

Self-Assembling Distributed Internet Software

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Biological Systems

- Self-healing
- Fault-tolerant
- Decentralized

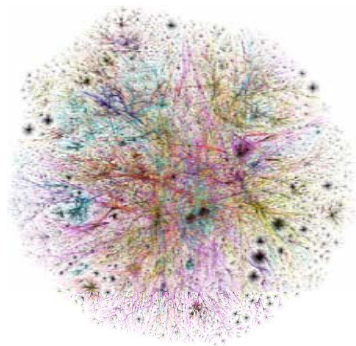


In Contrast: Software

- Less complexity
- Fault-tolerance is “intelligently designed”
- Not expected to recover from catastrophes



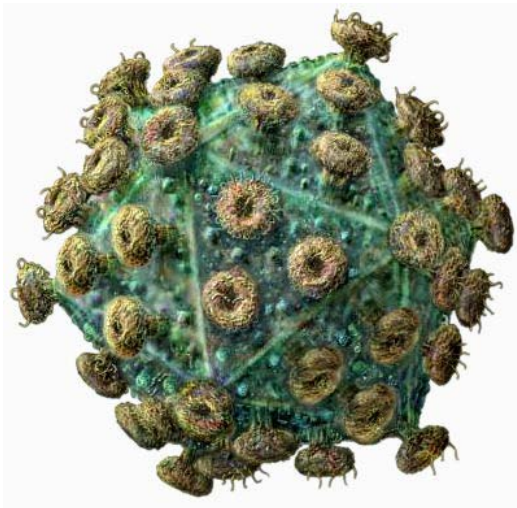
Computation is Evolving



Privacy: no entity should gain access to the data.

Security: no entity may undetectably compromise the computation.

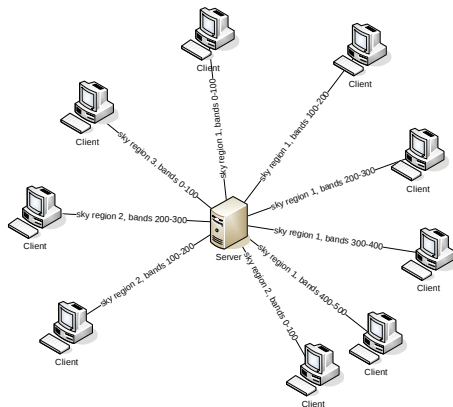
Parts of Real-World Problems Are Computational



- Protein folding
- Resource allocation
- Scheduling
- Encryption breaking
- ...

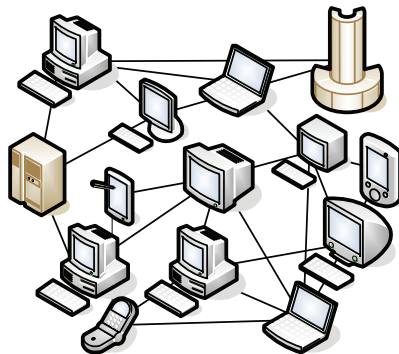
Distributed Computation

- Computation on the Internet
 - SETI@home [KWA⁺96]
 - Folding@Home [LSSP02]
 - Rosetta@home [Ros07]
- Grid Computing & Clouds
 - MapReduce [DG04]
 - OrganicGrid [CB04]
- Do not preserve privacy



My Approach: Intelligent Distribution

Obstacle: Discreet classical NP-hard computation is impossible [Chi05].



Solution: Distribute a computation so that no small group of machines knows too much or has too much power.

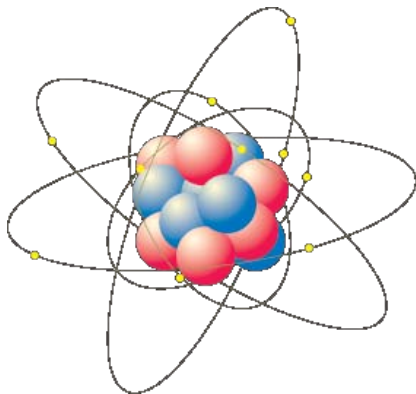
Outline

- 1 Private Distributed Computation
- 2 Self-Assembly
- 3 Tile Architectural Style
- 4 Contributions

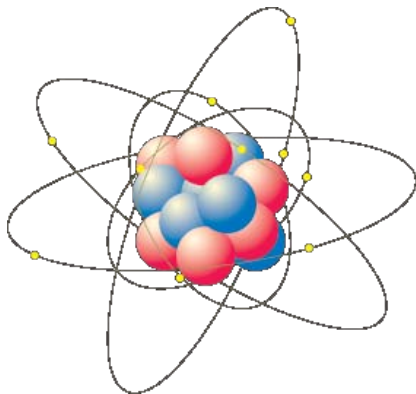
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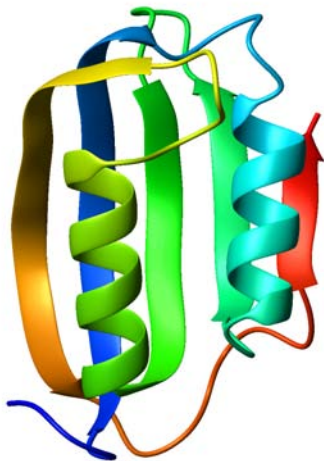
Self-Assembly in Nature



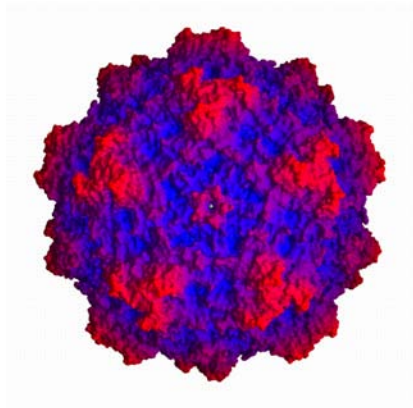
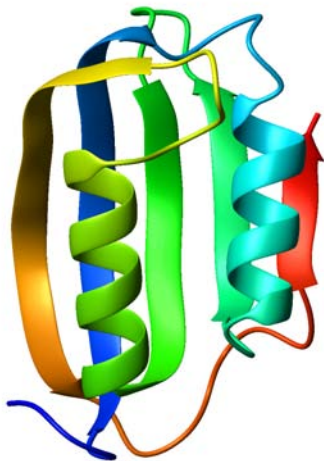
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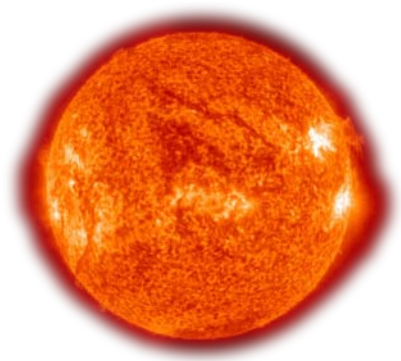
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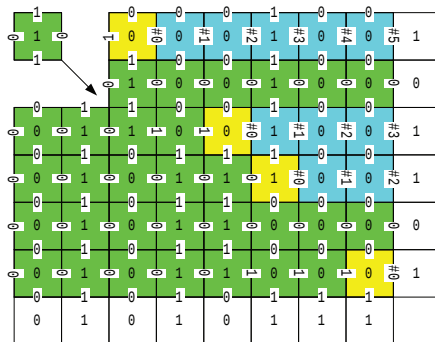
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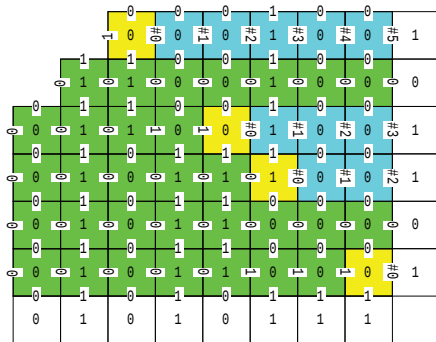
- Tile: a square with labels
- Each label has a strength
- Tiles attach if labels are strong enough



Tiles are Turing Universal [Win98b]

Tile Assembly Model [Win98b]

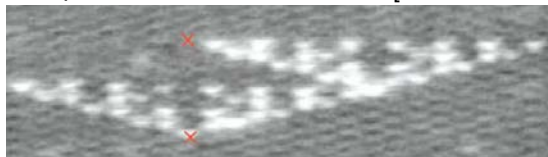
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Tiles are Turing Universal [Win98b]

Efficiency in Tile Systems

- Assemble
 - linear polymers [ACG⁺01]
 - squares [RW00, AGHM02, ACG⁺02]
 - computable shapes [SW07]
- Count [Win98a, Moi05, BRW05]
- Compute Binomial Coefficients [Win98a, RPW04]



Efficient Computation

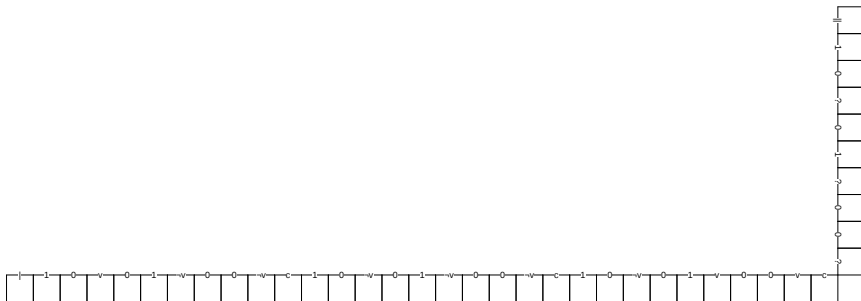
- Add [Bru07]
- Multiply [Bru07]
- Factor [Bru08a]
- Solve SubsetSum [Bru08b]
- Solve k-SAT [Bru08c]

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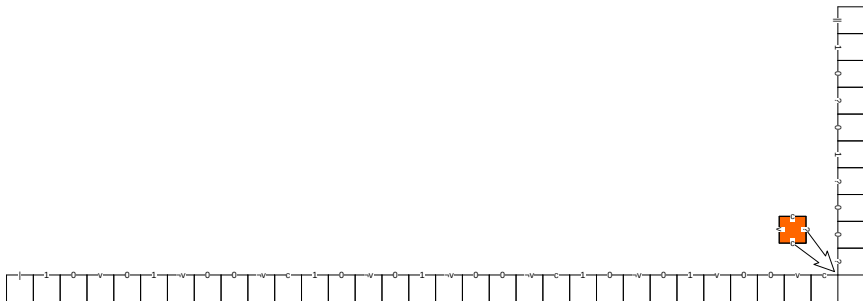
Solving 3-SAT

$$(x_2 \vee \neg x_1 \vee \neg x_0) \wedge (\neg x_2 \vee \neg x_1 \vee \neg x_0) \wedge (\neg x_2 \vee x_1 \vee x_0)$$



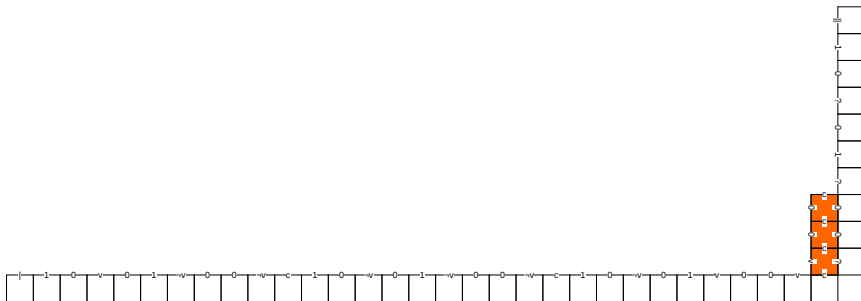
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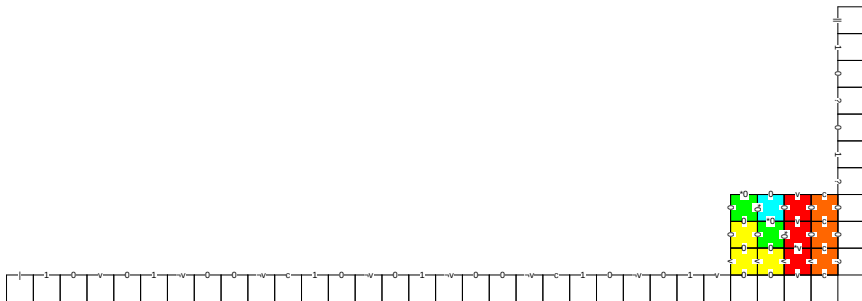
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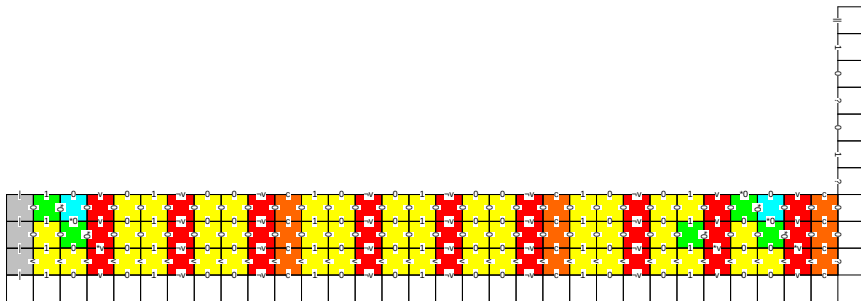
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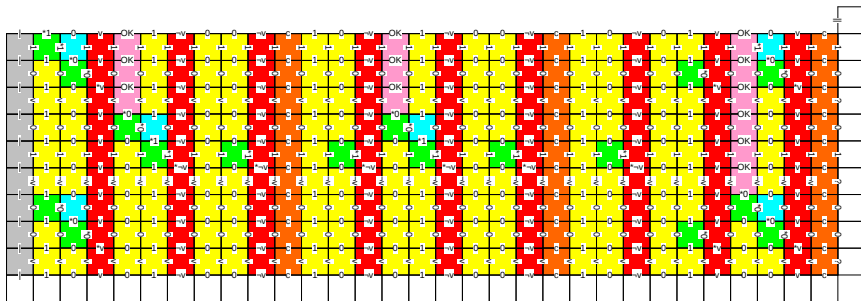
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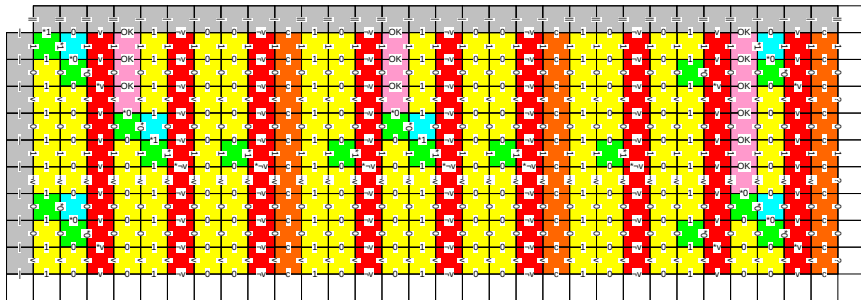
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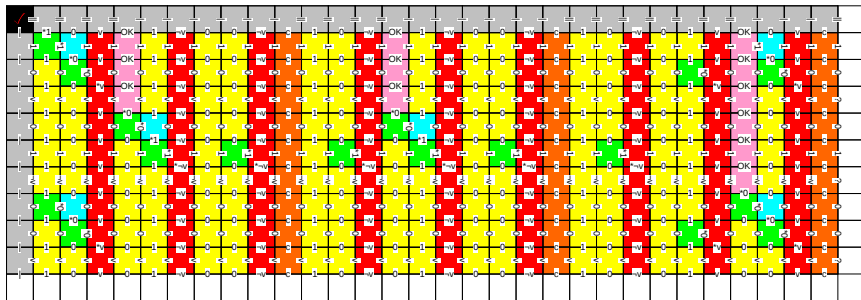
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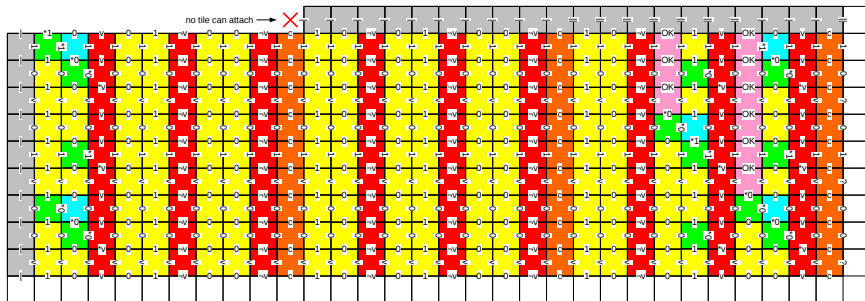
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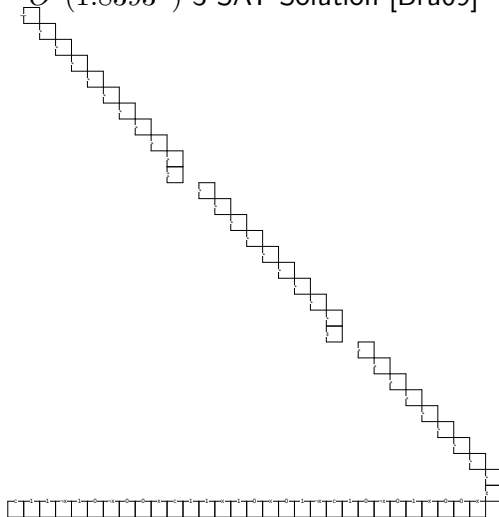


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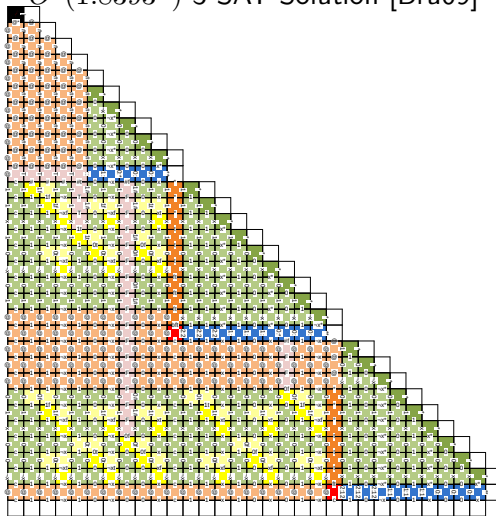


Can Tiles Implement More-Efficient Algorithms?

 $O^*(1.8393^n)$ 3-SAT Solution [Bru09]

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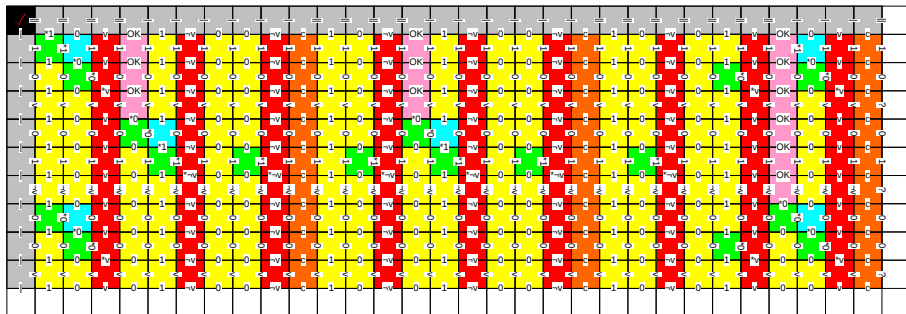
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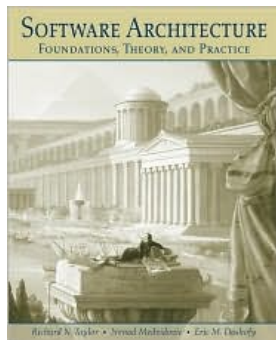
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Tile Style Intuition

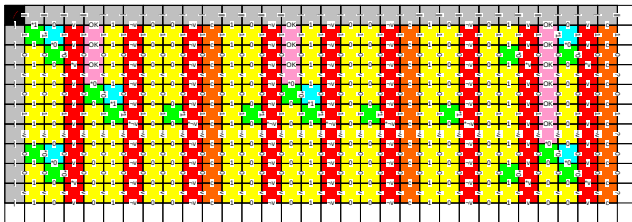


Software Architecture



“Software architecture: the set of principal design decisions made about a system.” [TMD09]

Converting the Model to an Architecture

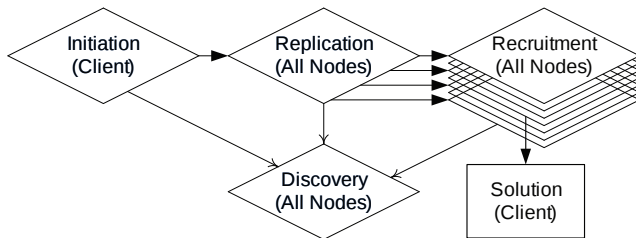


Architectural Elements [MRMM02]

- Components: tiles
- Interfaces: side labels
- Topology: 2-D grid
- Behaviors: identifying nodes, recruiting attachments, replicating, and reporting the solution
- Interaction: recruitment data exchange

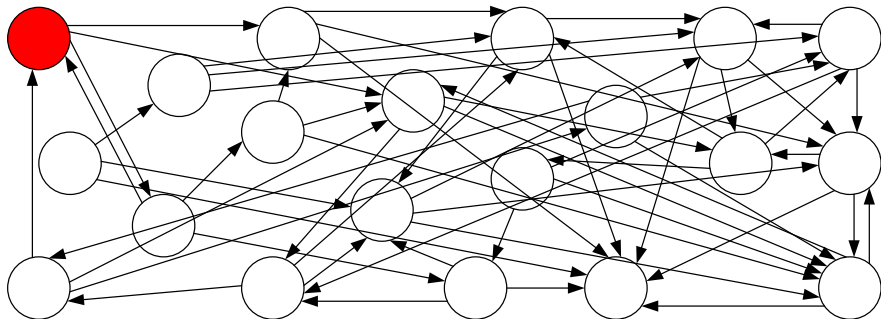
Node Operations [BM07]

- Initiation (by the client)
- Node Discovery
- Replication
- Recruitment



Node Discovery

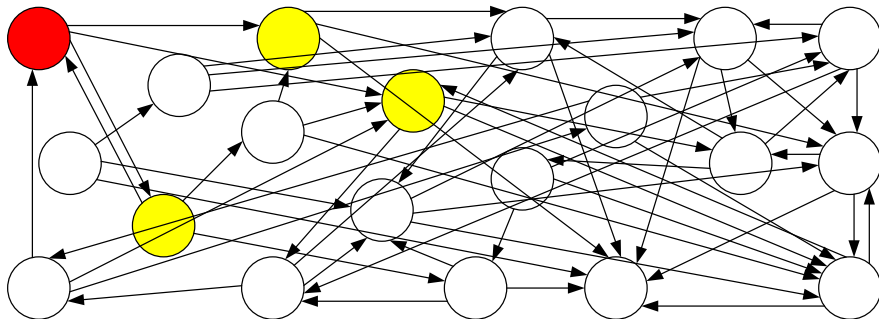
Goal: Selecting a uniformly random node.



A random walk on the graph provably returns a uniformly random node after only $\Theta(\log N)$ requests [MR95].

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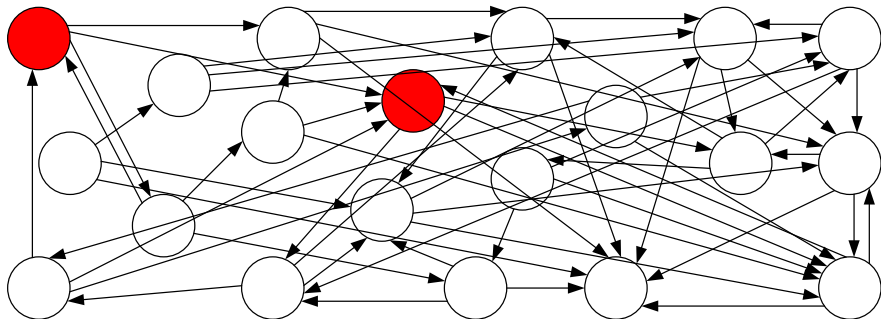
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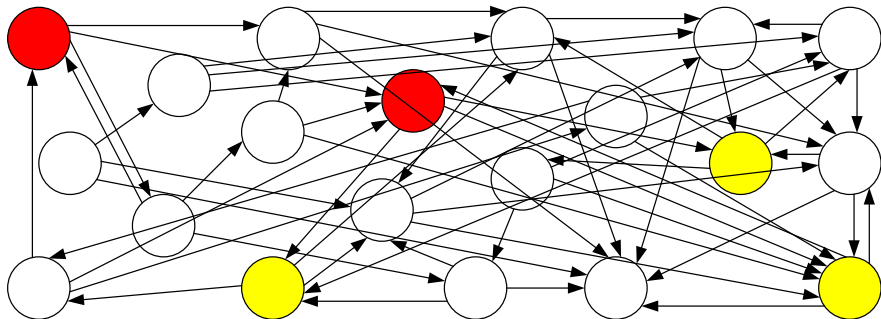
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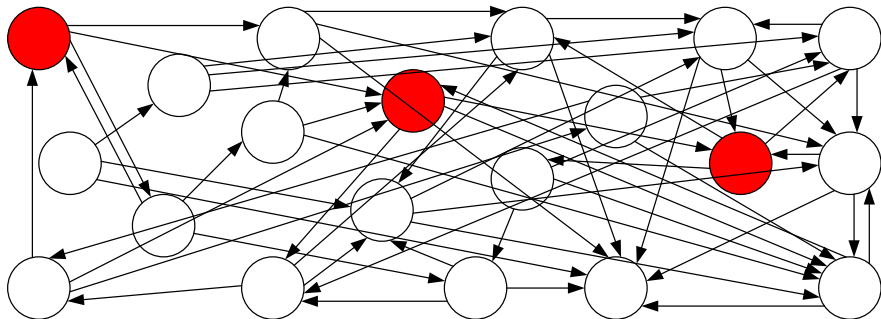
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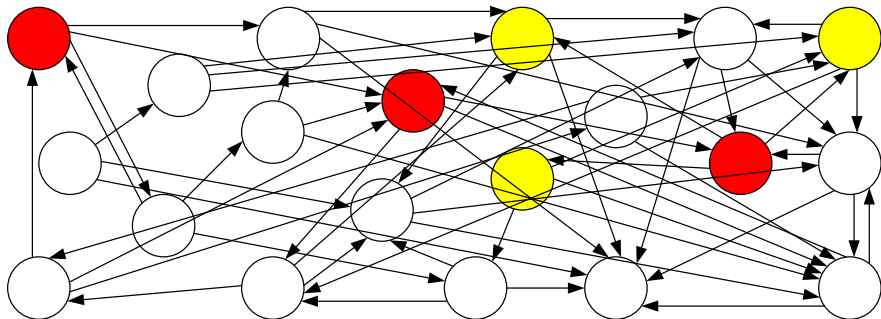
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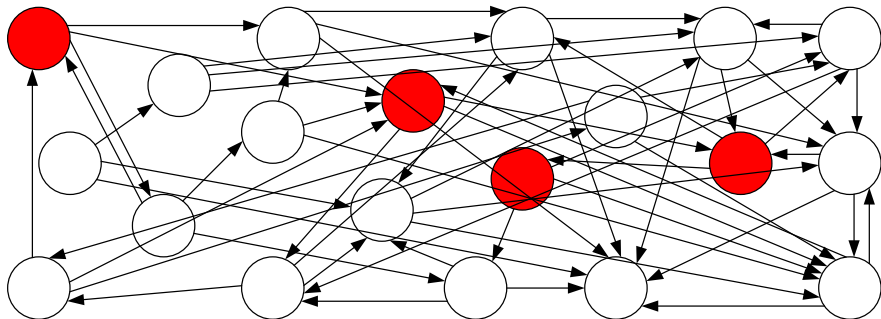
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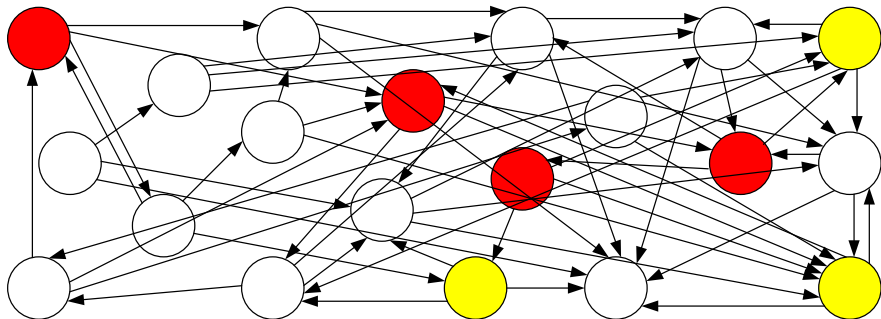
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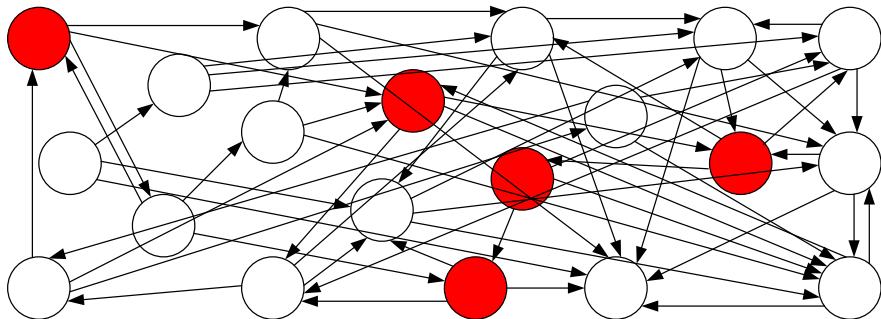
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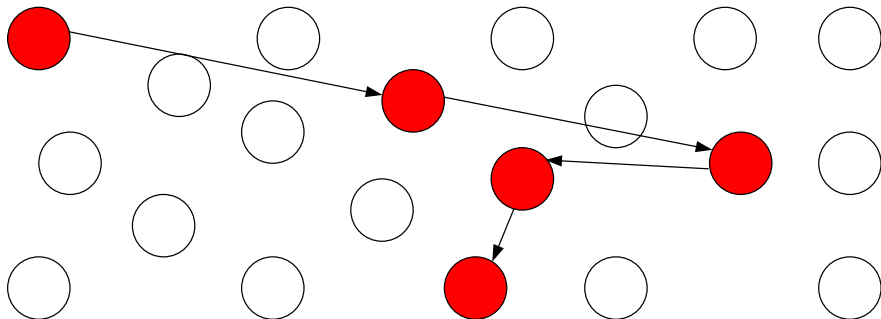
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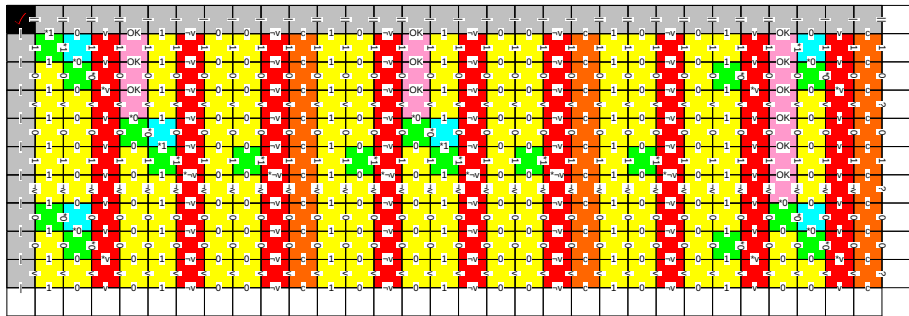
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Data: Each Node Knows Very Little



Less than 1 bit of information per tile.

Data: It Is Hard to Control the Entire Input

$$1 - (1 - c^n)^s$$

n — bits in input

c — compromised fraction

s — number of seeds

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TeraGrid Case Study

- $\sim 100,000$ machines
- 17-variable 100-clause 3-SAT problem

Compromised Fraction	Confidence Level
$\frac{1}{8}$	$1 - 10^{-10}$
$\frac{1}{4}$	$1 - 10^{-5}$
$\frac{1}{3}$	$1 - 10^{-3}$

Experimental Setup

- Mahjong: tile style implementation
 - Java, 3K LoC
 - Leverages Prism-MW [MMRM05]
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 - 11-node private cluster (P4 1.5GHz, 512MiB, WinXP/2000)
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- Sample problems:
 - ℳ : 5-number 21-bit *SubsetSum*
 - ℳ : 11-number 28-bit *SubsetSum*
 - ℳ : 20-variable 20-clause 3-*SAT*
 - ℳ : 33-variable 100-clause 3-*SAT*

Scalability: Speed $\propto$ Network Size

Network & Problem	# of Nodes	Execution Time	Speed-up Ratio
Private Cluster A	5	43 sec.	1.9
	10	23 sec.	
HPCC C	93	220 min.	1.9
	186	116 min.	
PlanetLab B	50	9.2 min.	1.9
	100	4.8 min.	
Simjong D	125,000	8.7 hours	1.9
	250,000	4.5 hours	
	500,000	2.1 hours	
	1,000,000	64 min.	

Scalability: Speed $\propto$ Network Size

Network & Problem	# of Nodes	Execution Time	Speed-up Ratio
Private Cluster ℳ	5	43 sec.	1.9
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System speed scales almost linearly with network size

Simjong ℳ	125,000	8.7 hours	1.9 2.1 2.0
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Robustness to Network Delay

Problem	# of Nodes	Network Delay	Execution Time
Mahjong			
A	11	Private Cluster	20.1 sec.
		HPCC	19.3 sec.
		PlanetLab	18.5 sec.
B	11	Private Cluster	41.6 min.
		HPCC	41.2 min.
		PlanetLab	43.9 min.
Simjong			
D	1,000,000	0ms	65 min.
		10ms	57 min.
		100ms	64 min.
		500ms	60 min.
		Gaussian	68 min.
		Distance-based	59 min.

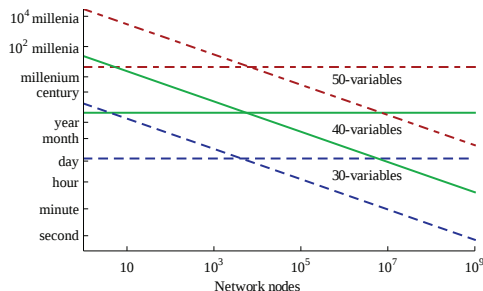
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Network latency does not affect system throughput

D	1,000,000	0ms	65 min.
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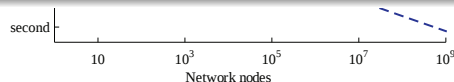
Efficiency: Solving Real-World-Sized Problems



Efficiency: Solving Real-World-Sized Problems

10^4 millenia
 10^2 millenia

Aimed at large untrusted networks

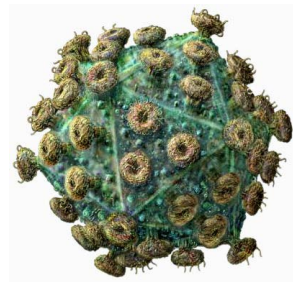


Related Work

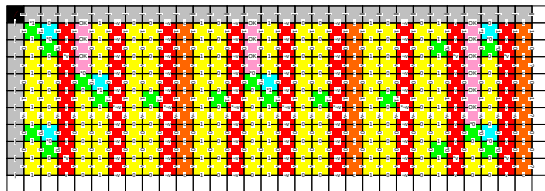
- Private computation in quantum computing through entanglement [Chi05]
- Homomorphic encryption for private computation [Gen09]
- Plethora of non-private distributed computation work [BOI09, KWA⁺96, LSSP02, Ros07, DG04, CB04]
- . . . and fault-tolerant computation work [Sar02, BGX93, BCGX02, FS01, KK07, HK03]

Contributions

- Developed self-assembling systems to solve complex computational problems



- Designed the tile architectural style for deploying tile systems on large networks





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