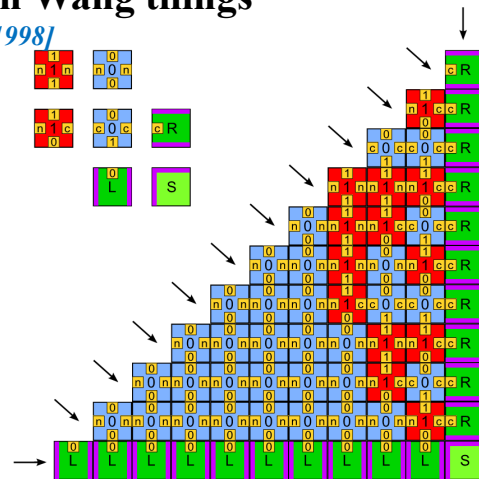


# Tile Complexity of Assembly of Length N Arrays and N x N Squares

by John Reif and Harish Chandran

## Tile assembly model (TAM)

- Proposed by Erik Winfree developing on Wang tilings
  - *[Winfree: Simulations of Computing by Self-Assembly, 1998]*
- Simple, yet powerful model
- Refines Wang tiling
- Models crystal growth
- Also, Turing-complete
- Can be implemented using DNA molecules



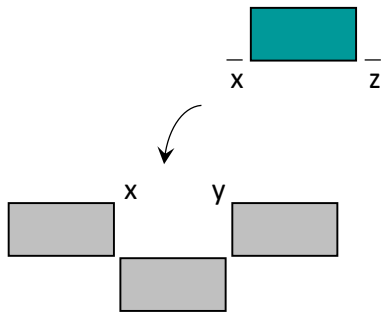
# Abstract Tile Assembly Model:

[Rothemund, Winfree, '2000]

**Temperature:** A positive integer. (Usually 1 or 2)

**A set of tile types:** Each tile is an oriented rectangle with glues on its corners. Each glue has a non-negative strength (0, 1 or 2).

**An initial assembly (seed).**



A tile can attach to an assembly iff the combined strength of the “matched glues” is greater or equal than the temperature  $T$ .

(Chen)

3

## Tile Complexity

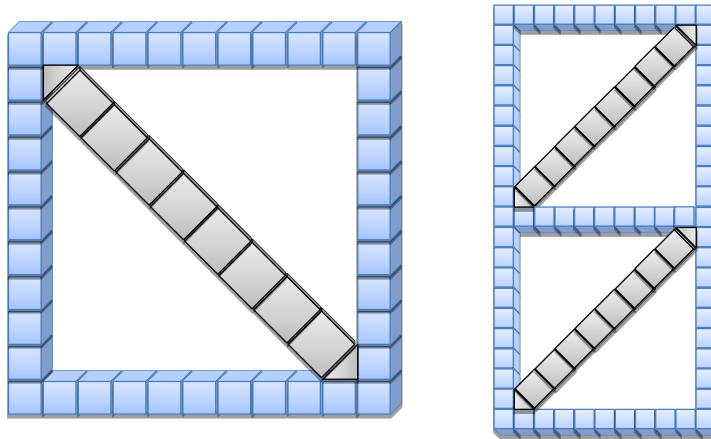
- **Tile Complexity** is the Number of tile types to construct a shape
- Need to minimize the tile complexity
- Implementation constraints
- There are only 4 bases to play with in DNA
- More number of tile types: longer DNA strands
  - High cost and more errors

# Linear Deterministic Tile Assemblies of length N Using N tiles

- Linear sequence of N tiles



- Can be used in nanostructures as beam and struts



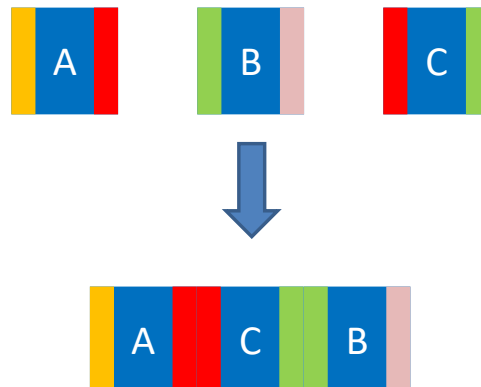
## L-TAM Tiling Model for Linear Assemblies

- **L-TAM** is a simplified version of TAM Tiling Model for linear assemblies

- Linear assemblies have no co-operative binding

- Pads on only the East and West side of tiles

- Tiles bind iff their pads match



## Output of Deterministic Tiling systems

- **Output of a tile system** is the final shape assembled
- Answer to the instance of problem being solved
- For a system under TAM:
  - Exactly one final shape is produced
  - One output for an instance of a problem
- Reason: at any given position in a partial assembly, exactly one tile type can attach
- Deterministic constraint of TAM

## Tile Complexity of Assembly of Given Size or Shape

Assume TAM model of Tiles

### •Size Problem:

- Given shape with defined size, assemble (with give size) using smallest number of tiles.

### •Examples:

#### •Linear Assembly Problem:

- given length  $N$ , assemble a  $1 \times N$  rectangle

#### •Square Assembly Problem:

- given length  $N$ , assemble a  $N \times N$  square

### •Shape Problem:

- Given shape with defined size, assemble shape (of any size) with smallest number of tiles.

# Results in Deterministic Tiling Assembly

- **Efficiently assembling basic shapes with precisely controlled size and pattern:**
  - Constructing  $N \times N$  squares with  $O(\log n / \log \log n)$  tiles. *[Adleman, Cheng, Goel, Huang, 2001]*
  - Perform universal computation by simulating BCA. *[Winfree 2009]*
  - Assemble arbitrary shape by  $O(\text{Kolmogorov complexity})$  tiles with scaling. *[Soloveichik, Winfree 2004]*

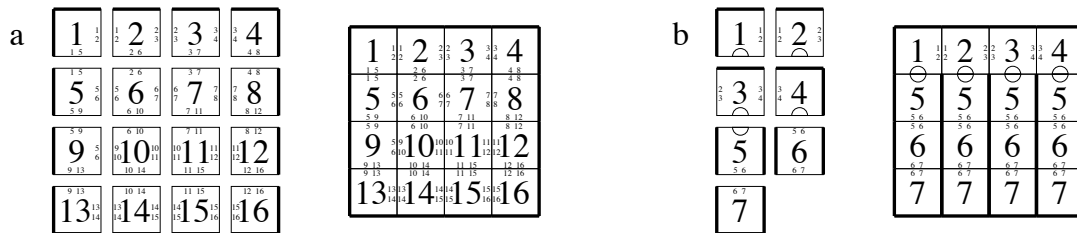
## Results for Deterministic Tiling Complexity

- Assume TAM model of Tiles (temperature  $\tau$ )
- Deterministic Tile Set:
  - require that only one assembly be possible for given set of tiles
- Linear Assembly Problem: temperature  $\tau=1$ 
  - given length  $N$ , uniquely assemble a  $1 \times N$  rectangle
  - has tile complexity  $\Theta(N)$
- Square Assembly Problem:
  - given length  $N$ , uniquely assemble a  $N \times N$  square
  - Temperature  $\tau=1$ 
    - Rothemund & Winfree:
      - has tile complexity:  $O(N^2)$
  - Temperature  $\tau=2$ 
    - Rothemund & Winfree: lower bound at least  $\Omega(\log(N)/\log\log(N))$ .
    - Rothemund & Winfree: upper bound at most  $O(\log(N))$
    - Adelman: upper bound improved at most  $O(\log(N)/\log\log(N))$
    - => has tight bounds on tile complexity:  $\Theta(\log(N)/\log\log(N))$

# Deterministic Temp $\tau=1$ Tiling Complexity

- **Linear Assembly Problem: temperature  $\tau=1$** 
  - given length  $N$ , uniquely assemble a  $1 \times N$  rectangle
  - has tile complexity  $\Theta(N)$
- **Square Assembly Problem:**
  - given length  $N$ , uniquely assemble a  $N \times N$  square
- **Temperature  $\tau=1$** 
  - **Rothmund & Winfree:**
    - has exact tile complexity:  $\Theta(N^2)$

## Deterministic Temp $\tau=1$ Square Tiling Complexity

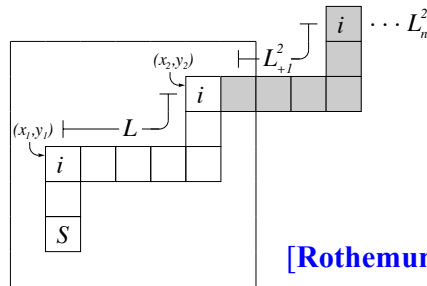


Formation of squares at  $\mathcal{T} = 1$ . (a)  $N^2 = 16$  tiles with unique side labels uniquely produce a terminal  $4 \times 4$  full square at  $\mathcal{T} = 1$ . (b)  $2N - 1 = 7$  tiles uniquely produce a  $4 \times 4$  square (but this is not a full square since thick sides have strength 0). Except for the sides labeled with a circle, each interacting pair of tiles share a unique side label. This comb-like construction is conjectured to be minimal for  $N \times N$  squares assembled at  $\mathcal{T} = 1$ .

[Rothmund & Winfree, 2000]

- **Square Assembly Problem:**
  - given length  $N$ , uniquely assemble a  $N \times N$  square
- **Temperature  $\tau=1$** 
  - **Rothmund & Winfree: Upper Bounds:**
    - has tile complexity at most  $O(N^2)$

# Deterministic Temp $\tau=1$ Square Tiling Complexity



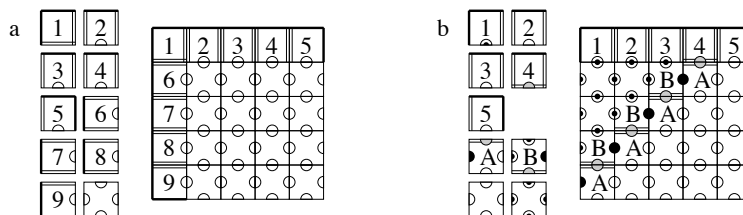
[Rothemund & Winfree, 2000]

: No  $\mathcal{T} = 1$  tile system with fewer than  $N^2$  tiles can uniquely produce an  $N \times N$  square. A full  $N \times N$  square with fewer than  $N^2$  tiles must have some tile  $i$  present at two sites. Consider the assembly  $R$  (the white tiles) which includes an assembly  $L$  (bounded by the tiles  $i$ ), the seed tile  $S$ , and a tile that connects the seed tile to  $L$ .  $R$  can be extended indefinitely with the addition of translated segments of  $L$  (e.g.  $L^2_{+1}$  shown in gray).

## Square Assembly Problem:

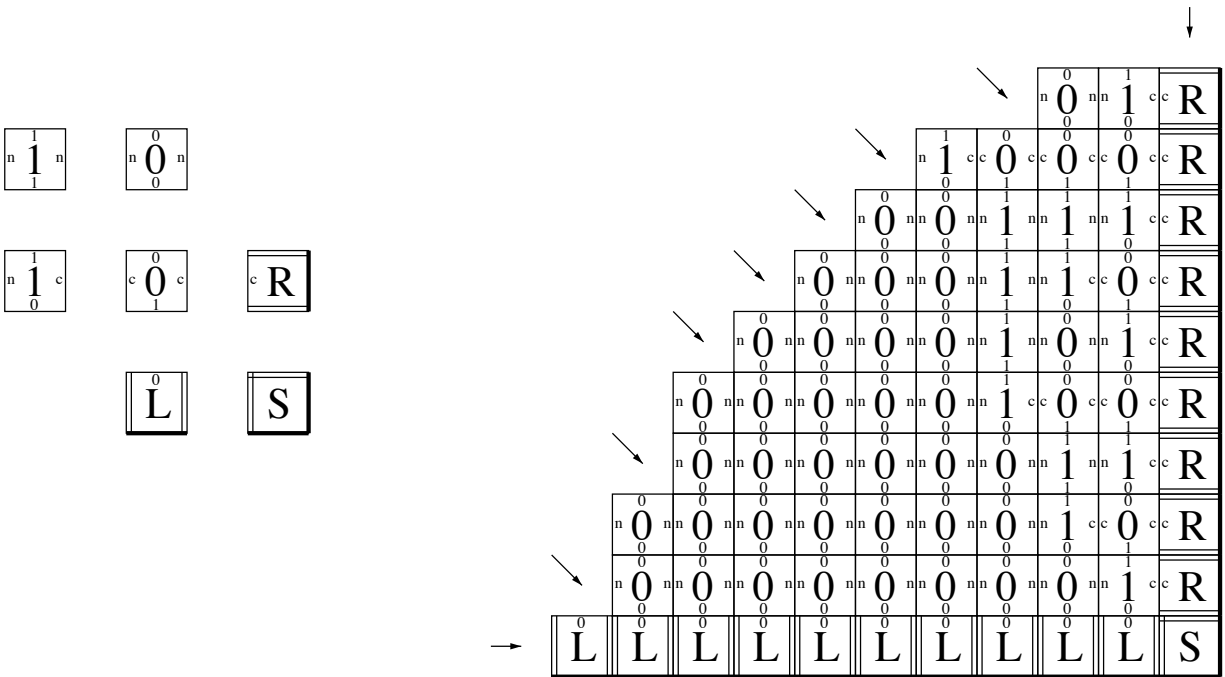
- given length  $N$ , uniquely assemble a  $N \times N$  square
- Temperature  $\tau=1$ 
  - **Rothemund & Winfree: Lower Bounds:**
    - has tile complexity at least  $\Omega(N^2)$
    - $\Rightarrow$  has exact tile complexity:  $\Theta(N^2)$

# Deterministic Temp $\tau=2$ Square Tiling Complexity



Formation of full squares at  $\mathcal{T} = 2$ . (a)  $2N = 10$  tiles uniquely produce  $5 \times 5$  full square. Except for the sides labeled with a circle, each interacting pair of tiles share a unique side label (but we do not label them explicitly as in Figure 2.) (b)  $N + 4 = 9$  tiles are used. [Rothemund & Winfree, 2000]

## (Temp $\tau=2$ ) Counter Assembly in 2D



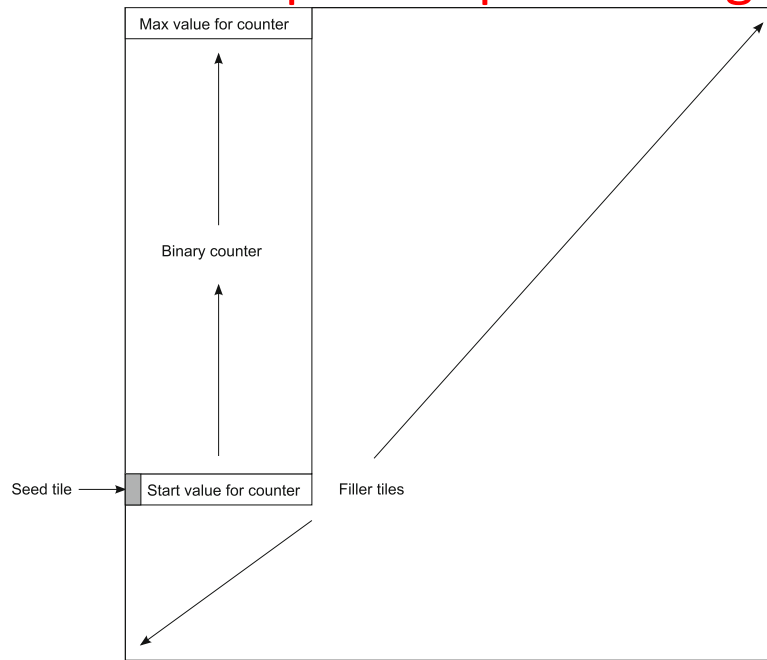
- Assembling a Counter using 7 tiles [Rothemund & Winfree, 2000]
- Can use Counter Assembly to count up to  $N$  using  $O(\log N)$  tiles

## Deterministic Temp $\tau=2$ Square Tiling Complexity Results

- Temperature  $\tau=2$ 
  - Rothemund & Winfree: at most  $O(\log(N))$
  - Adelman: at most  $O(\log(N)/\log\log(N))$
  - Rothemund & Winfree: at least  $\Omega(\log(N)/\log\log(N))$
  - $\Rightarrow$  has tile complexity:  $O(\log(N)/\log\log(N))$



# Deterministic Temp $\tau=2$ Square Tiling Complexity

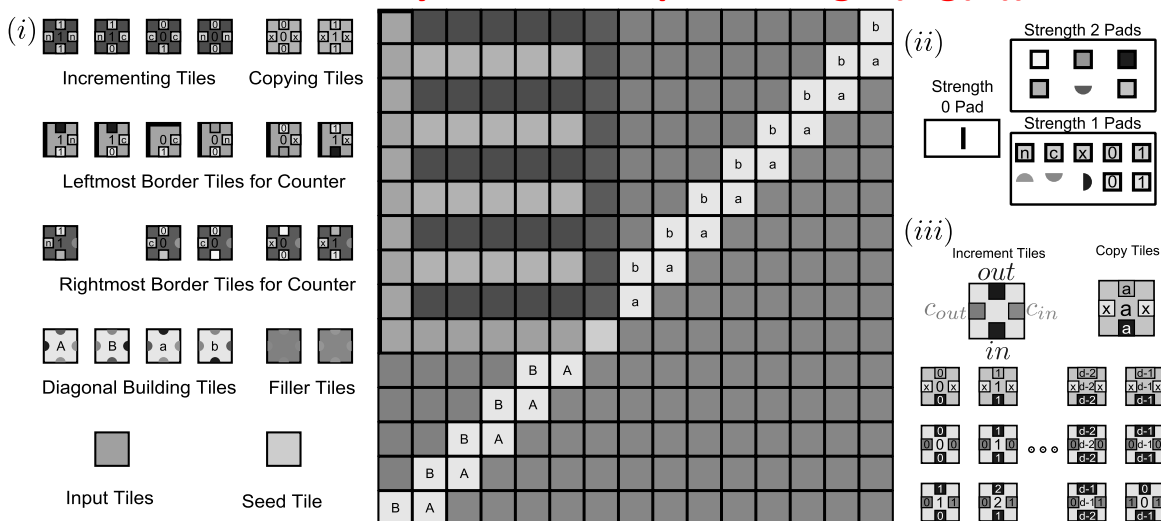


The high level schematic for building an  $n \times n$  square using  $O(\log n)$  tile types

(Figure from Patitz, 2012)

•**Rothmund & Winfree: tile complexity at most  $O(\log(N))$  for assembly of  $N \times N$  square**

## Deterministic Temp $\tau=2$ Square Tiling Complexity For Self Assembly of a $N \times N$ square using $O(\log(N))$ tiles.

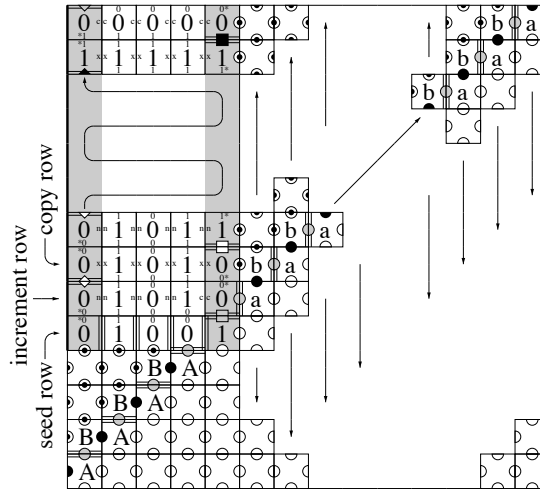
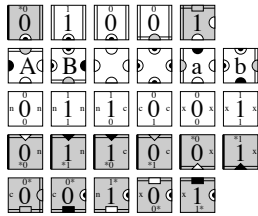


(i)  $N \times N$  Square using  $O(\log N)$  tile types. (ii) Pads for  $N \times N$  Square using  $O(\log N)$  tile types. (iii) Increment and Copy Tiles for Base  $d$ . The border tiles are not shown. The number of tile types is  $\Theta(d)$ .

(Figure from Chandran, 2010)

**Rothmund & Winfree: tile complexity at most  $O(\log(N))$  for assembly of  $N \times N$  square**

## Deterministic Temp $\tau=2$ Square Tiling Complexity For Self Assembly of a $N \times N$ square using $O(\log(N))$ tiles.



Let  $n = \lceil \log N \rceil$

Formation of  $N \times N$  square using  $O(\log N)$  tiles. Construction starts with an  $(n-1) \times (n-1)$  square as in Figure 4b. Here  $N = 52, n = 6$  and 28 tiles are used. The construction illustrates the case for even  $N - n$ ; the first row above the seed row is a copy row for odd  $N - n$ . [Rothemund & Winfree, 2000]

**Rothemund & Winfree: Construction of assembly of  $N \times N$  square with tile complexity at most  $O(\log(N))$ .**

- The counter assembly (in grey on upper left of  $N \times N$  square) has height  $N-n$  and width  $n = \log(N)$ .
- The diagonal continues distance  $n$  below the counter assembly, to form square assembly of total width and height  $(N-n)+n=N$ .

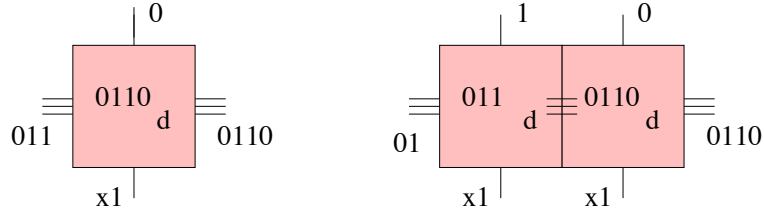
## Deterministic Temp $\tau=2$ Square Tiling Complexity For Self Assembly of a $N \times N$ square using $O(\log(N)/\log\log(N))$ tiles.

**Theorem [Adleman] Assembly of Temp  $\tau=2$  Square Tiling set requires at most  $O(\log(N)/\log\log(N))$  tiles**

**Proof idea:**

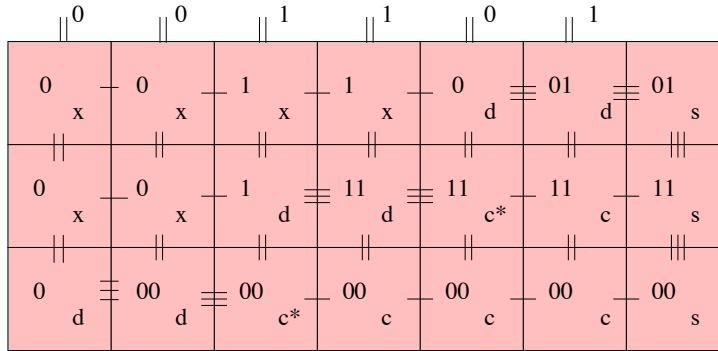
- Given  $N$ , need to construct tile set that uniquely assembles to an  $N \times N$  square. Let  $n = \log(N)$ .
- Use  $n/\log(n) = \log(N)/\log\log(N)$  tiles to encode number  $N-n$  by using base  $b = \log(\log(N)/\log\log(N))$  encoding of number  $N-n$ .
- Form  $N \times N$  square assembly in 3 stages:
  - “Unpack” these  $\log(N)/\log\log(N)$  tiles : Do base conversion from base  $\log(N)$  encoding of number  $N-n$  to binary encoding.
  - Again: use Binary Counter construction to go from binary encoding of  $N-n$  to unary encoding of length  $N-n$ . The counter assembly (in grey on upper left of  $N \times N$  square) has height  $N-n$  and width  $n = \log(N)$ .
  - The diagonal continues distance  $n$  below the counter assembly, to form square assembly of total width and height  $(N-n)+n=N$ .

**Deterministic Temp  $\tau=2$  Square Tiling Complexity  
For Self Assembly of a  $N \times N$  square using  $O(\log(N)/\log\log(N))$  tiles.**



(A) Convert one bit.

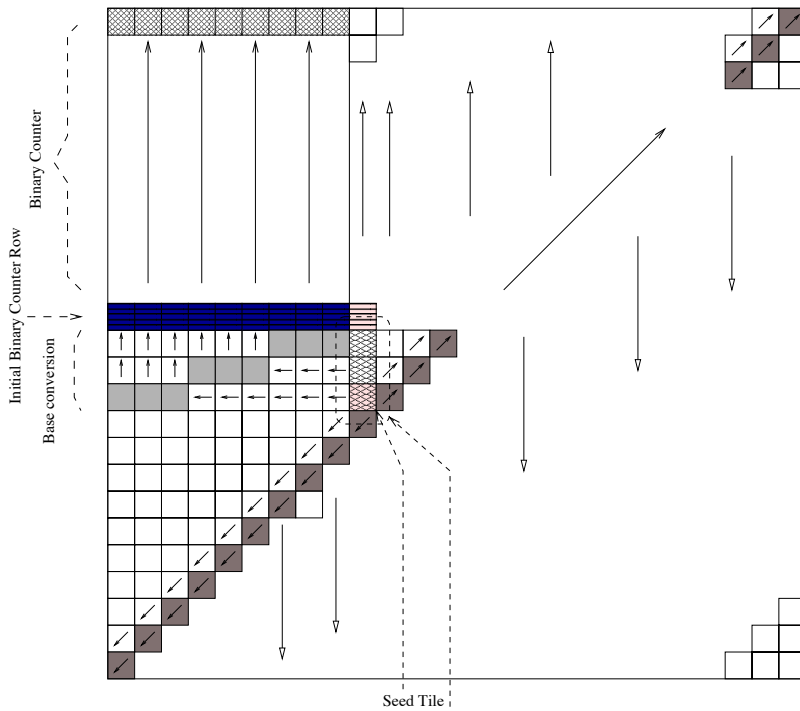
(B) Convert two bits.



**“Unpack” encoding of number  $N$  to length  $N$  assembly**


(C) Convert 031 in base 4 to 001101 in base 2.

**Deterministic Temp  $\tau=2$  Square Tiling Complexity  
For Self Assembly of a  $N \times N$  square using  $O(\log(N)/\log\log(N))$  tiles.**



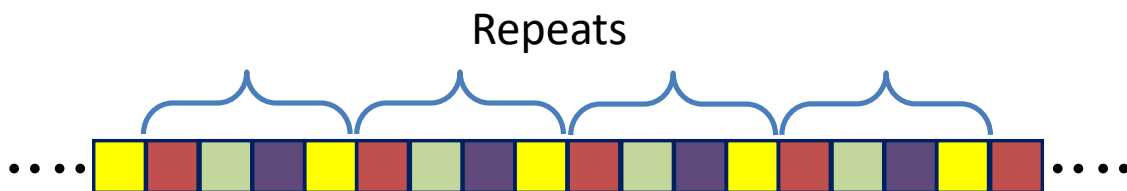
**Assembly communication through diagonal to convert rectangle to square**

# Lower Bounds on Tile Complexity

- **Consider assembling a line of length  $n$** 
  - Need at least  $n$  different tiles (high design complexity)  

  - Suppose tiles B and F are the same. Then we can “pump” the line segment BCDE into an infinite line
  - Are we doomed? No. Can assemble thicker rectangles more efficiently
- **Consider assembling an  $n \times n$  square**
  - The average Kolmogorov complexity (the smallest program size to produce a desired output) is  $\log n$  bits
    - Thus,  $k \log k = \Omega(\log n)$ , or  $k = \Omega(\log n / \log \log n)$

## Lower Bounds on Tile complexity for Deterministic linear assemblies of length $N$

- Lower bound in L-TAM is  $\Omega(N)$  tile types
- Reason: if a tile repeats, the sequence between the two tiles is pumped infinitely
- Can we modify TAM to get linear assemblies of length  $N$  using less than  $N$  tile types?



## Lower Bounds for Deterministic Tiling Complexity Temp $\tau=2$ Square For Self Assembly of a $N \times N$ square: Matching Lower Bounds

The Kolmogorov complexity  $K(N)$  of an integer  $N$  with respect to a Turing Machine (TM) is the smallest length TM that encodes  $N$ .

- Known result by Kolmogorov:  $K(N) = \Theta(\log(N)/\log\log(N))$
- Proof uses base  $\log(N)$  encoding of number  $N$

Theorem [Rothemund & Winfree] Temp  $\tau=2$  Assembly of Square Tiling requires at least  $\Omega(\log(N)/\log\log(N))$  tiles almost always

=> so Temp  $\tau=2$  Square Tiling has tight bounds on tile complexity:  
 $\Theta(\log(N)/\log\log(N))$

**Proof by contradiction:**

Given a tile set  $S$  claimed for assembly of  $N \times N$  square:

can construct unique assembly of an  $N \times N$  square

=> so can determine  $N$

Suppose:

Temp  $\tau=2$  Square Tiling Complexity is  $|S| < c \log(N)/\log\log(N)$  for any constant  $c$ .

=> Then can encode  $N$  by less than  $K(N) = \Theta(\log(N)/\log\log(N))$ , a contradiction. QED

## Deterministic Temp $\tau=2$ Square Tiling Complexity For Self Assembly of square of Approximate Size $N \times N$

*Harish Chandrann Nikhil Gopalkrishnan and John Reif, Tile Complexity of Approximate Squares and Lower Bounds for Arbitrary Shapes, Algorithmica, Volume 66, Issue 1 (2013), Page 1-17 (2013)*

Theorem [Chandran, Gopalkrishnan, Reif] Approx Temp  $\tau=2$  Assembly of Square Tiling size  $(1+\epsilon)N \times (1+\epsilon)N$  using  $O(d+(\log\log(\epsilon N)/\log\log\log(\epsilon N)))$  tiles where  $d=(\log(1/\epsilon)/\log\log(1/\epsilon))$

**Approximate Assembly Technique:** Assemble instead a  $L \times L$  square where  $L$  drops last  $n-k$  bits of accuracy:

Will be  $\epsilon$ -approximation of an  $N \times N$  square, where  $(1-\epsilon)N < L < (1+\epsilon)N$

Given input  $N$ , let

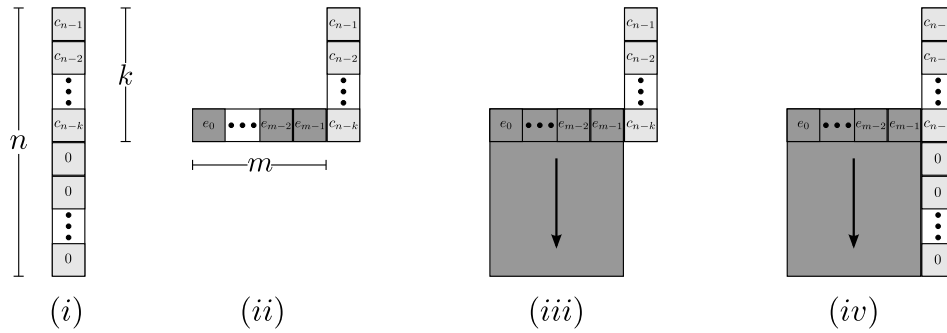
$N_1 = \text{floor}((N - (\text{floor}(\log_d N))/2)) = b_n b_{n-2} \dots b_0$  base  $d$  encoding  
where  $n = (\log_d N_1) + 1$  (note is about  $\frac{1}{2}$  of  $N$ )

$N_2 = b_n b_{n-2} \dots b_{n-k} 0^{n-k}$  base  $d$  encoding with last  $n-k$  symbols = 0  
and  $k = \text{floor}(\log_d(1/\epsilon)) + 1$

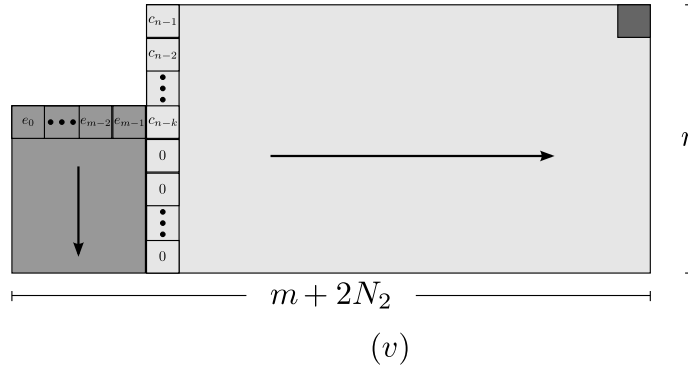
$N_3 = 1 0^{n-k} - N_2 = c_{n-1} c_{n-2} \dots c_{n-k} 0^{n-k}$  with last  $n-k$  symbols = 0  
 $m = \text{ceiling}(\log(n-k)/\log\log(n-k))$

Then Assemble a  $L \times L$  square where  $L$  is just over size  $(2N_2 + n)$

# Approximate Deterministic Temp $\tau=2$ Square Tiling



[Chandran, Gopalkrishnan, Reif] Assembly of Minor & Major Counters



Components of the construction: (i) *Seed column* for the major counter. (ii) L-shaped seed assembly. (iii) Assembly of the minor counter. (iv) Completing the *seed column* using the 0 tile type. (v) Assembly of the major counter.

# Approximate Deterministic Temp $\tau=2$ Square Tiling

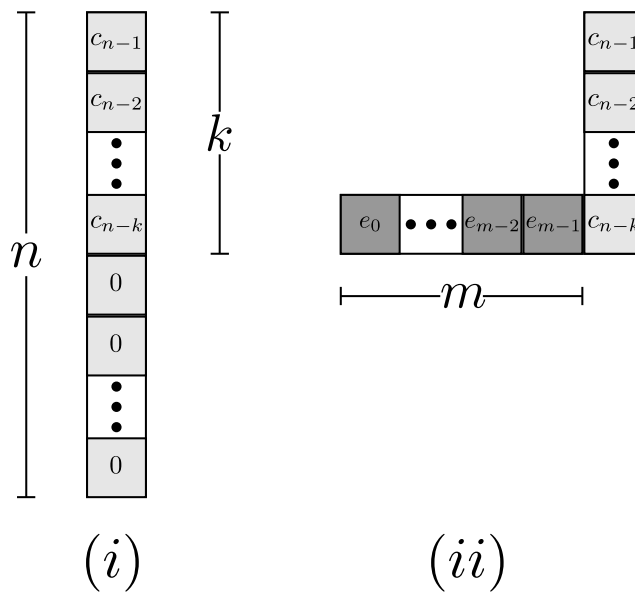


Figure [Chandran, Gopalkrishnan, Reif] L-shaped seed assembly  
**Horizontal row** is seed for base  $m = \lceil \log(n-k) / \log \log(n-k) \rceil$   
 counter with height  $n-k$ .  
**Vertical column** has  $k$  vertical tiles to encode  $c_{n-1} c_{n-2} \dots c_{n-k}$

# Approximate Deterministic Temp $\tau=2$ Square Tiling

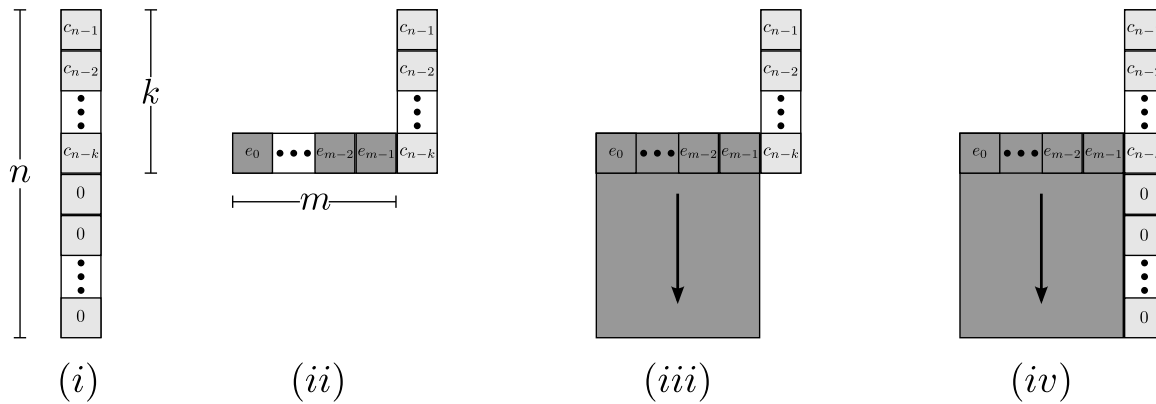


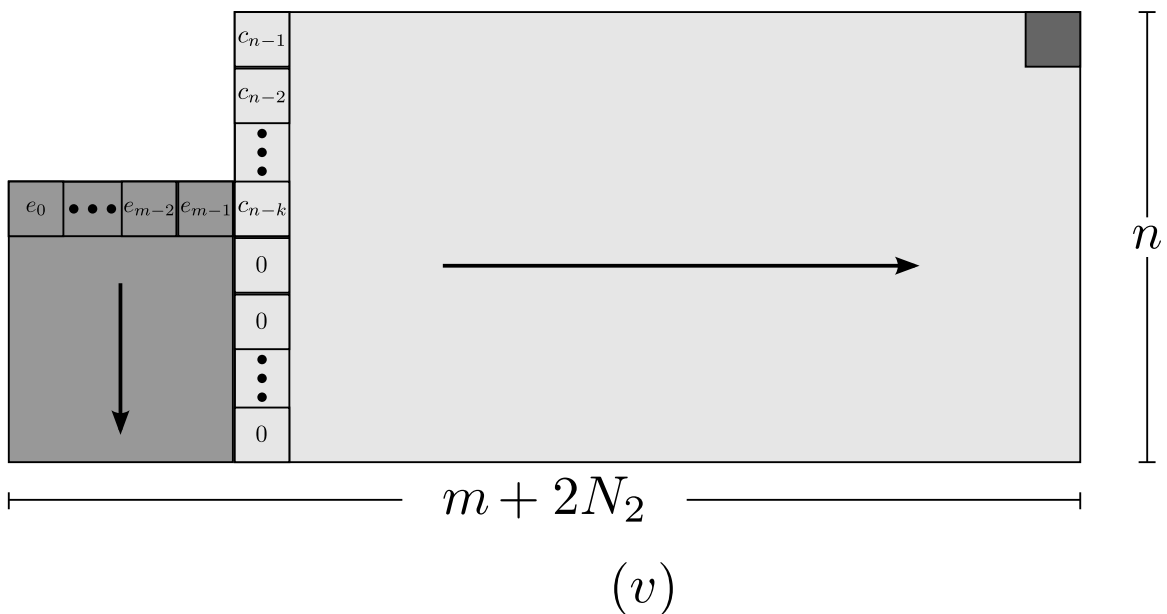
Figure [Chandran, Gopalkrishnan, Reif] Assembly of Minor Counter from L-shaped seed assembly: using  $m$  tile types

Rectangle width  $m$  and height  $n-k$  (excluding seed row):

Horizontal row is seed for base  $m = \text{ceiling}(\log(n-k)/\log\log(n-k))$  counter with height  $n-k$ .

Vertical column has  $k$  vertical tiles to encode  $c_{n-1} c_{n-2} \dots c_{n-k}$

# Approximate Deterministic Temp $\tau=2$ Square Tiling

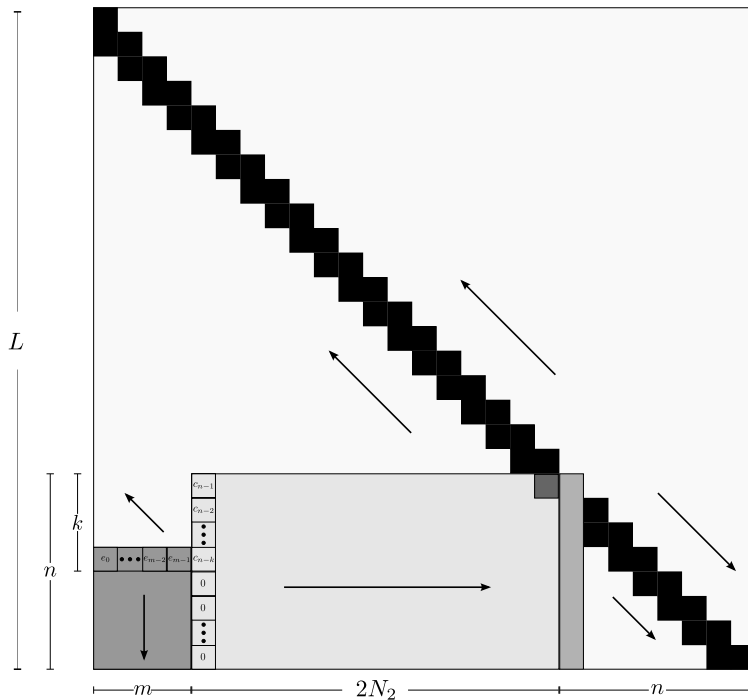


[Chandran, Gopalkrishnan, Reif] Assembly of Major Counter: Is  $n \times 2N_2$  rectangle

Uses column representing  $d$ -ary encoding of

$N_3 = 1 \ 0^n - N_2 = c_{n-1} c_{n-2} \dots c_{n-k} \ 0^n$  to count up to  $1 \ 0^n$  (with  $n$  0s) in base  $d$

## Approximate Deterministic Temp $\tau=2$ Square Tiling



[Chandran, Gopalkrishnan, Reif]

Diagonal and filler tiles complete approximate square of length  $L = 2N_2 + m + n$

## Approximate Deterministic Temp $\tau=2$ Square Tiling

**Theorem [Chandran, Gopalkrishnan, Reif] Approx Temp  $\tau=2$**   
**Assembly of Square Tiling size  $(1+\epsilon)N \times (1+\epsilon)N$  requires  $\Omega$**   
 **$(d + (\log \log(\epsilon N) / \log \log \log(\epsilon N)))$  tiles almost always, where**  
 **$d = (\log(1/\epsilon) / \log \log(1/\epsilon))$**

**Case 1:  $\epsilon > 1/4$ : Lower bound is within constant factor of exact case**

**Case 1:  $\epsilon \leq 1/4$ : use Kolmogorov complexity lower bound argument**

**Proof by contradiction:**

**Given a tile set S claimed for  $\epsilon$ -approximate assembly of  $N \times N$  square:**

**Can construct unique assembly of an  $L \times L$  square**

**Which is  $\epsilon$ -approximation of an  $N \times N$  square, where  $(1-\epsilon)N < L < (1+\epsilon)N$**

**So can determine first  $n = \text{floor}(L) + 1 > \text{floor}(\log(N))$  bits of  $N$**

**=> Can show violates Kolmogorov complexity lower bound for encoding  $n$  bit number.**

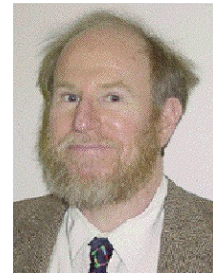
**QED**



# Randomized Tile Complexity of Linear Assemblies

Harish Chandran, Nikhil Gopalkrishnan, John Reif

- We extend TAM to incorporate stochastic behavior
- We study linear assemblies in this new model:  
The Probabilistic Tile Assembly Model (PTAM)



*Harish Chandran, Nikhil Gopalkrishnan, and John Reif, The Tile Complexity of Linear Assemblies, SIAM Journal of Computation (SICOMP), Society for Industrial Mathematics, Vol. 41, No. 4, pp. 1051-1073, (2012).*

## Multiple Possible Outputs of tiling systems For Randomized Assemblies

- We relax this constraint
- Result: many final shapes can be produced
- Many outputs for an instance of a problem

## Probabilistic Tile Assembly Model (PTAM)

- **Make tile attachments non-deterministic**
- **Multiple tile types can attach to a given position in a partial assembly**

## Probabilistic Tile Assembly Model (PTAM)

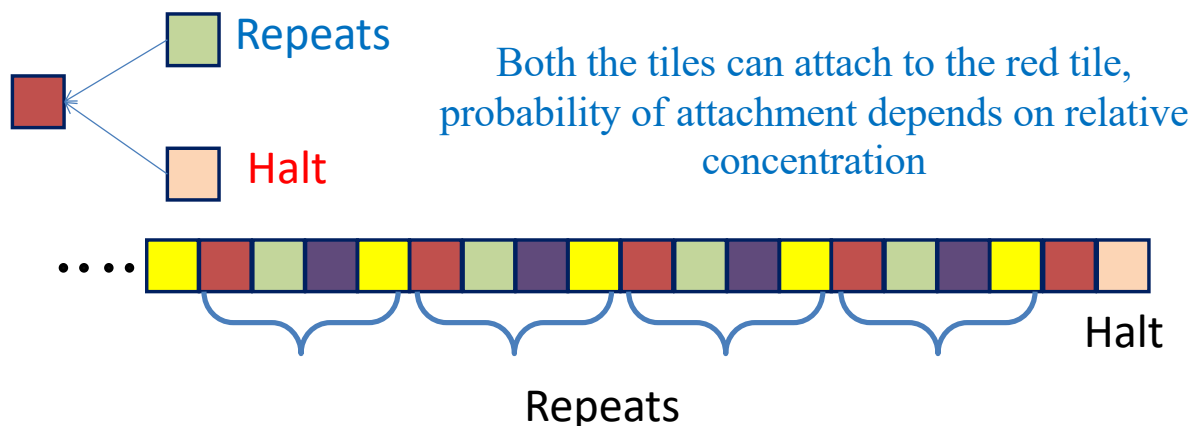
- **We allow the tile set to be a multiset, i.e., each tile type can occur multiple times**
  - **Example: {A,B,C,C,C,C,D}**
- **The multiplicity of each tile type indicates the tile type's concentration**
  - **Example: {1:1:4:1}**

# Probabilistic Tile Assembly Model (PTAM)

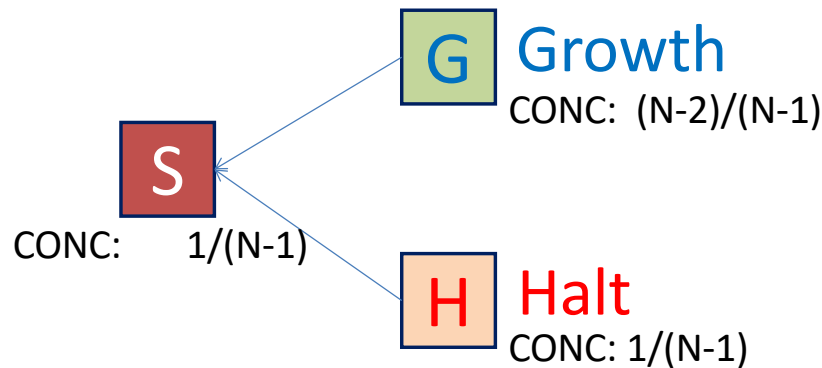
- At each stage of the assembly and at each growth position, a tile is chosen from the multiset with replacement
- If the tile can bind at that site, it does, else another tile is chosen until no tile can be added
- Output of a tiling system is a set of shapes
- For linear assemblies, we define the **output of a tiling system as the *expected length* of linear assemblies it produces**

How does this affect the lower bound of linear assemblies?

- More than one tile can attach at a given spot
  - So repeats can occur, yet the system can halt
- Notation: Arrows indicate probabilistic tile attachment with equal probability



## Example: a three tile PTAM system for linear assemblies of expected length $N$



Tile Multiset for the above system:  $\{S, \underbrace{G, G, \dots, G}_{n-2}, H\}$

### More on tile multisets

- By making the tileset a multiset, we implicitly encode information about the concentration of tile types
- Cardinality of a tile multiset is a true indicator of the information the tile set encodes
- Cardinality of a tile multiset is the descriptive complexity of the shape
- Though the previous example had only 3 tile types, the tile multiset had  $N$  tiles in it
- *No improvement from deterministic scenario*

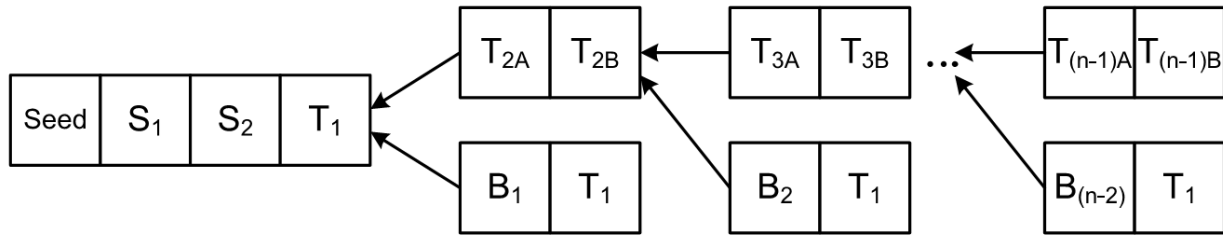
# Linear assemblies of expected length $N$ in PTAM

- We first show a construction using  $O(\log^2 N)$  tile types
- Then we show a more complex construction using  $O(\log N)$  tile types
- Next we show a matching lower bound  $\Omega(\log N)$  tile types are required to build linear assemblies of expected length  $N$
- Methods for constructing linear assemblies of length  $N$  with high probability using  $O(\log^3 N)$  tile types for infinitely many  $N$

## Linear assemblies of expected length $N$ using $O(\log^2 N)$ tile types

- We show how to construct linear assemblies of expected length  $N$  using  $O(\log N)$  tile types for any  $N$  that is an exact power of 2
- We then describe a method to extend this construction to all  $N$  using  $O(\log^2 N)$  tile types

## Powers of two construction



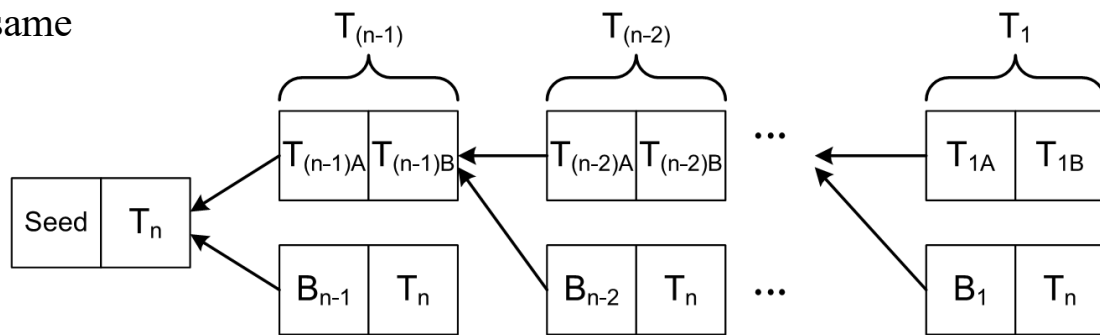
- Restarts with addition of  $B_i T_i$  tile complex after  $T_{iB}$
- Goes forward with addition of  $T_{(i+1)A} T_{(i+1)B}$  tile complex after  $T_{iB}$
- Each happens with equal probability
- Process akin to tossing a fair coin till we see  $n-2$  consecutive heads
- Probabilistic branching system shown above using tile multiset of cardinality  $O(n)$  has: Expected length =  $2^n$

## Linear assemblies of expected length $N$ using $O(\log^2 N)$ tile types

- We extend this to any  $N$  by:
  - Considering the binary representation of  $N = b_0 2^0 + b_1 2^1 + b_2 2^2 + \dots + b_n 2^n$ , where  $n = \text{floor}(\log(N))$ .
  - Constructing assemblies of expected length equal to numbers represented by each 1 in the binary representation of  $N$ 
    - Each of these is a 'powers of two' construction
- Deterministically concatenating these assemblies
- Each subassembly requires  $O(\log N)$  tile types and there are a maximum of  $O(\log N)$  of these
- Thus total number of tile types =  $O(\log^2 N)$

## Linear assemblies of expected length $N$ using $O(\log N)$ tile types

- **Key idea:**  $E[\# T_{k-1} \text{ appears}] = \frac{1}{2} E[\# T_k \text{ appears}]$
- Restart bridge  $B_{k-1}$  appears other half of the time
- We use this property and make some links deterministic
- **Observation:** Every time we branch, expected number of times the next tile appears is halved, if we don't branch, the expectation remains the same

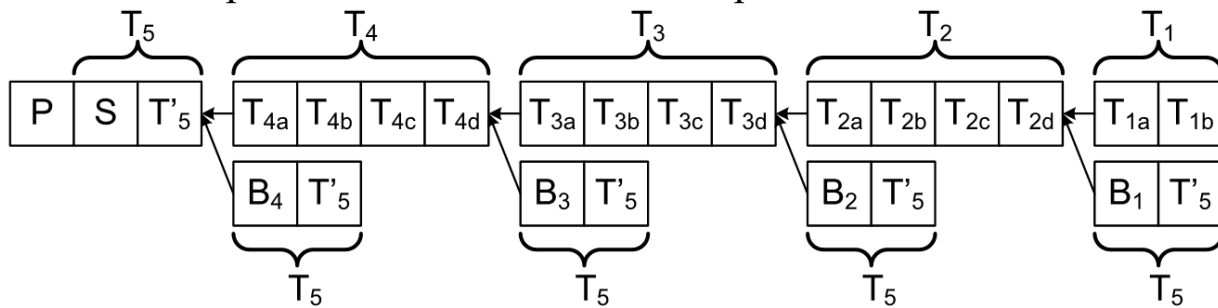


## Linear assemblies of expected length $N$ using $O(\log N)$ tile types

- **Key idea:** Any number  $N$  can be written in an alternate binary encoding using  $\{1,2\}$  instead of  $\{0,1\}$
- For example  $45 = (101101)_{\{0,1\}} = (12221)_{\{1,2\}}$
- $1x2^5 + 0x2^4 + 1x2^3 + 1x2^2 + 0x2^1 + 1x2^0 = 45$
- $1x2^4 + 2x2^3 + 2x2^2 + 2x2^1 + 1x2^0 = 45$
- **Observation:** The number of bits in this new encoding of  $N$  is at most  $\log N$ .
- We illustrate this technique using an example

## Example: Linear assemblies of expected length 91

- To get 91, we find the alternate encoding of  $\text{floor}(91/2) = 45$ 
  - $45 = (12221)_{\{1,2\}}$
- For the bits that are 2, we construct complexes of size 4
  - Deterministic links, expectation stays same
- For bits that are 1 we construct complexes of size 2
  - Probabilistic links, expectation is halved
- We add a prefix tile if N was odd to compensate for the floor



Number of tile types required :  $O(\log N)$

## Lower bounds for linear assemblies

- Can we do better than  $O(\log N)$ ?
  - NO!

• Proof sketch: **S**  $L_p$   $L_{l_1}$   $L_{l_2}$   $L_{l_3}$   $L_{l_4}$   $L_{l_5}$  **H**

- Split each run of a tile set with n tile types into
  - Intermediates
  - Prefix
- Simulate each segment using fewer number of tiles
- Can show through a recursive argument on each of these segments that maximum length is  $O(2^n)$

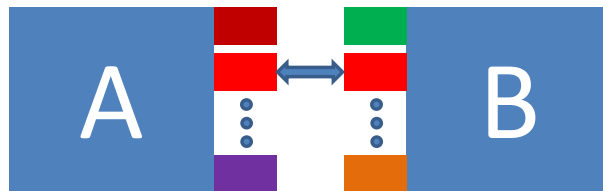


## Lower bounds for linear assemblies

- Thus, for each  $N$ , the cardinality of tile multiset to construct a linear assembly of expected length  $N$  is  $\Omega(\log N)$
- Notice that this bound is true for all  $N$
- Stronger than the usual Kolmogorov complexity based lower bounds that holds only for almost all  $N$

## k-pad Tiles

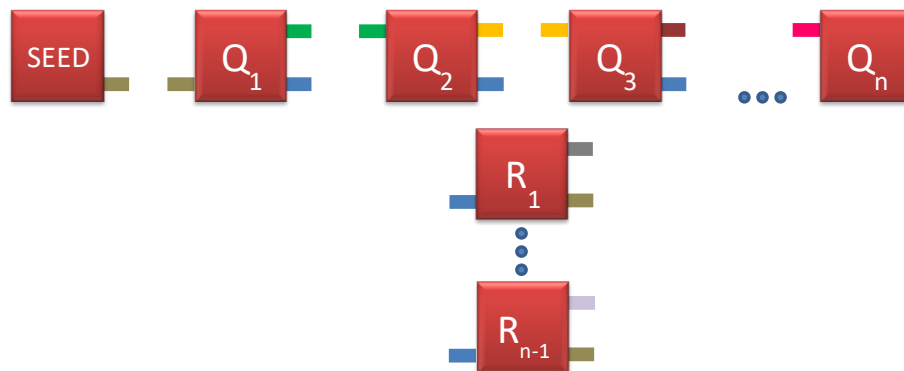
- A simple extension to PTAM is the k-pad PTAM system
- Each tile now has k-pads on each side



- Possible implementation via DDX or origami
- This allows more choices for binding with a tile
- Tiles bind if at least one of their corresponding pads match
- Note that the descriptonal complexity in 2-pad PTAM is still the cardinality of the tile multiset

## Linear assemblies of expected length $N$ using $O_{i.o}(\log N / \log \log N)$ $k$ -pad tile types

- The system shown below is akin to tossing a biased coin (Head : Tail :: 1 :  $n$ ) till we get  $n$  successive heads
- Expected number of tosses for this :  $n^{2^n}$
- We can get linear assemblies of expected length  $N$  using a tile multiset of cardinality  $O(\log N / \log \log N)$  2-pad tiles for infinitely many  $N$



## Lower bounds for $k$ -pad systems

- Can we do better than  $O_{i.o}(\log N / \log \log N)$ ?
  - NO!
- **Proof sketch:**
- Convert any  $k$ -pad tile system into a graph
  - Tiles  $\rightarrow$  vertices
  - Possible attachments  $\rightarrow$  edges
- Self-assembly is a random walk on the graph
- Expected length of the assembly is the expected *time  $T$  to first arrival* to the vertex for the halting tile
- This can be solved as a system of linear equations
- Bound first arrival time  $T$  by a ratio of determinants of size  $N^{O(\log N)}$

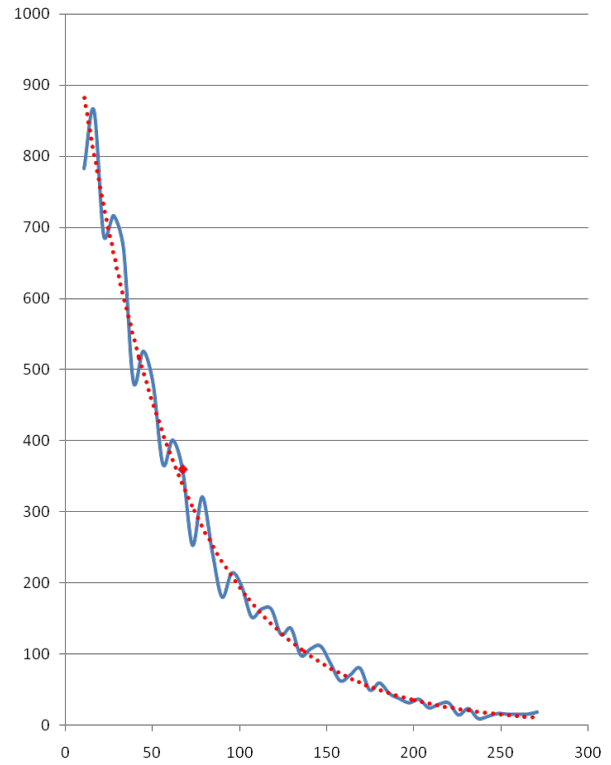
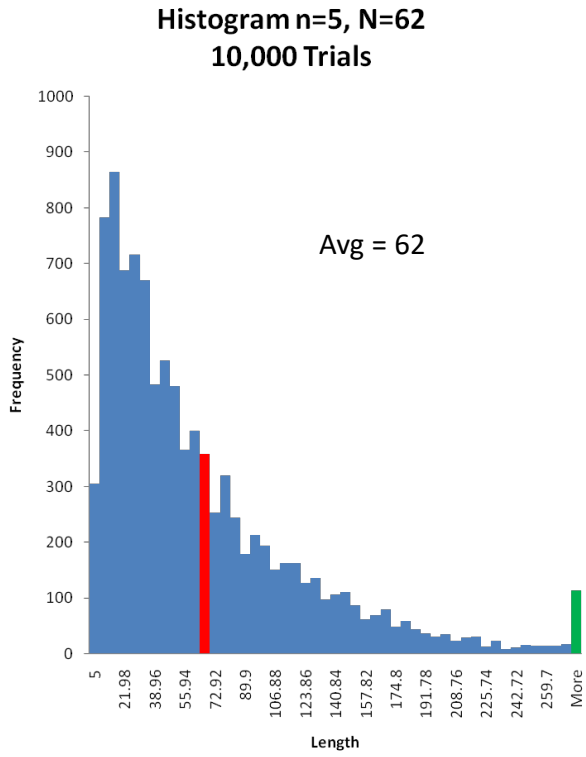
## Lower bounds for k-pad systems

- Thus, for each  $N$ , the cardinality of tile multiset to construct a linear assembly of expected length  $N$  using  $k$ -pad tiles for any given  $k$  is  $\Omega(\log N / \log \log N)$
- As before, this bound is true for all  $N$ 
  - Stronger than the usual Kolmogorov complexity based lower bounds that holds only for almost all  $N$

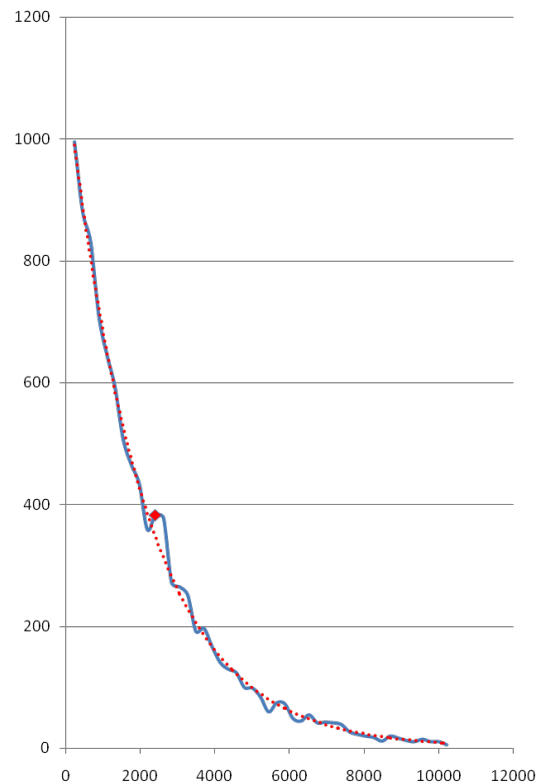
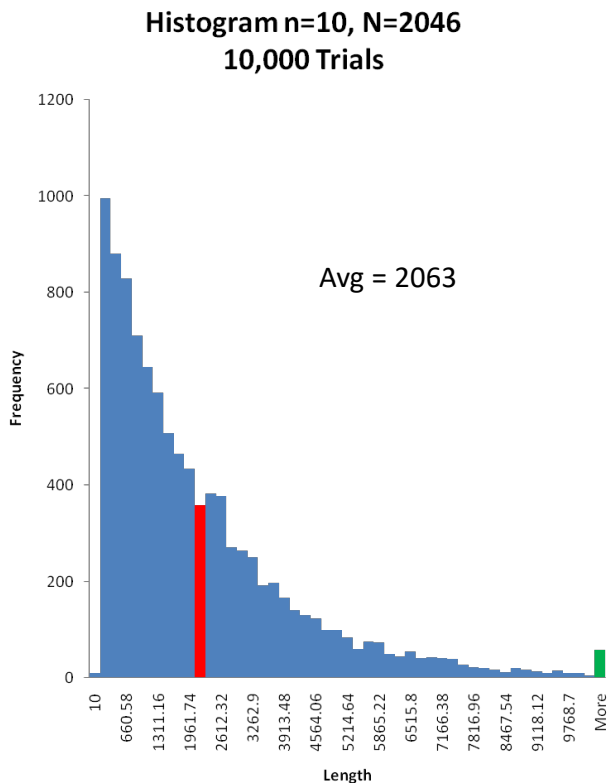
## Distribution and tail bounds

- We constructed linear assemblies of given length in expectation
  - What about the distribution of lengths?
- We can concatenate  $k$  assemblies each of expected length  $N/k$  deterministically to improve tail bounds
- By central limit theorem, as  $k$  grows large, the distribution approaches the standard normal distribution
- We get an exponentially dropping tail for a multiplicative increase in the tile set cardinality
- If  $k = N$ , we get a deterministic assembly (degenerate distribution)
- This is illustrated in the following examples

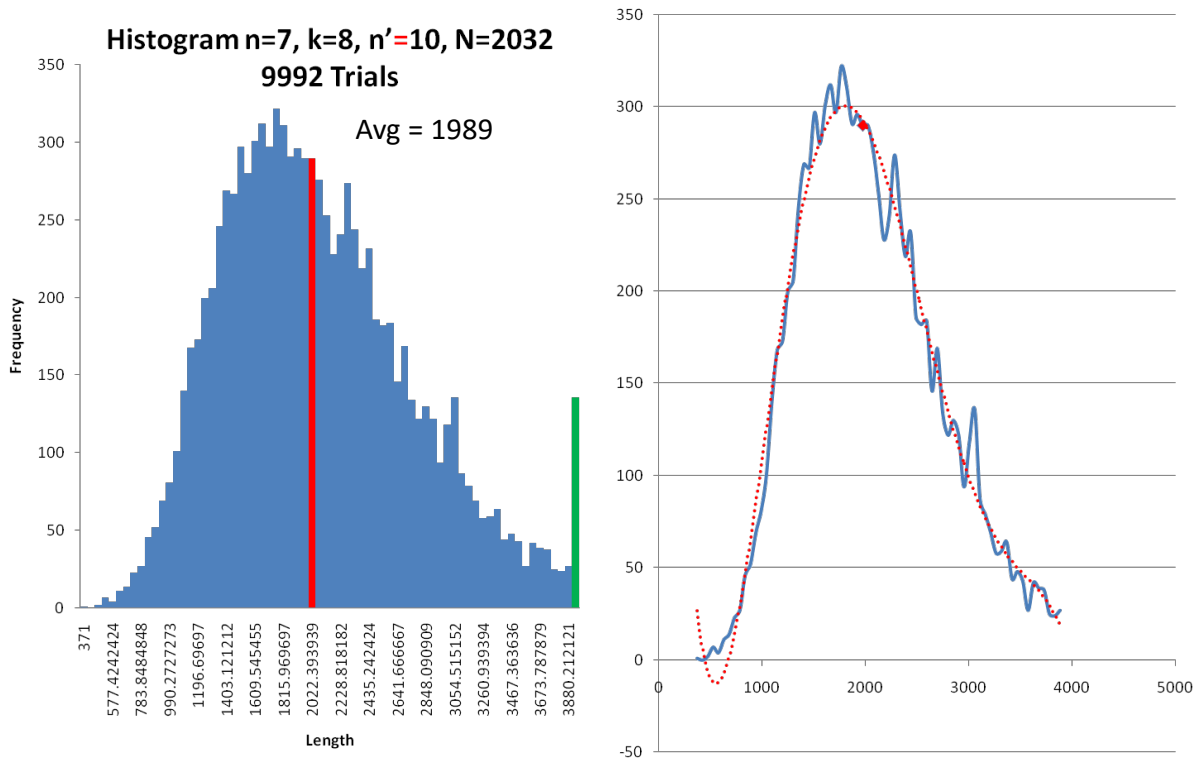
## Example: 5 consecutive heads



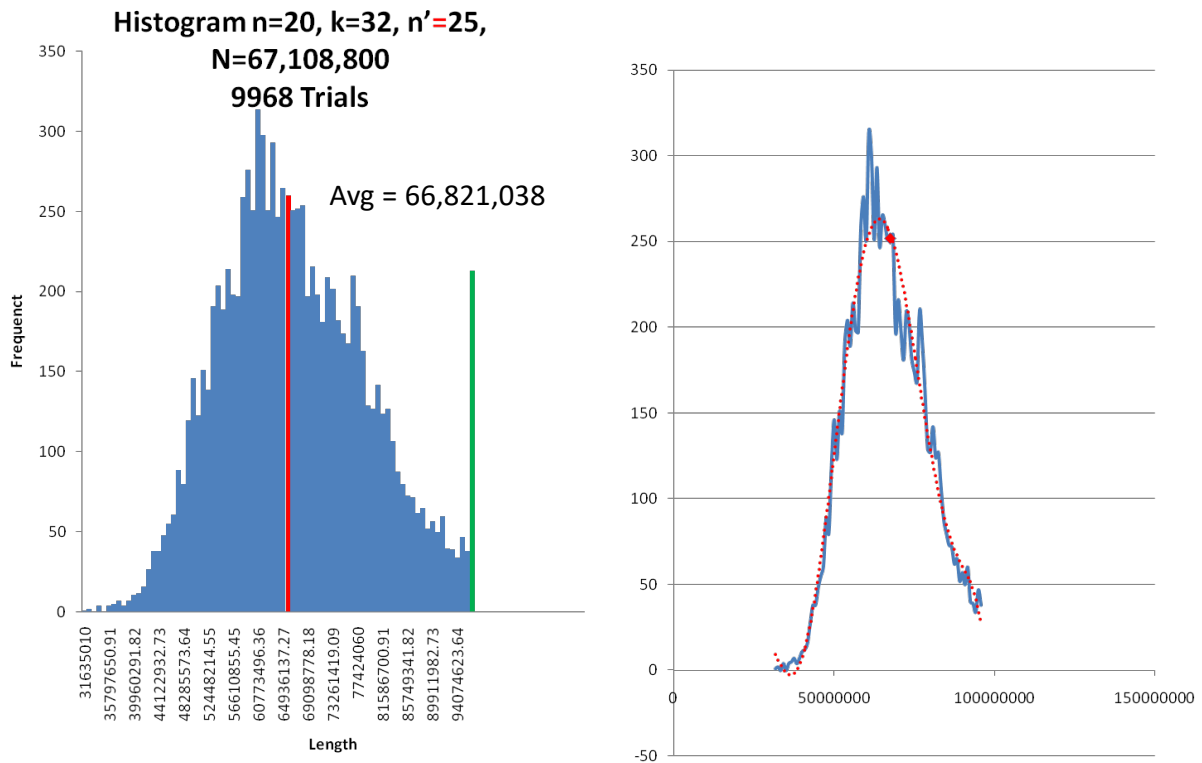
## Example: 10 consecutive heads



## Example: 8 concatenations of 7 consecutive heads (similar to 10 consecutive heads)



## Example: 32 concatenations of 20 consecutive heads (similar to 25 consecutive heads)



## Summary

- **Introduced the Probabilistic Tile Assembly Model**
  - **k-pad systems**
- **Studied the tile complexity of linear assemblies**
- **Showed how to construct linear assemblies of expected length  $N$  using  $O(\log N)$  tile type**
- **Proved that this is the best one can do by deriving a matching lower bound**
- **Proved analogous results for k-pad systems**
- **Provided a method to improve tail bounds**

## Future directions

- **Tightened tail bounds**
- **Running time analysis of all the systems described earlier**
- **Error correction in PTAM systems for linear assemblies**
- **Experimental Implementation of the DNA tile assemblies in the laboratory**