# Self-assembly of decidable sets

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**Abstract** The theme of this paper is computation in Winfree's Abstract Tile Assembly Model (TAM). We first review a simple, well-known tile assembly system (the "wedge construction") that is capable of universal computation. We then extend the wedge construction to prove the following result: if a set of natural numbers is decidable, then it and its complement's canonical two-dimensional representation self-assemble. This leads to a novel characterization of decidable sets of natural numbers in terms of self-assembly. Finally, we show that our characterization is robust with respect to various (restrictive) geometrical constraints.

**Keywords** Computability · Tile assembly · Self-assembly · DNA computing · Decidability · Universality · Space complexity

# 1 Introduction

In his 1998 PhD thesis, Winfree (1998) introduced the (abstract) Tile Assembly Model (TAM)—a mathematical model of laboratory-based nanoscale self-assembly. The TAM is also an extension of Wang tiling (1961, 1963). In the TAM, molecules are represented by un-rotatable, but translatable two-dimensional square "tiles," each side of which has a particular glue "color" and "strength" associated with it. Two tiles that are placed next to each other *interact* if the glue colors on their abutting sides match, and they *bind* if the strength on their abutting sides matches, and is at least a certain "temperature." Extensive refinements of the TAM were given by Rothemund and Winfree (2000; Rothemund 2001),

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and Lathrop et al. (2009) gave a treatment of the model that does not discriminate against the self-assembly of infinite structures.

Despite its deliberate over-simplification, the TAM is a computationally expressive model. For instance, Winfree (1998) proved that in two or more spatial dimensions, the TAM is capable of Turing-universal computation at temperature 2. On the other hand, Adleman, Kari, Kari, Reishus, and Sosík (Adleman et al. 2009) established that the TAM is universal (in two spatial dimensions) with respect to *non-deterministic* temperature 1 tile assembly systems. Doty et al. (to appear) then conjectured that any temperature 1 tile assembly system that produces a unique 2-dimensional terminal assembly must necessarily produce a "computationally very simple" shape, i.e., that the TAM is *not* Turing universal at temperature 1 with respect to deterministic self-assembly in two spatial dimensions. In a recent result, Fu and Schweller (2009) proved that the TAM is in fact Turing universal at temperature 1 in three spatial dimensions with respect to deterministic self-assembly systems.

Note that the universality of the TAM implies that it is possible to construct, for any Turing machine M and any input string w, a finite assembly system (i.e., finite set of tile types) that tiles the first quadrant and encodes the set of all configurations that M goes through when processing the input string w. In other words, the process of self-assembly can be, in some sense, directed algorithmically. But how is the computational expressiveness of a tile assembly system to be measured? In other words, what is the output of a tile system and how might we interpret it? There are two widely accepted notions that capture what it means to compute with a tile assembly system.

One interpretation of computation in the TAM is the self-assembly of a computationally interesting set (or pattern) on top of a much larger, possibly "less interesting", set that is used for auxiliary computations (so-called *weak* self-assembly). We say that a set of points X weakly self-assembles if there is a finite tile assembly system that places "black" tiles on, and only on, the points that are in X. Intuitively, one can view weak self-assembly as the process of a tile system "painting" a picture of the set X onto a much larger canvas of tiles. This interpretation was used by Papadakis and coauthors (2004) in which they exhibited both theoretical and molecular self-assemblies of the well-known fractal the discrete Sierpinski triangle.

The notion of weak self-assembly can be married to elementary computability theory in the following way: if X weakly self-assembles, then X is necessarily computably enumerable. Although the previously stated fact might not be surprising since the process of self-assembly can be simulated by a Turing machine, Lathrop et al. (to appear) discovered (perhaps surprisingly) that the converse holds in the following sense. If the set X is computably enumerable, then a "simple" two-dimensional representation of X, as points along the x-axis, weakly self-assembles. This result is interesting because its proof requires the simulation of a particular Turing machine M on *infinitely* many inputs (i.e., for all  $x \in \mathbb{N}$ ) in the two-dimensional discrete Euclidean plane  $\mathbb{Z}^2$ .

In contrast to weak self-assembly, one can interpret self-assembly as computation that takes as input an initial configuration of tiles (usually taken to be taken a single tile) and produces output in the form of some particular connected shape, and *nothing* else (i.e., *strict* self-assembly (Lathrop et al. 2009)). The strict self-assembly of general shapes, and their associated Kolmogorov (shape) complexity in the TAM, was studied beautifully and extensively by Soloveichik and Winfree (2007), where they proved the counter-intuitive fact that sometimes fewer tile types are required to self-assemble a "scaled-up" version of a particular shape than the actual un-scaled shape.

Of course, a major hurdle in studying the computational expressiveness of self-assembly is that of *providing input to tile assembly systems* (e.g., the size of a square, the description of a shape, etc.). In real-world laboratory implementations, as well as theoretical constructions, input to a tile system in the TAM is provided via a (possibly large) collection of "hard-coded" seed tile types (Rothemund and Winfree 2000; Soloveichik and Winfree 2007; Adleman et al. 2001; Barish et al. 2009). Unfortunately, in current implementations, having larger tile sets leads to increased error rates. This suggests that it might be advantageous to be able to provide input to a tile system without having to resort to hard-coding the input into a large number of its own tiles. As a result, several natural generalizations of the TAM have been developed in an attempt to model various types of alternative input delivery mechanisms.

One such model is the *staged self-assembly* model (Reif 1999; Demaine et al. 2008), in which several intermediate structures are allowed to assemble in different test tubes before they are all mixed together in a "2-handed" fashion in order to obtain the target structure. Demaine et al. (2008) proved that arbitrary shapes self-assemble with O(1) tile types but with a corresponding increase in the number of stages and even (in some cases) an increase in the scale of the target shape.

Another means of providing input to a tile system is through the programming of the relative concentrations of its tile types. Becker et al. (2006) proved that by appropriately setting the relative concentrations of tiles, squares, rectangles and diamonds can self-assemble in an expected sense with O(1) tile types, but with a large (and undesirable) variance. Kao and Schweller (2008) improved the aforementioned result by showing that it is possible to program the relative concentrations of O(1) tile types such that they will assemble into arbitrarily close approximations of  $N \times N$  squares with high probability. Furthermore, Doty (2009) recently showed that  $N \times N$  squares self-assemble *exactly* with high probability with O(1) tile types.

Input can also be delivered to a tile system through the deliberate variation of its temperature. The *multiple temperature* model (Kao and Schweller 2007; Cheng et al. 2005) is a natural generalization of the TAM, where the temperature of a tile system is dynamically adjusted by the experimenter as self-assembly proceeds. Aggarwal and coworkers (2005) proved that the number of tile types required to assemble "thin"  $k \times N$  rectangles can be reduced from  $O\left(\frac{N^{1/k}}{k}\right)$  (in the TAM) to  $O\left(\frac{\log N}{\log \log N}\right)$  if the temperature is allowed to change but once. Subsequently, Kao and Schweller (2007) discovered a clever "bit-flipping" scheme capable of assembling any  $N \times N$  square using O(1) tile types and  $\Theta(\log N)$  temperature changes.

Regardless of how the input of a tile system is delivered, a tile system must be able to ultimately transform the input into the desired output—whether that be into an exact shape or a pattern that is painted on top of a larger "canvas of tiles." How might we algorithmically direct this process? In other words, if the process of self-assembly is to be regarded as computation, how do we "program" it? There are several useful self-assembly algorithms that can be used to control the progress of self-assembly. For instance, in the TAM, "binary counter" tile systems (Adleman et al. 2001; Rothemund and Winfree 2000, Cheng et al. 2004, 2005) have been extensively utilized to precisely control the dimension of a particular exact regular shape such as a rectangle or a square. Another well-studied technique for directing the self-assembly of more intricate shapes and patterns is the simulation of Turing machines (Soloveichik and Winfree 2007; Rothemund and Winfree 2000; Lathrop et al. to appear).

#### 1.1 Motivation and statement of contributions

This paper is broadly motivated by the fact that while the computational-complexitytheoretic properties of the strict self-assembly of various classes of shapes have been extensively studied in the TAM (as well as generalized models of self-assembly), little is known about how to direct the more relaxed process of weak self-assembly. After all, weak self-assembly bestows upon a tile system a vast wealth of space in which to perform auxiliary computation. How do we most effectively utilize this space? In this paper, we continue our previous work from (Lathrop et al. to appear) in that we are particularly interested in studying various techniques that allow one to precisely direct the placement of specific "black" tiles (i.e., weak self-assembly) based on the outcome of simulating total Turing machines.

We first reproduce Winfree's proof of the universality of the TAM (Winfree 1998) in the form of a simple construction called the "wedge construction." The wedge construction self-assembles the *computation history* of an arbitrary TM *M* on input *w* in the space to the right of the *y*-axis, above the *x*-axis, and above the line y = x - |w| - 2. We then prove our first main result, which follows from an extension of the wedge construction and gives a new characterization of decidable languages of natural numbers in terms of (weak) self-assembly. That is, we prove that a set  $A \subseteq \mathbb{N}$  is decidable if and only if  $\{0\} \times -A$  and  $\{0\} \times (-A)^c$  weakly self-assemble. Technically speaking, our characterization is essentially the first main theorem from Lathrop et al. (to appear) with "computably enumerable" replaced by "decidable," and f(n) = n. Finally, we discuss how our construction is robust with respect to certain types of geometrical constraints, i.e., our characterization can be carried out in the set of integer lattice points lying *above* the *x*-axis yet *below* the line  $y = \frac{1}{a} \cdot x$ , for any  $a \in \mathbb{N}$ . It is worthy of note that all of our constructions are *singly-seeded*, i.e., self-assembly proceeds by starting from a single seed tile type that never appears elsewhere in the final output of the system.

## 2 The tile assembly model

We now give a brief intuitive sketch of the abstract TAM. See Winfree (1998), Rothemund and Winfree (2000), Rothemund (2001), Lathrop et al. (2009) for other developments of the model. We work in the 2-dimensional discrete Euclidean space. We write  $U_2 = \{(0, 1), (1, 0), (0, -1), (-1, 0)\}$ .

Intuitively, a tile type *t* is a unit square that can be translated, but not rotated, having a well-defined "side  $\vec{u}$ " for each  $\vec{u} \in U_2$ . Each side  $\vec{u}$  of *t* has a "glue" of "color" col<sub>t</sub>( $\vec{u}$ )—a string over some fixed alphabet  $\Sigma$ —and "strength" str<sub>t</sub>( $\vec{u}$ )—a natural number—specified by its type *t*. Two tiles *t* and *t'* that are placed at the points  $\vec{a}$  and  $\vec{a} + \vec{u}$  respectively, *bind* with *strength* str<sub>t</sub>( $\vec{u}$ ) if and only if (col<sub>t</sub>( $\vec{u}$ ), str<sub>t</sub>( $\vec{u}$ )) = (col<sub>t'</sub>( $-\vec{u}$ ), str<sub>t'</sub>( $-\vec{u}$ )).

Given a set *T* of tile types, an *assembly* is a partial function  $\alpha : \mathbb{Z}^2 \to T$ . An assembly is  $\tau$ -stable if it cannot be broken up into smaller assemblies without breaking bonds of total strength at least  $\tau$ , for some  $\tau \in \mathbb{N}$ .

Self-assembly begins with a *seed assembly*  $\sigma$  and proceeds asynchronously and nondeterministically, with tiles adsorbing one at a time to the existing assembly in any manner that preserves  $\tau$ -stability at all times. A *tile assembly system* (*TAS*) is an ordered triple  $T = (T, \sigma, \tau)$ , where T is a finite set of tile types,  $\sigma$  is a seed assembly with finite domain, and  $\tau \in \mathbb{N}$ . In this paper we deal exclusively with tile assembly systems in

which  $\tau = 2$ . A generalized tile assembly system (GTAS) is defined similarly, but without the finiteness requirements. We write  $\mathcal{A}[\mathcal{T}]$  for the set of all assemblies that can arise (in finitely many steps or in the limit) from  $\mathcal{T}$ . An assembly  $\alpha \in \mathcal{A}[\mathcal{T}]$  is terminal, and we write  $\alpha \in \mathcal{A}_{\Box}[\mathcal{T}]$ , if no tile can be  $\tau$ -stably added to it. It is clear that  $\mathcal{A}[\mathcal{T}] \subseteq \mathcal{A}_{\Box}[\mathcal{T}]$ .

An assembly sequence in a TAS  $\mathcal{T}$  is a (finite or infinite) sequence  $\vec{\alpha} = (\alpha_0, \alpha_1, ...)$  of assemblies in which each  $\alpha_{i+1}$  is obtained from  $\alpha_i$  by the addition of a single tile. The *result* res $(\vec{\alpha})$  of such an assembly sequence is its unique limiting assembly. (This is the last assembly in the sequence if the sequence is finite.) The set  $\mathcal{A}[\mathcal{T}]$  is partially ordered by the relation  $\longrightarrow$  defined by

$$\alpha \longrightarrow \alpha'$$
 iff there is an assembly sequence  $\vec{\alpha} = (\alpha_0, \alpha_1, ...)$   
such that  $\alpha_0 = \alpha$  and  $\alpha' = \operatorname{res}(\vec{\alpha})$ .

We say that  $\mathcal{T}$  is *directed* (a.k.a. *deterministic*, *confluent*, *produces a unique assembly*) if the relation  $\longrightarrow$  is directed, i.e., if for all  $\alpha, \alpha' \in \mathcal{A}[\mathcal{T}]$ , there exists  $\alpha'' \in \mathcal{A}[\mathcal{T}]$  such that  $\alpha \longrightarrow \alpha''$  and  $\alpha' \longrightarrow \alpha''$ . It is easy to show that  $\mathcal{T}$  is directed if and only if there is a unique terminal assembly  $\alpha \in \mathcal{A}[\mathcal{T}]$  such that  $\sigma \longrightarrow \alpha$ .

In general, even a directed TAS may have a very large (perhaps uncountably infinite) number of different assembly sequences leading to its terminal assembly. This seems to make it very difficult to prove that a TAS is directed. Fortunately, Soloveichik and Winfree (2007) have recently defined a property, *local determinism*, of assembly sequences and proven the remarkable fact that, if a TAS  $\mathcal{T}$  has *any* assembly sequence that is locally deterministic, then  $\mathcal{T}$  is directed. Intuitively, an assembly sequence  $\vec{\alpha}$  is locally deterministic if (1) each tile added in  $\vec{\alpha}$  "just barely" binds to the existing assembly; (2) if a tile of type  $t_0$  at a location  $\vec{m}$  and its immediate "output-neighbors" are deleted from the *result* of  $\vec{\alpha}$ , then no tile of type  $t \neq t_0$  can attach itself to the thus-obtained configuration at location  $\vec{m}$ ; and (3) the result of  $\vec{\alpha}$  is terminal.

A set  $X \subseteq \mathbb{Z}^2$  weakly self-assembles if there exists a TAS  $\mathcal{T} = (T, \sigma, \tau)$  and a set  $B \subseteq T$  such that  $\alpha^{-1}(B) = X$  holds for every terminal assembly  $\alpha \in \mathcal{A}_{\Box}[\mathcal{T}]$ .

Throughout this paper, tiles are depicted as squares whose various sides are dotted lines, solid lines, or doubled lines, indicating whether the glue strengths on these sides are 0, 1, or 2, respectively. Thus, for example, a tile of the type shown in Fig. 1 has glue of strength 0 on the left and bottom, glue of color 'a' and strength 2 on the top, and glue of color 'b' and strength 1 on the right. This tile also has a label 'L', which plays no formal role but may aid our understanding and discussion of the construction.

#### **3** The wedge construction: a review

In this section, we review the "wedge construction"—a simple, well-known technique used to carry out the simulation of an arbitrary Turing machine on some binary string in the

Fig. 1 An example tile type



first quadrant of the discrete Euclidean plane. We will later extend the wedge construction to prove a new characterization of decidable languages.

**Lemma 3.1** (The wedge construction) For every single-tape Turing machine M and input  $w \in \{0, 1\}^*$ , there exists a tile assembly system  $\mathcal{T}_{M(w)}$ , which simulates M on w in the following way.

- 1.  $\mathcal{T}_{M(w)}$  simulates the computation of M(w), with the configuration of M(w) after n steps represented by the line y = n in the terminal assembly of  $\mathcal{T}_{M(w)}$ ,
- 2. if *M* halts on *w* after *k* steps, then the line y = k + 1 in the terminal assembly of  $\mathcal{T}_{M(w)}$  contains one and only one "halting" tile that binds via a single strength-2 bond on its south edge, and
- 3.  $T_{M(w)}$  is locally deterministic, and therefore directed.

**Proof** Our proof is by construction. Let  $M = (Q, \Sigma, \Gamma, \delta, q_0, q_{accept}, q_{reject})$  be a Turing machine and  $w \in \{0, 1\}^*$ . Assume, without loss of generality, that M is a Turing machine having a one-way infinite-to-the-right tape such that the tape head of M never attempts to move left while reading the left most tape cell. We define the finite set of tile types  $T_{M(w)}$  as follows.

Definition of  $T_{M(w)}$ :

1. For all  $x \in \Gamma$ , add the seed row tile types:

Left most	Interior	Right most
$q_o x$	x	_*
$q_o x >$	> x >	> _
	ll	

2. For all  $x \in \Gamma$ , add the tile types:

Left of tape head Right of tape head  

$$\begin{array}{c|c} x \\ \hline x \\ \hline x \\ \hline x \end{array}$$

3. Add the following two tile types that grow the tape to the right:

2nd right most tape cell Right most tape cell  $\begin{array}{c} -* \\ -* \\ -* \\ -* \end{array}$ 

4. For all  $p, q \in Q$ , and all  $a, b, c \in \Gamma$  satisfying  $(q, b, R) = \delta(p, a)$  and  $q \notin \{q_{\text{accept}}, q_{\text{reject}}\}$  (i.e. for each transition moving the tape head to the right into a non-accepting state), add the tile types:

Tape cell with output					Cell that receives tape						
value after transition					head after transition						
		b					qc				
	<	b	pa			pa	qc	>			
		ра					с				

5. For all  $p, q \in Q$ , and all  $a, b, c \in \Gamma$  satisfying  $(q, b, L) = \delta(p, a)$  and  $q \notin \{q_{\text{accept}}, q_{\text{reject}}\}$  (i.e. for each transition moving the tape head to the left into a non-accepting state), add the tile types:

Tape cell with output					Cell that receives tape						
value a	$\operatorname{nsition}$	head after transition									
	b						qc				
	pa	b	>			<	qc	pa			
		pa					с				

6. For all  $p \in Q$ ,  $a, b \in \Gamma$ , and all  $h \in \{\text{reject}, \text{accept}\}\ \text{satisfying } \delta(q, b) \in \{q_{\text{accept}}, q_{\text{reject}}\}\ \times \Gamma \times \{L, R\}$ , with  $h = \text{accept}\ \text{if } \delta(q, b) = q_{\text{accept}}\ \text{and}\ h = \text{reject}\ \text{otherwise}\ (\text{i.e. for}\ \text{each transition moving the tape head into a halting state}), add the tile types:$ 

h	h
$_{pa}$ $qb$ >	< qb pa
b	b

Definition of  $\sigma_w$ : We now define the finite seed assembly  $\sigma_w$  of  $\mathcal{T}_{M(w)}$ . Let  $s_{\text{left}}$ ,  $s_{\text{interior}}$  and  $s_{\text{right}}$  be the "Left most," "Interior," and "Right most" tile types, respectively, defined above in the first group of "seed row" tile types. Define  $\sigma_w$  as follows.  $\sigma_w(0, 0) = s_{\text{left}}$ , where each occurrence of x in  $s_{\text{left}}$  is replaced by w[0] (i.e., the first bit of w); for all  $0 < i < |w|, \sigma_w(i, 0) = s_{\text{interior}}$ , with each occurrence of x in  $s_{\text{interior}}$  replaced by w[i]; let  $\sigma_w(0, |w|) = s_{\text{right}}$ ; finally, let  $\sigma_w$  be undefined at all other points in  $\mathbb{Z}^2$ .

Note that  $\mathcal{T}_{M(w)}$  satisfies property (1) of the conclusion of the lemma—this can be easily verified from the above definition of  $T_{M(w)}$  and is intuitively portrayed in Fig. 2. We now argue that  $\mathcal{T}_{M(w)}$  is locally deterministic. To do so, we first define an assembly sequence  $\vec{a}$ , leading to a terminal assembly  $\alpha = \operatorname{res}(\vec{a})$ , in which (1) the *j*th configuration  $C_i$  of M is

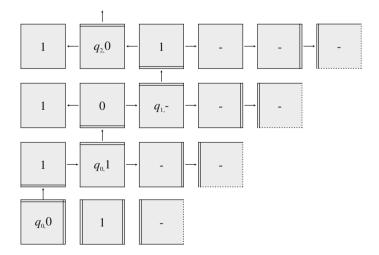


Fig. 2 Example of the first four rows of a sample wedge construction which is simulating a Turing machine M on the input string '01'

encoded in the row  $R_j = (\{0, ..., |w| - 1 + j\} \times \{j\})$ , and (2)  $\vec{\alpha}$  self-assembles  $C_i$  in its entirety before  $C_j$  if i < j. By the way we defined the tile types of  $T_{M(w)}$ , it is easy to see that every tile that binds in  $\vec{\alpha}$  does so deterministically, and with exactly strength-2 (either one strength-2 bond or two strength-1 bonds), whence  $\mathcal{T}_{M(w)}$  is locally deterministic. The lemma follows by the addition of two tile types, each having strength-2 glues on their south edges, labeled with "accept" and "reject" respectively.

The above "wedge" construction can be used to prove the following undecidability result.

**Corollary 3.2** The language defined as  $A = \{T \mid T \text{ is a TAS such that } T \text{ is locally deterministic} \}$  is undecidable.

*Proof* We will prove a stronger result: *A* is  $\Pi_1^0$ -complete (recall that the set  $\Pi_1^0$  is the set of all computably enumerable languages). To see that  $A \in \Pi_1^0$ , first note that

$$A = \left\{ \mathcal{T} \middle| \begin{array}{l} \text{for each } n \in \mathbb{N}, \vec{\alpha} \text{ is an assembly sequence in } \mathcal{T} \text{ of length } n, \\ \text{and } \vec{\alpha} \text{ satisfies the first two conditions of local determinism} \end{array} \right\}$$

Checking whether a finite assembly sequence in some tile assembly sequence satisfies the first two conditions of local determinism is a decidable condition, whence  $A \in \Pi_1^0$ .

Next, to show that A is  $\Pi_1^0$ -hard, we will exhibit a many-one reduction from the complement of the halting problem  $H^c$  to A. Our reduction F takes as input a Turing machine M and a binary string  $w \in \{0, 1\}^*$ , and outputs the tile assembly system  $\mathcal{T}_{M(w)}$  modified as follows: each "final halting tile type" is replaced by two distinct tile types that each have a strength-2 glue on their south edge but share the same glue label (either "accept" or "reject"). This clearly breaks the second condition of local determinism! Note that we could also modify  $\mathcal{T}_{M(w)}$  such that the final halting tiles bind with strength  $3 > \tau = 2$ , thus breaking the first condition of local determinism. It is clear that F is a reduction, seeing as how if M never halts on w, then  $\mathcal{T}_{M(w)}$  remains locally deterministic (because no halting tiles ever attach). However, if M halts on w, the one of the newly added halting tiles will non-deterministically attach breaking the local determinism of  $\mathcal{T}_{M(w)}$ .

#### 4 A new characterization of decidable languages

We now turn our attention to the self-assembly of decidable sets of positive integers. We will extend the wedge construction from the previous section in order to prove that, for every decidable set  $\{0\} \times -A$ , there exists a directed TAS  $\mathcal{T}_A = (T_A, \sigma, \tau)$  in which  $\{0\} \times -A$  weakly self-assembles. Our proof relies on the following observation.

**Observation 1** If  $A \subseteq \mathbb{N}$  is a decidable set, then there is a TM M, such that for every  $w \in A$ , M halts on w.

This means that we can essentially "stack" wedge constructions one on top of the other. Intuitively, our main construction is the "self-assembly version" of the following enumerator.

```
while 1 \le w < \infty do
simulate M on the binary representation of w
if M accepts then
output 1
else
output 0
end if
w := w + 1
end while
```

Just as the above enumerator prints the characteristic sequence of A, our construction will self-assemble a canonical two-dimensional representation of the characteristic sequence of A as points along the negative y-axis.

4.1 Main construction: self-assembly of 2-dimensional representations of decidable languages

In this section we present the full construction of the tile assembly system  $T_A$ , and in the next section we provide a higher-level description of the behavior of our tile system. Note that we used the Tile Set Designer graphical interface to the TAM DSL (Doty and Patitz 2009) to design the tile set for this construction and the ISU TAS simulator (Patitz 2009) to simulate it. Both software packages are available for download from http://www.cs.iastate. edu/~lnsa.

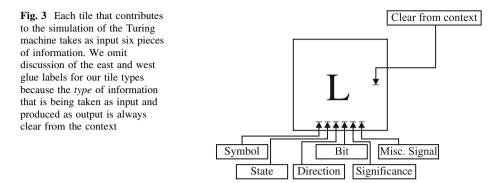
**Lemma 4.1** Let  $A \subseteq \mathbb{N}$  be a decidable set. There exists a directed, singly-seeded, tile assembly system  $\mathcal{T}_A = (T_A, \sigma, 2)$  in which the set  $\{0\} \times -A$  weakly self-assembles.

**Proof** Our proof is by construction. Let  $M = (Q, \Sigma, \Gamma, \delta, q_0, q_{accept}, q_{reject})$  be a Turing machine with blank symbol '-'  $\in \Gamma$  and L(M) = A. Assume, without loss of generality, that M is a total Turing machine having a one-way infinite-to-the-right tape such that the tape head of M never attempts to move left while reading the left most tape cell. We give the full specification of  $T_A$  and  $\sigma$  below.

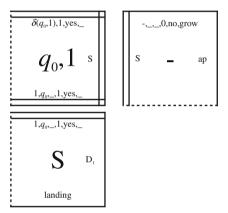
*Simulation tiles*: Throughout our construction of simulation tiles, every tile takes as input, and ultimately outputs, six pieces of information along its south and north edges, respectively:

- 1. The symbol stored in the tape cell represented by this tile,
- 2. the current state of the Turing machine that is being simulated,
- 3. the direction of movement of the tape head,
- 4. the value of the bit that is embedded into this tile,
- 5. the significance of the aforementioned bit, and
- 6. a miscellaneous signal.

This situation is illustrated in Fig. 3. Note that some or all of these six pieces of information might not be relevant at certain times during the assembly process. Therefore, we use underscores (i.e., "place holder" values) to denote the absence of values of some of the signals when they are not required. The following list of tile types encode the logic of the Turing machine M that decides A.



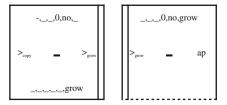
1. The following tile types appear only near the seed tile type (the tile having the 'S' label).



2. The following tile type only appears near the seed and receives the tape head from the left. For all  $p \in Q - \{q_{\text{accept}}, q_{\text{reject}}\}$ , add the following tile type.

$$\delta^{(p,-),0,\mathrm{no},-}$$
  
 $p$   $p, - >_{grow}$   
 $-,-,-,0,\mathrm{no},\mathrm{grow}$ 

3. The following tile types "grow" the tape one cell to the right.



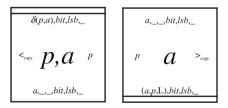
4. The following tile types move the tape head right. For all For all  $p \in Q - \{q_{\text{accept}}, q_{\text{reject}}\}, a \in \Gamma, bit \in \{0, 1\}, \text{ and } lsb \in \{\text{yes, no}\}, \text{ add the following tile types.}$ As noted above, the three pieces of information passed upward are the current symbol in this particular tape cell, and the current value of the bit of this column along with its significance.



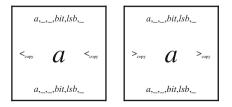
5. The following tile type receives the tape head from the left. For all  $p \in Q - \{q_{\text{accept}}, q_{\text{reject}}\}, a \in \Gamma$ , and  $bit \in \{0, 1\}$ , add the following tile types.

$$\delta(p,a),bit,no,\_$$
 $p p,a >_{copy}$ 
 $a,\_,\_bit,no,\_$ 

The following tile types receive the tape head from the right and move the tape head left (respectively). For all For all *p* ∈ *Q* − {*q*<sub>accept</sub>, *q*<sub>reject</sub>}, *a* ∈ Γ, *bit* ∈ {0, 1}, and *lsb* ∈ {yes, no}, add the following tile types.



 The following tile types copy the contents of the tape to the left and right of the tape head up to the next row (respectively). For all *a* ∈ Γ, *bit* ∈ {0, 1}, *lsb* ∈ {yes, no}, add the following tile types.



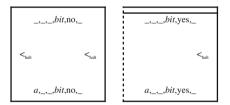
8. The following tile type halts the Turing machine when the tape head is not reading the left most tape cell. For all  $h \in \{accept, reject\}$ , and  $bit \in \{0, 1\}$ , add the following tile type.



9. The following tile type halts the Turing machine when the tape head *is* reading the left most tape cell. For all  $h \in \{accept, reject\}$ , and  $bit \in \{0, 1\}$ , add the following tile type.



10. The following tile types search (to the left of the tape head) for the left most tape cell after halting. For all  $a \in \Gamma$ , and  $bit \in \{0, 1\}$ , add the following tile types.



11. The following tile type transfers the halting state (either accept or reject) to the right enroute to the negative y-axis. For all  $a \in \Gamma$  and  $bit \in \{0, 1\}$ , add the following tile type.

12. The following tile types prepare to send the one-tile-wide path containing the halting state (either accept or reject) down to the negative y-axis. For all  $h \in \{q_{accept}, q_{reject}\}$ , add the following tile types.



13. The following tile type is the right most tile to attach in any halting row. Add the following tile type.



The following tile types "extract" the bits that are embedded within each simulation of the Turing machine. This is the final step before the count is incremented by one and used as input to the next simulation.

1. The following tile types initiate and carry out the bit extraction procedure starting from the least significant bit and working toward the right edge of the previous row of the assembly. For all  $bit \in \{0, 1\}$ , add the following tile types.

2. The following tile types extract the final two bits. The tile type on the left extracts the final bit of the previous row, and the tile type on the right side adds a dummy bit to maintain the geometry of the right most edge of the assembly. Add the following tile types.

The following tile types self-assemble on top of the bit-extraction row and increments the value of these bits by 1.

1. The following tile type initiates the increment process starting from the least significant bit. For all  $bit \in \{0, 1\}$ , add the following tile type.

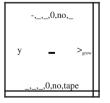


2. The following tile type performs the bulk of the increment procedure. For all  $bit_0 \in \{0, 1\}$  and  $c_0 \in \{0, 1\}$ , add the following tile type, where  $c_1 = \frac{|bit_0 + c_0|}{2}$  and  $bit_1 = (bit_0 + c_0) \mod 2$ .

3. The following tile types are the final two tile types to attach in any increment row. Since the right edge of the construction grows faster than the length of the binary integers, the bits will always be 0. Add the following tile types.

The following list of tile types build the initial configuration of the "next" simulation of M.

1. The following tile type assembles the right most tape cell (it always contains a blank) with a 0 bit embedded in it. Note that the 'y' signal is used to search for the right most 1 bit in the previous row. Add the following tile type



2. The following tile type continues the search (via the 'y' signal) for the right most 1 bit in the previous row. While doing so, blank symbols are encoded in the tape and 0 bits are also embedded. For all  $bit \in \{0, 1\}$ , add the following tile type.



3. The following tile type attaches directly above the right most 1 bit in the previous row. In this case, the 1 bit is encoded in the tape and the embedded bit is 1. Note that this never occurs in the least significant bit. We terminate our search by changing the 'y' signal to <<sub>init</sub>. Add the following tile types.



4. The following tile type initializes the contents of the tape to the left of the right most 1 bit. Here, we simply encode each cell with the appropriate bit from the previous row. Add the following tile type.

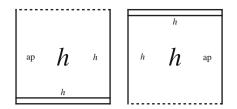
5. This tile type starts the next simulation of *M*. For all  $bit \in \{0, 1\}$ , add the following tile type.

(bit, R, q\_0), bit, yes,\_  
$$q_0, bit <_{mit}$$
  
\_,\_,\_,bit, yes,\_

"Decision path" tiles: All of the previous tile types contribute to the simulation of M on every input  $x \in \mathbb{N}$ . We complete our construction by adding the tile types that self-assemble one-tile-wide "decision paths" that result in the placement of black (accept) or non-black (reject) tiles on the negative y-axis.

1. The following tile types initiate the one-tile-wide "decision path." This path starts from the right edge of a halting row (see above tile types) and carries the answer to the question, "did the Turing machine accept or reject?" Note that the geometry of the

existing assembly guides the path down to the appropriate point on the negative y-axis. For each  $h \in \{accept, reject\}$ , add the following tile types.



2. The following tile types allow the decision paths to "turn" the corner and thus head straight for the appropriate point on the negative *y*-axis. We use the D<sub>0</sub> and D<sub>1</sub> signals to accomplish this task. For each  $h \in \{accept, reject\}$ , add the following tile types.

D,	h h,D,	h
h	h,D <sub>0</sub> h	D <sub>1</sub>

3. The following tile types assemble the final segment of each decision path. The tile type that is placed on the negative *y*-axis is the left most tile below. For each  $h \in \{accept, reject\}$ , add the following tile types.

landing	final
h h	<i>h h h</i>
landing	final

Let  $T_A$  be the set of *all* of the tile types that are defined above. Let  $\sigma$  be the seed assembly consisting of the unique tile type having the label 'S' placed at the origin and undefined at every other point  $\vec{0} \neq \vec{x} \in \mathbb{Z}^2$ . Finally, define the tile assembly system  $T_A = (T_A, \sigma, 2)$ . A routine local determinism argument can be used to show that  $T_A$  is locally deterministic and therefore directed.

Choosing the set *B* (a.k.a., the set of "black" tiles) to be the singleton set containing the left most tile type in the last pair of tile types defined above, where h = accept, proves that  $\{0\} \times -A$  weakly self-assembles.

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This section gives a high-level, intuitive description of the constructive Proof of Lemma 4.1. Note that  $\mathcal{T}_A$  is a singly-seeded, two-dimensional temperature 2 tile assembly system. The seed tile type is the unique tile type having a label of 'S.' We place the seed tile at the point (0, 0).

**Definition 4.2** In our construction, for all  $n \in \mathbb{N}$ , there exists a one-tile-wide path that carries the answer to the question "is  $n \in A$ ?" to the point (0, -n). We call such a path a *decision path*.

The tile assembly system  $\mathcal{T}_A$  consists of two logical modules. The first of these modules carries out the simulation of M on the binary representation of  $1 \le n \in \mathbb{N}$ . In order to simulate M on the binary representation of every natural number, we embed a kind of log width binary counter into the tiles of  $\mathcal{T}_A$ . Thus, each tile must "remember" (and possibly modify) the value and significance of a particular bit in the binary counter. Note that, because of the way we embedded the counter,  $\mathcal{T}_A$  actually simulates M on the reverse of the binary representation of every natural number. Tiles must also keep track of information pertaining to the simulation of M on a given input. The information that each tile is responsible for is shown visually in Fig. 3.

The assembly process starts by  $\mathcal{T}_A$  simulating M on the binary representation of 1. In general, after the simulation of M on i but *before* the simulation of M on i + 1,  $\mathcal{T}_A$  performs the following tasks.

- 1. The answer to the question "Does *M* accept or reject *i*?" is propagated via a one-tile-wide "decision path" down to the point (0, -i) (discussed below),
- 2. the bits of the embedded binary counter are extracted in the row immediately above the row of tiles representing the halting configuration of M on i,
- 3. in the row immediately above the row in which the bits of the binary counter were extracted, the value of the binary counter is incremented by 1, and finally,
- the simulation of M on i + 1 is initialized and proceeds in the same fashion as that of M on i.

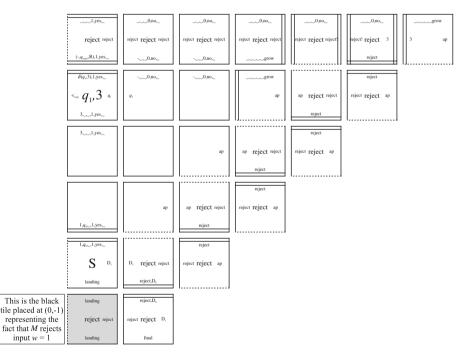
We give a concrete example of this four-step procedure in Fig. 4.

The second component of  $\mathcal{T}_A$  is a small group of tile types that carry the "accept" and "reject" signals to the appropriate location on the negative y-axis via a one-tile-wide path of tiles. The geometry of the existing assembly "guides" these decision paths to the correct location. Each decision path originates from the halting tile and proceeds down toward the x-axis. In order for each path to turn the corner and proceed toward their final destination somewhere on the negative y-axis, we propagate "diagonal" signals (i.e., D<sub>0</sub> and D<sub>1</sub>) down and to the right into the fourth quadrant. An example of this process is illustrated in Fig. 5.

Note that the simulation component of  $\mathcal{T}_A$  can self-assemble in the absence of the decision path component whereas the latter requires the former to self-assemble. Figure 6 shows the "flow" of information from the simulation components (the light grey spaces) to their respective halting rows (dark grey horizontal rows) down to the appropriate point on the negative *y*-axis via a decision path (the dark grey paths that snake down and to the left along the assembly).

	Ť									
After the increment, the initial	(0.R.g.),0.yes	1,,1,no,	0,ao	0,no	~0.no	0.mo	0.mo	·0,m	0.no	0.mo.grow
configuration of the simulation of M on w	$q_{0},0 \sim$	< 1 y	у = у	у – у	у _ у	у — у	У = У	у _ у	y = > <sub>pn</sub>	>, ap
= 01 (2) is assembled	0.yes		0,80,	0,no,	0,no,	0,no,	0.no	0,no	0,no,tape	
In this row, the bits	0.yes		0,80	0,00,	0.00	0,80	0,80	0.no	0,по,таре	
of the binary counter are	0 '	1 1 º	• 0 •	° 0 °	• 0 •	• 0 •	• 0 •	° 0 °	° 0 *	
incremented by 1	l.yes_		0,no,	0.no		0,no		0.mo.grow		
After sending the halting signal, the	1.yes	0,no,	0,no,	0.no		0,mo	0,no,	0,no.grow		
embedded bits of the counter are	1 -	». O ».	~ 0 ~	× 0 ×	». O ».	» 0 »	»    0    ».	> 0 ap		
extracted here	l.yes	0,no		0.00	0,no	0,no				
M halts and rejects, so we build a	l.yes_	0,no	0,no,	0.no	0.no	0,no	0ло.grow			
halting row that sends the "reject"	reject wint	reject	nint reject nint	nint reject nint	miner reject miner	miner reject 3	3 ар			
signal to the right	(-,q <sub>ajar</sub> ,R),1,yes,	0,no,	0.no			reject				
We start with a row	δ(q,3),1.yes	0,no,	0.no,	grow		↓ I				
that represents some configuration	~q <sub>1</sub> ,3 *	q >	$s_m = s_m$	> = ap		answer patl	1"			
of $M$ on bit the string $w = 1$	31.yes	(q.,L),0,no,	grow		L					
		↑								

Fig. 4 Trivial example of the "halt-extract-increment-initialize" procedure carried out by our construction



**Fig. 5** Trivial example of the one-tile-wide "decision path" that carries the answer to the question "is  $1 \in L(M)$ ?" down to the appropriate point on the negative y-axis. Note that the  $D_0$  and  $D_1$  signals allow each decision path to turn the "corner" and proceed left toward the negative y-axis

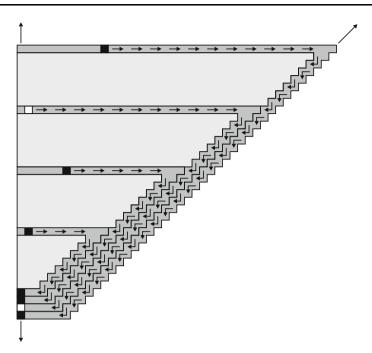
## 4.3 First main theorem

The following technical result is a primitive self-assembly simulator.

**Lemma 4.3** Let  $A \subseteq \mathbb{Z}^2$ . If A weakly self-assembles, then there exists a TM  $M_A$  with  $L(M_A) = A$ .

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**Fig. 6** Intuitive depiction of the behavior of  $\mathcal{T}_A$ . The *dark grey (horizontal)* rows are halting rows. The *arrows* represent one-tile-wide paths of tiles that carry the answer to the question "is  $n \in A$ ?" down to the negative y-axis

*Proof* Assume that *A* weakly self-assembles. Then there exists a TAS  $\mathcal{T} = (T, \sigma, \tau)$  in which the set *A* weakly self-assembles. Let *B* be the set of "black" tile types given in the definition of weak self-assembly. Fix some enumeration  $\vec{a}_1, \vec{a}_2, \vec{a}_3...$  of  $\mathbb{Z}^2$ , and let  $M_A$  be the TM, defined as follows.

```
Require \vec{v} \in \mathbb{Z}^2

\alpha := \sigma

while \vec{v} \notin \text{dom } \alpha \text{ do}

choose the least j \in \mathbb{N} such that some tile can be added to \alpha at \vec{a}_j

choose some t \in T that can be added to \alpha at \vec{a}_j

add t to \alpha at \vec{a}_j

end while

if \alpha(\vec{v}) \in B then

accept

else

reject

end if
```

It is routine to verify that  $M_A$  accepts A. **Lemma 4.4** Let  $A \subseteq \mathbb{N}$ . If  $\{0\} \times -A$  and  $\{0\} \times (-A)^c$  weakly self-assemble, then A is decidable. *Proof* Assume the hypothesis. Then by Lemma 4.3, there exist TMs  $M_{\{0\}\times -A}$  and  $M_{\{0\}\times (-A)^c\times -\mathbb{N}}$  satisfying  $L(M_{\{0\}\times -A}) = \{0\} \times -A$ , and  $L(M_{\{0\}\times (-A)^c}) = \{0\} \times (-A)^c$ , respectively. Now define the TM *M* as follows.

```
Require n \in \mathbb{N}

Simulate both M_{\{0\}\times -A} and (M_{\{0\}\times (-A)^c}) on input (0, -n) in parallel.

if M_{\{0\}\times -A} accepts then

accept

end if

if (M_{\{0\}\times (-A)^c}) accepts then

reject

end if
```

It is clear that M is a decider for A.

**Lemma 4.5** Let  $A \subseteq \mathbb{N}$ . If the set A is decidable, then  $\{0\} \times -A$  and  $\{0\} \times (-A)^c$  weakly self-assemble.

*Proof* This follows immediately from Lemma 4.1.

We now have the machinery to prove our main result.

**Theorem 4.6** Let  $A \subseteq \mathbb{N}$ . The set A is decidable if and only if  $\{0\} \times -A$  and  $\{0\} \times (-A)^c$  weakly self-assemble. Furthermore, a single tile set suffices in that the choice of B (the set of "black" tiles) determines whether  $\{0\} \times -A$  or  $\{0\} \times (-A)^c$  self-assembles.

*Proof* This follows from Lemmas 4.4 and 4.5.

In the next section, we will analyze the space requirements of this assembly and present a series of constructions which require less space, but at a price of increasing the tile set (a.k.a., program-size (Rothemund and Winfree 2000)) complexity.

#### 5 Space requirements of the self-assembly of decidable sets

In the Proof of Theorem 4.6, we exhibited a directed TAS whose (infinite) terminal assembly requires two full quadrants of the plane. This leads one to ask the natural question: is it possible to do any better than two quadrants? In other words, does Theorem 4.6 hold if only one quadrant of space, or less, is allowed? By investigating this, we hope to develop interesting "tile programming tricks".

If  $A \in DSPACE(n)$ , then it is possible to modify our construction to weakly selfassemble  $A \times \{0\}$  using only one quadrant of space by making the tape for each computation M(n) exactly n - 1 tiles wide, then self-assembling a path with the result directly down the right side of the assembly to the location (n,0). However, in the case that  $A \notin DSPACE(O(n))$ , this particular construction technique does not suffice to selfassemble  $A \times \{0\}$  within only one quadrant because we happen to use one tile to represent each tape cell and furthermore we grow the Turing machine tape to the right once per computation step. In the remainder of this section we will discuss why this is the case, as well as alternative constructions which do suffice even for such complex languages, and their space requirements.

 $\Box$ 

## 5.1 The impact of the decision paths

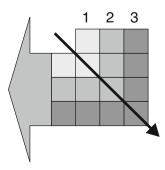
It is clear that the portions of the assembly of our main construction, which initiate and perform each of the infinite series of computations, are contained within a wedge-shaped portion of a single quadrant. However, the decision paths end up being the portion of the assembly which force the additional space requirement of a second quadrant for sufficiently complex languages.

If the language  $A \notin DSPACE(O(n))$ , then there exists some n for which the computation M(n) requires more than O(n) amount of space, and therefore the assembly simulating M(n) requires at least one row of tiles whose width is at least n tiles. Since the row of tiles forming the computation will already be in place and cannot be removed to allow the decision path through, in order for the decision path emanating from this computation to terminate in the correct location, (n, 0), it will have to go around that row, passing through an x-coordinate greater than n, then turn left at some point. (This ignores the possibility of the decision paths traveling down the left side of the assembly since they would therefore already be using a second quadrant.) Additionally, each of the infinite number of subsequent decision paths will then have to assemble around that path. Figure 7 depicts the situation where the first three paths in an infinite series of paths make a left turn. Figure 6 exemplifies how the diagonal along the right side of our construction makes a series of "left-turns." Note that each subsequent path must be translated one additional coordinate downward, and therefore, since there must be an infinite number of subsequent paths, eventually the decision path for some  $m \in \mathbb{N}$  must place a tile on the x-axis in a location other than (m, 0), or otherwise block another decision path. It is for this reason that the Main Construction requires the use of two quadrants for a language A of sufficient space complexity.

## 5.2 Squeezing more information into each decision path

As shown above, the decision paths of the Main Construction form a virtual bottleneck which force the assembly into a second quadrant. This is due to the fact that each computation has its own, unique, decision path. However, if we "compress" more information into the decision paths, we can further reduce the space requirements. In fact, with a tradeoff in tile set complexity, where complexity is measured as the size of the tile set required, not only can one quadrant be made sufficient, but an arbitrarily small slice of a single quadrant can suffice.

Fig. 7 Example of a series of paths which make a left turn. Notice that if path "2" assembles after path "1", in order to make the turn it must be translated one additional coordinate downward. This must occur for each of the infinite series of paths which follow



#### 5.2.1 A single-quadrant construction

For our next construction, instead of creating a decision path for each individual computation, we let four computations complete (i.e. M(n), M(n + 1), M(n + 2), and M(n + 3)) and then create a single decision path which collects and transmits all four answers to their correct locations on the x-axis. Figure 8 shows a high-level overview of this construction.

Essentially, an additional counter value which cycles from 0 to 3 and increments at the completion of each computation is passed upward through the right side of each computation. This allows the completion of each fourth computation to initiate the growth of a decision path which moves downward, collecting the previous three results until the single path contains four results. It then continues to the *x*-axis where it deposits all four results and initiates the growth of an upward growing path which eventually allows the next set of results to be propagated downward. Note that a main function of the upward growing path is to propagate a marker denoting which row is immediately above the *x*-axis to the right side of the assembly, and thus signal the next downward growing path when it needs to "unpack" its results.

This "compression" of four results into each result path obviates the need for the assembly to grow into a second quadrant, and it does so with only a trivial increase in tile set complexity, which comes mostly from the  $2^2 + 2^3 + 2^4$  tile types which must be added to allow the collection and transmission of 4 results in each decision path.

# 5.2.2 Constructions using arbitrarily thin "pie" slices of one quadrant

We now demonstrate how we can further exploit the method of compressing increasingly larger sets of results into each decision path to create constructions that use arbitrarily thin

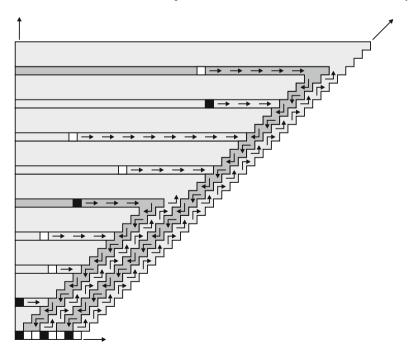
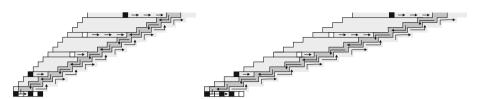


Fig. 8 The single quadrant construction



**Fig. 9** Examples of assemblies which weakly self-assembly the set  $A \times \{0\}$  within the portions of Quadrant 1 (approximately) underneath the lines y = x (*left*) and y = x/2 (*right*), corresponding to s = 1 and s = 2, respectively. Note that the constructions must combine 6 (for the left) and 8 (for the right) signals into each decision path

(but infinite) pie-shaped slices of a single quadrant. These constructions will be accompanied by a quickly growing trade off in tile set complexity which we will also analyze. Note that we merely sketch these constructions and leave open the problem of implementation, and perhaps further optimization with regards to space and tile set complexity.

First, note that a standard wedge construction can be modified so that the leftmost tile of each row is *s* positions further to the right than the leftmost tile of the row immediately below it. This is done by:

- 1. Initiating the growth of each row at the leftmost position and growing from left to right.
- 2. Within each tile representing the *n*th tape cell from the left of the tape, encode the contents of tape cells (n s, ..., n), including the state information if one of those cells contains the tape head.

This works because the tile representing the tape cell that must receive the tape head after a left or right moving transition always assembles either directly above or above and to the right of the tile representing the tape head in the previous row, and therefore that information is available as necessary to each proceeding row. One additional difference from the standard wedge construction is that, if a computation enters a halting state while the tape head is on the *n*th tape cell from the left, *n/s* additional rows (in which no computation is performed) will need to assemble before the information that it halted reaches the leftmost edge and the assembly of that simulation can terminate.

By using such a "slanted" wedge construction in the construction of Sect. 5.2.1 and modifying the decision paths to conform to the desired slope and to accumulate and carry 2s + 4 results to the x-axis, (along with a few other trivial modifications) an assembly which requires only the portion of the first quadrant lying below the line y = x/s can form which weakly self-assembles  $A \times \{0\}$ . Two examples of such constructions and their desired behaviors can be seen in Fig. 9.

We conjecture that the tradeoff for shrinking the assembly into such arbitrarily small "pie slices" of the first quadrant is an exponential increase in tile set complexity. In fact, for a given *s*, the size of the tile set required for our proposed assembly would be  $O(\gamma^{s+1})$  where  $\gamma = |\Gamma|$  (and  $\Gamma$  is the tape alphabet of the Turing machine M being simulated). Note that the tile complexity of our original two-quadrant construction is  $O(\gamma^1)$  (this bound also holds for our one-quadrant construction as well).

#### 6 Conclusion

In this paper, we investigated the self-assembly of decidable sets of natural numbers in the TAM. We proved that, for every decidable language  $A \subseteq \mathbb{N}$ ,  $\{0\} \times -A$  and  $\{0\} \times (-A)^c$ 

weakly self-assemble. This implied a novel characterization of decidable sets in terms of self-assembly. We then analyzed the space requirements of our construction and showed that, in general, for decidable languages, our construction requires two quadrants of space. This led us to the presentation of slightly modified constructions which required, first, only one quadrant of space, and then increasingly smaller portions of a single quadrant. However, this decrease in space was accompanied a "proportional" increase in the size of the tile set complexity.

Additional examples of the trade off between the space complexity of languages and the amount of space required to self-assemble their characteristic sequences in the TAM include the fact that one *spatial* dimension is sufficient to self-assemble  $A \times \{0\}$  if and only if A is a regular language over a unary alphabet, and our speculation that if A is a regular language over a binary alphabet that only one *fractal* dimension would be required. Many open problems related to such relationships remain, such as the implementation and potential optimization of our "pie-slice" constructions, and a proof of our above speculation about regular languages over binary alphabets. We hope that continued research in this direction will further extend these results, exposing, more and more, the rich interconnectedness between geometry and computation in the TAM.

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