

## ASYMPTOTICALLY OPTIMAL KINODYNAMIC MOTION PLANNING FOR A CLASS OF MODULAR SELF-RECONFIGURABLE ROBOTS

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### ABSTRACT

Self-reconfigurable robots are composed of many individual modules that can autonomously move to transform the shape and structure of the robot. The task of self-reconfiguration, transforming a set of modules from one arrangement to another specified arrangement, is a key problem for these robots and has been heavily studied. However, consideration of this problem has typically been limited to kinematics and so in this work we introduce analysis of dynamics for the problem. We characterize optimal reconfiguration movements in terms of basic laws of physics relating force, mass, acceleration, distance traveled, and movement time. A key property resulting from this is that through the simultaneous application of constant-bounded forces by a system of modules, certain modules in the system can achieve velocities exceeding any constant bounds. This delays some modules in order to accelerate others.

To exhibit the significance of simultaneously considering both kinematic and dynamics bounds, we consider the following “ $x$ -axis to  $y$ -axis” reconfiguration problem. Given a horizontal row of  $n$  modules, reconfigure that collection into a vertical column of  $n$  modules. The goal is to determine the sequence of movements of the modules that minimizes the movement time needed to achieve the desired reconfiguration of the modules. In this work we prove tight  $\Theta(\sqrt{n})$  upper and lower bounds on the movement time for the above reconfiguration problem. Prior work on reconfiguration problems which focused only on kinematic constraints kept a constant velocity bound on individual modules and so required time linear in  $n$  to complete problems of this type.

*Keywords:* Self-reconfigurable robots; kinodynamic motion planning; metamorphic robotics.

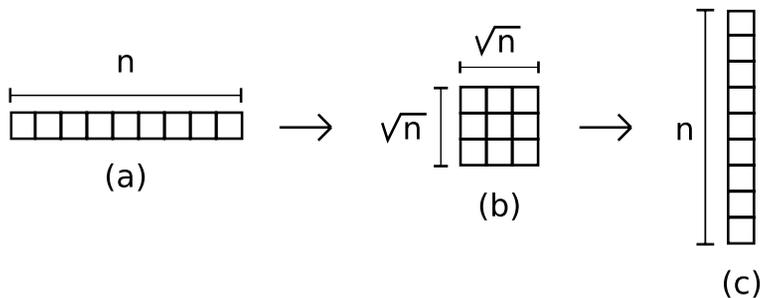


Fig. 1. The  $x$ -axis to  $y$ -axis problem: transforming a row of modules into a column. Our algorithm uses an intermediate step of forming a square.

## 1. Introduction

This paper develops efficient algorithms by treating reconfiguration as a kinodynamic planning problem. Kinodynamic planning refers to motion planning problems subject to simultaneous kinematic and dynamics constraints.<sup>1</sup> To that end, in this paper we define an abstract model for modules in SR robots. This extends the definitions of previous models by setting fixed unit bounds on a module’s shape, aspect ratio, mass, and the force it can apply, among other requirements.<sup>2,3</sup>

To exhibit the significance of these bounds we consider the following “ $x$ -axis to  $y$ -axis” reconfiguration problem. Given a horizontal row of  $n$  modules, reconfigure that collection into a vertical column of  $n$  modules. This simple problem, illustrated in Figure 1, provides a worst-case example in that  $\Omega(n)$  modules must move  $\Omega(n)$  module lengths to reach any position in the goal configuration regardless of that goal column’s horizontal placement. Any horizontal positioning of the vertical column along the initial row configuration is deemed acceptable in our treatment of the problem in this paper.

We define the *movement time* of a reconfiguration problem to be the time taken for a system of  $n$  modules to reconfigure from an initial configuration to a desired goal configuration. Modules are assumed to be interchangeable so the exact placement of a given module in the initial or goal configuration is irrelevant. An implicit assumption in various prior papers on reconfiguring robotic motion planning is that the modules are permitted only a fixed unit velocity.<sup>2,4,5</sup> This assumption is not essential to the physics of these systems and has constrained prior work in the area.

For the  $x$ -axis to  $y$ -axis problem, if only one module in the SR robot is permitted to move at a given time and with only a fixed unit velocity, a lower bound of  $\Omega(n^2)$ -time is clear.<sup>4</sup> Allowing concurrent movement of modules, a movement time of  $O(n)$  is possible while still keeping all modules connected to the system and keeping unit velocities. However, we observe that faster reconfiguration is possible if we do not restrict modules to move at a fixed, uniform pace.

Another major principle that we use, and that has seen use in prior reconfiguration algorithms,<sup>6,7</sup> is what we refer to as the principle of *time reversal*. This

principle is simply that executing reconfiguration movements in reverse is always possible, and they take precisely the same movement time as in the forward direction. This is, of course, ignoring concerns such as gravity. Otherwise an example of rolling a ball down a hill would require less time or less force than moving that ball back up the hill. We ignore gravity and use this principle extensively in the work of this paper.

Before continuing further, it will be useful to define some notation that we will use throughout the remainder of this paper. As given above, let  $n$  denote the number of modules in the SR robot undergoing reconfiguration. In the initial row configuration of the  $x$ -axis to  $y$ -axis problem, let the modules be numbered  $1, \dots, n$  from left to right. Let  $x_i(t)$  be the  $x$ -axis location of module  $i$  at time  $t$ . Similarly, let  $v_i(t)$  and  $a_i(t)$  be the velocity and acceleration, respectively, of module  $i$  at time  $t$ . For simplicity, the analysis in our examples will ignore aspects such as friction or gravity. The effect is similar to having the reconfiguration take place with ideal modules while lying flat on a frictionless planar surface.

In the following Section 2, we differentiate between different styles of self-reconfigurable robots and survey related work in the field. We begin introducing the work of this paper in Section 3 by giving our abstract model for SR robot modules. Given the bounds set by this model, Section 4 references physics equations that govern the movement of modules and define what reconfiguration performance is possible. Section 4 introduces a 1-dimensional problem of  $n$  modules arranged along a row with the goal of contracting each from length 1 to length  $1/2$  while keeping the row of modules connected to each other throughout movement. We show an  $\Omega(\sqrt{n})$  lower bound for this 1-dimensional problem and then also prove the same lower bound for the  $x$ -axis to  $y$ -axis problem.

We then meet these asymptotic lower bounds with algorithms presented in Section 5. We again first give an algorithm to solve the 1-dimensional row contraction problem. We then extend the result to a contraction/expansion case in 2 dimensions while maintaining the same time bound. This then leads to a  $O(\sqrt{n})$  movement time algorithm for the  $x$ -axis to  $y$ -axis reconfiguration problem. This algorithm works by repeatedly using the 1-dimensional contraction operation, and the reverse of that operation, to transform the initial  $n$  module row into an intermediate stage  $\sqrt{n} \times \sqrt{n}$  square 2D array. The process is then reversed to go from the square to the goal column configuration. Finally, the conclusion in Section 6 summarizes the results of this paper.

## 2. Related Work

When developing models and algorithmic bounds for self-reconfigurable (SR) robots (also known as metamorphic robots<sup>3,4,8</sup>) it is important to note the style of SR robot we are dealing with. Two of the main types of SR robots are chain style robots and lattice style robots. Chain SR robots are composed of open or closed kinematic chains of modules possibly forming string or tree topologies.<sup>9</sup> To reconfigure, these

modules often swing chains of other modules to new locations or can bend in other ways to achieve reconfiguration. Some implementations of this design, separately by Yim et al.<sup>10</sup> and by Shen et. al.,<sup>11</sup> have had several demonstrations of locomotion.

For the other major style, lattice or substrate SR robots attach together only at discrete locations to form lattice-like structures. Individual modules typically move by walking along the surfaces formed by other modules. The hardware requirements for this style of module are more relaxed than those for chain style systems. In some implementations chain style modules may require more strength for reconfiguration, but another more important difference is that for lattice style modules the configuration space is discrete – only considering locations in the lattice structure – while for chain style modules the configuration space is continuous. This increases the range of movements for chain SR modules, but also makes reconfiguration planning more difficult. The models and algorithms presented in this paper are meant for lattice style modules.

Previous work by several research groups has developed abstract models for lattice style SR robots. One of the most recent is the sliding cube model proposed by Rus et al.<sup>2</sup> As the name implies, this model represents modules as identical cubes that can slide along the flat surfaces created by lattices of other modules. In addition, modules have the ability to make convex or concave transitions to other orthogonal surfaces. In this abstraction, a single step action for a module would be to detach from its current location and then either transition to a neighboring location on the lattice surface, or make a convex or concave transition to another orthogonal surface to which it is next. Transitions are only made in the cardinal directions (no diagonal movements) and for a module to transition to a neighboring location that location must first be unoccupied. Most architectures for lattice style SR robots satisfy the requirements of this model.

One such physical implementation is the compressible unit or expanding cube design.<sup>5,6</sup> Here an individual module can expand from its original size to double its length in any given dimension, or alternatively compress to half its original length. Neighbor modules are then pushed or pulled by this action to generate movement and allow reconfiguration. This particular module design is relevant because it provides a good visual aide for the algorithms we present in this paper. For this purpose we also add the ability for expanding cubes to slide relative to each other. Otherwise a single row of these modules can only exert an expanding or contracting force along the length of that row and is unable to reconfigure in 2 dimensions.

Prior work has noted that while individual expanding cube modules do not have this ability, it can be approximated when groups of modules are treated as atomic units.<sup>5,6</sup> Early theoretical work with these expanding cube hardware designs utilized these groups and developed algorithms for complete reconfiguration that were distributed (i.e. no central controller needed), allowed for parallel movement by multiple modules in the system, and could reconfigure a collection of  $n$  modules in  $O(n^2)$  time in the worst case.<sup>27,28</sup> Here a unit of time is that which is required to move a single module a unit distance. More recent work has focused more on the

number of parallel movement steps needed for reconfiguration rather than just the number of atomic module movements that are needed. This work gave an algorithm which required only  $O(n)$  reconfiguration time.<sup>25</sup> It still required  $O(n^2)$  atomic module movements, but the overall reconfiguration time was much less because the algorithm was careful in how it organized those atomic movements into parallel stages. That algorithm, however, still relied on constraining module movements to a unit velocity speed limit and allowing each module only enough force to push or pull one neighbor a distance of 1 module unit in unit time. Our work here keeps that force restriction but shows how, in theory, the unit velocity speed limit might be exceeded even while keeping within the bounds set by the basic laws of physics.

Finally, we note that a preliminary version of this work appeared in conference form<sup>12</sup> and a follow-up paper extended these results to reconfiguration between arbitrary 2D configurations.<sup>13</sup> While the extended results for arbitrary 2D configurations only applied to expanding cube style modules, the results given in this current paper can apply more generally such as to designs fitting the sliding cube model as discussed at the end of Section 5.

### 3. Abstract Model

We now begin introducing our results for this paper by defining our abstract model for SR robot modules. It generalizes many of the requirements and properties of reconfigurable robots and in particular, the properties of the sliding cube model and the expanding cube hardware design described in the previous section. Our abstract model explicitly states bounds on physical properties such as the size, mass, and force exerted for each module. These properties will be utilized by the algorithms and complexity bounds that later follow. The requirements of our model are described by the following set of axioms.

- Each module is assumed to be an object in 3D with either (i) a fixed shape and size or (ii) a limited set of geometric shapes that it can acquire. In either case, the module also has a constant bound on its total volume and the aspect ratio of its shape.
- Each module can latch onto or grip adjacent modules and apply to these neighboring modules a force or torque.
- Generally, modules are all connected either directly or indirectly at any time.
- For each module there is a constant bound on its mass.
- There is a constant bound on the magnitude of the force and/or torque that a module may apply to neighboring modules with which it is in contact.
- The motion of modules is such that they never collide with a velocity above a fixed constant magnitude.
- For modules in direct contact with each other, the magnitude of the difference in velocity between these contacting modules is always bounded by a constant.

- Each module, when attached (or latched) to other modules, can dynamically set the stiffness of the attachment. This is in addition to the ability of the module to apply contraction/expansion or rotational forces at its specified attachments.

**Note on Stiffness:** The axiom on the stiffness of the attachments to neighboring modules is required to ensure that forces (external to the module) are transmitted through it to neighboring modules. We add this since contraction and/or rotational forces along a chain of modules can accumulate to amounts more than the unit maximum applied by any one module, and may need to be transferred from neighbor to neighbor. Note also that we assume idealized modules that act in synchronized movements under centralized control. This reduces analysis difficulties for cases when many sets of modules operate in parallel.

While the axioms given above state important module requirements, more concrete models are necessary for algorithm design and analysis. The sliding cube model and the expanding cube hardware design described in the previous section satisfy the axioms of our abstract model so long as bounds on the physical abilities of modules are implied. In particular, for these modules the “stiffness” requirement means that the transmitted forces are translational. The exact use of this will become apparent in our first 1-dimensional example with expanding cube modules.

Finally, while not used in this paper, we note two other useful abilities for physical modules: the ability to *push* and the ability to *tunnel*. The ability to push requires one module exerting enough force to push a second module in front of it while sliding along a surface in a straight line. The tunneling ability would allow modules to transition through the interior of a lattice structure in addition to moving along external surfaces.

#### 4. A Lower Bound for the $x$ -axis to $y$ -axis Problem

All analysis of movement planning in this paper is based on the physical limitations of individual modules stated in the last section. Given this abstract model, we can now make use of the elementary equations of Newtonian physics governing the modules’ movement in space and time. For these equations we use the notation first mentioned in Section 1. Let  $x_i(t)$  be the distance traveled by object  $i$  during movement time  $t$ . Similarly, let  $v_i(t)$  be its velocity after time  $t$ . Finally, given an object  $i$  with mass  $m_i$ , let  $F_i$  be the net force applied to that object and  $a_i$  be the resulting constant acceleration. Although the relevant equations are basic, we state them here so that they can be referred to again later in the paper:

$$F_i = m_i a_i \tag{1}$$

$$x_i(t) = x_i(0) + v_i(0)t + \frac{1}{2}a_i t^2 \tag{2}$$

$$v_i(t) = v_i(0) + a_i t . \tag{3}$$

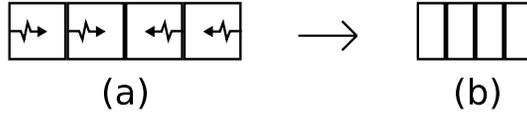


Fig. 2. The *Squeeze* problem: Expanding cube modules in (a), each of length 1, contract to each have length  $1/2$  and form the configuration in (b).

In the first equation we get that a net force of  $F_i$  is required to move an object with mass  $m_i$  at a constant acceleration with magnitude  $a_i$ . In the second equation, an object's location  $x_i(t)$  after traveling for a time  $t$  is given by its initial position  $x_i(0)$ , its initial velocity  $v_i(0)$  multiplied by the time, and a function of a constant acceleration  $a_i$  and the time traveled squared. Similarly, the third equation gives the velocity after time  $t$ ,  $v_i(t)$ , to be the initial velocity  $v_i(0)$  plus the constant acceleration  $a_i$  multiplied by the time traveled.

For our analysis we assume that modules have a unit mass  $m = 1$  and sides with unit length 1. Similarly, we assume that each module is capable of producing a unit amount of force, 1, for each stage of motion. For example, for an expanding cube module this unit force would be capable of contracting or expanding it in unit time while pulling or pushing one neighbor module. This still keeps within the constant-bounded force requirement of our abstract model. Note that using this to define a “unit” amount of time is a somewhat arbitrary decision intended to give us a simple baseline to work with. It is unimportant if we had instead chosen as our unit the amount of time for the unit force to actually push/pull 1, 2, or 7 neighboring modules. The important aspect is simply that the number of neighbors which can be moved by a unit (constant bounded) force in unit (constant bounded) time is also bounded by some constant, be that 1, 2, 7, etc. With any such constant bound the asymptotic results of this paper will hold.

Also, since the module has unit mass, by equation (1) we get a bound on its acceleration  $a \leq 1$  given the force applied in just a single motion stage. Again, all concerns for friction or gravity (or a detailed description of physical materials to ensure the proper stiffness of modules) are ignored to simplify calculations.

#### 4.1. Lower bounds: the squeeze problem

Before tackling the  $x$ -axis to  $y$ -axis reconfiguration problem, we first begin by analyzing a simpler 1-dimensional case which we will refer to as the *Squeeze* problem. For this problem, assume an even number of  $n$  modules, numbered  $i = 1, \dots, n$  from left to right. Keeping the modules connected as a single row, our goal is to contract the modules from each having length 1 to each having length  $1/2$  for some unit length in the  $x$ -axis direction. This reconfiguration task is shown in Figure 2. Given the bounds on the module's physical properties required by our abstract model, the goal is to perform this reconfiguration in the minimum possible movement time  $T$ .

Similarly, we define the *Reverse Squeeze* problem as the operation that undoes the first reconfiguration. Given a connected row of  $n$  contracted modules, each with length  $1/2$  in the  $x$ -axis direction, expand those modules to each have length 1 while keeping the system connected as a single row. Since this problem is exactly the reverse of the original *Squeeze* problem then, by the principle of *time reversal* mentioned in Section 1, steps for an algorithm solving the *Squeeze* problem can be run in reverse order to solve the *Reverse Squeeze* problem in the same movement time with the same amount of force.

We'll now rigorously define the constraints of our *Squeeze* problem before presenting our lower bound proof. We assume that we have  $n$  modules numbered  $i = 1, \dots, n$  arranged as a row along the  $x$ -axis. Each module has unit mass 1, can grip its adjoining cubes, and can exert expanding or contracting forces against those neighbors. We require that the velocity difference between the centers of consecutive modules is at most 1, and that the centers of consecutive modules never get closer than a distance of  $1/2$  from each other. (Alternatively we could require that no module contracts to a length less than  $1/2$ .) Furthermore, a unit upper bound is assumed on the magnitude of the force exerted by any 1 module, which as stated earlier also causes an acceleration bound  $a_i \leq 1$  for any module. For modules  $i = 1, \dots, n$  the  $i$ th module's center initially at time  $t = 0$  has  $x$ -coordinate  $x_i(0) = i - (n + 1)/2$ . For simplicity, we assume no friction or gravitational forces.

Our goal configuration at the final time  $T$  is the modules still arranged in a row on the  $x$ -axis, each with 0 final velocity, such that each module's center coordinate is a distance  $1/2$  from the next module's center in the  $x$ -axis direction. So, for  $i = 1, \dots, n$  the  $i$ th module's center at the final time  $T$  has  $x$ -coordinate:

$$x_i(T) = \frac{x_i(0)}{2} = \frac{i}{2} - \frac{n+1}{4} .$$

To summarize, this means that the "0" value along the  $x$ -axis is located at the middle of this row of modules and during movement all modules will move inwards toward that "0"  $x$ -axis coordinate location. This may seem to require that at least 1 module be somehow fixed to an immovable surface and thus might require a very strong force to do so as the number of modules grows large. However, this requirement is lessened considerably when we note that the inertia of the modules themselves, and the symmetry in their reconfiguration movements, will naturally help keep the overall center of mass of the system in a fixed location. This would then cause all modules to move toward the center of the row when contracting. If we assume ideal modules with frictionless reconfiguration then no fixture to an immovable surface is required, while any departure from this ideal form would require a small connection force to keep the overall center of mass of the system exactly fixed in place. Regardless, this is a small issue as our emphasis is on initial and final forms of the configurations and not their exact placements relative to each other.

Finally, to differentiate notation, we'll use parentheses to denote a function of time, such as  $x_i(t)$ , and square brackets to denote order of operations, such as  $2 * [3 - 1] = 4$ . Now, given our constraints just stated above, our goal is to prove a lower bound on the minimal possible movement time duration from the initial configuration at time 0 to final configuration at time  $T$ .

**Lemma 1.** *The Squeeze problem requires total movement time  $\Omega(\sqrt{n})$ .*

**Proof:** Consider the movement of the first  $n/c$  cubes  $i = 1, 2, \dots, n/c$ . Let  $c$  be a real number strictly larger than 2. For  $i = 1, \dots, n$  the center of cube  $i$  needs to move distance  $|x_i(T) - x_i(0)| = |[n + 1]/4 - i/2|$  from the initial  $x$ -coordinate  $x_i(0) = i - [n + 1]/2$  starting with initial velocity  $v_i(0) = 0$  to final  $x$ -coordinate  $x_i(T) = x_i(0)/2 = i/2 - [n + 1]/4$  and ending with final velocity  $v_i(T) = 0$ . Note that this distance is at least

$$\left| \frac{n+1}{4} - \frac{i}{2} \right| \geq n \left[ \frac{1}{4} - \frac{1}{2c} \right] + \frac{1}{4}$$

for the first  $n/c$  cubes (those with indices from 1 to  $[n/c]$ ) and the last  $n/c$  cubes (those with indices from  $n - [n/c] + 1$  to  $n$ ). This is a total of at least  $n_1 = 2[n/c - 1]$  cubes. The total force applied by all  $n$  cubes is at most  $n$ , since by assumption each has a force magnitude upper bound 1.

Hence, since they have unit masses, the average acceleration (at their center points) applied to each of these  $n_1 = 2[n/c - 1]$  cubes can be at most  $n/n_1 = c/[2[1 - c/n]] \approx c/2$ . Thus, at least one of these cubes (say the  $i$ th cube) has average acceleration at most  $a_i \approx c/2$ . But the  $i$ th cube needs to traverse a distance of at least  $|[n + 1]/4 - i/2| \geq n[1/4 - 1/[2c]] + 1/4$ .

Moreover, the  $i$ th cube must start and end with 0 velocity, so it is easy to verify that the time-optimal trajectory for its center point has an acceleration of at most  $a_i \approx c/2$  in the positive  $x$ -axis direction from time 0 to  $T/2$ , followed by a reverse direction acceleration of the same magnitude but in the negative  $x$ -axis direction.

The total distance traversed in each of the two stages is at most  $a_i t^2/2 = [c/2][T/2]^2/2$ , so the total distance traversed by the center of the  $i$ th cube is at most  $[c/2][T/2]^2 = cT^2/8$  which needs to be  $\geq n[1/4 - 1/[2c]] + 1/4$ . Thus,

$$\begin{aligned} \frac{cT^2}{8} &\geq n \left[ \frac{1}{4} - \frac{1}{2c} \right] + \frac{1}{4} \\ T &\geq \sqrt{\frac{8n}{c} \left[ \frac{1}{4} - \frac{1}{2c} \right] + \frac{2}{c}} \\ T &\geq \sqrt{\frac{2n}{c} \left[ 1 - \frac{2}{c} \right] + \frac{2}{c}} \\ T &= \Omega(\sqrt{n}) . \quad \square \end{aligned}$$

#### 4.2. Lower bounds: the $x$ -axis to $y$ -axis problem

Recall that our purpose of doing this analysis is to find movement time results for the  $x$ -axis to  $y$ -axis problem of reconfiguring a row of  $n$  modules in to a column of  $n$  modules. We can actually use the arguments just given for the *Squeeze* problem to provide a lower bound on the movement time required for the  $x$ -axis to  $y$ -axis problem.

**Corollary 1.** *The  $x$ -axis to  $y$ -axis reconfiguration problem requires total movement time  $\Omega(\sqrt{n})$ .*

**Proof:** Given the initial row configuration and the goal column configuration, pick the end of the row farthest away from the goal column configuration's horizontal placement. Select the  $n/c$  cubes at this end of the row, for some real number  $c$  greater than 2. Among these  $n/c$  cubes we can again find some  $i$ th cube that must have an acceleration at most  $a_i \approx c/2$  and that it must travel a distance  $\geq n[1/4 - 1/[2c]] + 1/4$ . This again leads to the movement time being bounded as  $T = \Omega(\sqrt{n})$ .  $\square$

### 5. A Reconfiguration Algorithm for the $x$ -axis to $y$ -axis Problem

In the previous section we were able to show that, when dynamics constraints governing SR robot modules are considered along with kinematic constraints, the  $x$ -axis to  $y$ -axis reconfiguration problem will require  $\Omega(\sqrt{n})$  movement time for a collection  $n$  modules. Proving the existence of this lower bound is interesting in isolation, but we can also match this lower bound with a reconfiguration algorithm that we present here in this section. To describe this algorithm, we'll first give a solution for the *Squeeze* problem described earlier, and then we will give our algorithm to solve the  $x$ -axis to  $y$ -axis problem.

#### 5.1. Solving the *Squeeze contraction problem*

Recall that in Subsection 4.1 we introduced the *Squeeze Problem*. This reconfigured a row of  $n$  interconnected modules, each with unit length in the  $x$ -axis direction, to have a final length of  $1/2$ , and proved that it required at least  $T = \Omega(\sqrt{n})$  movement time. We now describe an algorithm that matches that lower bound. Again, the same assumptions about the physical properties of the modules are held and concerns for friction or gravity are ignored. In the proof that follows we will refer to the basic units as “modules” and “cubes” interchangeably and any talk of its coordinate location refers to the location of the center of that module.

**Lemma 2.** *The *Squeeze problem* requires at most total movement time  $T = \sqrt{n-1}$ .*

**Proof:** Fix  $T = \sqrt{n-1}$ . For each module  $i = 1, \dots, n$  at time  $t$ , for  $0 \leq t \leq T$ , let  $x_i(t)$  be the  $x$ -coordinate of the center of the  $i$ th module at time  $t$  and let  $v_i(t), a_i(t)$  be its velocity and acceleration, respectively, in the  $x$ -direction (our algorithm for

this *Squeeze Problem* will provide velocity and acceleration only in the  $x$ -direction). Our proof that follows will have two main sections. The first views each module in isolation and finds a plan for accelerating it such that it moves as needed while meeting the requirements of our abstract module. The second section of this proof shows that these acceleration values are maintained even though the modules are interconnected and impart forces on each other.

**Proof Section 1:**

For  $i = 1, \dots, n$  the  $i$ th module needs to move from initial  $x$ -coordinate  $x_i(0) = i - (n + 1)/2$ , starting with initial velocity  $v_i(0) = 0$ , to final  $x$ -coordinate  $x_i(T) = x_i(0)/2 = i/2 - (n + 1)/4$  ending with final velocity  $v_i(T) = 0$ . To ensure the velocity at the final time is 0, during the first half of the movement time the  $i$ th module will be accelerated by an amount  $\alpha_i$  in the intended direction, and then during the second half of the movement time the  $i$ th module will accelerate by  $-\alpha_i$  (in the reverse of the intended direction). For  $i = 1, \dots, n$ , set that acceleration as:

$$\alpha_i = \frac{n + 1 - 2i}{n - 1} .$$

Note that the maximum acceleration bound is unit, since  $|\alpha_i| \leq 1$ , satisfying the requirement of our abstract model. During the first half of the movement time  $t$ , for  $0 \leq t \leq T/2$ , by equations (3) and (2) we get that the velocity at time  $t$  is  $v_i(t) = v_i(0) + \alpha_i t$  which implies  $v_i(t) = \alpha_i t$  and the  $x$ -coordinate is given by:

$$\begin{aligned} x_i(t) &= x_i(0) + v_i(0)t + \frac{\alpha_i}{2}t^2 \\ x_i(t) &= i - \frac{n + 1}{2} + \frac{\alpha_i}{2}t^2 . \end{aligned}$$

At the midway point  $T/2$ , this gives the  $i$ th module velocity  $v_i(T/2) = \alpha_i T/2$  and  $x$ -coordinate

$$\begin{aligned} x_i(T/2) &= i - \frac{n + 1}{2} + \frac{\alpha_i}{2} \left[ \frac{T}{2} \right]^2 \\ x_i(T/2) &= i - \frac{n + 1}{2} + \frac{\alpha_i T^2}{8} . \end{aligned}$$

During the second half of the movement time  $t$ , for  $T/2 < t \leq T$ , we will set the  $i$ th module's acceleration at time  $t$  to be  $a_i(t) = -\alpha_i$ . By equation (3) we get that the velocity at time  $t$  during the second half of the movement time is

$$v_i(t) = v_i(T/2) - \alpha_i \left[ t - \frac{T}{2} \right]$$

$$v_i(t) = \alpha_i \left[ \frac{T}{2} \right] - \alpha_i \left[ t - \frac{T}{2} \right]$$

$$v_i(t) = \alpha_i [T - t]$$

and the  $x$ -coordinate given by equation (2) is

$$x_i(t) = x_i(T/2) + v_i(T/2) \left[ t - \frac{T}{2} \right] - \frac{\alpha_i}{2} \left[ t - \frac{T}{2} \right]^2$$

$$x_i(t) = \left[ i - \frac{n+1}{2} + \frac{\alpha_i T^2}{8} \right] + \frac{\alpha_i T}{2} \left[ t - \frac{T}{2} \right] - \frac{\alpha_i}{2} \left[ t - \frac{T}{2} \right]^2.$$

This implies that at the final time  $T$ , the  $i$ th module's center has velocity  $v_i(T) = \alpha_i(T - T) = 0$  and  $x$ -coordinate

$$\begin{aligned} x_i(T) &= \left[ i - \frac{n+1}{2} + \frac{\alpha_i T^2}{8} \right] \\ &\quad + \frac{\alpha_i T}{2} \left[ T - \frac{T}{2} \right] - \frac{\alpha_i}{2} \left[ T - \frac{T}{2} \right]^2 \\ x_i(T) &= \left[ i - \frac{n+1}{2} + \frac{\alpha_i T^2}{8} \right] + \frac{\alpha_i T^2}{4} - \frac{\alpha_i T^2}{8} \\ x_i(T) &= i - \frac{n+1}{2} + \frac{\alpha_i T^2}{4}. \end{aligned}$$

Recalling that we initially set  $\alpha_i = \frac{n+1-2i}{n-1}$  and  $T = \sqrt{n-1}$  we get:

$$\begin{aligned} x_i(T) &= i - \frac{n+1}{2} + \frac{n+1-2i}{4} \\ x_i(T) &= \frac{i}{2} - \frac{n+1}{4} \\ x_i(T) &= \frac{x_i(0)}{2}. \end{aligned}$$

So we get that  $x_i(T) = x_i(0)/2$  as required. Moreover, the time any consecutive points are closest is the final time  $T$ , and at that time they are distance  $1/2$  from each other, as required in the specification of the problem.

It is easy to verify that the velocity difference between consecutive module centers  $i$  and  $i + 1$  is maximized at time  $T/2$ , and at that time the the magnitude of the velocity difference is

$$\begin{aligned} |v_i(T/2) - v_{i+1}(T/2)| &= |\alpha_i - \alpha_{i+1}|T/2 \\ &\leq \frac{2}{n-1} \frac{\sqrt{n-1}}{2} \\ &\leq 1 \end{aligned}$$

as required in the specification of the problem. Thus, we have shown it possible to complete this problem in time  $T = \sqrt{n-1}$  while still satisfying the axioms of our abstract model *if* the connectivity and gripping between adjacent modules does not interfere with the acceleration plans we have chosen for each module.

### ***Proof Section 2:***

In the *Squeeze* problem, there is an expansion/contraction force applied by each  $i$ th cube to its neighbors that are located just before and just after it on the  $x$ -axis. These consecutive neighbors are assumed to be gripped together. Our goal is to use  $\alpha_i = [n + 1 - 2i]/[n - 1]$  as the acceleration of each module  $i$  just as was defined in the first proof section.

During the first half of the movement time  $t$ , for  $0 \leq t \leq T/2$ , the  $i$ th cube will be subjected to external force  $F_{i,L}(t) = \sum_{j=1}^{j=i-1} a_j(t)$  from its left neighbor (the  $i - 1$ th cube) and will be subjected to external force  $F_{i,R}(t) = \sum_{j=i+1}^{j=n} a_j(t)$  from its right neighbor (the  $i + 1$ th cube). During this time, we let the  $i$ th cube apply the additional contraction force  $a_i(t) = \alpha_i$ . This will result in the constant acceleration of the center of the  $i$ th cube by  $\alpha_i$ .

During the second half of the movement time  $t$ , for  $T/2 < t \leq T$ , the  $i$ th cube will be subjected to external force  $F_{i,L}(t) = \sum_{j=1}^{j=i-1} -a_j(t)$  from its left neighbor and will be subjected to external force  $F_{i,R}(t) = \sum_{j=i+1}^{j=n} -a_j(t)$  from its right neighbor. During this time we will let the  $i$ th cube apply the additional force  $a_i(t) = -\alpha_i$ . This will result in the constant deceleration of the center of cube  $i$  by  $-\alpha_i$ .

The above sums describing forces  $F_{i,L}(t)$  and  $F_{i,R}(t)$  are due to the accumulation of the forces (the individual mass of each cube is unit, so each contributed force is just the  $j$ th cube's acceleration) along the chain of cubes (to the left or right, respectively) of the  $i$ th cube. Note that the model's axiom on allowed specification of stiffness of the attachments to neighbors of a module is required to ensure forces (external to the module) are transmitted between neighbors of the module. (For example, during the middle time phases of the *Squeeze* algorithm, the middle two modules indexed  $n/2$  and  $n/2 + 1$  can each only apply a unit maximum force between each other, but there is an accumulated force transmitted between them of a constant times  $n$ .) For our *Squeeze* algorithm, this is immediate since the accumulated forces  $F_{i,L}(t)$  and  $F_{i,R}(t)$  are precisely known for each  $i$ th module.

It is useful to observe that  $\sum_{j=1}^{j=n} a_j(t) = 0$  due to the definition of the  $a_j(t)$  (that is, the center of the overall system does not change  $x$ -coordinates). This implies that at all times the total sum of forces involving the the  $i$ th cube — including both external forces as well as forces providing acceleration of the mass of the  $i$ th cube — is balanced:  $F_{i,L}(t) + F_{i,R}(t) + a_i(t) = \sum_{j=1}^{j=n} a_j(t) = 0$ .

In summary, the resulting acceleration of the center point of the  $i$ th cube is  $a_i(t) = \alpha_i$  for  $0 \leq t \leq T/2$  and is  $a_i(t) = -\alpha_i$  for  $T/2 < t < T$ . Hence, we have made the center of each cube translate in the  $x$ -axis on a trajectory exactly the same as defined in the first section of this proof. In this way, we satisfied all required movement restrictions of the *Squeeze* Problem. That is, for  $i = 1, \dots, n$  the center of the  $i$ th cube will move from the initial  $x$ -coordinate  $x_i(0) = i - [n + 1]/2$  starting with initial velocity  $v_i(0) = 0$  to final  $x$ -coordinate  $x_i(T) = x_i(0)/2 = i/2 - [n + 1]/4$  and ending with final velocity  $v_i(T) = 0$ .  $\square$

Given that the above problem requires at most  $T = \sqrt{n - 1}$  time to be solved, we get the same result for the *Reverse Squeeze* problem.

**Corollary 2.** *The Reverse Squeeze problem requires at most movement time  $T = \sqrt{n - 1}$ .*

Note that all of the operations performed in solving the *Squeeze* problem can be done in reverse. The forces and resulting accelerations used to contract modules can be performed in reverse to expand modules that were previously contracted. Thus, we can reverse the above *Squeeze* algorithm in order to solve the *Reverse Squeeze* problem in exactly the same movement time as the original *Squeeze* problem. (Note: Although the forces are reversed in the Reverse Squeeze problem, the stiffness settings remain the same. It is important to observe that without these stiff attachments between neighboring modules, the accumulated expansion forces would make the entire assembly fly apart.)

## 5.2. Solving 2D array reconfiguration

The above analysis of the 1-dimensional *Squeeze* problem has laid the groundwork for reconfiguration in 2 dimensions. This includes the  $x$ -axis to  $y$ -axis reconfiguration problem which we will provide an algorithm for in the next subsection. We build to that result by first looking at a simpler example of 2-dimensional reconfiguration that will serve as an intermediate step in our final algorithm. We continue to use the same expanding cube model here as was used in the previous section.

In that previous section a connected row of an even number of  $n$  expanding cube modules was contracted from each module having length 1 in the  $x$ -axis direction to each having length  $1/2$ . We now begin with that contracted row and reconfigure it into two stacked rows of  $n/2$  contracted modules. Modules begin with  $\frac{1}{2} \times 1$  width by height dimensions and then finish with  $1 \times \frac{1}{2}$  dimensions. This allows pairs of adjacent modules to rotate positions within a bounded  $1 \times 1$  unit dimension square. We denote this reconfiguration task as the *confined cubes swapping* problem.

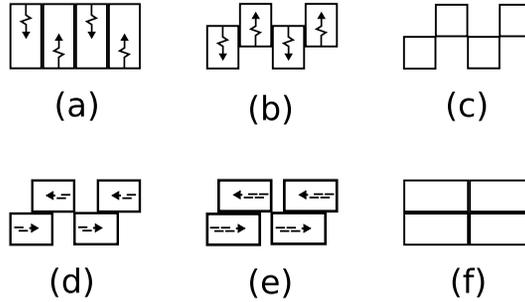


Fig. 3. **Confined Cubes Swapping:** Expanding cube modules (a–c) contracting vertically, then (d–f) expanding horizontally. Here the scrunched arrow represents contraction and the multi-piece arrow denotes expansion.

The process that we use to achieve reconfiguration is shown in Figure 3. We begin with a row of modules, each with dimension  $\frac{1}{2} \times 1$ . Here motion occurs in two parts. First, “fix” the bottom edge of odd numbered modules so that edge does not move. Do the same for the top edge of even numbered modules. Then contract all modules in the  $y$  direction from length 1 to length  $1/2$ . Note that to achieve this no external connection is used to “fix” the edges in place, but instead two counterbalancing forces are required: (1) a force within each module to contract it, and (2) sliding forces between adjacent modules in the row to keep the required top/bottom edges in fixed locations as described earlier. This process creates the “checkered” configuration in part (c) of Figure 3.

Something worth clarifying here is that when saying that we “fix” the locations of the top or bottom edges of certain modules, this is only an aide to help the reader conceptually understand the intended reconfiguration movements. In fact, there is no external connection that keeps the location of these edges fixed, as is visually apparent in part (c) of Figure 3. The catch is that the edges of these modules will keep fixed locations, not by some external connection, but by a perfect balancing of the contracting force of each module and the sliding forces between adjacent module (as mentioned in the last paragraph). When dealing with ideal modules, the intended edges exactly keep their fixed locations. In actual, imperfect reconfiguration these edges would likely stay in nearly the same locations, but would waver a bit during reconfiguration.

We can then reverse the process, but execute it in the  $x$  direction instead, to expand the modules in the  $x$  direction and create 2 stacked rows of modules, each with dimension  $1 \times \frac{1}{2}$ . Note that requiring certain edges to stay in fixed locations had an important byproduct. This results in pairs of adjacent modules moving within the same  $1 \times 1$  square at all times during reconfiguration. This also means that the bounding box of the entire row does not change as it reconfigures into 2 rows. This trait will be of great significance when this reconfiguration is executed in parallel on an initial configuration of several stacked rows.

Again, number modules  $i = 1, \dots, n$  from left to right and assume modules have unit mass 1, can grip each other, and can apply contraction, expansion and sliding forces. In this problem each module will exert a unit amount of force twice: once for a contraction reconfiguration stage – going from part (a) to part (c) in Figure 3 – and once for an expansion reconfiguration stage – going from part (c) to part (f) in the same figure. Having two stages will double our running time, but will still meet our abstract model’s requirements. Finally, concerns for gravity or friction are again ignored for the sake of simplicity. Given these bounds, our goal is to find the minimum reconfiguration time for this confined cubes swapping problem.

**Lemma 3.** *The confined cubes swapping problem described above requires  $T = O(1)$  movement time for reconfiguration.*

**Proof:** First consider the step of transforming the single row of modules into the intermediate “checkered” configuration. In this step all forces and movement occur in the  $y$ -axis direction. Let the number of modules  $n$  be even. From the initial row configuration let the even numbered cubes  $i = 2, \dots, n$  be the modules that contract upwards while the odd numbered cubes  $i = 1, \dots, n - 1$  are contracted downwards.

As stated above, we wish to begin reconfiguration by keeping fixed the location of top edges of even numbered (upward) modules. We also want to fix the location of bottom edges of odd (downward) modules. This is done by having sliding forces between adjacent modules to balance out contraction forces. By definition an expanding cube module can exert enough force to contract from length 1 to length  $1/2$  in  $O(1)$  movement time using a unit amount of force while beginning and ending with zero velocity. To also allow for sliding forces, let  $1/4$ th of each module’s force go toward contracting it while the other  $3/4$  of its force capability is left available to generate sliding force.

A constant fraction of the original force still permits contraction to occur in  $O(1)$  time. Specifically, if a force of 1 caused contraction in time  $T = 1$  then from our equations in Section 4 we conclude that a force of  $1/4$  permits contraction in time  $T = \sqrt{4} = 2$ . Thus, set  $T = 2$  as the movement time for this contraction reconfiguration step.

Since the contraction motions were suitably created by applying the constant fraction  $1/4$  of the original force, we focus now on the sliding motions by looking at the even numbered (upward) modules. In the initial configuration, even and odd modules have their centers at the same  $y$  coordinate. In the checkered configuration, even modules’ centers have a  $y$  coordinate a distance of  $1/2$  above the odd modules’ center coordinates. This is created by even modules’ centers moving up  $1/4$  unit distance and odd modules’ centers moving down  $1/4$  unit. Alternatively, we can think of it as the even modules’ centers moving  $1/2$  unit distance relative to the odd modules’ centers. We focus on this relative separation between the center points of upward and downward moving modules to simplify our analysis. To create this motion let each module  $i = 1, \dots, n - 1$  apply a force of  $1/4$  to each of its connection boundaries in the proper direction to create sliding motion.

Given these force applications, the resulting force applied to each upward moving (even) module  $i = 2, 4, \dots, n - 2$  comes from 2 such boundaries and a total force of  $[1/4 + 1/4] + [1/4 + 1/4] = 1$ . The exception is module  $n$  that has only 1 such boundary and so only a force of  $1/4$  contributed from its lone neighbor. This matter is resolved by module  $n$  applying all of its available force of  $3/4$ . Now all upward moving modules have a force of 1 applied to them.

With unit masses for each of the modules, from equation (1) in Section 4 we get that a force of 1 will generate an acceleration of 1. Yet, as in previous examples we first need an acceleration in the direction of movement, then a reverse acceleration in the opposite direction to ensure a final velocity of 0. Splitting the force evenly between 2 stages, we will have accelerations with magnitude  $1/2$ . Let  $y(t)$  denote an upward moving module's position relative to its neighboring downward moving modules, while  $v(t)$  and  $a(t)$  denote its velocity and acceleration, respectively. In the first stage, during  $0 \leq t \leq T/2$ ,  $a(t) = 1/2$ , and during  $T/2 < t \leq T$ ,  $a(t) = -1/2$ . We require only 3 such values  $y(t)$ ,  $v(t)$ , and  $a(t)$  because in this idealized model all modules will be moving in unison.

The equations describing this motion are the same as those found during the work of Section 4. At the final time  $T$  the final velocity is given by  $v(T) = a(0)[T - T] = 0$  as desired. The final position is given by  $y(T) = a(0)T^2/4 = [1/2] * [4/4] = 1/2$  exactly as desired. Finally, we know that the velocity difference between adjacent modules never exceeded a constant bound because velocities themselves never exceeded a constant bound in this movement. Also, note that forces in this system are balanced with the contracting modules absorbing the sliding motion just described to result in the entire system keeping the same bounding box throughout reconfiguration as is visually apparent in Figure 3.

For the second reconfiguration step, we perform the reverse of the contraction operation just described. The only difference is instead of the modules expanding in the  $y$ -axis direction, they do so in the  $x$ -axis direction. By the principle of time reversal described in the Section 1 this operation can be done in exactly the same amount of time and using the same amount of force as the prior operation (and forces are balanced in the same way). Thus we also get that this step takes time  $T=2$ , thereby completing the confined cubes swapping problem in  $O(1)$  total time.  $\square$

Extending this analysis, we now consider the case of an  $m \times n$  array of normal, unit-dimension modules. That is, we have  $m$  rows with  $n$  modules each. We wish to transform this into a  $2m \times \frac{n}{2}$  array configuration. All of the same bounds on the physical properties of modules hold and gravity and friction are still ignored. Once more we wish to find the minimum movement time  $T$  for this reconfiguration.

**Lemma 4.** *Reconfiguring from an  $m \times n$  array of unit-dimension modules to an array of  $2m \times \frac{n}{2}$  unit-dimension modules takes  $O(\sqrt{m} + \sqrt{n})$  movement time.*

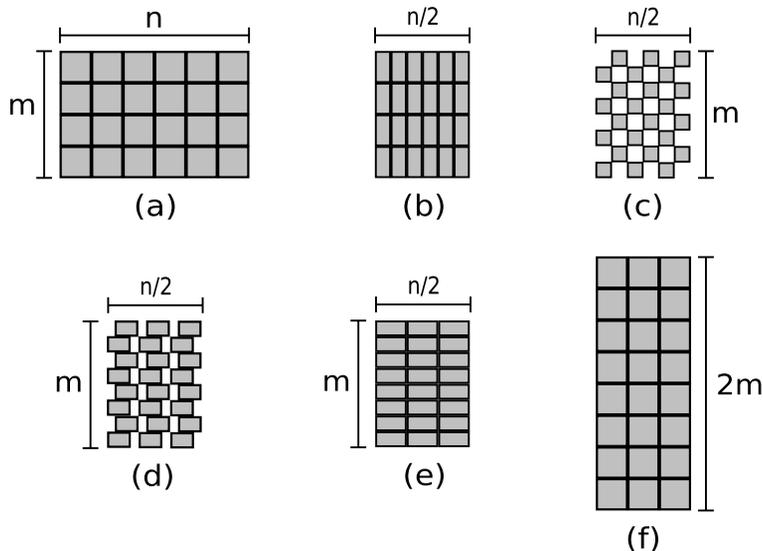


Fig. 4. **Reconfiguring an array of modules:** Horizontal contraction from stage (a) to (b). Vertical expansion from state (e) to (f). Note that the dimensions of the array remain unchanged through stages (b)–(e) as that is the *confined cubes swapping* subproblem.

**Proof:** Assign to the modules array coordinates  $(i, j)$  for being in row  $i$  and column  $j$ , counting from the bottom and from the left of the array, respectively. Let  $x_{(i,j)}(t)$  and  $y_{(i,j)}(t)$  denote the  $x$  and  $y$  coordinates of module  $(i, j)$ 's center at time  $t$ . Furthermore, let  $v_{(i,j)}^x(t)$  and  $a_{(i,j)}^x(t)$  give the velocity and acceleration, respectively, of module  $(i, j)$  at time  $t$  in the  $x$  direction. Let  $v_{(i,j)}^y(t)$  and  $a_{(i,j)}^y(t)$  do the same in the  $y$  direction. This reconfiguration problem will be completed in three stages, all of which have already been analyzed: the *Squeeze* problem, the *confined cubes swapping* problem, and the *Reverse Squeeze* problem.

In the first motion stage – state (a) to state (b) in Figure 4 – all  $m$  rows contract from length  $n$  to length  $n/2$  in time  $T_1$ . Note that this reconfiguration is just the *Squeeze* problem from Section 4, but now with several rows executing that same step simultaneously. All motion and forces occur in the  $x$  direction and the location of module  $(i, j)$  is described by  $x_{(i,j)}(0) = j - [n + 1]/2$  and  $x_{(i,j)}(T_1) = x_{(i,j)}(0)/2 = j/2 - [n + 1]/4$ . Since forces and motion only occur along individual rows (ignoring shearing) we treat each row individually and find the same reconfiguration problem as was solved in the the *Squeeze* problem. Solving in the same way, we first accelerate for  $0 \leq t \leq T_1/2$  and decelerate for  $T_1/2 \leq t \leq T_1$  we set  $\alpha_{(i,j)}^x = \frac{n+1-2j}{n-1}$  as the magnitude of that acceleration. As previously found, this leads to a final velocity of  $v_{(i,j)}^x(T_1) = \alpha_{(i,j)}^x(T_1 - T_1) = 0$  and a final  $x$  coordinate of  $x_{(i,j)}(T_1) = j - \frac{n+1}{2} + [\alpha_{(i,j)}^x [T_1]^2]/4$ . With our stated values for  $\alpha_{(i,j)}^x$ , setting  $T_1 = \sqrt{n-1}$  gives  $x_{(i,j)}(T_1) = j/2 - [n + 1]/4 = x_{(i,j)}(0)/2$  as desired. All forces are balanced and unit bound requirements are met just as during our analysis of the *Squeeze* problem.

For the second stage of motion, pairs of modules along each row independently and simultaneously solve the *confined cubes swapping* problem. This reconfiguration is shown in the changes from state (b) to state (e) in Figure 4. Let the contraction motion take place from  $T_1 < t \leq T_2$  and the expansion motion take place during  $T_2 < t \leq T_3$ . Let modules in even numbered columns move upward while modules in odd numbered columns move downward. Initially,  $y_{(i,j)}(T_1) = i - [m+1]/2$  for all modules. For even numbered modules, if  $i \leq m/2$  then  $y_{(i,j)}(T_2) = i - [m+1]/2 - 1/4$  and if  $i > m/2$  then  $y_{(i,j)}(T_2) = i - [m+1]/2 + 1/4$ . This is because all of these modules move upward, but our location for  $y = 0$  is through the middle of the module array. For odd numbered modules if  $i \leq m/2$  then  $y_{(i,j)}(T_2) = i - [m+1]/2 + 1/4$  and if  $i > m/2$  then  $y_{(i,j)}(T_2) = i - [m+1]/2 - 1/4$ .

The shift in horizontal locations during the expansion stage of this instance of the *confined cubes swapping* problem is similar. For modules formerly in even numbered columns with  $j \leq n/2$  we have  $x_{(i,j)}(T_2) = j/2 - [n+1]/4$  and  $x_{(i,j)}(T_3) = j/2 - [n+1]/4 + 1/4$  while for columns with  $j > n/2$  it is  $x_{(i,j)}(T_3) = j/2 - [n+1]/4 - 1/4$ . For modules formerly in odd numbered columns it is the opposite: if  $j \leq n/2$  then  $x_{(i,j)}(T_3) = j/2 - [n+1]/4 - 1/4$  and if  $j > n/2$  then  $x_{(i,j)}(T_3) = j/2 - [n+1]/4 + 1/4$ . This is because even numbered modules expand to the left while the odd numbered modules under them expand to the right. Note that by the analysis of the confined cubes swapping problem this stage takes time  $T_3 - T_1 = O(1)$ . Alternatively, we can just note that every modules moves only  $O(1)$  distance and so  $O(1)$  movement time is to be expected.

Now, from time  $T_3$  to  $T_4$  we need to perform the *Reverse Squeeze* problem and expand the modules in the vertical direction – state (e) to state (f) in Figure 5. The difficulty is that the number of rows has now doubled as modules from even numbered columns moved on top of modules from odd numbered columns. So, for each module  $(i, j)$  from an even numbered column, assign it a new row number  $k = 2i$ . For each module  $(i, j)$  from an odd numbered column, assign it  $k = 2i - 1$ . Now, let  $y_k(t)$  be the vertical location of a module in row  $k$ . At time  $t = T_3$  we have  $y_k(T_3) = k/2 - [2m+1]/4$ . After expansion, we wish to have  $y_k(T_4) = k - [2m+1]/2$ . This is exactly the *Reverse Squeeze* problem. So, we can again complete the expansion in to movement stages, one to accelerate and one to decelerate. It can be verified that this can be completed in time  $T_4 - T_3 = \sqrt{2m-1}$  (and by the principle of time reversal, this should be expected).

Thus we have completed the reconfiguration task in 3 stages taking  $\sqrt{n-1}$ ,  $O(1)$ , and  $\sqrt{2m-1}$  time, respectively. We also have that the total time for reconfiguration is  $O(\sqrt{m} + \sqrt{n})$ .  $\square$

### 5.3. Solving the $x$ -axis to $y$ -axis problem

The reconfiguration problem just analyzed may now be used iteratively to solve the  $x$ -axis to  $y$ -axis reconfiguration problem that was posed at the start of this paper. Note that a row of  $n$  modules can be viewed as a  $1 \times n$  array, which by the previous

lemma would take  $O(\sqrt{n})$  movement time to reconfigure into two stacked rows of  $n/2$  modules each. By continuing to apply our module array reconfiguration step, we double the height and halve the width of our array each time until we are left with a single vertical column of  $n$  modules.

This process will take  $O(\log_2 n)$  such steps, and so there would seem to be a danger of the reconfiguration problem requiring an extra  $\lg_2 n$  factor in its movement time. This is avoided because far less time is required to reconfigure arrays in intermediate steps. Note that the  $O(\sqrt{m} + \sqrt{n})$  time bound will be dominated by the larger of the two values  $m$  and  $n$ . For the first  $\lfloor (\lg_2 n)/2 \rfloor$  steps the larger value will be the number of columns  $n$ , until an array of  $\lfloor \sqrt{n} \rfloor \times \lceil \sqrt{n} \rceil$  dimensions is reached. In the next step a  $\lceil \sqrt{n} \rceil \times \lfloor \sqrt{n} \rfloor$  array of modules is created, and from that point on we have more rows than columns and the time bound is dominated by  $m$ .

The key aspect is that the movement time for each reconfiguration step is decreased by half from the time we begin until we reach an intermediate array of dimensions about  $\sqrt{n} \times \sqrt{n}$ . By the principle of time reversal it should take us the same amount of movement time to go from a single row of  $n$  modules to an  $\sqrt{n} \times \sqrt{n}$  cube as it does to go from that cube to a single column of  $n$  modules. This tactic is now used in our analysis to find the minimum reconfiguration time for the  $x$ -axis to  $y$ -axis problem.

**Lemma 5.** *The  $x$ -axis to  $y$ -axis reconfiguration problem can be completed in movement time  $O(\sqrt{n})$ .*

**Proof:** For simplicity, let  $n$  be even and let  $n = p^2$  for some integer  $p > 0$ . Let  $r(i)$  and  $c(i)$  be the number of rows and columns, respectively, in the module system after  $i$  reconfiguration steps. From the previous Lemma 4 in this section we have that a single step of reconfiguring an  $m \times n$  array of modules into a  $2m \times \frac{n}{2}$  array requires time  $O(\sqrt{m} + \sqrt{n})$ . Initially, assuming a large initial row length, then  $c(0) = n$ ,  $n \gg 1$ , and the reconfiguration step takes  $O(\sqrt{n})$  time. For subsequent steps we still have  $c(i) \gg r(i)$ , but  $c(1) = n/2, c(2) = n/4$ , etc. while  $r(1) = 2, r(2) = 4$ , etc. In general  $c(i) = n/2^i$  and  $r(i) = 2^i$ . Eventually, we get  $c(i') = r(i') = \sqrt{n}$  at  $i' = (\lg_2 n)/2$ . Up until that point the time for each reconfiguration stage  $i + 1$  is  $O(\sqrt{c(i)})$ . So, the total reconfiguration time to that point is given by the following summation.

$$\begin{aligned} \sum_{i=0}^{(\lg_2 n)/2} \sqrt{c(i)} &= \sum_{i=0}^{(\lg_2 n)/2} \sqrt{\frac{n}{2^i}} \\ &\leq \sqrt{n} \sum_{i=0}^{\infty} \left(\frac{1}{\sqrt{2}}\right)^i \\ &= \frac{\sqrt{n}}{1 - (1/\sqrt{2})} \\ &= O(\sqrt{n}) . \end{aligned}$$

Thus we have that reconfiguration from the initial row of  $n$  modules to the intermediate  $\sqrt{n} \times \sqrt{n}$  square configuration takes  $O(\sqrt{n})$  movement time. Reconfiguring from this cube to the goal configuration is just the reverse operation: we are simply creating a “vertical row” now instead of a horizontal one. This reverse operation will then take the exact same movement time using the same amounts of force as the original operation, so it too takes  $O(\sqrt{n})$  movement time. Thus, we have that while satisfying the requirements of our abstract model the  $x$ -axis to  $y$ -axis problem takes  $O(\sqrt{n})$  movement time.  $\square$

In the proof just given we assumed that the number of modules  $n$  was both even and the square of some integer ( $n = p^2$  for some integer  $p > 0$ ). This simplified the calculations above, but it was not necessary to achieve the  $O(\sqrt{n})$  movement time bound. One problem that could come up in a non-ideal case is if we have an intermediate configuration with an odd number of columns. Our reconfiguration sub-step required an even number of columns so that adjacent modules along each row can pair up and rearrange so that they are stacked vertically instead. During reconfiguration, whenever we have an odd number of columns we can simply leave the column at one end unchanged and only reconfigure the remaining columns as normal.

The question then is what does this do to the running time of the algorithm? We can see that at each stage where an odd number of columns is encountered, the reconfiguration movement time can be no greater than if we had one more column to make an even number. Thus, the total movement time of reconfiguring this non-ideal number of modules  $n$  must be bounded by the time to reconfigure the next largest power of 2. That is, the time to reconfigure  $m$  modules where  $m \geq n$  and  $m = 2^p$  for the smallest possible integer  $p$ . In choosing the smallest possible value for  $p$  we also get that  $2^{p-1} < n \leq 2^p = m$ . Hence,  $m \leq 2n$  and therefore if it takes  $O(\sqrt{m})$  time to reconfigure that larger, ideal number of modules then we have:  $O(\sqrt{m}) = O(\sqrt{2n}) = O(\sqrt{n})$ . Hence, combining this result with the lower bound shown in Subsection 4.2, we have also shown:

**Theorem 1.** *The total movement time for the  $x$ -axis to  $y$ -axis problem is both upper and lower bounded by  $\Theta(\sqrt{n})$ .*

Finally, it is also worth noting that although we chose the sliding cube module design as an example hardware system for the proofs in this paper, our results are not limited to this design only. Figure 5 gives a visual aide to what the same reconfiguration process would look like if it were instead implemented by fixed-size modules matching the sliding cube model of Rus et. al.<sup>2</sup> This abstract model was mentioned in this paper’s Related Work section and is referenced because it encapsulates many of the properties common to lattice style self-reconfigurable module designs. One possible extension needed to match the algorithmic intuition shown in Figure 5 is that we require modules to remain attached to multiple neighbors while reconfiguring, a requirement that some hardware designs may not match. Also, for our reconfiguration algorithm modules will either need to make a tricky corner tran-

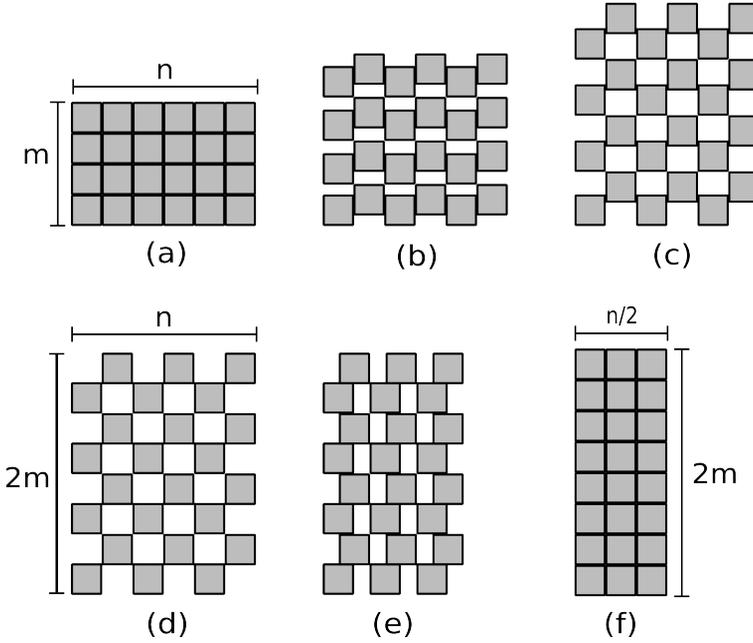


Fig. 5. **Sliding Cube Reconfiguration:** A demonstration of how the same  $x$ -axis to  $y$ -axis reconfiguration could be executed for another style of module design.

sition or could operate with multiple modules forming a base, meta-module unit as has been investigated in other related work.<sup>14–16</sup>

## 6. Conclusion

In this paper we have presented analysis of both kinematics and dynamics constraints that govern self-reconfigurable (SR) robots during their reconfiguration movements. While analysis of kinematics has been common, the addition of dynamics constraints is rare in the field of self-reconfigurable robots. To facilitate our analysis, we introduced a novel abstract model for self-reconfigurable (SR) robots that provides a basis for kinodynamic (kinematics and dynamics) motion planning for these robots. Our model explicitly requires that SR robot modules have unit bounds on their size, mass, magnitude of force or torque they can apply, and the relative velocity between directly connected modules. The model allows for feasible physical implementations and permits the use of basic laws of physics to derive improved reconfiguration algorithms and lower bounds.

In this paper we have focused on a simple and basic reconfiguration problem to demonstrate the importance of considering dynamics constraints for SR robot motion planning. Our main results were tight upper and lower bounds for the movement time for this problem. Our recursive *Squeeze* algorithm reconfigures a horizon-

tal row of  $n$  modules into a vertical column in  $O(\sqrt{n})$ -time. This result significantly improves on the running time of previous reconfiguration algorithms. Our algorithm satisfies the restrictions imposed by our abstract model and we also show that it is kinodynamically optimal given the assumptions of that model. A key property used to create our algorithm was that through the simultaneous application of constant-bounded forces by a system of modules, certain modules in the system can achieve velocities exceeding any constant bounds.

While carefully using the forces produced by modules, our analysis ignored forces caused by gravity and friction. While incorporating a full analysis of these forces is an important topic for future work, we did not immediately find a simple characterization to include them and still preserve the pure elegance of the results presented here. Regarding another issue, the algorithm given is a centralized planner and only solves a simple example to demonstrate that faster reconfiguration algorithms are possible. We note, however, that the multipart nature of SR robots makes distributed algorithms a necessity. Extending our lower-bound analysis to more complex analysis, and developing distributed algorithms to match those bounds, are topics for future work. We also note that this work was supported by NSF EMT Grant CCF-0829797, CCF-0829798 and AFSOR Contract FA9550-08-1-0188.

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