Discrete Cellular Lattice Assembly

by

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Abstract

Robotic assembly of discrete cellular lattices at super-hertz (>1Hz) assembly rates is shown to be possible by integrating the design of a modular robotic assembler with the specified lattice topology such that the lattice can itself be removed from the incremental assembly process. Limits to assembly rates are ultimately dependent on allowable error, system stiffness, and damping characteristics. Vibrations due to cyclical motions of the end-effector, locomotion system, and the dynamic response of an incrementally varying lattice must settle to acceptable ranges to enable engagement between end-effectors, discrete elements, and their affixing features to adjacent cells. For given system dynamics, longer settling times enables greater energy dissipation, and less error. With a greater allowable error at the interface, a shorter assembly cycle period can be attained. Passive alignment features designed into the robot end-effectors, locomotion systems, and the discrete lattice elements reduce the precision requirements of the assembly process by opening up the acceptable error range, thereby, enabling higher assembly cycle-rates. An experiment was performed to evaluate how an assembler locally referencing a lattice performed in comparison to a globally referenced assembler. The two assemblers were of similar kinematic form: both gantry-type CNC machines: a ShopBot and a custom built relative robotic assembler. The results showed superior performance by the global coordinate frame system. An error budget analysis of the two systems showed that the locally referenced, lattice based system had a larger more variable structural loop than the global coordinate frame ShopBot. The control experiment, demonstrated 0.1Hz assembly rates, while first order approximations predict a maximum 4Hz cycle for the specified interface geometry. Results show that in order to successfully assemble discrete cellular lattices at super-hertz rates the robot must itself become the local, instantaneous global coordinate frame such that the structural loop is absolutely minimized, while stiffness is maximized; at the instantaneous moment of assembly the structural loop of the robot must reference only itself.

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Discrete Cellular Lattice Assembly

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Figure 0-1: The late night crew: Sam Calisch, Will Langford, Ben Jenett, Amanda Ghassaei.

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Chapter 1

Introduction

In order for robotic assemblers of discrete cellular lattices (RADCL) to reach superhertz (>1Hz) assembly rates the system must operate with a local, instantaneous, global coordinate frame. Assembly happens without reference to the lattice, at all. The settling time for allowable error is the greatest limit to assembly rates. To reduce this error contribution the system must be maximally rigid, with minimal structural loop. There is no room for the lattice to contribute error, and so it must not. The robot incrementally ratchets along the lattice, placing cells relative to its own internal coordinate frame.

Robotic assemblers whose kinematic design is directly informed by a lattice topology exploit tuning of kinematic and inertial mechanisms for high frequency assembly and locomotion. Heterogeneous modular robotic systems, or relative robotic assembly of non-stochastic discrete cellular lattices, provide a primary contrast to traditional manufacturing in that the factory is turned inside out: the object being created is itself the framework for the factory; the periodic lattice acts as both the desired construction objective as well as the foundation of locomotion. It is also not self-assembly robotics, rather wherein self-assembly systems the robot is both the assembler and the structure, here, the focus is high performance lattice structures assembled by task-specific modular robots. The complexity of assembly remains within the robot, allowing the lattice to construct a material that is simple, light weight, and manufacturable at scale.

Large-scale assembly of arbitrarily sized periodic lattice structures lends itself to automated assembly. This, more so than other manufacturing processes; the environment of the lattice is highly structured, enabling the automation to be equivalently structured. Where a traditional industrial robot arm provides a range of functionality, its arrangement of degrees of freedom and inertial characteristics generally serialize the operational capabilities of the system. Kinematic tuning can allow parallelization of assembly sequences while minimizing vibrational modes, thereby increasing robustness, and capacity for higher velocity construction routines. Both the robot, and the structure are defined with respect to one another, making each one a necessary, and contributing component to a heterogeneous modular robotic assembly system. Relative robotic assembly enables unbounded, repairable and reconfigurable construction, along with the computationally tuned material performance of non-stochastic discrete cellular materials. Discrete cel-



Figure 1-1: A robotic assembler of discrete cellular solids, built as a test-case to evaluate gantry-based assembly platforms.

lular lattices are a way of designing, and manufacturing with: ultralight, high stiffness material regimes [17], reuse and reconfigurability of materials [18], tuned functional performance [11], reduced simulation complexity [19], error correction [20], and automated assembly. Rather than building large, monolithic, single-use components, the material is discretized into simple, repeating, functional bits. A discrete set of base elements, with a discrete set of allowable positions, and orientations are integrated to form non-stochastic cellular lattices with bulk material properties. In this way, the performance of a material can be maximized by incrementally assembling high-performance sub-elements. The next element placed only after the prior, provides *in situ* error checking and correction. The order of magnitude difference in wavelength between discrete element, and expressed cellular solid material properties provides $\frac{1}{\sqrt{N}}$ surface precision. The reconfigurability maximizes the sustainability post life of the product as it is simply deconstructed, and reconstructed. Finally, periodicity of structure reduces system uncertainty enabling parallelization of locomotion, and assembly operations.

The premise for cellular solids operation in the ultralight regime will be explained along with how the design elements necessary to generate reconfigurable discrete cellular lattices were identified through analysis and experimentation. The discretization allows reconfigurability of materials yet the interface between individual elements sets constraints on load paths, as well as the kinematics of assembly automation. The design of the interface is directly related to the connectivity, and structural performance of the material. It is also dependent on the total static, and dynamic error budget of the assembly process; the accumulation of mechanical error from the lattice, through the assembler machine components, to the interface of the next adjoining element of the lattice, and the dynamic vibration of lattice, and assembler all combine to define minimum clearance, and ultimately allowable interface designs. These constraints affect the mass, the stiffness of the system, and ultimately the achievable assembly rates.

By tightly integrating the design of the assembly robot along with that of the discretized lattice RADCL can be optimized. As is common in robotics, the mutual interdependencies of the subjects must be applied to satisfy the desired goal. The breadth of this subject requires an introduction to the current state of this emerging field, which then enables an integration of those concepts into simulated, and built models.

To set the scope, similar heterogeneous reconfiguring modular robotic systems are introduced. Then, the reader is taken on a dive into cellular materials, with the intention that they surface with an appreciation for the benefits, and applications for non-stochastic discrete cellular lattices. The effects of error are so crucial to understanding the demands of the interface design - which ultimately define dynamic assembly rates - that methods of tolerance, kinematic constraint, error budget analysis, and vibrations are presented, and applied, along with a brief section discussing how elastic-averaging enables local error to become global precision. The learnings from the background chapters are then applied toward mechanical design experiments performed on lattice topologies, and their associated inter, and intracellular interfaces. Rather than present all of the work I performed in this area, I provide a selection of the discovered pivotal design elements, then discuss them through application, and simulation. ¹

To test the above defined dependencies of discrete lattice assembly I built a custom, relative robotic assembler to test against an off-the-shelf, traditional, linear kinematic, gantry-type CNC machine. The question asked was: does an assembler that locally

¹All work performed was scaled to the same cell dimension, that being the length of an edge of a cube encompassing an octahedron: that is 100mm measured across opposing nodes on an octahedron.

references a lattice place with more or less precision than a globally referenced assembler? The experiment consisted of picking up an octahedron voxel from one location, and then placing it into a target location within an *edge-connected* octahedral lattice. The two machines had the same kinematic configuration consisting of linear actuators for x, y, and z axes. The dependent variable being that the custom built assembler system was mounted directly on the lattice by way of an incremental relative motion system which included leg, and foot actuators. The results of the experiment showed, that due to the increase in uncertainty from the dimensional variability accumulated from the lattice elements, a local assembler must actually be a locally global assembler.

The conclusion is that the relative robotic assembly process must minimize the structural loop. The global assembler was more successful in the experiment because the tolerance stack only ever included its own, tightly controlled, and non-variable, hardware. In order for a robotic assembler that moves relative to the lattice to assemble locally, the assembler must minimize its structural loop; the assembler must place parts only relative to itself, without dependency on non-adjacent lattice elements. At each incremental step the assembler must consider that location its instantaneous global origin, and place adjacent elements with reference to only this instantaneous coordinate frame. In this way, static dimensional uncertainty is reduced, allowing more room to manage the positional variability from dynamic conditions, increasing potential assembly rates. The final chapters utilize this information, and make recommendations of designs for future relative robotic assemblers to be built and tested.

Chapter 2

Robotic Assembler Systems

The use of manipulators for assembly tasks requires that precision with which parts are positioned with respect to one another be quite high. Current insdustrial robots are often not accurate enough for these tasks, and building robots that are may not make sense. Manipulators of greater precision can be achieved only at the expense of size, weight, and cost. The ability to measure and control contact forces generated at the hand, however, offers a possible alternative for extending the effective precision of a manipulator. Since relative measurements are used, absolute errors in the position of the manipulator and manipulated objects are not as important as they would be in a purely position controlled system. Since small variations in relative position generate large contact forces when parts of moderate sitffness interact, knowledge and control of these forces can lead to a remendous increase in effecive positional accuracy.

Craig, J. J. (1989). Introduction to robotics : mechanics and control. Reading, Mass. : Addison-Wesley, c1989. [21]

2.1 Automated Assembly

2.1.1 Common Robot Classifications

Robotic automation is used to perform tasks that are either unsafe for humans, or repetitious and require the dexterity of enough degrees of freedoms that it is not feasible to build a factory-style automation system. Common views of robots are the traditional six axis industrial robot arm, humanoid or self-assembling modular robots. The examples in figure 2-1 from top right, clockwise show traditional factory automation in a beer bottling system. The next shows a 6-axis industrial robotic arm, coupled with an additional 7th rotary axis - this robot is performing advanced computational architectural fabrication, it is machining custom panels for a computationally designed pavilion. Humanoid robots often have seven degrees of freedom to mimic human range of motion. Humanoids are designed to operate in unstructured environments, safely, alongside humans. Self-reconfiguring Modular Robots are combinations of 1-axis modules. The reconfigurability has been partially driven by a desire to operate in unstructured environments where adaptation is necessary. These often move quite slow, and are neither good at being a robot nor a structure, but are highly adaptable.

All but one of the systems described are generalist, that is their design is such that they have a multitude of degrees of freedom to enable a variety of applications. This makes them adaptable for varying tasks, but the serial-link configuration also brings with it the additional mass of potentially unnecessary degrees of freedom. This additional mass can limit rates of motion (due to power or vibration limits), as well as limit dexterity in tight spaces. Task specific assemblers can exploit task specific kinematics.

Classification of Automation





Carney et al, Meka Robotics, 2009



Figure 2-1: Classification of Automation, clockwise: factory automation [1], humanoids, robotic fabrication [2], self-assembly [3].

2.1.2 Task Specific Assemblers



Figure 2-2: Task specific assemblers, counter-clockwise: space truss assembly [4], modular robotic truss assembly [5], modular robotic [6], automation cell [7], filament winding [8].

Driving for more efficient fabrication modular reconfiguring robotic systems have been utilized to perform the specific task of assembling arbitrarily sized truss structures. Trusses are sparse, load bearing systems that are fundamentally, a set of distance and angle constraints. The system on the right is spiderbot, a space-based, *in situ* robotic 3D printer of large apperature trusses. Below it is a self contained filament winder for extruding composite trusses. Beside that is another type of statically mounted truss extruder that builds with distances and angles. The systems on the left crawl along the structure and assemble a truss out of discrete elements. In each case the assembly components have specific features to aid assembly. These features include passive alignment, fixturing and even locomotion mechanisms.

2.2 Modular Robotic Systems: Coordinated Assembly of Lattice Structures

One of the grand-challenges of robotics is the design and coordination of multiple robot systems to cooperatively solve tasks [22] - scalability through parallelization is the fundamental inspiration. A taxonomy of this new field is still subjective, and best identified by task goals rather than control architecture. Roughly, system architectures can be discretized into low-instance coordinated tasks, centralized computation with task distribution, and decentralized algorithmic coordination – swarms.

Self-assembly, and re-configurable robots have been used interchangeably to describe both robots that themselves re-configure into new shapes (programmable matter |23|), and those which are able to compose, and decompose structures. This research focuses on reconfiguring robots, that is robots acting on lattice structures, but not (generally) being an integral part of the lattice. In this way the structural performance of the lattice can be maximized without massive embedded complexity. Similarly, the robotic assembler can be optimized to assembly tasks specific to the lattice topology, without the complexity of also being the lattice. The adaptability of structures is highly desirable for space-based construction where mass can be optimized for final in-space use rather than launch loading resilience – that is structural elements are packaged for launch and assembled in-space. Further, localized failures may be compensated or repaired with reconfigurable systems. Reconfigurability also allows the building of temporary scaffold structures to allow relatively simple, one-unit-step robots to assemble complex geometries such as overhangs or pillars [24]. Further, in some instances, the robot may behave as both the assembler and the structure [25], and be optimized to live, and interact only within the lattice structure [26]. Optimization between hardware, and path planning is tightly coupled due to computation, communication, topology, and physical limitations.

Control strategies of swarm systems are generally based on a principle of stigmergy:

In such algorithms, local patterns of matter that result from past construction provide the exclusive cues necessary to direct and coordinate the building activities of the swarm. Therefore, any coherent architecture naturally induces coordination, which may then be seen as a by-product of the architecture; more over coordination severely constrains in turn the spaces of possible coherent architectures. [27]

Further, a range of control strategies based on stigmergy algorithms may include such ideas of granular convection, gradients [28], etc. Most of these strategies end up being relatively similar in the fact that the agents have limited or no knowledge of overall mission goals but instead stochastically investigate, and assemble based on simple rules. While, this strategy does allow the construction of structured environments, it is done without specificity. If detailed custom configuration is necessary then a fully generalized control approach must make use of more centralized control. Strategies range from high bandwidth communication from fully centralized computation to beacon elements that manipulate locally generalized construction.

The following is a short survey of the current state of multi-robot coordination for solving the task of assembly of discrete, cubic, lattice type structures.

2.2.1 Brick Construction

The Self-organizing Systems Research Group at Harvard University has developed a brick laying robot bioinspired by termite construction techniques, TERMES. "The hardware comprises a mobile robot and specialized passive blocks; the robot is able to manipulate blocks to build desired structures, and can maneuver on these structures as well as in unstructured environments" [24]. The brick morphology of the structure is similar to an unstructured environment, such as a flat floor or gravel covered field. The bricks contain kinematic locating features to allow higher placement precision than the robot is, in itself, capable of providing. Similarly the bricks contain geometry to provide stepping features, locating, and communication features that provide information to the assembler robot.

Control methodology is based on stigmergy with the modification that agents may be turned into beacons. This means agents, in general, follow simple rules, however, they can be locally manipulated to change their path by local beacon information. While the agents may traverse on unstructured environments, they are gravity based, and as such are constrained to assemble in ordered fashion. Temporary scaffold structures can be built to allow complex features such as pillars, and overhangs.



Figure 2-3: TERMES, bio-inspired construction robots. Petersen, K. H., Nagpal, R., & Werfel, J. K. (2011). Termes: An autonomous robotic system for three-dimensional collective construction. In Robotics: Science and Systems Conference VII. MIT Press. [24].

2.2.2 Active Modules with Passive Truss Elements

A modular robotic system designed to not only build truss structures but to behave as active elements of the structure; Shady-3D is a three degree of freedom modular robot that is specified to live within the truss environment it constructs. Reconfigurability of the structure is a primary element of the design, such that a robotic system "decomposes a given structure into constituent building blocks and reassembles the same building blocks into a target structure...[this] approach uses truss structures rather than modular cubic units, allowing lighter structures and more flexibility in reconfiguration" [29]. Multiple assembler robots may gang themselves to increase their effective degrees of freedom for specific tasks. This research is a collaboration between the labs of Hod Lipson at Creative Machines at Cornell and Daniela Rus at the Distributed Robotics Lab at MIT. Several iterations of the robots and control algorithms have focused on topological optimization of the structures. Coordinated assembly, and activation of the structure is optimized through a quadratic competitive ratio for both static and dynamic graph methods [30].



Figure 2-4: Shady-3D, assembler robot for reconfigurable truss lattice structures.
Terada, Y., & Murata, S. (2008). Automatic Modular Assembly System and its Distributed Control. The International Journal of Robotics Research, 27(3-4), 445-462.
[30].

2.2.3 Relative Robotic Lattice Assembly

The Automatic Modular Assembly System (AMAS) is a heterogenous modular robotic construction system. The robotic assemblers are active making motions based on a finite set of required motions. The building blocks are passive cubic lattice elements, though they contain mechanisms for mechanical latching, power and communications transmission. The assemblers locate locally, relative to the structural elements of the lattice:

The assembler robot can walk on the modules by using connectors on their

hands and carrying a module with its hand (L-shaped part). As any modular structure made up of these modules can be described on a cubic grid, a finite set of motion patterns is sufficient to build any shape. We took advantage of this to minimize the configuration of the assembler robot. Only four degrees of freedom are enough for locomotion and adding a new module on any surface of another. [31]



Figure 2-5: AMAS assembler robot.

Terada, Y., & Murata, S. (2006). Modular stucture assembly using blackboard path planning systems. In International Symposium on Automation and Robotics in Construction (pp. 852–857). [26]

The control strategy is gradient based; a gradient between supply chain and growth front is communicated to the assemblers to direct their motion. "The desired shape of the panel is given *a priori* to both the robot and the structure modules. The modules can tell whether they are at the growth front, or inside of the shape, and whether their neighbor point is occupied" [31].

2.3 Global vs. Local

Each of the above modular robotic systems utilize local reference frames for positioning and locomotion. The premise being the ability to build structures without bound. That is, by making incremental motions across the structure - assuming an effective method of material distribution - the scale of structure to be constructed is effectively unbounded. Repair, and reconfiguration of these structures is also possible with modular robots, as specific components can be reconfigured *in situ*, without diseassembly of monolithic components in a factory. Each of the above robotic systems operate at a scale on the order of the discrete cell size, or smaller. Each cell provides some alignment features that provide a local position reference. The robot places components only onto the adjacent cell, and so the precision required is based on the structural loop between only adjacent cells. This provides a placing accuracy directly related to the precision of two cells.

When it comes to discrete lattice assembly, the assumption is that this local reference potentially provides higher locational precision than a global scale assembler; the error stack includes only two adjacent cells, where as global assembly includes the root sum square of all deviations between the global reference, and the end-effector. That is an end-effector, whose location is referenced to a single global origin, traversing across a vast array of cells to a target location may not find the target location in its exact, specified spot, due to the accumulation of error of each of the discrete cells. There are two possible options, then to solve this: elastic averaging, and relative placement.

It is possible to have error reduction better than linear when operating locally by exploiting elastic averaging (see §4.1.3). A modular robotic assembler that spans across N_p parts can express a local precision that is $\frac{1}{\sqrt{N_p}}$. For a magnitude increase in averaged accuracy it would require a span across 100 parts - perhaps unrealistic. An error reduction of one half is potentially possible with four points of contact. It should therefore be possible to utilize the concepts from modular robotic assemblers of discrete lattices to design an assembler that has higher positioning accuracy, enabling faster cycle rates (see §4.2), by utilizing a locomotion system spanning multiples cells.

Alternatively, a further reduction in error can be achieved if the lattice is actually not part of the structural loop of assembly. If, instead the robot has alignment features that enable placement only with reference to its own hardware, then the static and dynamic error contribution from the lattice can be completely removed; the robot latches onto a lattice cell, and then makes a placement maneuver into the adjacent cell by mechanically referencing its own hardware. In this way the global origin of the robot moves incrementally with the robot; at each step its instantaneous local position is its global reference frame.

Chapter 3

Discrete Cellular Lattices

Here we are concerned with lattice or cellular materials. Like the trusses and frames of the engineer, these are made up of a connected array of struts or plates, and like the crystal lattice, they are characterized by a typical cell with certain symmetry elements; some, but not all, have translational symmetry...At one level, they can be analysed using classical methods of mechanics, just as any space frame is analysed. But at another we must think of the lattice not only as a set of connected struts, but as a 'material' in its own right, with its own set of effective properties, allowing direct comparison with those of fully dense, monolithic materials.

Ashby, M. F. (2006). The properties of foams and lattices. Philosophical Transactions. Series A, Mathematical, Physical, and Engineering Sciences, 364(1838), p16. [32]

Cellular lattices, low density materials whose properties are defined by the bending or stretching of load carrying, highly connected, and sparsely distributed structures with periodic, and translational symmetries [33] [34] exhibit isotropic, anisotropic, or quasi-isotropic behavior determined by the connectivity of their strut node network [32]. Stretch dominated axial stresses or coupled bending moments are primary material behavior indicators that can be identified by the connectivity at nodes and the multiphase distribution of rigid and mechanism cells throughout the material [35, 36]. "For the lattice to behave as a material, the wavelength of any loading is also much longer than that of the lattice elements. In contrast, the lattice behaves as a 'structure' when it contains a relatively small number of lattice elements, and the length scale of the loading is comparable to that of the lattice elements" [37]. Primary engineering interest of the cellular lattice is the property of sparse density. Two distinctly different material behaviors exist within this ultralight regime: energy absorption, and stiffness [38]. Each property, unique in its cellular structure, application, and traditionally, in its manufacturing process. Historically engineered uses of cellular solids have relied on stochastic, bending dominated cellular structures such as honeycomb and foams, but modern manufacturing techniques enable tuned stretch dominated non-stochastic lattices that demonstrate an order of magnitude increase in structural efficiency over bend dominated lattices [35, 39].

This research is primarily concerned with maximizing stiffness and strength of structures and developing means to assemble lattices from discrete cellular components. The following is a brief explanation of how the rigidity of a lattice framework is examined and what underlying scaling variables exist. Then I introduce the variables of importance to discrete cellular assembly, and how they are effected by the lattice and following chapters will explain how they effect assembly scalability.



Figure 3-1: Celluar lattices. The left-most image is a stochastic cellular lattice metal foam [9]. The right-most image is a non-stochastic discrete cellular lattice designed and built by the author.

3.1 Cellular Lattice Rigidity

Analysis of the behavior of cellular lattices requires both a micro and a macro description. The cellular material has useful engineering mechanical properties that can be treated as a bulk material with elastic modulus, yield strength, and mass, among other things. These properties however, are dependent on the aggregate behavior of the cellular lattice that makes up its microstructure. The most defining attribute of the lattice is how loads are transmitted through the connecting material that forms the cells, how they connect to one another, and the distribution of cell types throughout the lattice. The nodes that are at the interface between load paths can be either exactly, over, or, under constrained. If they are under constrained then an applied load to the lattice, such a compression or shear will cause the nodes to migrate and the connecting members to bend. If the nodes are exactly, or over constrained by the load bearing members then those same members will experience only axial, and no bending loads. This is significant because it results in an order of magnitude difference in stiffness. Perhaps the best description was given by Deshpande et al. in the following quote and accompanying figure 3-2:



Figure 3-2: (a) a mechanism; (b) a structure. [35]

An open-cell foam can be treated as a connected set of pin-jointed struts by the following argument. Consider the pin-jointed frames shown in Fig. 1. The frame in Fig. 1(a) is a mechanism. When loaded, the struts rotate about the joints and the frame collapses; it has neither stiffness nor strength. The triangulated frame shown in Fig. 1(b) is a structure: when loaded the struts support axial loads, tensile in some, com- pressive in others. Thus, the deformation is stretching-dominated and the frame collapses by stretching of the struts. Imagine now that the joints of both frames are frozen to prevent free rotation of the struts. On loading the first frame, the struts can no longer rotate. The applied load induces bending moments at the frozen joints, and these cause the struts to bend. This is the situation in most foam structures. However, freezing the joints of the triangulated structure has virtually no effect on the macroscopic stiffness or strength; although the struts bend, the frame is still stretching-dominated and the collapse load is dictated mainly by the axial strength of the struts.

Deshpande, V. S., Ashby, M. F., & Fleck, N. a. (2001). Foam topology: bending versus stretching dominated architectures. Acta Materialia, 49(6), 1035. Understanding, now, that the lattice may be treated as a pin-jointed framework of struts, the traditional next step is to then evaluate the Maxwell rigidity criteria, and the coordination number for the repeating cell type. Both of these methods evaluate the kinematic constraint of lattice nodes, yet, the numerical simplifications of geometrical constraint disregards the mixture of multiphase closed polyhedra (i.e. rigid octahedron mixed with flexible truncated cubic forms) that necessarily makeup a space filling lattice, and also help define the operating behavior of cellular materials. The following section will briefly introduce kinematic constraints which apply both to the understanding of cellular lattice microstructure, rigid frameworks, as well as later will be directly applied to discrete cellular lattices.

3.1.1 Kinematic Constraints

An object can move freely in space unless constrained to not move in certain directions by some fixing force. A 2D object has three kinematic degrees of freedom two translational and one rotational: X, Y, θ_z . A 3D object has six kinematic degrees of freedom three translational and three rotational: $X, Y, Z, \theta_x, \theta_y, \theta_z$. Structures make use of secondary rigid bodies to enforce the constraints to limit each of the degrees of freedom. Exact constraint design, or kinematic constraint design is a design methodology that aims to constrain each of the required degrees of freedom and only those required, such that additional internal stresses are not applied to the structure, and that robust, repeatable precision location of parts is possible [40].

The methodology is straightforward. Each constraint should be effective as a strut with pins on each end, and acts along a line of action, applying tension or compression forces and no other. Only translation perpendicular to each line of action is possible. At the point of intersection of two lines of action there is a rotational degree of freedom, known as an instantaneous center of rotation. As the point of intersection approaches the limit of infinity the lines approach parallel and the rotation can be approximated as a translation. The instantaneous center of rotation is only valid at the instant of evaluation as it can migrate based on the orientation of the constraint members and their intersections. In this way, all degrees of freedom can be considered rotations. For each unwanted degree of freedom a constraint is needed to satisfy the equations of equilibrium. Further, to form a rigid body framework "each constraint line needs to have a "good size" moment arm about the instant center of rotation defined by the intersection of the other two constraint lines" [40].

The figure 3-3 shows an under constrained and exactly constrained body. The instantaneous center of rotation is at the intersection of each constraint line, colored light blue. In frame (a) it is apparent that x, and y are effectively constrained, yet there still exists a rotational pivot at this arbitrary location on the body shown in blue. The body is able to rotate about this point, and this point does move based on the orientation of the body. This system is a four bar linkage. Frame (b) shows a third constraint has been established that intersects with the x-axis constraint, creating a secondary instant center of rotation. This new line of action is some "good size" distance from the original instant center of (a) and generates a moment that restricts the rotational degree of freedom that had existed. In this way this framework is now rigid, and each degree of freedom is exactly accounted for, it is an exact constraint design. If however, an additional strut were attached to the body in (b) and it had any, even infinitesimal variation as is always the case in real systems, then all of the members would then be forced into conditions of self stress as they strain to accommodate the new, over constraint. Any infinitesimal extension in a strut due to an over constrained structure induces internal stresses throughout the structure, and is generally considered an undesirable feature in the mechanical design of structures. The following section shows how Maxwell utilized these concepts of constraint to apply towards the construction of rigid frames, and how his framework has since been utilized to predicit the behavior of cellular solids.



Figure 3-3: (a) two translations constrained, one rotation free; (b) exactly constrained two translations and one rotation.

3.1.2 Modified Maxwell Criteria of Rigid Frameworks

Maxwell [41] defined the necessary conditions for a pin-jointed frame of struts to be rigid statically, and, kinematically determinate in the form a stability criteria. His methodology later evolved into exact kinematic constraint as described above [42]. Maxwell established his rule to define the rigidity of frames, as at the time he was developing precision instrumentation for laboratory equipment, rather than infinite frameworks of lattices. Nonetheless, it has been shown that a cellular framework can be evaluated as a system of struts, and pin joints [35]. The rules were updated to include information regarding not only if the frame was rigid, but if it is bending, or stretch dominated when the pins are effectively frozen in the nodes of a cellular lattice. The three dimensional criteria modified to examine the frame stability in terms of mechanisms and self-stress is given in the following by Pellegrino and Calladine [43]:

$$M = b - 3j + 6 = s - m \tag{3.1}$$

where, b is number of non-collinear struts, j is number of joints, s is value of self-stress, m is number of mechanisms. A visualization of what self stress and mechanisms mean in a framework is seen in figure 3-4.



Figure 3-4: "Perspective sketches of assemblies to illustrate statical and kinematical determinacy and indeterminacy. (a) The three foundation joints lie at the comers of a square. (b) One bar has now been removed, and the assembly has a mode of inextensional displacement in which the central node moves towards the reader. (c) The fourth bar makes the assembly statically in- determinate. (d.1) A third bar added to (b) makes the assembly both statically and kinematically indeterminate; but only small displacements of the inextensional mechanism are possible. (d.2) As (d. l), except that the three foundation joints are collinear, and free motion of the inextensional mechanism, as in (b), is possible."

Pellegrino, S., & Calladine, C. R. (1986). Matrix analysis of statically and kinematically indeterminate frameworks. International Journal of Solids and Structures, 22(4), 410.

It should be noted, though, that a similar method of evaluating the behavior of cell loading conditions that commonly leads to misinterpretation of the Maxwell Criteria is that of coordination or connectivity number, Z, that is the average number of struts connected to a node. This criteria is used as an explanation for how rigidity can be defined for an infinite lattice. From coordination number the conditions for rigidity are Z = 4 for 2D, and Z = 6 for 3D structures[43]. What is commonly forgotten, however, is that Maxwell's rule specifically states only non-collinear struts may be evaluated due to redundancy and the kinematic indeterminance of the equilibrium equations due to strut collinearity. Figure 3-7 shows a symmetrically sectioned cubic octahedron, showing how it is in fact a mechanism.

The more accurate Pellegrino and Calladine equation helps us understand the loading conditions of a cellular lattice. When M < 0, the frame is a mechanism and bending dominated. When M >= 0, the structure becomes kinematically determinate, and strut loading conditions are dominantly axial - the frame is stretch-dominated [43].

3.1.3 Stiffness of Beams

The literature has examined through empirical evaluation as well as linear algebraic analysis that stretch dominated frameworks are an order of magnitude stiffer than bending dominated, and what conditions must be present in order for a lattice to exhibit such behavior. However, one additional factor to explicitly state to help understand the scaling differences is an examination of the stiffness of a simple beam in each of these loading conditions: axial, and transverse bending (see figure 4-4).

The distinction between stretch and bending dominated behavior can be further understood by comparing the stiffness of a solid round beam in axial versus bending load conditions (figure 3-5). The mechanics for this can be found in most mechanics of materials or mechanical design references [44, 45]:

$$k_a = \frac{AE}{L} \tag{3.2}$$

$$k_b = \frac{3EI}{L^3} \tag{3.3}$$

Where, for a round slender member, $d \ll L$, and inserting

$$A = \frac{\pi d^2}{4}$$
$$I = \frac{\pi d^3}{64}$$

back into the stiffness equations

$$k_a = \frac{AE}{L} \qquad \qquad = \frac{\pi E}{4} \left(\frac{d^2}{L}\right) \tag{3.4}$$

$$k_b = \frac{3EI}{L^3} \qquad \qquad = \frac{3\pi E}{64} \left(\frac{d^2}{L}\right)^2 \frac{1}{L} \tag{3.5}$$

it can be seen that axial stiffness is related to a beam slenderness ratio $\frac{d^2}{L}$ by an order of magnitude scaling $O(\frac{d^2}{L}) = O(1)$. The bending stiffness of the same beam is then a two order of magnitude O(2) scaling of this slenderness ratio, and additionally, inversely proportional to the length of the beam.

Due to the slenderness condition of the beam this second order scaling explicitly defines the empirical evidence found by Ashby et al.[32] that bending-dominated lattices exhibit an order of magnitude less stiffness than highly triangulated stretch-dominated lattice frameworks. §4.2.2 goes into some detail of the system response to each of the axial and bending conditions.



Figure 3-5: (a) Applied bending load; (b) applied axial load; (c) axial load sufficient to induce buckling.

3.1.4 Euler Beam Buckling

There is a limit to the allowable slenderness ratio, and that limit is due to buckling. A long slender beam will still exhibit bending modes even in an axial load condition when the compression stress reaches a critical stress. The Euler buckling criteria for a slender beam in compression is [44]:

$$\sigma_{cr} = \frac{P_{cr}}{A_{cr}} = \frac{\pi^2 E}{\left(\frac{L_e}{r}\right)^2} \tag{3.6}$$

$$r = \sqrt{\frac{I}{A}} \tag{3.7}$$
where, r is the radius of gyration, σ_{cr} is the critical buckling stress, I second area moment of inertia, A projected area of beam, E modulus of elasticity, and L_e is the effective length. The effective length is dependent on the constraints applied to the end conditions and can be found in the references of Hibbeler or Juvinall [44, 45]. Assuming a pin jointed constraint, this can be reorganized to evaluate the maximum effective beam length for a given geometry,

$$L_e = r \frac{\pi^2 E}{\sigma_{cr}} \tag{3.8}$$

or, in the case of the simple round slender beam,

$$L_e = \frac{d}{4} \frac{\pi^2 E}{\sigma_{cr}} \tag{3.9}$$

 σ_{cr} must remain below the yield stress limit of the material, and depending on the application, should likely be further reduced to the fatigue stress limit.

For evaluation of cellular lattices it has been found that a pin joint connection between struts, and nodes is an adequate representation [35]. However, what remains to be evaluated is if this effective length could be considered fixed, rather than pin-joint. For pinned joints $L_e = L$, but for fixed end joints the theoretical limit is $2L_e = L$, and empirically $0.65L_e = L$. Hence, a fixed joint approximation would improve the slenderness ratio, which theoretically cubicly improves volumetric sparsity by a half to nearly a full order of magnitude. ¹

3.1.5 Multiphase Cellular Distribution

"It is worth mentioning here that any convex simply-closed polyhedron with triangular faces satisfies the Maxwell criterion and is rigid (see Appendix 9 in Calladine). It is generally assumed that the best model for a cell in a foam approximates a space filling shape. However, none of the space filling shapes (indicated by numbers 2, 3, 4, 6, 7 and 8) are rigid. In fact, we could not identify any rigid space filling cell in the 3D case and only succeeded in

¹Of course, this is in contrast to the pin-jointed assumptions previously stated. Those however are approximations to simplify analysis, and it may be that each approximation can be made as appropriate and necessary for the conditions of interest - this technicality remains to be proven.

synthesising rigid periodic 3D frameworks from combinations of rigid cells (e.g. the tetrahedron and octahedron in combination fill space to form" [32]



Figure 3-6: Cubic octahedron shown as vertex connected octahedra solid phase, tiled with truncated cubic void phase.

What Ashby is referring to is that while triangulated polyhedra do satisfy the Maxwell criterion, there are only two shapes that self fill space, rigidly. In fact the only known regular polyhedra to fill space are the cube, tetrahedra, and octahedra [46]. This means, since foams do fill space with closed polyhedra forms, there results a mixture or multiphase configuration of different polyhedra shapes that fill the volume. The multi-phase arrangement may then be composed of statically rigid, fully constrained polyhedra, and polyhedra of varying mechanism.

The effective elastic moduli of such multi-phase materials are approximated by the strain energy bounds of the Hashin-Shtrikman variational principles of mixtures. Shown below is the simplification for a two phase mixture [36].

$$\frac{k_e}{k} = \frac{G\phi}{k(1-\phi)+G} \tag{3.10}$$

$$\frac{G_e}{G} = \frac{k\phi}{(k+2G)(1-\phi)+k}$$
(3.11)

where, ϕ is a solid volume fraction, $1 - \phi$ void phase volume fraction, k bulk modulus, k_e effective bulk modulus, G shear modulus, G_e effective shear modulus [36, 47].

As the void phase volume fraction approaches zero the cellular material behaves as its stretch-dominated rigid polyhedra dictates. However, for mixed phase cellular lattices there exists a derating of rigidity due to the mixture of rigid and mechanism frameworks. This derating effect can make a solid phase rigid cellular lattice and make it minimal rigid [35].

Some examples of this shown in figure 3-6 are the cubic octahedron tiling system that includes node connected octahedra (rigid), mixed with truncated cubes (mechanism void). The octahedron is a fully triangulated six joint, twelve strut, structure; it is exactly constrained with zero self-stress, zero mechanisms, and demonstrates stretchdominated behaviour. The octahedron can be assembled in different density configurations: vertex-connected, edge-connected and face connected. Each configuration nesting with a different type of volume filling space: a truncated cube, tetrahedron and tetrahedral dipyramid. However, as a mixture of rigid, closed polyhedra is not necessarily rigid.

In this example the octahedra are rigid, and in planar tension/compression the lattice remains so. However, the truncated cubic void phase volume fraction expresses three degree of freedom mechanisms (rotations about each axis). In planar shear, the vertex connected octahedra solid phase has a single constraint that lies along the plane perpendicular to the shear, while the void phase has a mechanism, such that the shear response of the cubic octahedra (the cuboct) comes from a pure bending load condition on the strut members of they are frozen in their joints. Another way to look at this mechanism to reference figure 3-7 where Pellegrino and Calladine demonstrate how a cross sectioned cubic octahedron can seemingly satisfy the Maxwell criteria yet be statically and kinematically indeterminate. Finally, it is also apparent from figure 3-8 where it is clear that the node connectivity only constrains translational modes, while rotational modes are free. From this analysis we see a vertex connected, cubic octahedron has been shown to be a minimum density, maximum *axially* stiff lattice yet identified [17], but may only be axially stiff; it is quasitropic, axial loading is stretch dominated, shear is bending dominated.

That said, according to Deshpande et al. a rigid boundary condition can be considered part of the volume fraction, and will play a part in overall system stiffness. For instance, a rigid boundary can assert distance constraints on the boundary nodes, restricting the expression of a structural mechanism that would otherwise exist. This example surface rigidity constraint, however, becomes inconsequential as the volume increases such that the fraction of the rigid boundary condition phase becomes insignificant, and the void phase volume fraction approaches a significant contribution to the total solid volume. The system then approaches a minimal stiffness condition for the specified loading conditions



Figure 3-7: "(a)A ring assembly [or cross sectioned cubic octahedron] which satisfies Maxwell's rule, but (b) is statically and kinematically indeterminate with a free mechanism of inextensional displacement."

Pellegrino, S., & Calladine, C. R. (1986). Matrix analysis of statically and kinematically indeterminate frameworks. International Journal of Solids and Structures, 22(4), 410.



Figure 3-8: Although an octahedron is statically and kinematically constrained, when stacked vertex to vertex there remain three degrees of freedom about the vertex. A common accounting error is to double count the collinear struts coming from the node. Here it would appear that this configuration has a coordination number of Z=8, but in fact it is Z=4. The node or vertex is constrained in 2D, but there remain three rotational degrees of freedom about it.

3.2 Stochastic Cellular Lattices

Stochastic cellular lattices may exist in open or closed cell forms. These cellular lattices occur in nature in the form of honeycomb, bones, woods, etc., and have been synthesized in the lab, and factory from polymers, ceramics, and metals [38]. Their performance is generally characterized by energy absorption, space filling capabilities, and high surface to volume ratios. The low density space filling property has been of particular interest to the aerospace industry for its ability to stiffen composite panels by providing buckling support

to thin wall composite designs, allowing higher second area moment of inertia structural geometries [48]. The macroscopic strength of such materials is based on the microscopic lattice connectivity, which in the case of cellular foams is bending dominated. Due to the reduced stiffness of bend loading (see 3.1.3) compared to axial tension, the linear elastic stiffness characteristics of open and closed cell foams scale with relative density $\bar{\rho}^2$ and $\bar{\rho}^3$, respectively [33]. When applied towards stiffening applications stochastic cellular solids provide non-optimal elastic modulus, and density scaling properties [48]. The limitation to stochastically assembled lattices in ultralight stiff material regimes is the existence of non-homogenous cellular distributions of voids; cellular topology variation compromises structural efficiency by creating undesired multiphase lattice structures. Finally, because "a low-connectivity lattice, typified by a foam, with a relative density of 0.1 (meaning that the solid cell walls occupy 10% of the volume) is less stiff by a factor of 10 than a stretch-dominated, triangulated lattice of the same relative density," [32] the engineer in search of an optimal, ultralight, stiff, and strong structural framework looks to non-stochastic, or ordered, cellular lattices.

3.3 Non-stochastic Cellular Lattices

Non-stochastic stretch-dominated cellular lattices can be designed to operate with a linear relationship between stiffness and relative density, allowing the already stated (section 3.1.3) magnitude increase in stiffness to mass over traditional foam materials [32, 35, 37]. By combining rigid, and semi-rigid (rigid as defined by Maxwell, a statically and kinematically determinate framework, where semi-rigid is kinematically indeterminate and therefore can express a mechanism) space filling forms the overall characteristics of the materials can be tuned to specific performance. Combinations of space filling tetrahedra, octahedra, and other non-rigid, under-constrained frameworks enable tuning of stiffness and degrees of freedom, allowing controlled anisotropic behaviors enabling energy absorption or morphing structures. It has been conjectured that, because these non-stochastic structures can be made to be kinematically determinate, manipulation of these structures by replacing some struct members with actuators may even result in materials that perform controlled mechanical behaviors [49]. A great deal of work has been published regarding the use of 2.5D lattices as the core of structural panels of composites or metals [50, 51]. Continuous processes have also been utilized with fiber wrapped structures [52]. Additive manufacturing processes have allowed the construction of 3D lattices in combinations of polymer or polymer core, metal coated structures. Of great interest further is the construction of multi-scale hierarchical structures that follow the same construction rules at multiple scales [53] to further maximize material sparsity, and at the nano level, exploit material nonlinearities. Hierarchy has been applied at nano [54], micro [55] and macro [53] scales.

3.3.1 Hierarchical Structures



Figure 3-9: Hierarchical structure built from the OT6 discrete cellular lattice elements. Length scales from 5cm to 1m by building columns of face-connected octahedra terminated with tetrahedra. This is the same geometry as Rayneau-Kirkhope et al. [55] except fabricated with reconfigurable discrete cellular lattices. Far right is a notional image of space-scale structures (*parts/image credit: Matt Carney/Benjamin Jenett 2015*).

Second order hierarchical structures have been shown to exhibit an additional order of magnitude increase in stiffness to mass over first order cellular lattice assemblies when operated in low-load conditions - a property directly applicable to space structures that are often stiffness limited [53]. Both Murphy and Rayneau-Kirkhope et al. show optimization of self-similar hierarchy settling on second order configurations at both macro and micro scales. Rayneau-Kirkhope et al. found an optimal strut member to be a column of face connected octahedra terminating at the 2^{nd} order nodes with tetrahedra. One potential drawback they found, however [56], was any failures occurring at the first order lattice affected system stability at the following hierarchical orders. This likely due to the exact constraint of the geometry having limited redundancy. Hierarchical structures have also been created with a continuous fiber wrap process and has similarly demonstrated local and global buckling behavior[52]. That said, hierarchical structures can further exploit deterministic lattice behavior such as tuned stiffness, strength and failure resilience by combining combinations of stretch and bend dominated lattice geometries [37, 55, 56].

3.3.2 Kagome Structures



Figure 3-10: "Relative modulus plotted against relative density on logarithmic scales for cellular structures with alternative topologies. Bending-dominated structures lie along a trajectory of slope 2; stretch-dominated structures along a line of slope 1." Ashby, M. F. (2006). The properties of foams and lattices. Philosophical Transactions. Series A, Mathematical, Physical, and Engineering Sciences, 364(1838), 27.

When filling space with sparse structures, and with a goal to maximize isotropic stiffness while filling the space one would like to find the optimal configuration of closed polyhedra. Similarly, in order to have isotropic properties one supposes it is best to find regular polyhedra that fill the space. Asking this question it was found that for a 2D topology optimization "Kagomé-like cellular solids will have superior strength to the elastic buckling loads than either triangular-like or hexagonal-like cellular solids" and has "optimal elastic moduli in the zero-density limit" [47], in planar loading. Further, Ashby found the Kagome structure represents the upper limit to achievable strength to relative density, figure 3-10, [32] while Fleck et al. found it is the maximum stiffness to relative density, and also fracture toughness for cellular lattice materials, figure 3-11 [37]. However, these analysis were performed on planar loading, without disturbance. The connectivity of nodes is Z=3 in 3D, which leaves three rotational degrees of freedom. Due to these degree of freedom the structure is actually a combination of bending and stretching. Which, is how it receives high scores for overall toughness, by combining elongation and bending loading conditions [57, 49]. The literature shows a variety of different structures that claim to be 3D Kagome, which include variations of tessellated



Figure 3-11: "The predicted mode I fracture toughness KIC plotted as a function of relative density, for the three isotropic lattices: hexagonal, triangular and Kagome." Fleck, N. a., Deshpande, V. S., & Ashby, M. F. (2010). Micro-architectured materials: past, present and future. Proceedings of the Royal Society A: Mathematical, Physical and Engineering Sciences, 466(2121), 2511.

vertex connected tetrahedra, dipyramid tetrahedra, and alternating polarity tetrahedra. Manufactured forms of this structure have been made in 2.5D with welded formed sheetmetal and in 3D with additive manufacturing processes. The discrepencies in what this form actually is in 3D opens it up to potential for discrete assembly for applications where the benefits of fracture toughness outweigh the need for stiffness.



Figure 3-12: Two potential 3D Kagome lattice layouts. The connectivity remains the same, but the left image has an offset orientation which provides clean cutting planes.





Figure 3-13: Discrete cellular lattice assembly vocabulary. *(image credit: Ben Jenett 2015)*

Although it has been shown that for designs operating in the ultra-light regime nonstochastic cellular lattices are a primary material choice, their scalability in application, and sub-material options can be reliant on limited additive manufacturing processes. To build at substantial scale, components must be batch processed, and fit together with some discontinuous interface. This type of bulk production generates monolithic, high value components - transportation, and handling of these can be costly, and risky. One way to potentially address these issues is to plan on the discontinuous interface, integrate it fully into the structure, and discretize the lattice geometry entirely into its fundamental building blocks.



Figure 3-14: Premanufactured carbon fiber laminate layup, discretely assembled into truss-core panels. Finnegan, K. A. (2007). Carbon fiber composite pyramidal lattice structures. University of Virginia. [10]

Discrete cellular lattices (digital materials) are a way of designing and manufacturing. Rather than building large, monolithic, single-use components, the material is discretized into simple, repeating, functional bits. The individual elements pack densely and are then unpacked into sparse, performance structures. The discrete set of base elements, with a discrete set of relative positions, and orientations are combined to form cellular lattices that perform as bulk materials. Building the lattice one structural element at a time with robust load bearing interfaces enables utilization of all known material, and manufacturing processes, allowing for highly tuned structures [10]. While local variations exist, bulk precision elastically averages out (§4.1.3), providing overall precision greater than the placement of the individual blocks. This discretization provides assurance of the structural capacity of the final bulk material by allowing the use of tightly controlled manufacturing environments for the construction of each discrete element; tightly controlled manufacturing process gives assurance of individual element performance, allowing prediction and control of their failure, and therefore the ultimate failure of the bulk structure. It also allows the combination of heterogeneous material combinations, as well as the opportunity for reconfiguration of materials and structures for repair or re-purpose. Local metrology is physically encoded in the geometry of mating surfaces; the placement of each component can be controlled, checked, and recorded - error correction is *in situ* to manufacture. These processes are not entirely-unlike, and inspired by ribosomal amino acid construction.

The discretization of the lattice enables combinations of heterogeneous elements that include varying stiffness as well as embedded functionality. When enclosed-area elements are utilized there is space reserved for housing additional features such as sensing, and actuation. Further, electrical connectivity could be molded into the individual elements enabling distributed power generation and health monitoring of structures. Langford has shown that elements can themselves be made electrically functional: conductive, semi-conductive, and non-conductive combined into discrete electronic components [11].



Figure 3-15: Electronic digital materials. (image credit: Will Langford) [11]

Automated assembly is paramount to the scalability of manufacture of high part-count structures. A major win comes from the simplicity provided by a structured environment for the assembly robots. The lattice, being a lattice, provides local metrology, enabling both global and local coordinate frame assembly machines. Just as a factory is tuned to a specific product line, relative robotic assemblers of discrete lattices are tuned to the lattice geometry. Operations, and kinematics are performed in parallel, rather than serially, increasing system stiffness and throughput. That is to say, rather than constructing a product inside a factory, the factory will consist of swarms of highly tuned robots crawling incrementally across the lattice, assembling and disassembly as necessary. While some systems may still benefit most from the rigidity and control of a factory, the most severe benefit comes to the construction of objects that do not fit within the confines of a factory. Space-structures are limited by deployment mechanisms. The unfurling behavior requires



Figure 3-16: Hierarchical space structures and risk reduction from one-shot unfurling of deployable space structures. *(image credit: Ben Jenett 2015)*

substantial mechanical features consuming limited launch mass and volume availability, limiting the range of their deployable reach. Additionally, space structures are designed to withstand launch forces, conditions only ever experienced once in their operational lifetime. These load requirements unnecessarily increase the mass of the systems - cost. Discrete lattice elements are designed to be flat-packed for efficient transportation, and autonomously unpacked once in space. The incremental, and error correcting nature of the construction system enables unbounded-scale space construction with continuous, but incremental unpacking of resupply shipments of lattice elements. Landscape scale structures would be the next architecture to be unbounded from the factory: bridges and levees. Both infrastructural improvements that benefit from sparse density, high stiffness, simplified transportation and assembly. Both infrastructures also are in dire need of repair in the United States and would benefit highly from an automated assembly system that can operate without stop - integrating its work effort over a longer period than humans are capable. Bridges possibly more likely to come sooner than levees however because they benefit from a structured foundation; the pivotal technology of the robotic assembler of discrete lattices is the highly structured environment. Assembly nucleates from a seed; a foundation of some sort is necessary. Bridge construction would be a strong impedance match for this technology as it provides a formulated anchor and benefits greatly from



Figure 3-17: Landscape scale structures such as levees can be constructed - shown simulated in the digital material design tool. [12]. (*image credit: Amanda Ghassaei 2015*)

highly-triangular sparse lattice structures.



Figure 3-18: Design tools exploiting the discretization as finite elements analysis [12].

Design and analysis come with discretization of the structure; the lattice inherently decomposes itself into finite elements. This feature can be utilized for design, simulation, and optimization, as well as path planning for assembly, simplifying the entire design to build work-flow. Calisch demonstrated the lattice geometry can be characterized, and treated as individual finite elements for reduced computational overhead in analysis [19]. His work has now begun to be integrated into the design tool and optimization research of Amanda Ghassaei 3-18.

Chapter 4

Sources of Error

All mechanical systems have dimensional variation due to their manufacturing processes. One part off of a press, or a CNC machine, or any other manufacturing equipment will be slightly different from the next part, and the previous part. These are small local errors, δ , and a production lot of parts have statistical means, μ , and standard deviations, σ . A mechanical system, composed of a multitude of mechanical parts will have some variation in its overall dimensional accuracy when compared to another system of the exact same design made from parts that came off of the exact same manufacturing line. The dimensional variation of each part in the assembly of the mechanical system adds to the overall system variation. The act of assembling two parts also introduces uncertainty based on: how flat the surfaces are, if dust or something larger slipped between the mating surfaces, how tight the bolts are - if they are warping the geometry of the parts they fasten - what the temperature in the room was when they were assembled, and more. These are variations internal to a single mechanical assembly, which itself may be a subassembly that gets assembled amongst other systems to combine into some more complex machinery such as a toaster, an airplane, or a robot.

In order for sub-assemblies to properly fit within the context of their larger roles as machine subsystems, the other parts of the machine must be designed to tolerate the statistical variation of dimensions, and performance, of the to be inserted components such that there is adequate room for the subassembly to fit. Yet, the fit must still be substantially precise enough that there remains adequate accuracy in alignment for further assemblies, and adequate holding force by the fastening system. This cascade of sub-assemblies becomes a structural loop. There is some critical point that can be considered the origin of this structural loop, and it is here at this point that the stack-



Figure 4-1: Deviations in material dimensional tolerance stack-up. The left shows how σ_0 must be designed and manufactured such that the combination of $\sigma_1, \sigma_2, \sigma_3$ still allow the new part with dimension σ_4 to fit securely, but not too loose. The right image shows how the structural loop and dynamics of the assembler further contribute to the tolerance requirements of the interface.

up of errors from this structural loop is evaluated. From this structural loop analysis a design must be implemented that tolerates these system variations. Parts can have varying degrees of effect on the total system error, if for example there are angular alignment errors, *abbe errors*, [13] in a serially stacked system, then those small angular defects can be amplified by their serially stacked lever arm, having significant impact at the positional accuracy at the end of the chain. An error budget analysis can be performed to analyze the impact of errors to identify the overall performance, or what are adequate design consideration to be made such that desired overall performance can be attained.

Static errors, due to manufacturing and assembly combine with dynamic errors from operational conditions to generate uncertainty at the end effector or point of interest. Static or quasi-static errors come from the manufacturing, and assembly variations. These errors exist due to random variation, systematic, and hysteretic variation. They effect the overall system accuracy, can often be managed through design, measurement, and closed-loop feedback. Dynamic errors dictate how fast a machine may operate. The stiffness of the structure, actuators, their natural frequencies, mass of moving objects, and motor dynamics define an operational stability. In the case of a robotic assembler, the rate at which it may operate is a balance between the time constant to stabilize within a specified dimensional tolerance, and what is an allowable dimension the part interface can tolerate while maintaining its desired structural performance. The more mass or the faster the mass needs to move the larger the acceleration that must be generated by the actuator. The reaction force from the actuator to the structure induces vibrations. The amplitude of force combined with the rate of actuation must be out of range of system natural frequencies, else large amplitude vibrations may be induced. These vibrations lengthen settling time, and contribute to end-effector positional accuracy oscillations. Alternatively, it is possible to design systems that attempt to reduce the effects of dynamic errors by operating in regimes outside of system natural frequencies, by building stiff, damped, vibration tolerant designs.

4.1 Static Errors

4.1.1 Tolerance Analysis

All parts exhibit some fluctuation in size due to the normal distribution of variation from manufacturing processes. When multiple parts are stacked into assemblies and are then to fit together within another assembly their total variations must be accounted for in the design of receiving assembly, else the fit will not be robust or even possible. This stack of parts make up a structural loop, and their variations can be considered a *tolerance* stack, visualized in figure 4-1. The total contribution to error of the series of variations can be estimated by making use of a Root Sum Square (RSS) of the standard deviation of the errors of each of the individual parts in the stack. In modern manufacturing terms the preference is for six sigma design principles, where parts are designed to fit together accommodating six standard deviations of variation, guaranteeing 99.9999998% reliability fitting interfaces. Motorola found that this six sigma process really depends on short term variation. That is, over long term distribution the mean might migrate $\pm 1.5\sigma$, but manufacturing process should identify and fix these process defects, and as such short term $6\sigma_{ST}$ is a valid. Common practice is to design with traditional manufacturing tolerances in mind, traditionally documented from a three sigma longterm distribution. Design principles from a modern consumer electronics manufacturer suggest a conversion between long term and short term distributions with a simple ± 1.5 . This distribution is generally acceptable to be used in analysis of clearance requirements, but must be evaluated based on the needs of the product. [58]

$$\sigma = \left(\sum_{i=1}^{N} \sigma_i^2\right)^{\frac{1}{2}} \tag{4.1}$$

$$\sigma_{ST} = 1.5 \left(\sum_{i=1}^{N} \sigma_{i,LT}^2 \right)^{\frac{1}{2}}$$
(4.2)

In the case of discrete cellular lattice assembly there are very large numbers of individual parts that must be assembled to fit together. Statistical variations become significant with large volumes of assembled parts. The reliability of the interfaces, as well as the stacks of components must be designed such that robust fixturing is possible with the dimensional distributions expected from manufacturing processes.

The number of standard deviations necessary for N number of assembled parts with X desired product reliability is:

$$\sqrt[N]{X}$$
 (4.3)

For example, a desired 99% reliability with 1000 parts requires designing interfaces to a tolerance defined by the following standard deviation (making use of a Z-table [59]):

$$\sqrt[1000]{.99} = 0.99998995$$

failure rate $= \frac{1 - 0.99998995}{2} = 6.0 \times 10^{-6}$
 $\Rightarrow \pm 4.42\sigma$

More likely for discrete cellular lattice assembly would be volumes on the order of 10^6 or more parts, thus requiring the industry standard 6σ distribution analysis in order to get close to reliable interface mating.

4.1.2 Total Error Budget Analysis

The homogeneous transformation matrix (HTM) can be used to evaluate the amplifying effect of the relative translations and rotations expressed through each link of the



Figure 4-2: Coordinate frames of primary links, and their offsets for the custom built gantry-type assembler. O_r is the the robot origin, O_l is the incremental local lattice origin (target location), O_e is end-effector origin.

structure [13] ¹. Each part, or subsystem has some nominal dimension, and with it some deviation from that nominal. The more parts that interface, generally the larger the potential for error stack. Additionally, the longer the lengths between interfaces the more angular discrepancies can be amplified: this is known as Abbe Error. Figure 4-2 shows a representation of the primary links on one half of a gantry-type relative robotic assembler ² - the coordinate frames also mirror across the *xz*-plane. This robot sits on a lattice as seen in figure 6-14 that would itself have coordinate transformations between the target lattice origin O_l , through each element of the lattice, and too the origins of each individual foot. A thorough analysis, as one can imagine, becomes tedious. However, individual link analysis is not tedious and if tracked step by step can easily be integrated into a total system analysis through the following method:

¹This same method is applied to robotic kinematics to relate end-effector position to local and global coordinate frames [21].

 $^{^{2}}$ Referred to as Batmen. The name comes from a combination of the names of the machine designer Matt Carney, and the lattice element designer Ben Jenett.

A system has a global coordinate frame from which workpiece, and end-effector reference (in the case of the relative robot, this coordinate frame changes with each new target location, but can be considered incrementally-global). Each link has an origin defined with respect to the origin of the previous link by the HTM:

$$\begin{bmatrix} X_{R} \\ Y_{R} \\ Z_{R} \\ 1 \end{bmatrix} = {}^{R} T_{N} \begin{bmatrix} X_{N} \\ Y_{N} \\ Z_{N} \\ 1 \end{bmatrix}$$

$$RT_{n} = \begin{bmatrix} O_{ix} & O_{iy} & O_{iz} & P_{x} \\ O_{jx} & O_{jy} & O_{jz} & P_{y} \\ O_{jx} & O_{jy} & O_{jz} & P_{y} \\ O_{kx} & O_{ky} & O_{kz} & P_{z} \\ 0 & 0 & 0 & P_{s} \end{bmatrix}$$

$$(4.4)$$

The upper left quadrant defines angular orientation. The upper right column performs translations, while the P_s is a scaling factor (usually left as 1). The zeros are for the convenience of square matrix multiplication. The superscript and subscript on the T are the reference and current origin specifiers.

$$E_{n} = \begin{bmatrix} \epsilon i x & \epsilon i y & \epsilon i z & \delta x \\ \epsilon j x & \epsilon j y & \epsilon j z & \delta_{y} \\ \epsilon k x & \epsilon k y & \epsilon k z & \delta_{z} \\ 0 & 0 & 0 & 1 \end{bmatrix}$$
(4.6)

The error transformation matrix is of the same form but with respect to deviations, and is added to each respective HTM. Such that, the total error at the end link with respect to the reference coordinate frame is the product of the sequence of all links and their errors. To size the geometry of the joint the amplified error at the reference position can be assessed by subtracting the total error from the total transformation.

$${}^{R}T_{nerr} = {}^{R}T_{n} + E_{n} \tag{4.7}$$

$${}^{R}T_{Nerr} = \prod_{m=1}^{N} {}^{m-1}T_{merr} = {}^{0}T_{1err} {}^{1}T_{2err} {}^{2}T_{3err} \cdots$$
(4.8)

Referring back to §4.1.1 we see that every component has some deviation, and from

this section it is clear every component contributes to the overall uncertainty of the system; the longer the structural loop, and the more discrete components that lie within that loop, the more uncertainty is developed. This leads to some design considerations: the first being that the design of the assembler should minimize the structural loop between the target lattice location, and the end effector, second, this loop should be designed such that structural deviations minimally affect end-effector location with respect to target position, third the design of the discrete lattice element interfaces must accommodate positional error.

4.1.3 Elastic Averaging

One takeaway from §4.1.2 is that not only do the discrete subcomponents of the structural loop contribute to error at the end-effector, the discrete elements of the lattice similarly contribute to a local incremental error stack between the lattice target origin and the locomotion system which reflects to the robot reference frame. So a question arises, in a cellular material with many numbers of discrete parts assembled together how can an ever accumulating local error provide global accuracy?

Elastic averaging is a concept that exploits the large number of discrete interfaces to statistically smooth their accumulated structure into a globally precise interface:

The principle of *elastic averaging* states that to accurately locate two surfaces and support a large load, there should be a very large number of contact points spread out over a broad region...However, this type of mechanism causes the system to be over constrained; on the other hand, if an elastically averaged system is properly designed, fabricated, and preloaded, the average contact stress will be low, high points will wear themselves in with use, and errors will be averaged out by elastic deformation. The system itself will then have a very high load capacity and stiffness. For a worn-in elastically averaged system, the repeatability is on the order of the accuracy of the manufacturing process used to make the parts divided by the square root of the number of contact points [eqtn. 4.9]. Still, because of the large number of contact points, the chance of dirt contaminating the interface increases. (pg353) [13]

$$\delta_{ea} = \frac{\delta_m}{\sqrt{N_p}} \tag{4.9}$$

where, δ_{ea} is elastically averaged error, δ_m is manufactured error at the part, and N_p is the number of parts in contact.

An interface can be made much more accurate and stiffer than its individual constituent features by forcing the features into a condition of over constraint, where the individual features are made to bend into complimentary positions. The manufacturing tolerances of the components will produce a set of features with some mean dimension, characterized by standard deviations. Elastic averaging assumes that with enough applied force the features over constrain one another, causing bending, and this interference of features, despite their deviations, accumulate to a dimensionally stable point at the average of the dimensional distribution.

As described in §3.1.1, over constraint generates internal stress as its members strain into a position that satisfies the additional kinematic constraints. This internal stress increases the effective stiffness of the interface by pre-loading the beams such that they ultimately are near the end of their maximum extension, and hence maximum reaction force induced by these strains. This load can be determined at a first order approximation by applying Hooke's law, equation 3.3, and recognizing that springs in parallel are simply summed:

$$F_{interface} = \sum_{i=1}^{N} k_i \delta_i \tag{4.10}$$

where, δ_i is deflection at individual nodes, friction is ignored. Without this applied load not all features may be forced to bend into an average orientation.

With respect to lattices, one consideration is the contribution of elastic averaging the interface of boundary lattices to a skin structure. Precision comes from overconstrained nodes, inducing bending in the struts. This initial bend may nucleate a buckling mode in the strut structure. It is possible the angle generated by bending forms the buckling mode and reduces the stiffness of this strut from the axial domain to the bending stiffness domain.

Elastic averaging is global averaging, rather than local. What that means is the cellular material can be assumed to average error on a global scale. However, individual nodal locations still vary from node to node based on local manufacturing tolerance errors, δ_i .

When it comes to local positioning versus global positioning it is necessary to recognize that for the relative motion system to take advantage of elastic averaging its positioning and locomotion system must itself scale across N_p parts. For a magnitude increase in averaged accuracy it would require a span across 100 parts. So, a robot must scale its locomotion system to engage with 100 parts in order for its global position to have an order of magnitude greater precision than the individual components. Perhaps a full magnitude accuracy improvement is not necessary. Even an error reduction in half is potentially possible with four points of contact.

4.2 Dynamic Error and Rate Limits

Dynamic errors are often traceable and characterizable once the machine is built, but they are the most difficult to predict and compensate for during the design phase. In general, making the machine rigid, well damped, and lightweight helps to make it easier for the machine to achieve high-speed operation. [13]

There are two primary metrics to consider when discussing the scaling of assembly rates for discrete cellular lattice assembly: allowable positional error and power require*ments.* Ultimately this is all about the natural frequency of the mechanics and controls of the assembly system: locomotion and part placement, as well the lattice itself. The stiffness and moving mass of the actuators affect the natural resonances of the system. The rate at which these systems move define their power requirements. Or, said another way, the rate at which these systems can be moved is dependent on operating frequencies sufficiently far away from mechanical natural frequencies (to avoid resonant instabilities), within controllable frequency ranges, and limited by allowable error, and power requirements. Control systems are limited by computational, and communications capacity and have general rate limits. Further, as the lattice changes during the assembly/disassembly process its own rigidity, and mass change, thereby affecting dynamics of the system as a whole. It is beyond the scope of this paper to define in detail all these dependencies as system topology is still very much in development. While these are necessary areas for future research, much of the design space can be inferred through analysis of relational trends.

As noted in §4.2 There are two methods we will examine. One is proposed by Alex Slocum in [13] to identify necessary actuator stiffness based on limits to digital control, and power to move. In order to quantify the stiffness and power requirements of an actuator Slocum suggests first order approximations based on mass, travel distance and time requirements. The second will be a comparison that helps quali-quantitatively evaluate how the allowable error affects requirements of stiffness, power, and operating frequency.

4.2.1 Servo Loop Time and Stiffness

Slocum suggests evaluating actuator stiffness beginning with the natural frequency of the mechanical system, and evaluating how the force imparted by the control system causes deflection which then determines overall allowable system operating frequency.

First, estimate the *mechanical time constant* from the natural frequency of the endeffector.

$$\tau_{mech} = 2\pi \sqrt{\frac{M}{K}} \tag{4.11}$$

$$\tau_{servo} \le \frac{\tau_{mech}}{2} \tag{4.12}$$

(4.13)

where, τ_{servo} must be at least two times faster than the mechanical natural frequency, τ_{mech} , such that sample aliasing does not occur.

Next, evaluate the *incremental error* due to force input from the servo. The servo is able to apply a force/torque to the actuator at a resolution dependent on its own digital resolution. Due to noise in a system, one or two bits of resolution are generally unusable. Even for a 16bit processor, there may be only 14 bits of usable control information. The amount of force that is to be generated is discretized by the total increments of control, and evaluated to find how incremental force effects system error due to the actuator stiffness.

$$\Delta F = \frac{F_{max}}{2^N \sqrt{\frac{\tau_{mech}}{2\tau_{servo}}}} \tag{4.14}$$

$$\delta_K = \frac{\Delta F}{K} \tag{4.15}$$

$$\delta_M = \frac{1}{2} \left(\frac{\Delta_F}{M} \right) \tau_{servo}^2 \tag{4.16}$$

where, δ_K is the incremental error due to incremental force applied to the actuator, and δ_M is error due to mechanical acceleration. These two values generally should be equivalent and be designed to be allowed to only be half that due to the servo.

The *maximum servo-loop time* can alternatively be defined by the above equations, as is the *minimum allowable actuator stiffness*:

$$\tau_{servo} = \sqrt{\frac{2\delta_M M}{\Delta_F}} \tag{4.17}$$

$$K \ge \frac{F_{max}\delta_M^{\frac{1}{4}}}{2^{N-\frac{1}{4}}\pi^{\frac{1}{2}}\delta_K^{\frac{5}{4}}}$$
(4.18)

Figure 4-3 shows how a decreasing actuator stiffness results logarithmically with a larger positional error. This is to be expected, the less stiff the actuator the more vibration will occur at the end effector. As stiffness decreases, error increases, and cycle time also increases. Again, due to low stiffness the natural frequency of the actuator structure is lower, as such, it requires operating the controls at again a lower cycle rate.



Figure 4-3: Allowable error dependencies for servo-loop time and actuator stiffness. Based on equations provided by Slocum [13]

4.2.2 Allowable Error and Frequency

The goal of this analysis is to tie the stiffness, and speed of the assembly system to the design of the discrete cellular lattice interfaces. The assumption is that this single degree of freedom actuator is placing a part into the lattice (figure 4-4); it could as well be

placing a foot into position on the lattice, or merely be a model of a link within a serial stack of actuators. The frequency at which a part can be placed is designated, ultimately, by the design of the interface between the lattices. The more precise the positioning and alignment of the interface requires to secure a consistent and robust interlock, the less vibrational error can be tolerated at the end effector. The design of the interface must account for the static error that stacks up through the system in addition to the dynamic error that is contributed by the mechanical and control system vibrations.

To operate at high frequency the system must be sufficiently stiff such that the structure remain in phase with the demands of the controller. This means an order of magnitude difference in operating and natural frequencies. To reduce the error the system must be sufficiently damped such that oscillation energy may be drained and command positions can be rapidly settled upon. Mass must be minimized as well to reduce the stiffness requirements from the oscillating inertia. Stiffness, mass, and damping are, though, related.



Figure 4-4: (a) Transverse loading of actuator beam; (b) axial loading of actuator beam; (c) simple mass, spring, damper model.

The simplified model evaluated is a mass on the end of a round cross-sectional cantilever beam. This system is modeled as a simple second order mass, spring, damper, system. The stiffness of the beam is the spring. The damping ratio is assumed to be mildly underdamped to demonstrate the error conditions³ The orientation of the loading of the beam has significant implications, that being the order of magnitude difference in beam stiffness as described in 3.1.3; bending is an order of magnitude less stiff than axial loading. Figure 4-5 shows how the same beam loaded transversely and axially behaves

³Relying purely on material damping leads to severely underdamped conditions. A metal such as aluminum has a longitudinal loss factor of 0.3×10^{-5} , and flexural loss factor 10^{-4} , additionally, internal structure of metal due to processing affect its loss factor, such that it cannot be considered constant [60]. In reality viscous damping, coulomb friction and bolted connections would provide additional damping.

with varying damping ratios.

The following analysis focuses on how allowable error affects the settling time behavior of the second order system. The dotted lines on figure 4-5 demonstrate an allowable error bounding a target position. By specifying an allowable error, i.e. based on an acceptable tolerance range for an interface, a settling time can be determined from the system characteristics. This settling time can be evaluated from the time domain response of the system. The maximum cycle rate of the system can then be estimated under the assumption that the system must settle into position, then some dwell time is required to apply an activation energy to secure the part into the lattice, the actuator retracts and settles into reload position, and a new part is reloaded 4-6

$$\frac{d^2x}{dt^2} + \frac{c}{m}\frac{dx}{dt} + \frac{k}{m}(x+\delta) \qquad \qquad = \frac{f(t)}{m} \tag{4.19}$$

Applying the Laplace transform to put this into a generalized transfer function form identifies the defining natural frequency, and damping coefficients:

$$G(s) = \frac{\omega_n^2}{s^2 + 2\zeta\omega_n s + \omega_n} \tag{4.20}$$

$$\omega_n = \sqrt{\frac{k}{m}} \tag{4.21}$$

$$\zeta = \frac{c}{2m\omega_n} \tag{4.22}$$

Applying a step input, and working back through the time domain we can solve for the settling time [61]: the time taken for the oscillatory behavior of the system to lose enough energy to be bounded by a specified error bounds, δ , around the steady-state target value.

$$t_s = \frac{-1}{\omega_n \zeta} \ln \frac{\delta}{u} \tag{4.23}$$

$$\frac{dt_s}{d\delta} = \frac{-\delta}{\omega_n \zeta} = \frac{-2\delta m}{c} \tag{4.24}$$

where, u is the steady state step input value [62]. From this equation 4.23 and figure & 4-6 we can see how a decrease in δ results in a longer settling time, a decreased cycle frequency. Minimizing t_s with respect to δ is inversely proportional with natural frequency, or substituting 4.21 and 4.22 we see that there is a direct relationship to mass.

Figure 4-6 also lays out a timing schedule for a pick and place operation. In this situation it is assumed that the actuator moves the end effector into position. Once settled into position, after a period t_s a dwell time allows for an activation energy to be applied to lattice interface, presumably necessary to fixture the part into the lattice, t_a . This is followed by a command to return to reload position, assumed another t_s and then a reload dwell is initiated, t_d , before restarting the cycle.

These timings were included in the evaluation of the design space, where each of the attach and reload timings were considered $\frac{1}{10}$ the settling time - with the assumption much lower inertia components would be involved in these steps. This settling time equation was used as a design space exploration. Figure 4-7 provides a look at the relationships of each of the dependencies of equation 4.23 through visualization. Apparent from the figure 4-7 is that frequency response benefits from low mass, high stiffness, and larger allowable error.



Figure 4-5: Comparison frequency response of axially and transversely loaded beams. Transversely loaded beam bends with a much lower stiffness than an axial load. Natural frequency of bending was 408 Hz, and axial was 12225 Hz for the given arbitrary condition of a 10mm radius, 20cm length aluminum rod.



Figure 4-6: Frequency response of an underdamped system. Timings are for the following conditions: t_s settling time, t_a part attachment, t_d , part reload.



Figure 4-7: Design space exploration of system characteristics affect on operating frequency, dependent on error.

4.2.3 Power

The power required to move the actuator through a desired trajectory depends on the necessary velocity profile. The trapezoidal velocity profile is commonly implemented as a balance between smooth slew, complexity, power, and speed; to move between two linear points the actuator is accelerated to a specified velocity, driven at said velocity, and then decelerated in time to reach the target position. However, in the case of discrete cellular lattice assembly there are many lattice voxels to fill. To understand how assembly might scale it is helpful to look at maximum speed trajectories. The triangular velocity profile, figure 4-8 is then a convenient model to evaluate, as it is defined by maximum acceleration

for as long as possible (halfway), followed by maximum deceleration:

x = distance to travel	[m]
a = acceleration	$\left[\frac{m}{s^2}\right]$
t = time	[s]
D = duty cycle	

$$F_{rms} = 4m \left(\frac{x}{t^2}\right) \sqrt{D} \qquad [N] \qquad (4.25)$$

$$V_{rms} = \frac{2x}{t} \qquad \qquad \left\lfloor \frac{m}{s} \right\rfloor \tag{4.26}$$

$$P_{avg} = F_{rms} V_{rms} = \frac{8mx^2}{t^3} \sqrt{D} \qquad [W] \qquad (4.27)$$

Figure 4-8 shows the cubic relationship relationship between cycle time and the linear relationship of moving mass to power consumption.



Figure 4-8: (a)Power requirement dependencies for high frequency assembly; (b) triangular velocity profile.

4.2.4 Control System

The control strategy of the assembler includes a high-level path planner (off-board the assembler), mid-level control (embedded host or agent controller system), and low-level control (actuator level control). High-level control is generally performed offboard, where processing frequency requirements are not limited by embedded system requirements. The high-level control and path planning is in development by other researchers at The Center for Bits and Atoms, and will incorporate design tools along with path planning.

The mid-level, and low-level controllers live on-board the assembler. The agent is a statemachine; it receives commands from the path planner, references its current configuration, then commands actuators to step through the necessary prescribed motions to traverse, place, or remove parts across the lattice.

Where desktop CNC machines operate with stepper motors, the assembly robots being mobile systems, require high energy density actuators. Reduction in mass reduces vibration, and power requirements. Direct current motors (DC, BLDC)can provide this energy density. Torque, and velocity control are also possible with DC motors, where steppers are limited by their switching frequency and step size.

Control system bandwidth requirements depend on motor characteristics, sensor sampling frequency, control loop, position loop, filtering, and system topology. A general rule is to operate each control loop at an order of magnitude increasing frequency from output back to input. That is, if a positional output of 10Hz is required, then the position control should run at 100Hz, the velocity control at 500Hz, the current/torque control at 1000Hz, processing at 10kHz, sampling at 200kHz to allow for 1/2 filtering lag. Additionally, due to motor topology of motors there are additional limits based on phase frequency and inductance due to pole count and current rush limits and back EMF. While these numbers do not sound difficult to achieve these numbers can actually become limited due to filtering and when full duplex communications are necessary between a hierarchical control scheme: "Typical bandwidth numbers for position loops are in the 1-20Hz range, while current loops run in the 100-1,000Hz range. High performance systems can reach as high as 100Hz for the position loop and 5,000Hz for the current loop" [63].

Control architectures designed around high performance motor control make use of modern processor architectures that do not rely on interrupt based sampling, and instead have dedicated hardware modules. 32-bit embedded processors such as the PSOC 5 from Cypress Semiconductor [64], the LPC1768 from NXP Semiconductor [65], and the Piccolo from Texas Instruments [66] all provide dedicated hardware modules for high frequency sampling of motion control systems. Texas Instruments provides a great deal of proprietary motor control software to enhance tuning of motor level control profiles. PSOC provides a proprietary graphical user interface to integrate custom FPGA-like re-programmable universal data blocks. The LPC1768 can be programmed with the arduino-like *mbed* interface, making it a lightweight prototyping platform.

Chapter 5

Comparable High-rate Machines

5.1 Qualitative Timing Analysis

Quantification of the effectiveness of the assembly of digital materials is dependent upon the two most fundamental, and high rate of occurrence serial assembly procedures: part placement, and lattice locomotion. But, what sets the maximum rates for each of these operations? Comparison to high-speed pick and place machines, or other comparable magazine driven machines can be made. The ready-fire-aim approach looks at comparable machines, and mechanisms.

The One-bit-bot (figure 5-1)demonstrates the concepts of discrete relative robotics: a part is retrieved from a magazine of components (material handling), the part is moved into position (end effector), and placed amongst the lattice structure. The legs then move (locomotion) to their next position, moving the entire system chassis to the next cell. Each element of the structure is placed, one element at a time. The motion of the end-effector as it grabs a new part, and moves to place it must stabilize or settle within dimensional tolerance range of the joints before attachment. Similarly, during locomotion, placement of feet initiate a reaction from the lattice as a force is applied. Reaction forces from the motion systems induce deflection in structures. There are forced vibrations of the continuously assembling assembler, and free vibrations that must be damped at the end effector and at the lattice attachment point. Vibrational modes near natural frequencies and potentially over strained systems.

Deflections due to vibration of both the end-effector and the lattice must stabilize

within an acceptable range before the next element may be placed. Operating the machine components in vibrational regimes far away from resonant frequencies keeps vibrational deflections low. The acceptable range is defined by the uncertainty allowed by the design of the interface between the parts. This can be addressed by either adjusting the interface geometries of the parts and feet such that they tolerate larger dimensional uncertainty, or waiting for the vibrational motion to stabilize. Tighter tolerances of the machine structure generally result in a more massive system. More mass can increase stiffness, and increase inertial damping, both good for stabilization, but also require larger forces for motion, power for assembly, and reaction loads to the locomotion system. Large forces require the structure to also exhibit greater stiffness. Damping can be utilized, either actively through controls, or passively through material selection to reduce vibration. For a given rate of assembly there is an overall system stiffness, damping ratio, and acceptable error at the end effector and lattice interface that ultimately define the maximum assembly rates for a given lattice design.



Figure 5-1: One-Bit Bot, the first interpretation of a relative robotic assembler.

In order to evaluate what the timing limits of an assembler might be, a rough timing evaluation was made of the one-bit-bot assembler strategy. Each operation was assigned a cost of time. The system was not, yet, fully modeled so true inertial values were not available. Instead, comparisons were made to other machines that perform similar types of motions and time costs were evaluated based on assumptions of relative mass

Table 5.1 outlines actions that contribute to the overall time cost of assembling a

Characteristic	Symbol	Typ. Value	Unit			
Element Part Placement						
Retrieve element from magazine	t_{em}	100	ms			
Move element to position	t_{ep}	200	ms			
Insert part into lattice	t_{ei}	100	ms			
Fasten element	t_{ef}	100	ms			
Return to reload next from magazine	t_{er}	200	ms			
Total Time per part	T_{et}	700	ms			
Lattice Locomotion - Foot						
Unclasping foot mechanism	t_{fu}	100	ms			
Raise foot assembly	t_{fr}	150	ms			
Move foot	t_{fm}	300	ms			
Clasp foot mechanism	t_{fc}	100	ms			
Total time to move foot	T_{ft}	800	ms			
Lattice Locomotion - Body						
Raise body	t_{br}	200	ms			
Move body	t_{bm}	400	ms			
Lower body	t_{bl}	200	ms			
Total time to move body one lattice	T_{bt}	800	ms			
Total time to build one lattice cell	T_{ft}	6800	ms			
Cell placing frequency	F_{ft}	0.15	Hz			

four sided lattice cell, based on the gantry-type one-bit bot. The typical values given are rough, and should be considered estimates until each of the systems described are realized, and evaluated.

Table 5.1: Individual element placement timing estimates for six discrete elements placed to form a cubic cell.

The overall system assembly time cost were from the following:

$$T_e = t_{em} + t_{ep} + t_{ei} + t_{ef} + t_{er}$$
(5.1)

$$T_f = t_{fu} + t_{fr} + t_{fm} + t_{fl} + t_{fc} (5.2)$$

$$T_b = t_{br} + t_{bm} + t_{bl} \tag{5.3}$$

$$T_{cost} = n_e T_e + n_f T_f + T_b \tag{5.4}$$

where, n_e is the number of elements being placed per lattice, and n_f is the number of foot-elements required to make a full body step across a lattice period. The element number per lattice varies depending on the location of the current assembly with respect with already placed lattice cells, i.e., edge conditions, or bulk volume fill.

A test scenario of assembling 1000 100mm lattice cells was analyzed with the initial one-bit-bot timing values of table 5.1. The analysis assumed one row of four-sided assembly followed by three-sided assembly for the remaining cells. Additionally, the z-height change is assumed to cost a double penalty for double distance foot and body raises - however this only contributed an additional seven seconds to the overall build. Overall time to fill a cubic meter with 100mm lattice cubic-octahedral cells is estimated at about 170 minutes or 2.8 hours. Exploiting parallelization, six assemblers would accomplish the build in half an hour.

5.2 Comparison Machines

To qualify the quantified timing values given in table 5.1 a comparison between some similar types of high-speed machine operations were evaluated and shown in table 5.2. The comparative studies, shown in the table, are based on current state-of-the-art systems that perform punching or magazine driven motions.

The maximum machine driven mechanism identified was that of the highest speed, straight-stitch sewing machine, stitching at a rate of 83Hz or 12 milliseconds per cycle. The system is tightly controlled, precision machined, high speed components are soaked in oil and components do not mate, rather the mechanisms are in constant contact with shafts, cams and lifters, similar to an engine valve assembly. The internals of the sewing machine are precision machined and timing and positional accuracy are critical. The positioning of the needle of a sewing machine is similar to that of a nail-gun or a machine gun - the mating component does not have a fixed location to interface with, rather it punches its own mating interface into the specified target object - it is therefore only useful as a demonstration of mechanism speeds, rather than assembling speeds.

A timing belt has the requirement where a tooth must land in a specific location on a pulley. The maximum operating speed of a GT2 timing belt is 4500 rpm, with a 3000 hour expected operational lifetime. The belt locates itself circumferentially around a pulley, along grooves, with the help of some elasticity in the carrier to managed misalignment. Axial position is only constrained by flanges attached to the pulley which track the belt into alignment, but which also reduce efficiency; misalignment features require 15% of the width of the belt to be effective - a relatively costly size. Self aligning and compression locking biperiodic interface.

The most direct comparison to an assembly machine that was found was that of a



Figure 5-2: High-speed industrial sewing machine. Note the large crankshaft rotation driving the needle, cast-iron frame, and the amber cooling oil tube.



Figure 5-3: High speed bottling machinery. The KHS Innofill filling and capping machines are the fastest in the industry reaching up to 80,000 bottles per hour (22Hz). Residence time is increased by passing bottles around a large circumference. [14, 1]

bottling machine. Two separate components, with specific indexing requirements, move relative to one another, and then become conjoined by use of specified forces and trajectories - the world's fastest bottling machine operates at 20Hz. The caps are fed from hoppers while the bottles are moved along by a chain-like carrier that defines a distance constraint between bottles. The capping operation happens as bottles are picked up, locked into carriages, and transported around a large circumference. This enables a prolonged residence time in which the capping mechanism may feed, index, and apply necessary capping trajectories and forces while keeping the bottle in a tightly controlled position and orientation.

Machine	Speed of Operation		Time per	Frequency
			cycle (ms)	(Hz)
High-Speed Straight Stitch	5500	stiches/min	12	83
Sewing Machine				
Commerical High-Speed	1500	stiches/min	40	25
Straight Stitch Sewing Ma-				
chine				
Timing Belt (max speed)	4500	rpm	13	75
Nail gun	4	nails/second	250	4
Standard rpm Engine @ redline	6,000	rpm	160	6.3
(4 stroke, 4 cylinder)				
High rpm Engine @ redline (4	10,500	rpm	91	11
stroke, 8 cylinder)				
High rpm Motorcycle Engine @	18,000	rpm	53	19
redline (4 stroke, 4 cylinder)				
M16 Rifle, automatic fire	800	rounds/min	75	13
CNC Turret Press Punching	400	punches/min	150	7
Bottle Capping Machine[14]	80,000	bottles/hr	5	20
MIT Cheetah Robot[67]	2.3	m/s	220	4.5

Table 5.2: Timing comparison of machines with equivalent motions to assembler robots.

Assembly rates are dependent on both static and dynamic positional certainty, both of which are mass dependent. That is, positional certainty generally comes with structural stiffness, which is affected by mass and geometry. The relative mass of the above mentioned mechanism examples was plotted. The relative mass was defined as the machine mass compared to the end-effector mass. In the case of the sewing machine that is considered the overall machine mass compared to that of the needle, in an engine the mass of the valve is compared to the engine. Not all machine data was available. The sewing machine is not plotted due to its extreme case of a 20,000:1 mass ratio. Evident from figure 5-4 is an average relative mass ratio grouping of 1000:1 around an average placement frequency of 10hz.

It is necessary to regard that operating at redline is not feasible for longevity of any machine. High revolution per minute engines have been suggested as a comparable system due to the valve assembly mechanisms. Since an engine is a 4 stroke machine each valve is lifted 1/4 of the time during its cycle, further the fastest engine found was that in an Ariel Atom 500 which is an 8 cylinder engine so it is necessary to reduce cycle rates by 1/8 * 2 for an even firing order. This puts max frequency of valve rockers slapping against camshafts at about 11Hz. Valve springs start hitting their limits at these


Figure 5-4: Mass ratio of chassis frame to moving component of comparison machines.

speeds and start hopping on cams, throwing off timing, destroying cylinders. This may be considered the high limit of operation of a mechanically driven machine. It should be noted that an engine is soaked in oil for lubrication, all mating components are precision machined with tight control of their operating conditions, and systems weigh in at least 200lbs - mass necessary to resist forces and vibrations.

These estimates lend insight into the design focus. It is apparent that high speed part placement is critical. Low inertia mechanisms with energy conserving kinematics are necessary. Increased residence time, minimal structural loop enable tight control of position and orientation reducing static, and dynamic error. Additionally, local component storage with elements for a single construction cell should be integrated into the part placing design to reduce reload maneuvers, shifting reloads from a serial timing dependency to a parallel operation performed only during body moves rather than at each element placement.

Chapter 6

Implementation

The reader has now journeyed through a handful of chapters that introduce fundamental concepts crucial to the understanding of the design challenges of building relative robotic assemblers of discrete cellular lattices. In the following chapter I will explain how I applied that information directly to solving the problem of attempting to build a robot that robustly and rapidly assembles non-stochastic, discrete, periodic, cellular lattices. A number of mechanical design experiments were performed along the way to understand the limits to inter and intracellular joining techniques, and limitations. Lattice geometries were similarly explored, as node connectivity of course defines real estate available for load transmission and fastening. Both the interface and lattice then define trajectory requirements for an end-effector. Finally, a controlled experiment was performed to compare a global referenced versus a local referenced assembler. The results were evaluated against a system error budget and applied to inform new design directions. Simulations of new assemblers that implement learnings from the experiments and analysis were constructed and are promoted as future build directions.

6.1 Geometries: Elements and their Interfaces

The design of the interface between discrete cellular lattice elements is the single most critical element to the entire construction system. Struts simply bear axial load, but the joint must transfer load in compression, tension, shear, couple moments, while also providing alignment features that tolerate the stack up of error from both static and dynamic loading conditions contributed to by both the lattice, and the assembler (§4). In a preference towards structural rigidity the joints would be permanently fixed, and fused of the same material as the struts to allow a simple, continuous load path, with minimal stress concentrators. In preference toward rapid assembly rates the nodes would passively align themselves, at some distance, perhaps with an attraction field (magnets are used in self-assembly modular robotics), such that the parts could essentially be ballistically fired at high rate in the general direction of the lattice, and would non-stochastically self-assemble into their specified location, without error.

The reality is, the solution is a balance of each of the design requirements, founded in engineering first principles. The premise of the preceding chapters has been to layout the foundational concepts that constrain this design problem. As with many engineering problems the process is iterative. Each feature is interdependent with its neighbor. Until the robot is built it is not clear how much dimensional uncertainty due to static and dynamic errors will need to be managed by the joint. The kinematics of the robot, cannot be settled until a lattice is identified to be constructed with an element type that can be secured with a joint that satisfies the requirements of load transfer, error management, minimal post fastening requirements (pins, screws, etc.), and high packing density. Not all of these, though, must be solved simultaneously. In reality the primary dependency is identifying a node interface that can be placed with minimal precision, yet self-locates with enough positional certainty for the next element to be placed in its required adjacent position, transmits loads uniformly, and builds a specified lattice topology. The necessary trajectory profiles can then be determined, enabling the kinematic design of the assembler. From this, initial prototypes may be implemented, and from there necessary additional complexity can be added. Each of these primary constraints are based on the premises of minimal structural loop, minimal moving mass, maximum stiffness, and passive alignment. The design space can be narrowed rapidly once the fundamental dependencies are understood:

- A construction system of non-stochastic discrete cellular lattices assembly .
- Maximize the stiffness to density ratio of final material in the ultra-light stiffness regime.
- Maximize assembly rates.
- Assembled from discrete, reconfigurable parts.
- Minimize the packed to unpacked density ratio.
- Manufacture with scalable manufacturing processes.

In order to maximize the stiffness in the ultra-light regime a highly triangulated lattice was implemented [32]. The maximum stiffness to density comes from exactly constrained sub-structures so that there is no added mass from redundant, indeterminate supports. In order to maximize assembly rate elements need to passively orient into their final positions precisely, stiff, and constrained. Similarly, as the assembler translates across the structure it must itself passively align with the lattice, repeatably, and minimize high-frequency motions of inertial components while keeping degrees of freedom to a minimum.

6.1.1 Building Blocks

It was learned that the only rigid, regular, closed-cell polyhedra that fill space are the tetrahedron, and the octahedron. To maximize stiffness for an isotropic cellular material only rigid closed-cell polyhedra should be used to avoid multi-phase mixing of rigid (stretch-dominated), and non-rigid (bending-dominated) cells [35]. Alternative design configurations could be generated with multi-phase mixtures producing orthotropic or quasi-orthotropic properties that may have greater sparsity, and higher specific stiffness in particular loading directions. The takeaway though is that the load bearing structure is the tetrahedron and the octahedron, and thus should be the focus of examination.¹

Some questions arising around the order of operations of assembly inform decisions about minimum construction features: if a cell is to be placed adjacent to an already fixed cell, whose nodes retain the locational information; must their orientations be indexed? Should the lattice be discretized all the way down to the placement of individual nodes, and struts, or should there be some minimal functional element from which to construct? Figure 6-1 demonstrates a construction method utilizing only distance, and node elements. Two concepts become apparent: a large number of degrees of freedom are necessary to assemble even the simplest single structural element - the triangle, and it becomes unclear where the boundary exists between cells. This then scores poorly on the assembly kinematic scale, and requires a more optimal solution.

The structural component is defined as a closed cell, regular, rigid, polyhedra *voxel*. In the case of the octahedron there are twelve struts, eight faces, and six nodes. The struts, and nodes are the load bearing components. The elements can be assembled to form voxel cells, which are then placed into the lattice; or, the elements can be placed independently, sequentially, or simultaneously to form the polyhedron. I realized though,

¹This is an important realization as the inspiration for this research was initiated from the x-shape element of the cubic-octahedron specified by Cheung [17]. More specifically, the cuboct are vertex connected octahedra formed from an X-shape design (figure 6-11) that require the placement (and interweaving) of ten elements before managing to construct a single constrained structural element.



Figure 6-1: Distance, and angle constraint assembly process. Three degrees of freedom are necessary to form each closed triangular truss-face. Each truss face must then be circularly arrayed three times and mirrored about their base plane to form an octahedron; a large number of degrees of freedom are necessary to construct with individual strut elements.

that because the triangle is a minimal structure to constrain points in two-dimensional space, and that because I want to build the structural elements directly, and rapidly, then it must be that the optimal solution to those design constraints is prefabrication of structural triangles, and direct placement of them into cells. In this way the assembler may place the maximum amount of structure with minimum effort simultaneously, while retaining high packing density with a mostly planar discrete element.

The triangle can be combined into any number of geometric cell shapes which when repeatedly patterned, or tiled, form rigid or deformable lattice structures. A single, triangular, nearly planar part type assembles to form the four faces of a tetrahedron or the eight faces of an octahedron, or other triangulated geometries (figure 6-2). The repeated tiling of these geometries form lattice structures whose global stiffness properties are dependent on the relative orientation of the triangular enclosed volumes, and the connectivity of struts between the nodes of the triangles. In this manner rigid or deformable lattice structures may be constructed from a simple, yet, structural element. Then, it becomes the job of the vertex geometry to define what specific orientations are allowable. In this way, the triangle bears the load, while the interface at the node (vertex) embeds functional information directly into the structure.



Figure 6-2: Node-to-node connections possible with (a)vertex-connected and (b)faceconnected lattice topologies. In (b) an interface geometry attempts at passive kinematic alignment: intracellular interface is ball and cone, while intercellular are tapered faces; both rely on a shear pin for tensile load. (Dimensions are 100mm node-to-node in both frames.)

6.1.2 Interfaces



Figure 6-3: An alignment feature that has π polar periodic symmetry, allows more than a millimeter of deviation in all degrees of freedom and self-energizes in compression (grid size is 1cm). The broad face, and interlocking nature of the joint enable moment coupling across the interface.

The node defines the functionality of the lattice, but how are elements and cells fixed together, and, by what means? Directly building the structural blocks leads the analysis to consider two joint types: intracellular, and intercellular interfaces. A large variety of instantiations of kinematic alignment features, and combination intra/intercellular interfaces were designed and evaluated, primarily focused around node-to-node configurations². If bending conditions exist due to lattice geometry, the node must couple moments

²At first glance (fig. 3-8), a lattice topology of node-to-node connections appears non-optimal

about those free bending axes in addition to bearing axial loads. As explained in §3.1.1 two points of intersection are necessary between constraint lines of action to resist a moment, thus the nodes become more massive (increasing relative density) to allow for this geometry. To explain this further figure 6-4 shows a simplified geometric representation of joint stiffness: an axial constraint does not resist the applied moment due to a force P, placing a second constraint resists the moment and prevents rotating at the origin, but still allows bending of the beam, finally, placing a pivot at the location of applied load prevents bending, and assures its location to be at the pivot. This is the reason it is necessary to have a placed element be fully constrained during the assembly process. If it is not, then the location of its vertices may be bent away from their expected position, requiring additional means to assure positional accuracy of the interface locations when the net part is to be placed. To prevent this, it is helpful to find geometries or mechanisms that lend themselves to accurate, repeatable, and stiff orientation.



Figure 6-4: Joint constraints viewed as a lever: (a) free to rotate about the pivot; (b) applied moment is constrained, but the diving board at the applied force can bend; (c) the pivot located at the applied force resists bending due to the applied load, creating a stiffer structure.

Applying the concepts of §3.1.1, the equilateral, three-groove, and ball kinematic interface is the stiffest, most repeatable, precision alignment fixture that also tolerates substantial initial misalignment, and passively self-aligns (figure 6-5) [15]; it is an appropriate starting point and was the anchor in the interface design process. The face of the ball contacts the groove in only two points, generating two lines of constraint that intersect. The plane established by these contact force vectors intersect the planes established by each of the other two ball-groove configurations. Motion is only possible perpendicular to the lines of constraint, but the perpendicular bisectors from each ballgroove intersection also intersect at the intersection of the other two force contact planes, constraining motion along that perpendicular. These angle bisectors also intersect in the

stiffness-wise. This is a problem for high-rate assembly because with three degrees of rotational freedom left unconstrained there is a high level of uncertainty in the location in any one of the nodes. While this may hold true for boundary cells, it turns out cells placed within the bulk of the material can, in fact, be located against three nodes simultaneously - providing the necessary kinematic constraints to provide stiffness and positional certainty (figure 6-2).



Figure 6-5: On the left is a standard issue three-groove kinematic coupling [15]."For good stability in a three-groove kinematic coupling, the normals to the planes containing the contact force vectors should bisect the angles between the balls."[16]

centroid at the coupling centroid. The virtual center point established at the coupling moments that are external to the frame actually provide a rigid moment arm that is larger than the frame, anchored at each virtual center point. Thus, this equilateral structure is isometrically stiff [16].³

The concepts of separated constraint line intersection turn out to apply to not only nodal interface design, but also help to define how lattice topology affects stiffness. Kinematic constraint was utilized, or inspired a number of design studies, some shown below. It was found that it was also pivotal to the development of one lattice topology in particular, helping to define not only its lattice stability, and interface design (§6.2.1), but also was implemented by the trajectory requirements of the automated assembler that was simulated (6.3.6).



Figure 6-6: (a) flat elements (PF1) with alignment features; (b) interlocking joint with additional complexity (OH5).

³This behavior is also seen in angular contact bearings, which when arranged in duplex demonstrate high stiffness to moment loads due to the high contact angle (often 20-45 degrees) projecting virtual coupling moments external the their own frame.

6.2 Geometries: Lattice Topologies

Overall structural performance is highly dependent on the geometry of the lattice; scalability is dependent on affinity for robust attachment between individual elements; assembly is dependent on the three R's: repeatable, robust, and rapid. Simplicity is a primary design anchor as it relates directly to packing density as well as manufacturability; it favors parts from flat-stock that readily stack like the stock from which they are formed. Yet, repeatable rapid assembly tends to favor greater feature complexity at the node to manage misalignment. Each tiling geometry has specific, discrete, sets of orientation, that define the level of constraint of assembled, and partially assembled cells, along with the kinematic trajectory requirements for placement of the individual elements. Under constrained elements have indeterminate free nodal locations, introducing significant uncertainty to the assembly process. As seen in §4.2.2 error bounds cycle rates; constraint directly affects the rapidity of assembly. Coordination number also drives nodal complexity, with increasing connectivity demanding increasingly more physical real-estate at the node, decreasing mass efficiency of the architecture.

Below is a sampling of some lattice geometries that were evaluated, followed by a more in depth description of the lattice interface development, and how the principles were applied.

6.2.1 Face Connected Octahedra

The face connected octahedra lattice has a coordination number of Z=6, it is an exactly constrained topology. The even number of edges of an octahedron enable it to be formed from just four regular triangular faces. The edges are the load bearing members of the octahedron. So an equilateral triangular component can be created by extruding members centered along the ideal edges of the triangle. Rather than building separate edge elements, three edges, and respective nodes can be produced simultaneously. This triangular element type allows the formation of the twelve edges of an octahedron with only three or four elements, depending on the desired configuration. Both configurations mirror triangular elements across their vertices forming octahedra from the edges of four faces. The faces themselves may be defined as open or closed. Figure 6-2 shows these two different lattice topologies, each constructed from four, or three face elements. One configuration of four triangular bits allows vertex connected octahedra - the cubic octahedron. Another configuration exists of three elements mirrored across vertices,

arranged into a partially formed octahedron that is then stacked face-to-face with a neighboring octahedron. The edges from the shared face are shared to close the next octahedron.

This shared face arrangement, and column stacking of octahedra defines a bi-directional, cross-linked, triple helix column where each vertex is exactly constrained by six edges. This triple helix resembles the structure of collagen with high connectivity between the helices. The entire helix is formed from a single part type, or may also include an additional fastening element. Multiple levels of complexity may be formed into the part including using the central face as a location for additional functional components such as sensors or actuators.

As it turns out, connecting regular octahedra face-to-face intersect three nodes from each face, coordinating six non-collinear members to meet at each node. Each node thus satisfies the modified Maxwell Criteria and is exactly constrained. Further, because a face is shared and a $\frac{\pi}{6}$ periodic lag exists, it is possible to borrow a set of edges from the neighboring cell, producing octahedra with only three triangular elements, each representing one face, and three nodes. More importantly though is that by projecting the angle bisector normal to the mating face, a plane is formed whose normal at the intersection point is a contact force vector that intersects the similar, and adjacent contact force vector emanating from the other two corners of a shared triangular face. This means an equilateral coupling tetrahedron forms external to each similarly arranged triangular face, providing a stiff structure. Or, in other words, a triangular element can be designed such that each of its nodes are exactly constrained and the element kinematically aligns to its neighboring element.

The structure aligns well with the geometrical ideal with regards to stiffness, kinematics, as well as design for assembly. The nature of the interface is that a singly applied nesting force orthogonal to the primary plane of the element evenly nests into the boundary planes of its neighbors. A discrete interface was identified that again exploits the polar periodicity of the octa-stack, whereby the node of the next element to be placed loops around the previously placed nodes of two elements, locking into a fixed position. The geometry of the interface aligns load paths to near ideal virtual nodes such that load transmission across the joint closely retains the pin-joint assumption for stretchdominated behavior while maintaining a fully reversible interlock whose operation is orthogonal to the load path (figure ??). Tapered interfaces tolerate some misalignment, and passively orient themselves to a repeatable position. Finally, the nesting force vector



Figure 6-7: Kinematic constraints of the face connected octahedra lattice. (a) shows coupling triangles can form rigid coupling tetrahedra in 3d; (b) colored lines show the six lines of constraint at each node provided by the alternating faces of stacked octahedra.



Figure 6-8: Close-up view of node interface for the octa-stack configuration.

is also the single degree of freedom necessary to assemble the part into the structure.

Single vector assembly simplifies the machinery of the robot by limiting kinematic degrees of freedom, and potentially allows higher assembly rates by limiting unwarranted inertially induced vibrations. With a lattice topology and a joint interface identified that satisfy the primary design anchors the kinematics of an automated assembler that can satisfy the interface assembly requirements can be evaluated. Due to the periodic nature of this structure automation can be parallelized. A model of a potential robotic assembler, technically referred to as the octahedral turret version six (OT6), and colloquially as Leapfrog, is shown stepping through an assembly procedure in figure 6-22. Further description of the robot is explained in §6.3.6.



Figure 6-9: Octahedra (blue) tile vertically face-to-face, and edge-to-edge laterally, with dipyramidal tetrahedra (magenta) filling intermediate volumes, and which again tile with themselves on edge. Shown in rendering as well as discrete lattice.



Figure 6-10: Mechanical testing of octa-stack under position controlled loading. The middle image just before failure due to buckling. The right-most image is near total failure, half of the struts have already broken.

6.2.2 Vertex Connected Octahedra - Cuboct

The vertex connected octahedra lattice has a coordination number of Z=4. This claims it has two rotational degrees of freedom. When the vertex-connected octahera lattice topology is approached from both the Hashin-Shtrickman approach of multi-phase mixtures \$3.1.5, and the modified Maxwell criteria from Pellegrino \$3.1.2, they both suggest this lattice structure is not isotropically rigid, but instead should express bending dominated behavior in shear loading conditions. The easiest way to describe the HS mixture is that a mixture of rigid and bendable forms will perform as ratio of the relative mixture of those volumes. This structure has also been referred to as the cubic octahedron (cuboct), and it is that description that helps see the bending dominated nature. Figure 3-6 shows the two different closed-cell polyhedra contributions to the structure. The blue are the rigid octahedra, the magenta is the cuboct. The cuboct is clearly non-rigid by Maxwell's criteria, loads applied to any face cause the polyhedra to act as a mechanism and compress. Looking at figure 3-4 shows the top half of a cuboct structure, and again, shows how there is mobility in the structure.

Yet, despite these three strong arguments for the cuboct to be bending dominated in shear, I propose there is actually a condition where the structure is rigid in shear. In a condition where top and bottom interfaces are cemented into a plane, and shear is applied, the structure is again stiff. This can possibly be understood by two means: one by Deshpande et al. explanation of boundary conditions as part of the multi-phase mixture [35], and second by principal stress analysis. Normally, I would expect a shear load to cause a four-bar linkage type of mechanism to be expressed; alternating expanding, and contracting distances between nodes. By constraining the upper and lower boundaries, however, such that the nodes cannot change their relational distance, and cannot move in the y-direction the end condition struts have then reduced their degrees of freedom. The applied shear load is then a pure shear load with zero x or y stress contributions. This can be seen in the following equations [44]:

$$\sigma_n = \frac{1}{2}(\sigma_x + \sigma_y) + \frac{1}{2}(\sigma_x - \sigma_y)\cos 2\theta + \tau_{xy}\sin 2\theta$$
(6.1)

$$\sigma_n = \tau_{xy} \tag{6.2}$$

where, σ_n is principal stress, σ_x, σ_y are x,y coordinates of stress, and τ_{xy} is shear in the xy plane. This shows that when a material is loaded in pure shear, the principal axis of stress is aligned along the pi/4 direction. In that case, the principal stress is then aligned directly along the struts, providing again, pure axial loading of the struts, thus, providing a stiff, and strong structure. So, in this loading condition, it may be that in fact, as it was shown this lattice topology is the lightest stiffest structure in the ultralight regime [17]. This conclusion remains funny in my mind as I can visualize how a direct forty-five strand should take all of the stress of shear, and yet the void phase is a pure mechanism. Perhaps the question still remains, is this loading condition something to be expected in the wild, or is it a convenience of numerical evaluation? This topic is perhaps worth further examination at a future date.

The element design described by Cheung was composed of x-shaped elements arranged in-plane and orthogonal to one another, the ends of the X meeting at the midpoint of

the orthogonal X. The assembly strategy relied on bending and weaving parts into place and a tight dimensional fit to restrict motion and finally fastened with an additional shear pin. A model of this is shown in figure 6-11 (a). I immediately discounted this assembly strategy for the following reasons: first weaving parts from multiple directions would require dexterity, tight tolerance fitting is difficult for robots, and finally the free ends introduce uncertainty for placement.

To manage the free end condition I investigated closed curve base elements such as the square, and the triangle, and how they could be made to incorporate alignment features, figure 6-11 (b), and (c) show these respectively. The square-element provides wide face-face interfaces to allow passive alignment from the orthogonal oriented corners, but requires a clip to tie together the embedded pins. The triangle shape of (c) was the beginning of exploration into constructing the octahedron directly with triangular faces, rather than laying out unneccesary periphery edges. Details of the interface are also visible in (a) from figure 6-6, tabs help with axial alignment and the joint is fastened by compression with a custom designed plug that is transparent in the image. Further investigations included triangular shapes with more complex passive alignment geometry and dual interfaces such as those in figures 6-2, 6-6.

As seen in those figures, the cell geometry does, as it turns out, lend itself to single axis assembly with the potential for kinematic alignment features. Progress in this direction had been detoured as at the time the face-connected, triple-helix configuration emerged as a promising direction that tied together many facets of the design requirements. The vertex connected structure may return for future research initiatives.



Figure 6-11: Cubic-octahedron, or vertex connected octahedra: (a) x-shape element design with shearpin; (b) square-element with clipped pins; (c) triangle-element with interlocking fingers.



Figure 6-12: Edge connected octahedra with kinematic constraints colored *(image credit: Ben Jenett)*

6.2.3 Edge Connected Octahedra

The edge connected octahedra has Z = 6, it is exactly constrained. This configuration allows the construction of voxels which when placed are always fully constrained. This is a viable construction topology and was used as the basis for the first full assembler system built, figure 6-14. The interface design relied on snap fit joints requiring 70N of applied force to sufficiently engage. The removal of the cells again required 70N force, or additional actuation to help open the snaps to allow disengagement (performed by grad students with tweezers).

6.2.4 Kelvin



Figure 6-13: Kelvin Lattice, standard discrete - left, and with reduced degrees of freedom, right. (node-to-node spacing is 100mm)

The Kelvin lattice has a coordination number Z = 3. There are four non-collinear struts entering into a node, two pairs each operating along the same plane. This leaves three rotational degrees of freedom. Some attempts have been made to increase the rigidity of the structure by introducing an additional strut to the element as seen in figure 6-13, making it a reinforced Kelvin lattice. However, the rotational degrees of freedom remain, regardless. The specific stiffness may be increased along the direction of the newly added strut, as the element is itself now stiff, however the rotational degrees of freedom cannot be constrained and as such the system operates in bending in all other modes than direct compression along this specific orientation.

From the point of view of assembly this structure receives low grades for its high level of mobility. The nodes do not naturally resist bending, so they either must be oversized to couple the moment, else the position of the free nodes of that element are indeterminate. For relative assembly the structure provides an even worse operating condition, because, even in complete, closed polyhedra form it expresses many degrees of freedom; essentially this structure acts as a trampoline for a locally referencing, relative robotic assembler.

6.3 Robots: Designs toward dB Scaling

The studies above lend insight into the design focus, and help shape a strategy to assure robust, rapid assembly of discrete cellular lattices. The periodic nature of the lattice provides a structured environment in which an assembler can to be tuned to operate. The level of discretization and topology of the lattice affect the kinematic requirements of the assembler. Based on what has already been learned it is apparent that part placement and locomotion require minimal dwell time. Low inertia mechanisms with energy conserving, and minimal vibration inducing kinematics are necessary. Local component storage can reduce reload maneuvers. Further, shifting reloads from a serial timing dependency to a parallel operation performed as part of body moves rather than as discrete events can potentially lead to time savings. Most importantly though, it has already been shown that joint interfaces which reduce assembly precision requirements enable higher speed operation by way of reduced dwell to wait for settling of dynamic errors. A successful discrete lattice assembler system integrates the design of the lattice with that of the assembler, sharing precision and parallel mechanism across lattice and machine.

While designs had already been developed informed by the constraint and tolerance studies, discussed in previous chapters, a controlled experiment was performed to demonstrate the need for these specific system integrations. The following outlines what I built, tested and sketches of what is planned to be built in order to reach super-hertz assembly rates for digital lattice materials.

6.3.1 Gantry-based



Figure 6-14: The gantry-based relative robotic assembler (designed and built in March 2015). Also shown with error budget coordinate transformations in figure 4-2.

To test the dependencies of discrete lattice assembly I built a custom, relative robotic assembler to test against an off-the-shelf, traditional, linear kinematic, gantry-type CNC machine (a Shopbot PRS Alpha). The question asked was: does an assembler that locally references a lattice, place with more or less precision than a globally referenced assembler? The experiment consisted of picking up an octahedron voxel from one location, and then placing it into a target position within an *edge-connected* octahedral lattice. The two machines had the same kinematic configuration consisting of linear actuators for x, y, and z axes. The dependent variable being that the custom built assembler system was mounted directly on the lattice by way of an incremental relative motion system which included leg, and foot actuators.

A custom gantry-type of robot (figure 6-14), similar to a traditional computer numerically controlled (CNC) router was built to evaluate a traditional manufacturing platform as a means of assembly. The control machine to evaluate against was a ShopBot PRS Alpha, a design that consists of a long x-axis with an overhead gantry y-axis, both driven by rack and pinion actuators. The traditional machine is considered a global coordinate frame system because all moves and actions are done with reference to a single reference frame established at some static position on the machine. The relative robot has been considered a local coordinate frame machine because it incrementally steps along the lattice, referencing its position from the local cells, and placing components relative to this non-static local coordinate frame. The custom assembler consisted of a similar structural loop as the traditional machine including a linear x-axis, and a linear overhead gantry, but also include additional x, and z axes for a locomotion system. In this way, the custom router became a robot able to take discrete steps across the lattice, and then, in an analog fashion, place a set of cells within its local work area.

The gantry system fabrication was performed primarily by myself, and included CNC machining, fused deposition manufacturing, lasers, wire-edm, and waterjet processes. The chassis was machined from aluminum billet on a 3-axis CNC machining center. The remaining aluminum components were machined on a 5-axis CNC mill or waterjet. The lattice elements and the end effector were constructed of laser-cut acetal. The feet (Ben Jenett) and the foot actuator mounts were FDM, and waterjet. The actuators make use of precision linear guideways for tracking. Three varieties of actuators were designed as separate test cases: belt drive, capstan drive, and rack-pinion. The rack tooth-profile were precision machined on a wire-EDM (with the help of Will Langford and Sam Calisch), and their chassis machined of delrin. The drive systems were stepper motors on the x, y and secondary y axes. The z-axis actuators were all driven by brushed dc gear-motors. The control system was implemented with an off-the-shelf TinyG stepper motor controller [68]. A hack was performed to allow the TinyG to communicate with the DC motor actuators (hacked by Sam Calish, Will Langford, Amanda Ghassaei). This is the complete system that I designed, and built with help from my fellow labmates. This system placed cells on a time scale on the order of 0.1Hz.

The experiment consisted of placing octahedral cells into an edge-connected lattice topology. The cells were preformed from laser cut delrin elements. The interface of the edge-connected octahedra cell type used in the gantry robot experiments (shown below the gantry assembler in figure 6-14 and 6-12 were designed to include an integrated flexural snap. The force required to engage the snap interface was 70N. The manufacturing tolerance of the laser used to manufacture the elemetns holds to about $0.003'' \approx 0.05mm$. The interface had a gap designed to utilize the kerf of the laser process of $0.004'' \approx 0.15mm$ for a total of 0.3mm allowable variation in parts placement.

Initial experiments were performed to compare the performance of the global reference frame system to the locally referencing relative robotic assembler. In this experiment cells were picked up from a hopper, and placed onto a static positioned lattice. The PRS Alpha claims a positional accuracy of ± 0.002 ". Evaluating the structural error loop, including a 1.5σ coefficient required a gap of 0.23mm. Including the positional accuracy of the machine brought the required interface gap of 0.279mm. A second experiment was performed with the relative robotic assembler of similar gantry-type design (figure 6-14). Following the protocol of the first test, the cells, preformed from flat, laser-cut elements, were stored locally, in a hopper type of fixture, on the machine. The assembler, this time though, was mounted directly onto the lattice. In both tests the end-effector was used to zero the machine origin to the target position. The task performed included picking up, and then placing cells into a target position on the lattice.

The first tests on the global reference system (ShopBot)were successful in placing parts. The tests performed with the relative robot did not successfully, repeatably place parts. An error budget analysis of the two systems lends insight to the difference in placement results. An example analysis of the total error budget of the custom relative robot, as described in §4.1.2, due to the structural loop in figure 4-2 of one serial path from the leading foot to a cell placement was evaluated. The calculation was performed with the assumption of no angular misalignment and manufacturing error on the order of 0.05mm per part - reasonable for machined components.⁴ In this case six coordinate frames⁵ were implemented with the homogeneous transformation matrix method of calculating the total error budget (§4.1.2) of the robot chassis side, and similarly included the contribution of the five lattices located between the target origin, and foot in question. The error from each structure, and lattice are below. An error of 0.25mm is contributed structurally, and a 0.15mm error is contributed from the lattice. Applying the 1.5σ from §4.1.1, this analysis leads to to a necessary joint clearance of $\pm 0.44mm$.

$$\begin{bmatrix} \delta_{sx} \\ \delta_{sy} \\ \delta_{sz} \\ 1 \end{bmatrix} = \begin{bmatrix} 0.25 \\ 0.25 \\ 0.25 \\ 1 \end{bmatrix}, \begin{bmatrix} \delta_{lx} \\ \delta_{ly} \\ \delta_{lz} \\ 1 \end{bmatrix} = \begin{bmatrix} 0.15 \\ 0.15 \\ 0.15 \\ 1 \end{bmatrix}$$
(6.3)

$$\sigma_{gap} = \sigma_s + \sigma_l = 0.4mm \tag{6.4}$$

where, σ_s is the structural error, and σ_l is the lattice error contribution. The individual cell interface was designed to accommodate up to 0.3mm of variation. The global reference system with a structural loop error stack of 0.28mm did manage to place parts. The local reference system with a structural loop error stack of 0.4mm did not manage to place parts. The global frame system has consistent control of its structural loop, while

⁴The reason for a milled aluminum chassis was exactly this point. In order to have a fair comparison between machines rigidity, and precision was desired, two properties currently difficult to achieve without machining.

⁵In reality, there are a great more number of component interfaces that would need to be accounted.

the local system must managed the error contribution of all of the discrete elements between its target position and its locomotion system. Further, the dynamics timing analysis shows that if an allowable settling error of 0.1mm is allowed, and an operational frequency matched to the MIT Cheetah robot is desired (4 Hz) then moving mass must be limited to a mere 0.005kg.⁶

An interesting note from the experiment is that it was immediately apparent that the error contribution from standing on the lattice was significant when it was attempted to zero the robot to the origin. It was not possible to establish a mutually agreed upon origin between the lattice and the chassis of the robot. If an origin was chosen on the lattice then retrieving a cell from the local hopper was not successful. If the origin was chosen to pickup the cell from the local hopper then there was not success with fully engaging the cell into the lattice snaps. The results of the experiment showed, that due to the increase in uncertainty from the dimensional variability accumulated from the lattice elements, a local assembler must actually be a locally global assembler - that is the lattice should not be part of the structural loop during assembly.



Figure 6-15: Maximum frequency of operation with an axially loaded aluminum beam as an end-effector.

⁶One might question, how does the MIT Cheetah reach such high speed operation with presumably greater mass? The answer is two fold: for one, there is great attention to reduction of mass and inertia of the moving components, the actuators are mounted in the body and light-weight linkage mechanisms are used to keep mass low, second, exact foot placement precision is not required, rather their concern is velocity profile and foot orientation during the stance phase of locomotion [67].

The takeaway from this experiment is that a traditional manufacturing kinematic assembly strategy is not adequate for automated relative lattice placement. If dynamic error were also included in the analysis, a wider gap would be necessary, minimizing the effectiveness of a snap interface. The design of the interface defines if successful assembly is even possible, and then what rates may be achieved. A relative robotic assembler requires a more integrated design approach, where kinematics, structural loop, and joint topology are iteratively designed together; primarily the assembly process must minimize the structural loop. The global assembler was more successful in the experiment because the tolerance stack-up through the structural loop only ever included its own, tightly controlled, and non-variable, hardware - it did not rely on the error contribution from a multitude of discrete cells in the lattice. In order for a robotic assembler that moves relative to the lattice to assemble locally, the assembler must minimize its structural loop; the assembler must place parts only relative to itself, without dependency on non-adjacent lattice elements. At each incremental step the assembler must consider that location its instantaneous origin, and place adjacent elements with reference to only this instantaneous coordinate frame. In this way, static dimensional uncertainty is reduced, allowing more room to manage the positional variability from dynamic conditions, thereby potential enabling faster assembly rates.

6.3.2 Mandrel-based

The mandrel-based assembler was a study in dimensional control during cell construction. Learning from the data in table 5.1, the performance of placing individual elements is speed-limited due to the need to retrieve and place individual components onto a notyet fully constrained lattice. This system utilizes the square-shape element to construct cuboct cells. A mandrel is a fixture that temporarily defines the location of components during subassembly procedures, which is then removed from the final part post processing. The system in figure 6-17 uses a mandrel to locally build a cell in the immediate vicinity of the material handling system, and then place the completed cell onto the lattice. This creates greater certainty, and stiffness during cell builds due to a short, and high rigidity structural loop allowing a more robust, and faster assembly strategy. Simple motion paths, and short traverse distances reduce vibrations while shortening cycle times. Tighter control at part placement also reduces the need for joint complexity, saving mass and cost. Locomotion, however, is a completely separate mechanism from part placement. It implements the elastic averaging strategy to gain precision from



Figure 6-16: Global positioning gantry-type assembler.

engagement with multiple cells, averaging their positions, and then placing only on the next adjacent cell. This system demonstrates some applied concepts, however, the cuboct lattice it generates in this depiction is bending-dominated, and therefore does not satisfy the maximum stiffness design criteria.

6.3.3 Dynamic Aperture

Rather than place fully discrete elements one by one, an active carrier based method of assembly is possible where the discrete elements have a distance constraint formed by a rigid intermediary component connected by pivots, composing the discrete elements into a chain that can be fed into location by the locomotion system 6-18. The belt of



Figure 6-17: A mandrel based assembler. A mandrel provides a fixture for elements to be placed onto before placement on the lattice assembly. Locomotion is then performed relative to the structure. Code-name: Koala (cubes are 100mm edge to edge)

elements are stored either on rails, or in the figure shown folded into local hoppers, and then they are fed into position by a rotary mandrel that creates a dynamic aperture. A rack and pinion type of arrangement of rollers feeds the elements into the lattice, while traversing along the lattice. The rigid elements pivot on their integrated carrier as they roll along the rollers, similar to a chain on a sprocket. In this way both locomotion, and part placement are integrated into the same mechanism.

The arrangement of adjacent rollers enables connecting the chains into volume enclosing structures. Where total reconfigurability is lost in this case, due to the need for specific lengths of carriers, speed of assembly is potentially gained. The rotary motion of the rollers, similar to the bottling machine in §4.2, increase residence time with a no-slip condition due to rolling (which just means the parts have no relative motion except for with the target interface) providing a rigid, minimal structural loop with increased time to fasten components without a reduction in linear velocity. The rotary motion also keeps vibration low by providing a parts feeding trajectory with continuous non-interrupted



Figure 6-18: A rack, and pinion drive system both traverse, and place parts incrementally and simultaneously. Parts are fed from a magazine, individual elements are connected together with distance constraint mechanism such as a chain or belt. Code-name: Knuckles



Figure 6-19: A design tool was written to make a custom gear profile to match the periodic structure of the column. This custom tooth profile can then be applied to the dynamic aperature assembler.

motions, essentially only the mass of the parts are making relative motions.

In an effort to build the rollers to truly match the part geometry a design tool was developed, to build a custom gear profile that directly match arbitrary periodic surfaces. Figure 6-19 shows some screen shots of the design tool operation ⁷. A round cylinder is carved away by a single period of the tri-helix column (a double-stacked octahedron) traced through an involute profile. By tuning the locomotion kinematics to the structure it is possible to minimize inertial costs, allowing lower vibration and higher speed operations.

6.3.4 Fully Passive



Figure 6-20: The geometry of the assembly mandrel passively aligns elements during placement. Code-name: Zipper

A fully passive system was found 6-20 that uses a distance constraint, such as a carrier, to time the zipping of elements into location. The geometry of the zipper provides the necessary trajectory to fixture the joints between the elements. One degree of freedom is necessary to traverse along the length of the column as parts are automatically fed, and fixed into position. The joint operates in an inverse arrangement to that of the Leapfrog. That is, the build direction is reversed and snap pins built into the structure provide joint fixture, rather than being looped into position from the following set of cells.

A passive assembler relies on the three dimensional geometry of an assembly head, or a mandrel, to define the path that the discrete element tracks along as it is placed or removed from the lattice (figure 6-20). The discrete element follows along the path

⁷The design tool runs in HTML5 in the browser, and utilizes the javascript library *Three.js*. http://dma.cba.mit.edu/mechanical/jsTools/rackPinion/index.html

formed into the assembly head. Elements are fixed in place by the placement of the following element. That is, the part is only fully constrained after the placement of following adjoining parts. The trajectory necessary to mate part interfaces is iteratively defined by the interface fixture geometry while it is itself, also, informed by the possible trajectory (figure 6-21). Control of the timing for placement is defined by a distance constraint between parts that are to be collinear in their placed configuration. The distance constraint may be established by a carrier, such as a belt, cable or chain. In this way the assembly system is similar to that of a zipper, where individual elements are constrained by their neighbors in one direction, by a carrier in the opposite direction and their assembly trajectory is defined by a physical track that the parts are pulled through. The kinematics of this assembly strategy are that of a three-dimensional zipper. A single degree of freedom is necessary to pull the zipper assembly head along the structure. This degree of freedom may be actuated by external systems, or even the mass and inertia of the motion of an initial seed assembly sequence, where gravity provides the constant pulling force that drives the elements through the assembly head. The discrete elements may be stored in a magazine, cartridge, reel or hopper type of system.



Figure 6-21: A passive mandrel type of assembly requires a distance constraint such as a belt or a chain between the components.

6.3.5 Hybrid Passive Dynamic

A likely candidate assembler design for building columns involves design features from both the Zipper, Knuckles, and Leapfrog; the zipper assembler trades the carrier distance constraint for a mechanical timing constraint. Discrete elements are timed, and fed into location by the rack and pinion, while the geometry of the zipper assures trajectory compliance. The rack and pinion also provide the single degree of freedom locomotion mechanism. In this way the discrete elements require no carrier. The track still provides the passive trajectory control while an active mechanism coordinates the dispersal of discrete elements from their storage location and along the track. The latching may be performed by tooth geometry, adhesion such as vacuum, magnetics, hook and loop, adhesive bond, etc. Upon attachment of element to lattice the latch disengages. This mechanism may also provide a locomotion system that traverses along the already formed structure, such that the zipper is capable of self locomotion along the lattice. This system provides a fully integrated, locomotion, material handling, and part placement strategy. The integration of multiple systems reduce the serialized mechanism requirement to just a couple of motions with potential timing characteristics outlined in table 6.1.

Characteristic	Symbol	Typ. Value	Unit
Element Part Placement			
Retrieve element from magazine	t_{em}	120	ms
Move element to position	t_{ep}	120	ms
Fasten element	t_{ef}	0	ms
Total Time per part	T_{et}	240	ms
Cell placing frequency	F_{ft}	4.2	Hz

Table 6.1: Timing estimates for both placing three elements of a cell, and simultaneously traversing to the next cell with a passive loading mandrel.

6.3.6 Tri-helix Locomotion Integrated

The tri-helix locomotion assembler, figure 6-22, integrates all of the concepts presented, and is the definition of an incremental global coordinate frame robotic assembler. The lattice structure this assembles is the face-connected tri-helix structure §6.2.1, which is itself the product of the pivotal design concepts presented in the preceding chapters: the elements kinematically align with themselves, establishing an exactly constrained, isotropically stiff by the tetrahedral intersection of its coupling moment bisectors, flatpacks and is manufacturable at scale. The structural loop of the system is reduced to its core elements. The end-effector is the part placement, parts feeder, locomotion system, and error correction mechanism. The end-effectors, or feet have features that provide kinematic alignment with the other foot mechanisms, therefore passively locating, and locking to each adjacent foot (each of which includes at least one or more repeating mechanisms that latch together as they step along the lattice). The overall structural loop for part placement, and locomotion is actually independent of the lattice structure, and instead contained within a single set of mechanisms on-board the robot. All operations happen internally, and in parallel rather than as separate external systems, and can be



Figure 6-22: A fully integrated locomotion, and placing system where both part placement, and traversal occur simultaneously. Code-name: Leapfrog

mechanically or electrically driven by a single prime-mover.

The process of assembly goes as follows. At each step a cell is built from three symmetrically spaced end-effectors (feet). Once a set of feet are located, either the new parts are fed from the storage magazine, and placed or an already placed part is locked-onto by the internal feed mechanisms, fixing the assembler to the structure, significantly reducing the total mechanical tolerance stack-up and increasing part placement certainty. The previously placed foot of the assembler that was also attached to the previous part, and the adjacent feet then release and swing up to take the next step. The assembler moves the foot through a trajectory to get to the next cell position. The necessary trajectory is dependent on lattice geometry, and part interface design. A design goal is to rely on a single prime mover, such as a single motor capable of driving the machine through the stepping process while a series of mechanical timing mechanisms (or electrically controlled) actuators drive the assembly, and locking chain of events.

The table 6.2 outlines design criteria specifications for placing components when subsystems are integrated together. Potential assembly rates of 1.5Hz may be possible with a system of this nature. Faster operation may be possible, but the mass of the magazine loaded with elements likely limits maximum acceptable assembly rates.

Characteristic	Symbol	Typ. Value	Unit
Element Part Placement			
Retrieve element from magazine	t_{em}	25	ms
Move element to position	t_{ep}	75	ms
Fasten element	t_{ef}	75	ms
Total Time per part	T_{et}	175	ms
Lattice Locomotion - Foot			
Unclasping foot mechanism	t_{fu}	100	ms
Raise foot assembly	t_{fr}	300	ms
Clasp foot mechanism	t_{fc}	100	ms
Total time to move foot	T_{ft}	500	ms
Total time to build one lattice cell	T_{ft}	675	ms
Cell placing frequency	F_{ft}	1.5	Hz

Table 6.2: Timing estimates for both placing three elements of a cell, and simultaneously traversing to the next cell.

This system is, in my mind, an accumulation of the knowledge so far developed in this field of relative robotic assemblers of non-stochastic discrete cellular lattices. It is a preferred direction of action going forward as it provides a data point for total integration between lattice topology, and robotic assembler. While it does suffer from a reciprocating, and rotating mass problem (as it currently swings a full magazine through its locomotion trajectory), it is symmetrically balanced around the tri-helix axis, mutually canceling induced vibrations. Development on this system is ongoing (figure 6-23), and currently has a single cell assembly stage prototype near completion. This single-stage system is designed to mount to a traditional robot arm (UR10 [69]) allowing the testing of magazine, parts feeding, alignment and locking mechanism without the added complexity of the locomotion system. In this way, individual components can be tried and switched out with minimal risk or complexity to the system integration.



Figure 6-23: A prototype of the robot arm mounted single-stage integrated octahedral turret assembler (a collaboration between Matt Carney and Sebastian Nowak).

Chapter 7

Conclusions: Future Directions

The integration of the design of the interface between discrete elements, and robotic assembler kinematics is of paramount concern to reaching high rates of assembly of robust structural systems. The overall performance of the system comes down to the joints; how much tolerance there is to misalignment scales assembly rates, and robustness of load passing scales structural efficiency. Complexity at the joint costs mass, and creates: obstacles for load paths, stress concentrations, and manufacturing complexity with reduced packing density. Yet, joint complexity also reduces assembler complexity, and cycle times by providing passive alignment features that reduce precision requirements. Additionally, the structural loop of the assembler robot, and any reciprocating mass must be minimized to reduce static, and dynamic uncertainty. The need for minimal uncertainty in the structural loop leads to the concept of an incremental, or, instantaneous global coordinate frame for relative assembler robots; the robot only ever places components with respect to its own coordinate frame. The lattice cannot be part of the structural loop, rather the robot attaches to the lattice, places a cell into its own alignment features, then disengages, and increments to the next cell, leaving in place the just installed cell.

My research found that a gantry based relative coordinate frame assembler performed more poorly than a similarly designed global frame system (§6.3.1). The reason is twofold: the relative gantry system must accommodate both its own long structural loop, and that of the lattice, and yet does not exploit elastic-averaging (§4.1.3). The edge-toedge octahedral lattice interface provided minimal passive alignment features requiring a total system precision of $\leq \pm 0.2mm$. The contribution to positional error from the lattice consumed half of that allowable error. The manufacture of the assembler being a combination of precision machined components, and imprecise fused deposition manufactured (3d printed) components limited its overall precision to an estimated 0.25mm. While not quantified, there was additional error due to the control system, which in the case of the assembler was operating in open-loop with stepper motors. While the difference in machine, and allowable precision was slight, it was enough to prevent successful assembly. Further, the dynamics of the gantry assembler would not be favorable for high frequency assembly. Besides the speed limit of stepper motors, and the stiffness of the machined aluminum chassis, and actuators, the substantial mass in motion would provide significant limits to dynamic performance. Further, the motion paths required to pick-and-place components were excessive requiring multi-degree of freedom traverses across the full length of the chassis, costing time and/or power.

Relative robotic assemblers that incrementally traverse a lattice are not only feasible, but, when their design is deeply integrated with lattice topology, they have the capacity to operate at higher cycle rates than traditional serial-link configuration robotic arms, or gantry-type configurations because of reduced mass, and traversal distances. Designing lattices, and joints with simple kinematic trajectory requirements enable parallelization of the assembly mechanisms while minimizing errant vibration. Co-location of element storage with end-effectors reduce traverse distances. Geometry, such as mandrels, and kinematic alignment features can help assert positional certainty - reducing dwell, and settling times. The principles of elastic averaging can be utilized by locomotion systems that span longer wavelengths than the cell geometry to increase effective local precision. Alternatively, complete removal of the lattice structure from the incremental assembler structural loop minimizes the error contribution from the lattice entirely.

For each of these improvements to be applied more assembly strategies must also be evaluated, designed, built, and tested. While a few systems have been designed, and prototyped, there are still many potential strategies for locomotion, or assembly. Rather than a single robot assembling elements into voxels, and placing them, it may be that voxel cells are assembled off-board, then, placed. Or, it is possible, assembly happens in collaboration between multiple robots moving both inside, and outside of the structure.

The first next step is to gather the data point of an Instantaneous Global Coordinate Frame (IGCF) assembler that removes the lattice from the assembly of the lattice. The tri-helix (Leapfrog) system integrates all of the design concepts developed through the research including the IGCF protocol. This machine is currently under development, and should be completed to understand the implications of this concept. The learnings from this will lead to future design efforts. Future research might also further address new technologies at the interface. The ultimate goal for reconfigurable interfaces is for a face-to-face element interface to exist that operates as conveniently as a shared electron covalent-bond. An interface that aligns with the assistance of a field active at some distance, can transmit tension as well as compression, and moments, yet retains a continuous structural path would be ideal. New material combinations that morph shape with changes in activation energy could also potentially provide a robust reconfigurable interface. The design of struts, and interfaces have much room for improvement. Current methods involved a brute force design approach. Implementation of computational tools to further explore the design-space of interfaces, and trajectories are of great interest. More detailed analysis of buckling criteria, as well as strut material options will lead to designs with improved cross-sectional second area moment of inertias to optimize stiffness, slenderness ratios, limiting buckling in compression loading conditions. Finally, substantial dynamic analysis of locomotion gaits, and system vibrations would enable the tuning of assembly systems.

RADCL would have significant societal impact on land, air, and space. Any construction process that starts with a foundation could utilize this technology by integrating the periodically symmetric interface joints into the foundation. The RADCL systems would begin construction directly from these foundational interfaces. Bridges are a primary example of a system that would directly benefit from this technology. A foundation is set, and a lattice construction of struts is built from pylon to pylon. With RADCL errors could be corrected during the assembly process, or even later, inspection robots regularly traversing the structure could pinpoint failures, and those sections directly deconstructed, and repaired. This is in stark contrast to modern bridge construction techniques that are not built for disassembly: for instance, the new construction of the eastern span of the San Francisco Bay Bridge was found (after eleven years and \$6.4 billion) to have failed anchor bolts in the pylon that cannot be removed [70], posing safety concerns. Other similar, but permanent construction such as that of dams, and levees could utilize this technology to rapidly, and autonomously build more complex structurally conformal reinforcing "re-bar" structures that would later be filled with concrete. In this case the lattice is utilized for its best tensile properties while concrete provides the compressive and fluid handling properties. Finally, large scale space structures such as large aperture radio telescopes, solar arrays, or even new stations have not been realized as there has yet been no scalable manufacturing process beyond unfurling. The RADCL system would enable these technologies by autonomously assembling structures, incrementally increasing their capacities as additional shipments of raw material arrive. Rather than build deployable mechanisms that must survive launch vibration forces, shipments of discrete elements optimized for mass, strength, and packing density would be shipped to space flat-packed (minimally susceptibel to launch loads), and assembled into their final useful forms by the RADCL systems.

Robotic assembly of discrete cellular lattices offers new opportunities for construction of ultra-light stiff, and strong materials that are fully reconfigurable, and can be assembled autonomously by relative robotic systems. There is a growing field of research around the individual areas of non-stochastic periodic discrete cellular solids, and modular robotic assemblers, yet the full integration of kinematic principles to drive the topology of the discrete elements, and their autonomous assemblers has not yet been explicitly recognized. The research performed here outlines the key design features necessary to realize unbounded relative robotic assembly.
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