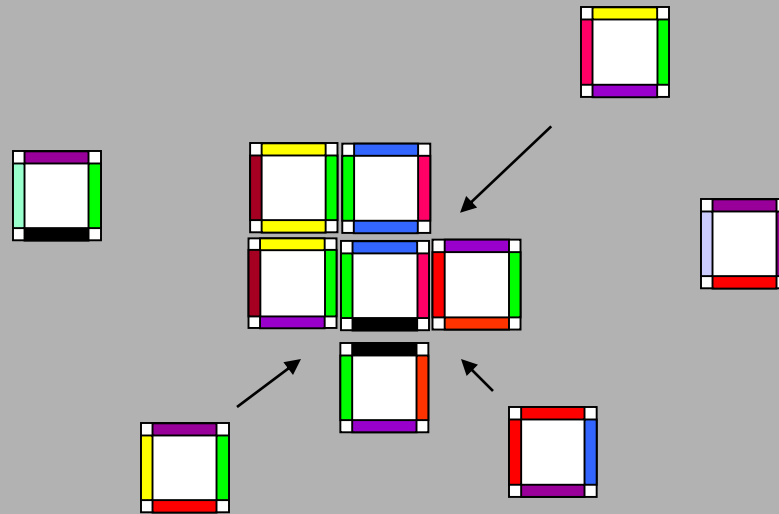


Fast Arithmetic in Algorithmic Self-Assembly

Unconventional Computation & Natural Computation

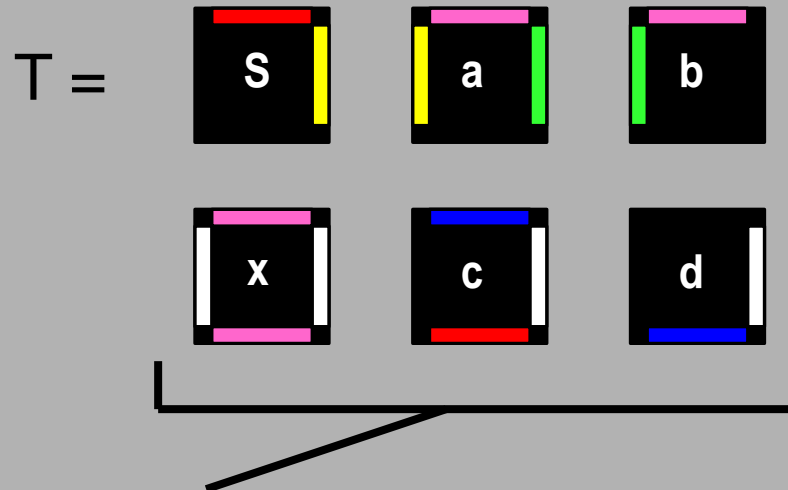
July 14, 2014



Alexandra Keenan
Robert Schweller
Michael Sherman
Xingsi Zhong

Wyle Science Technology and Engineering Group
University of Texas - Pan American
Amazon
Clemson University

How a tile system self assembles



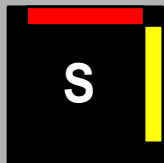
Tile Set:

Glue Function:

- $G(y) = 2$
- $G(g) = 2$
- $G(r) = 2$
- $G(b) = 2$
- $G(p) = 1$
- $G(w) = 1$

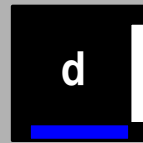
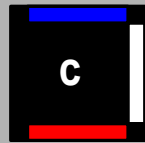
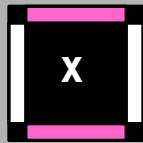
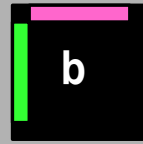
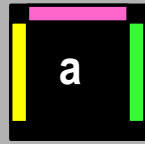
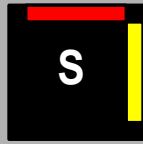
Temperature: $t = 2$

Seed:



How a tile system self assembles

T =



$$G(y) = 2$$

$$G(g) = 2$$

$$G(r) = 2$$

$$G(b) = 2$$

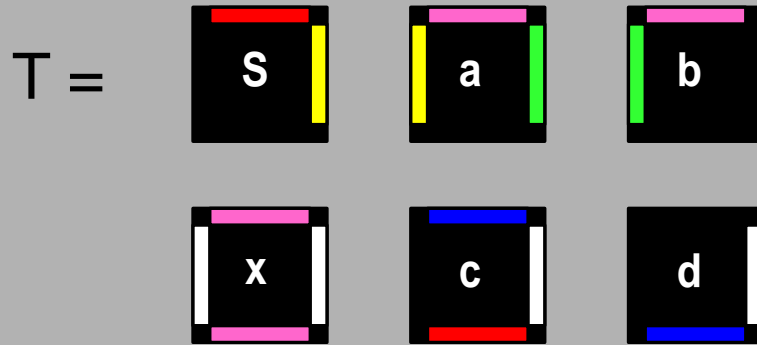
$$G(p) = 1$$

$$G(w) = 1$$

$$t = 2$$



How a tile system self assembles



$$G(y) = 2$$

$$G(g) = 2$$

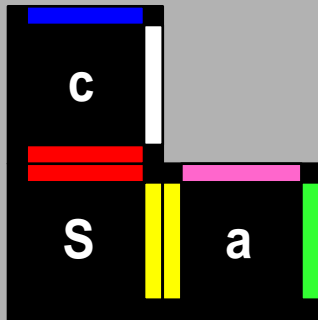
$$G(r) = 2$$

$$G(b) = 2$$

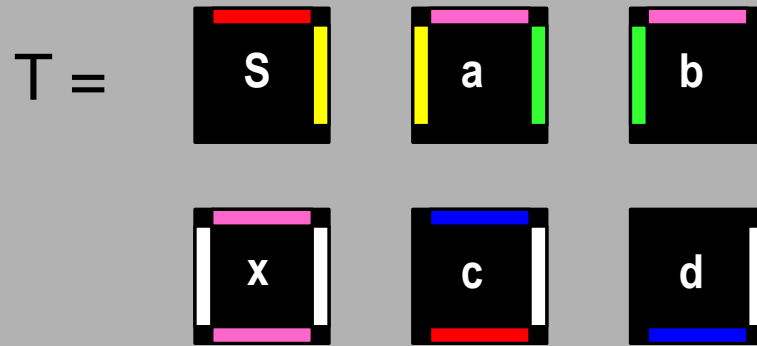
$$G(p) = 1$$

$$G(w) = 1$$

$$t = 2$$



How a tile system self assembles



$$G(y) = 2$$

$$G(g) = 2$$

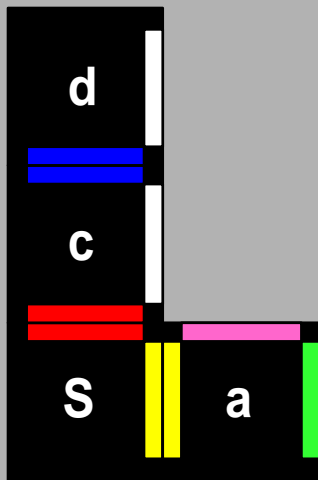
$$G(r) = 2$$

$$G(b) = 2$$

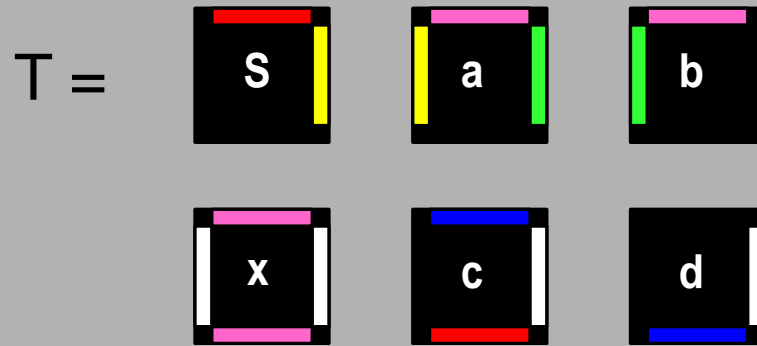
$$G(p) = 1$$

$$G(w) = 1$$

$$t = 2$$



How a tile system self assembles



$$G(y) = 2$$

$$G(g) = 2$$

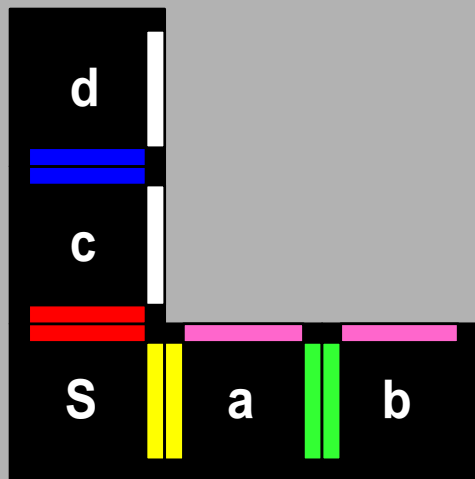
$$G(r) = 2$$

$$G(b) = 2$$

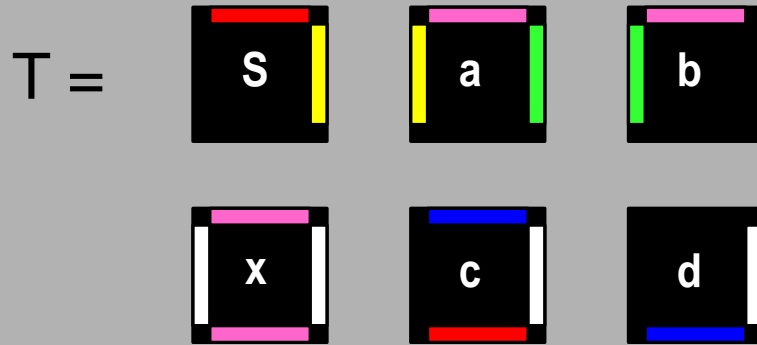
$$G(p) = 1$$

$$G(w) = 1$$

$$t = 2$$



How a tile system self assembles



$$G(y) = 2$$

$$G(g) = 2$$

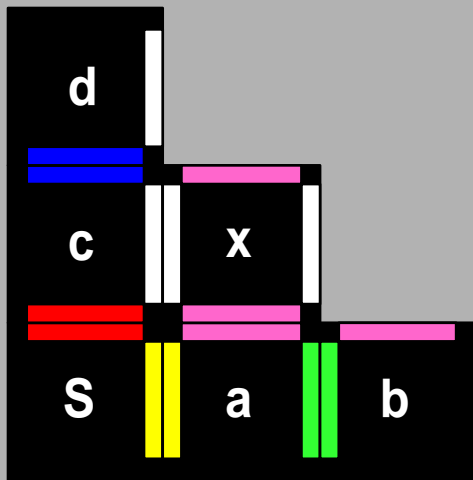
$$G(r) = 2$$

$$G(b) = 2$$

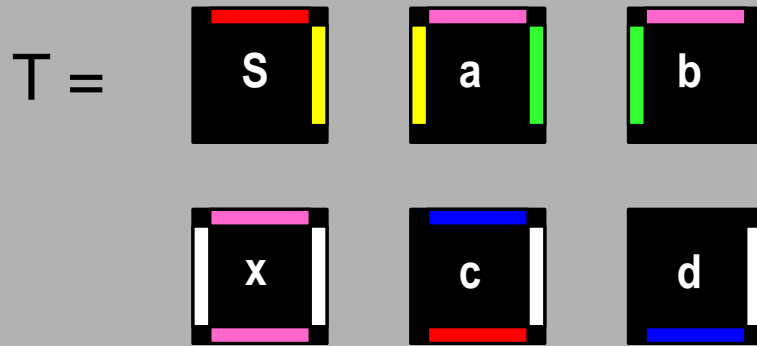
$$G(p) = 1$$

$$G(w) = 1$$

$$t = 2$$



How a tile system self assembles



$$G(y) = 2$$

$$G(g) = 2$$

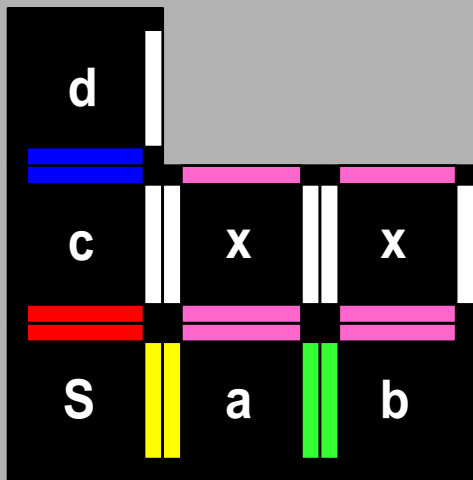
$$G(r) = 2$$

$$G(b) = 2$$

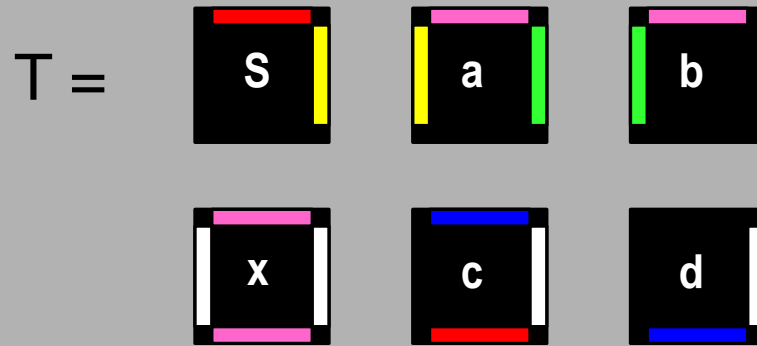
$$G(p) = 1$$

$$G(w) = 1$$

$$t = 2$$



How a tile system self assembles



$$G(y) = 2$$

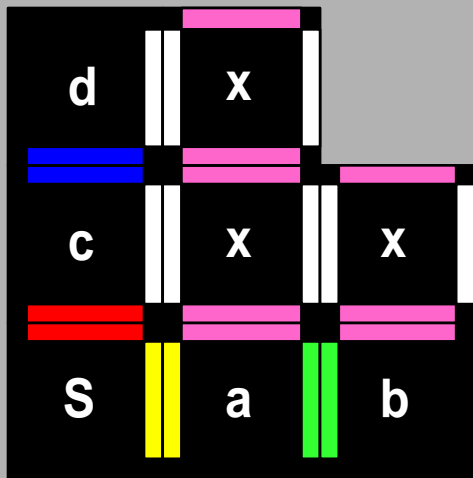
$$G(g) = 2$$

$$G(r) = 2$$

$$G(b) = 2$$

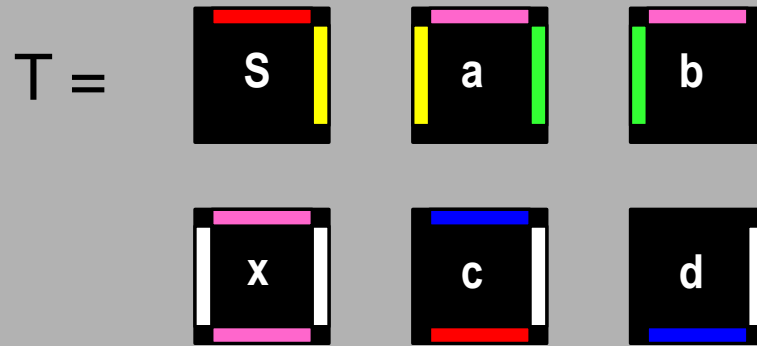
$$G(p) = 1$$

$$G(w) = 1$$



$$t = 2$$

How a tile system self assembles



$$G(y) = 2$$

$$G(g) = 2$$

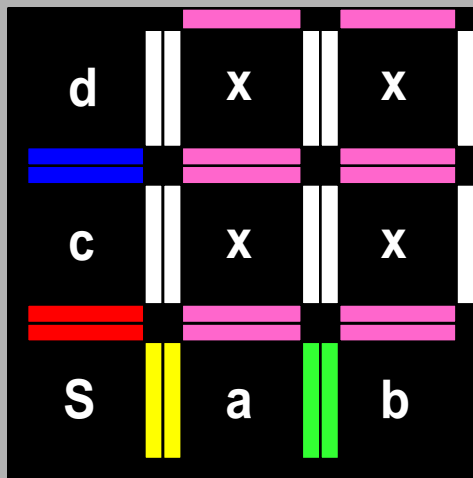
$$G(r) = 2$$

$$G(b) = 2$$

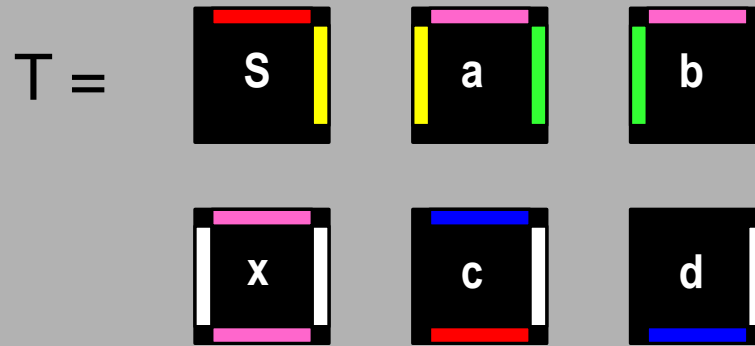
$$G(p) = 1$$

$$G(w) = 1$$

$$t = 2$$



How a tile system self assembles



$$G(y) = 2$$

$$G(g) = 2$$

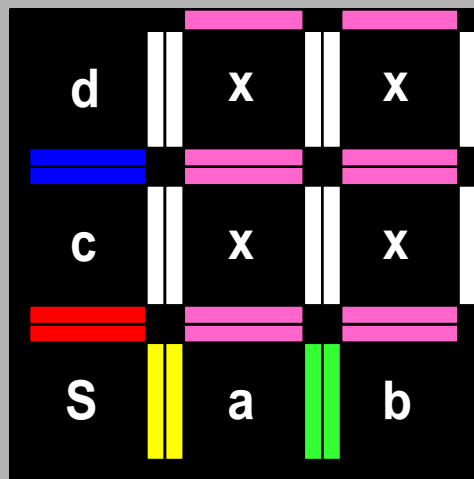
$$G(r) = 2$$

$$G(b) = 2$$

$$G(p) = 1$$

$$G(w) = 1$$

$$t = 2$$

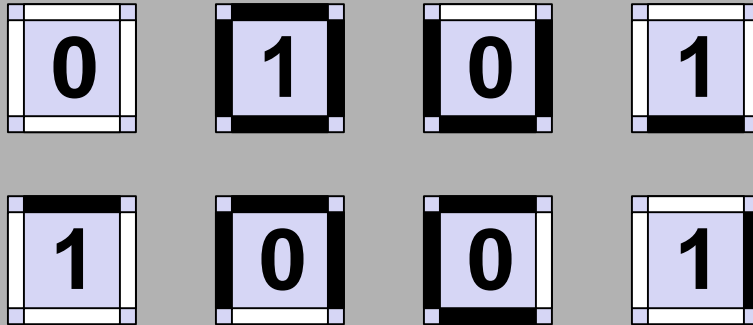


- What is this model capable above?
- efficient assembly of shapes/patterns
 - shape and pattern replication
 - computation**
 - fast arithmetic**

Binary Addition

(Yuriy Brun, TCS 2007)

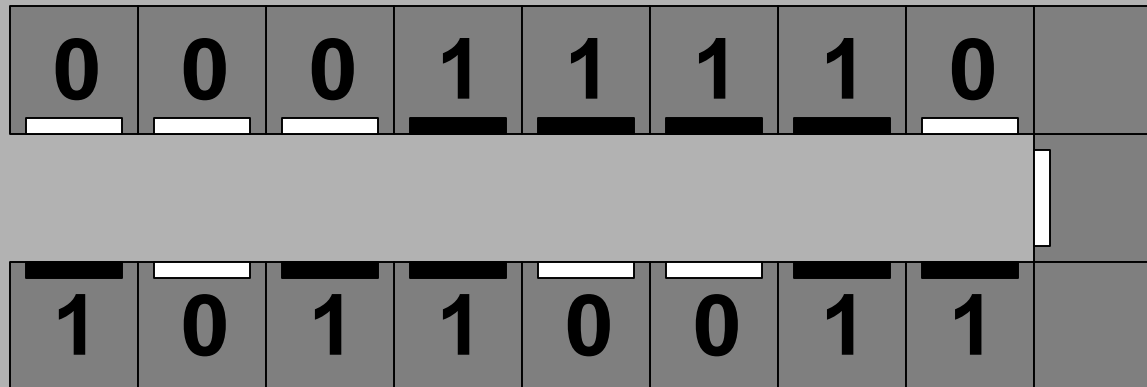
Tile set :



Compute:

$$\begin{array}{r} 00011110 \\ + 10110011 \\ \hline \end{array}$$

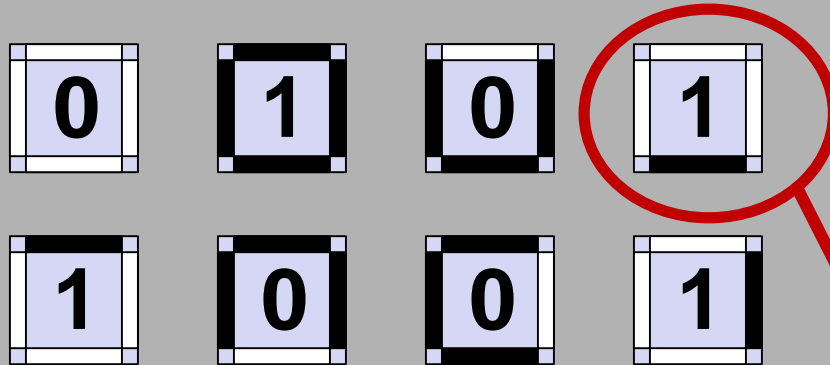
Seed :



Binary Addition

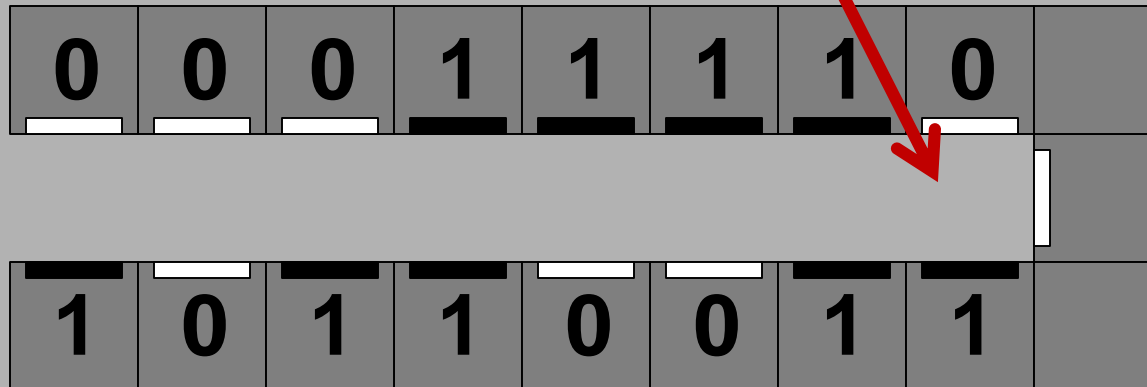
(Yuriy Brun, TCS 2007)

Tile set :



$$\begin{array}{r} 00011110 \\ + 10110011 \\ \hline \end{array}$$

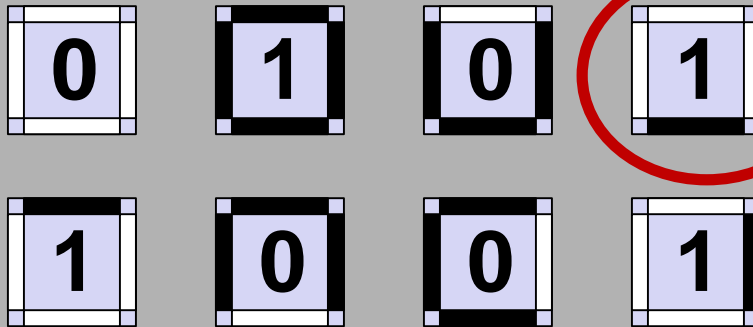
Seed :



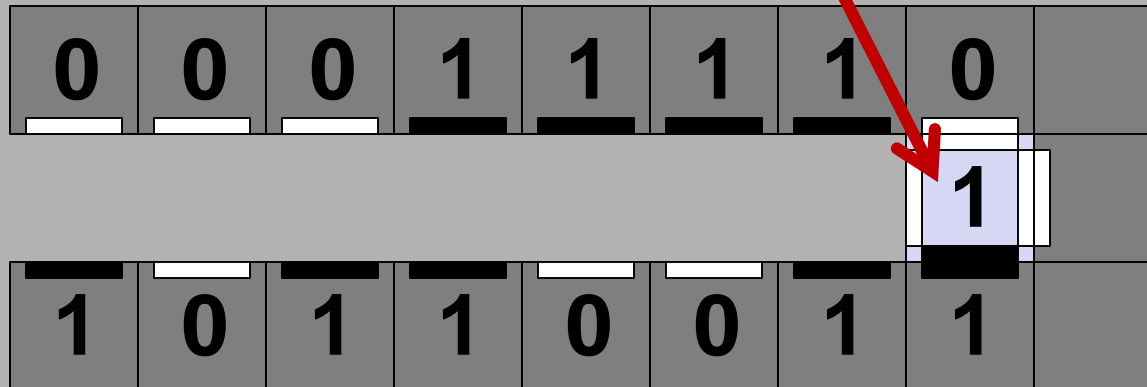
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



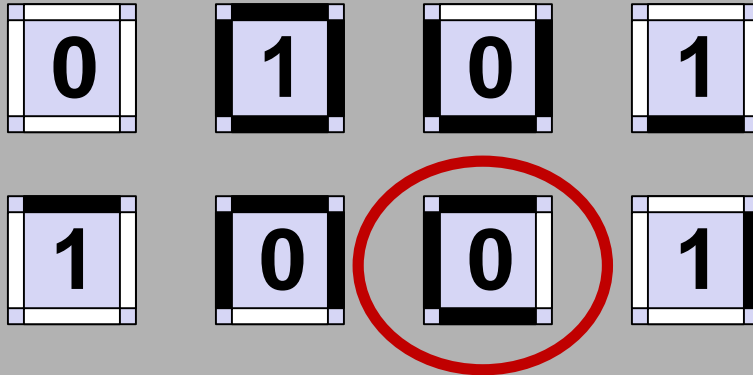
$$\begin{array}{r} 00011110 \\ + 10110011 \\ \hline 1 \end{array}$$



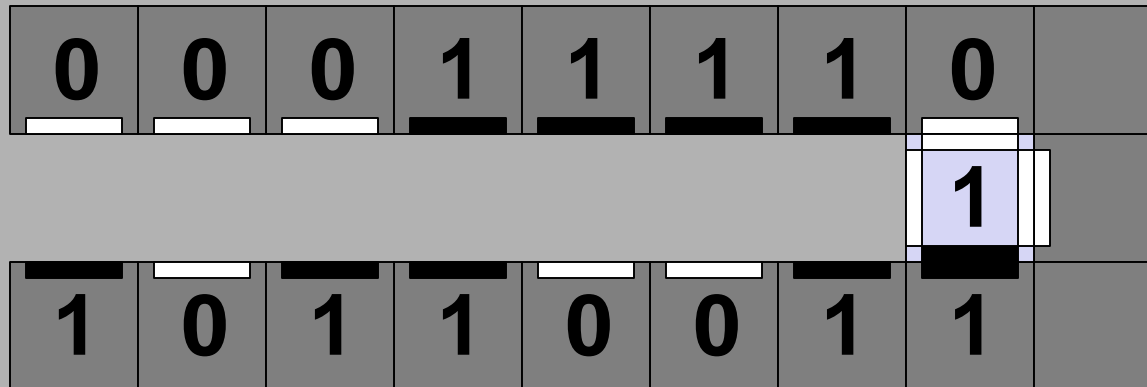
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



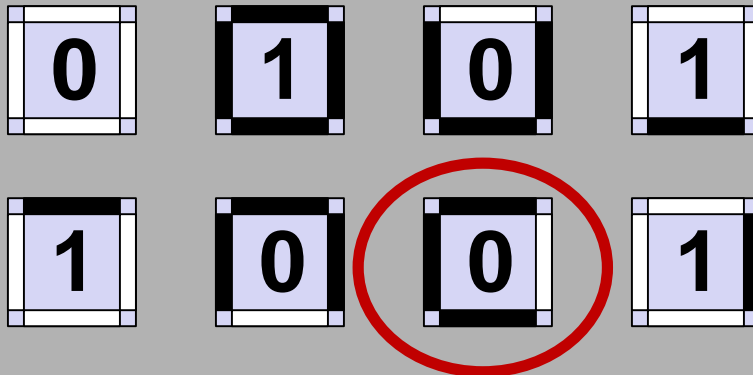
$$\begin{array}{r} 00011110 \\ + 10110011 \\ \hline 1 \end{array}$$



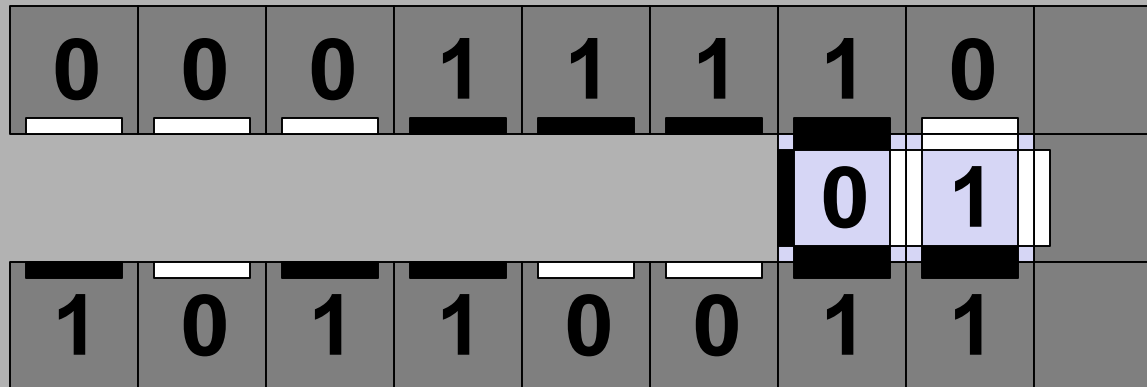
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



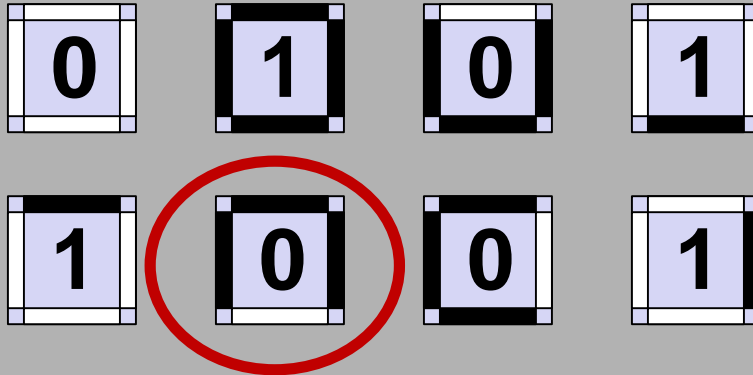
$$\begin{array}{r} 1 \\ 00011110 \\ + 10110011 \\ \hline 01 \end{array}$$



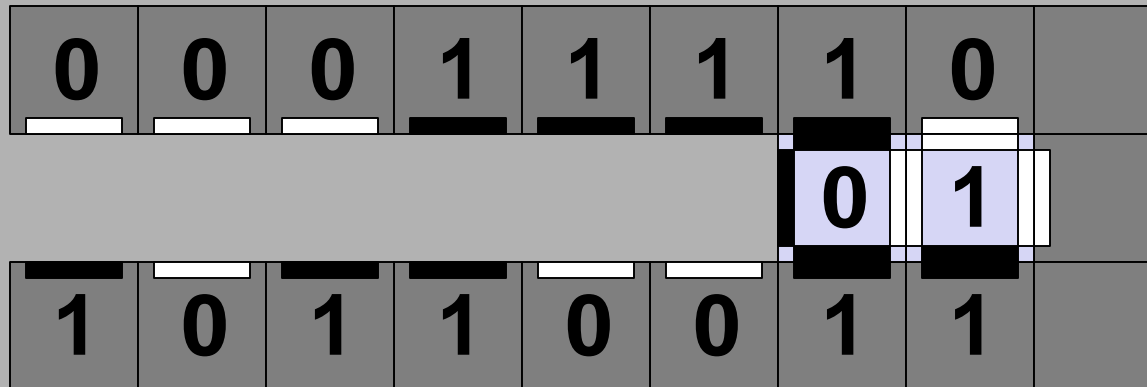
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



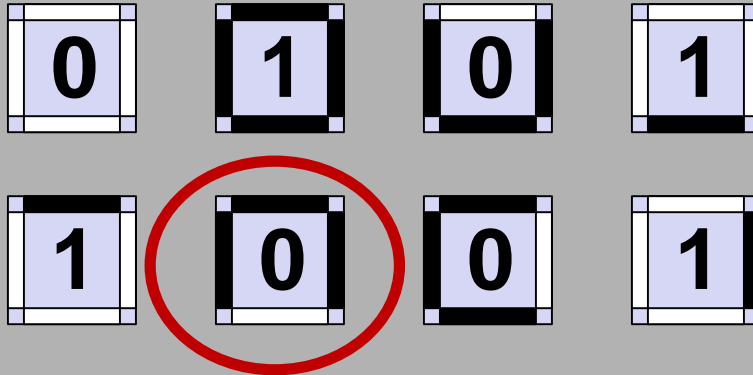
$$\begin{array}{r} 1 \\ 00011110 \\ + 10110011 \\ \hline 01 \end{array}$$



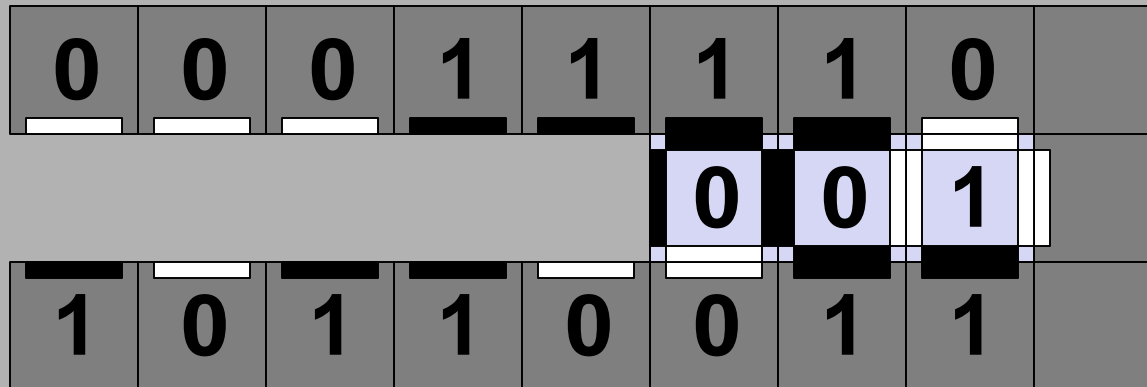
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



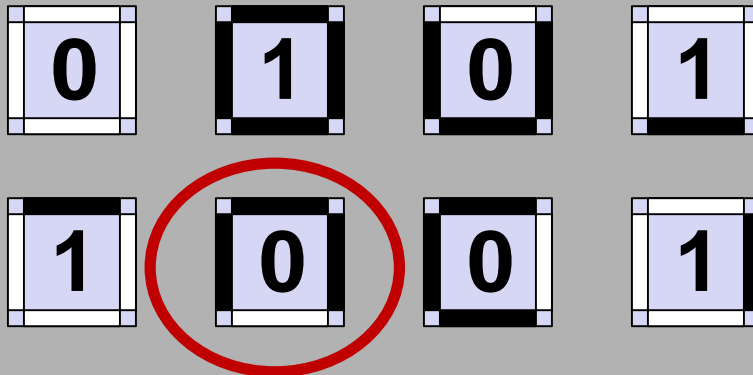
$$\begin{array}{r} 11 \\ 00011110 \\ + 10110011 \\ \hline 001 \end{array}$$



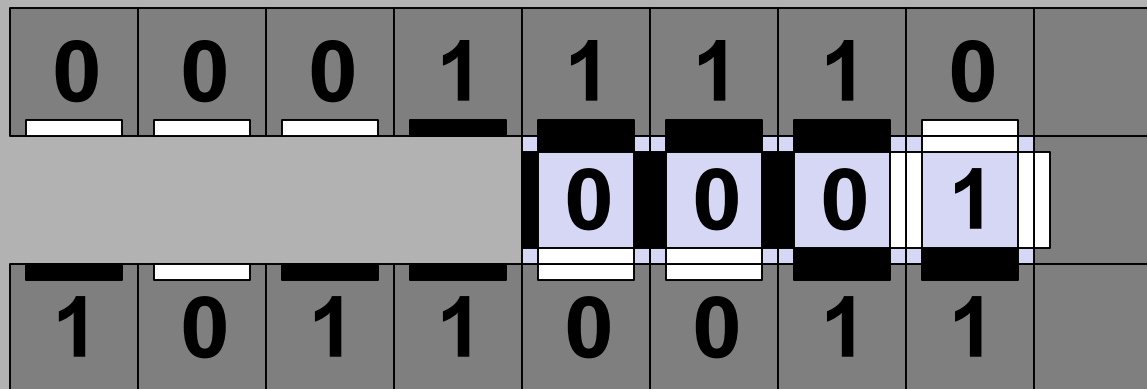
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



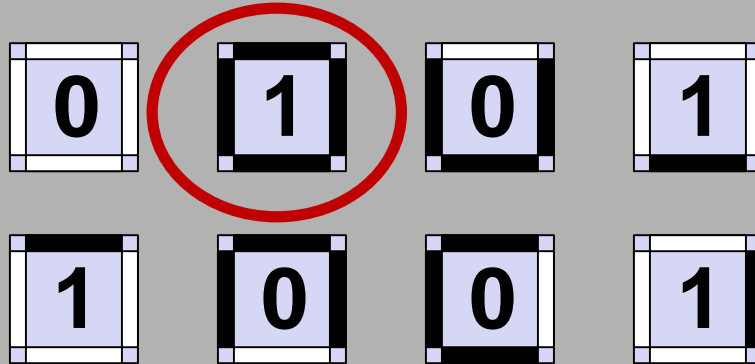
$$\begin{array}{r} 111 \\ 00011110 \\ + 10110011 \\ \hline 0001 \end{array}$$



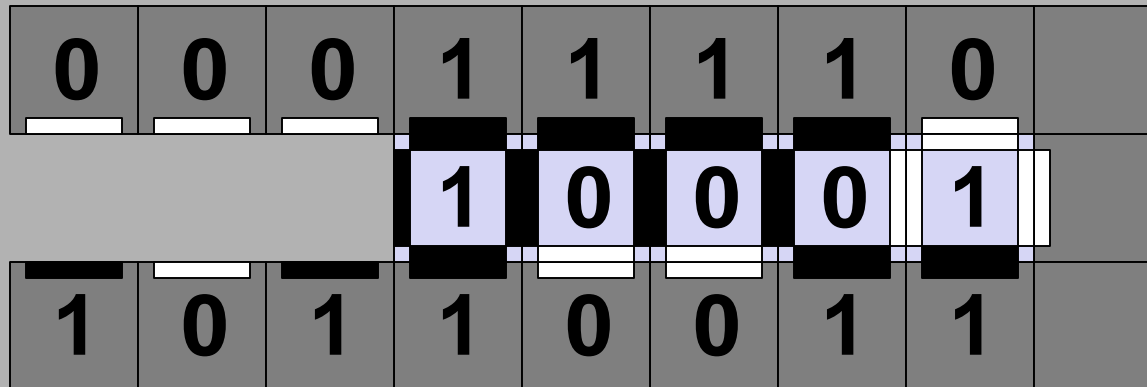
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



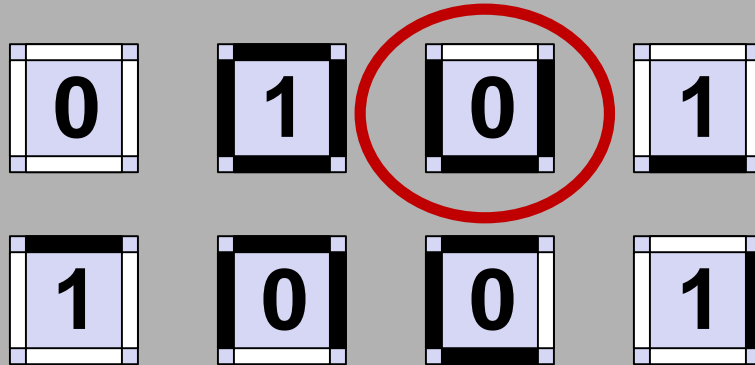
$$\begin{array}{r} 1111 \\ 00011110 \\ + 10110011 \\ \hline 10001 \end{array}$$



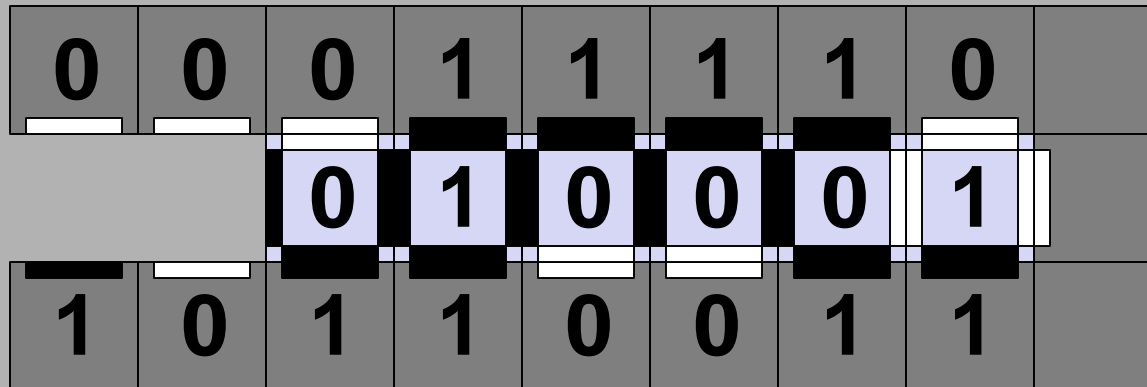
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



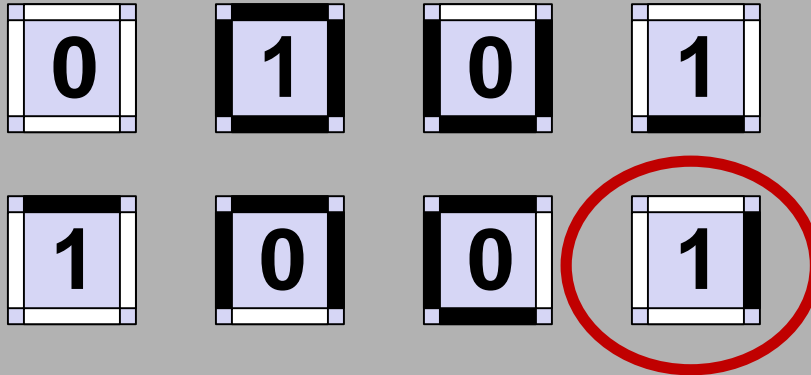
$$\begin{array}{r} 11111 \\ 00011110 \\ + 10110011 \\ \hline 010001 \end{array}$$



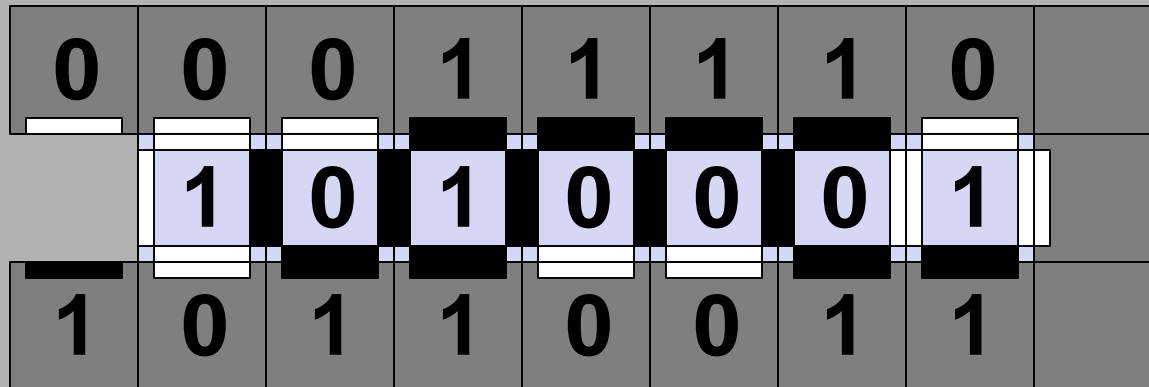
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



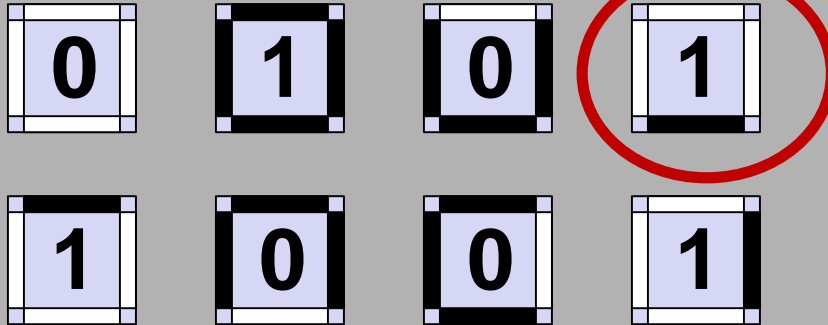
$$\begin{array}{r} 11111 \\ 00011110 \\ + 10110011 \\ \hline 1010001 \end{array}$$



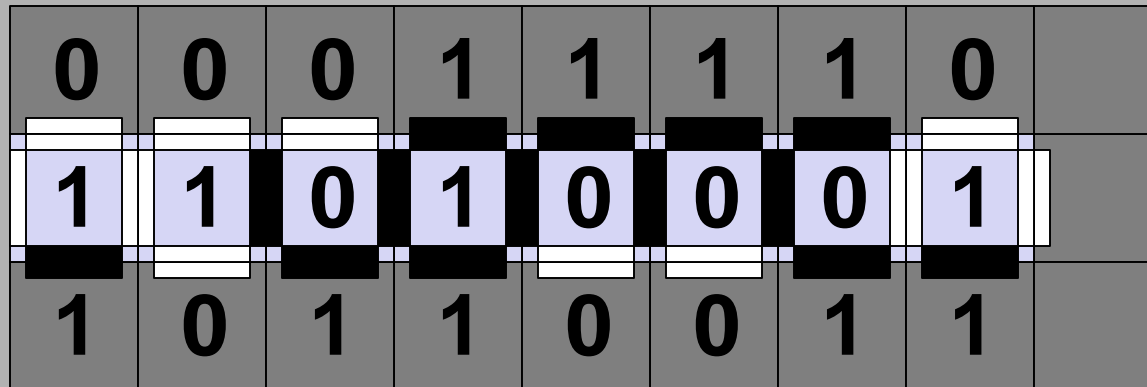
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



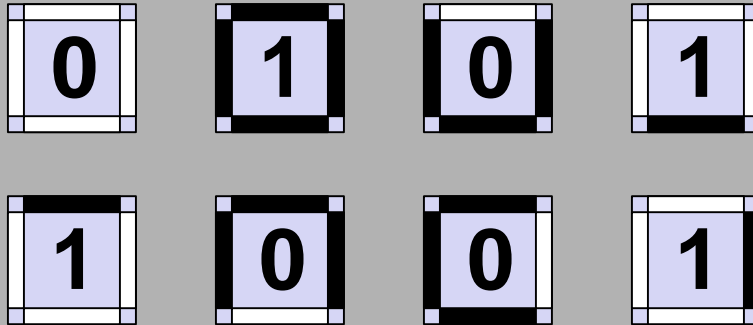
$$\begin{array}{r} 11111 \\ 00011110 \\ + 10110011 \\ \hline 11010001 \end{array}$$



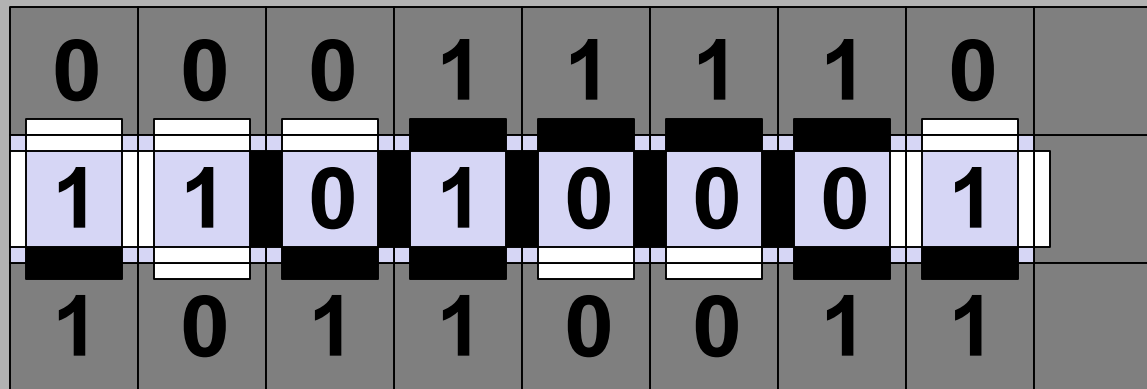
Binary Addition

(Yuriy Brun, TCS 2007)

Tile set :



$$\begin{array}{r} 11111 \\ 00011110 \\ + 10110011 \\ \hline 11010001 \end{array}$$



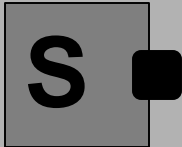
Run time: $O(n)$

¿Are there faster algorithms?

Run Time Model

Build a 3x3 square

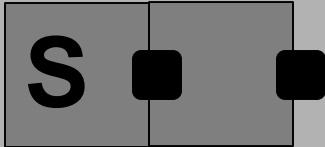
Time steps: 0



Run Time Model

Build a 3x3 square

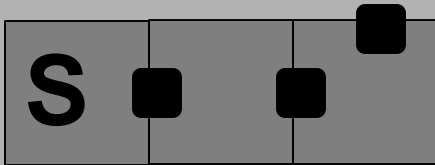
Time steps: 1



Run Time Model

Build a 3x3 square

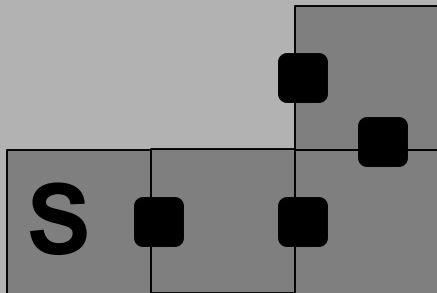
Time steps: 2



Run Time Model

Build a 3x3 square

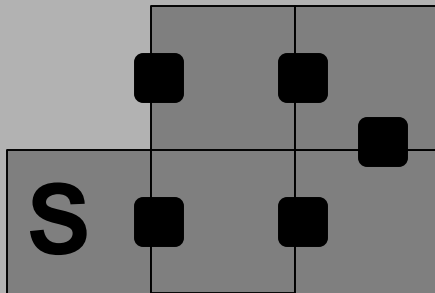
Time steps: 3



Run Time Model

Build a 3x3 square

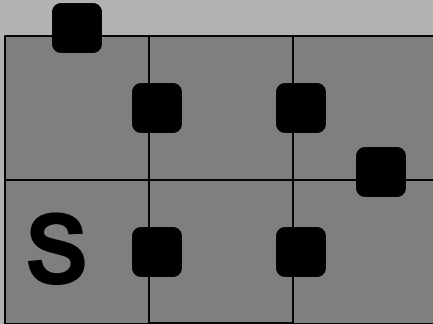
Time steps: 4



Run Time Model

Build a 3x3 square

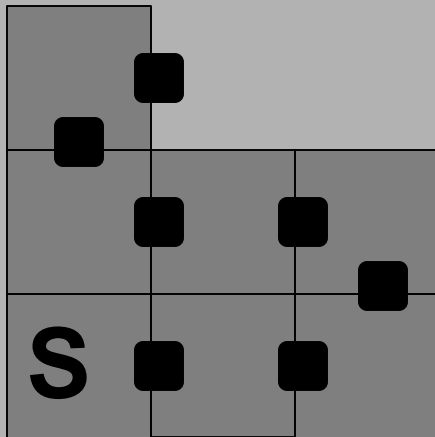
Time steps: 5



Run Time Model

Build a 3x3 square

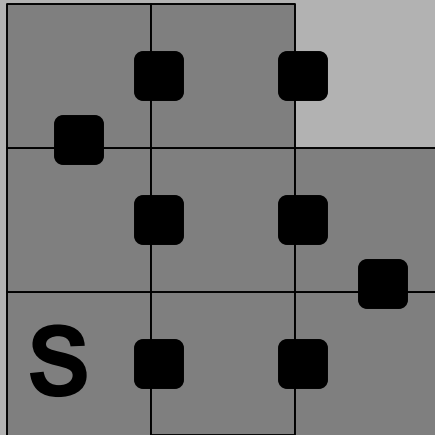
Time steps: 6



Run Time Model

Build a 3x3 square

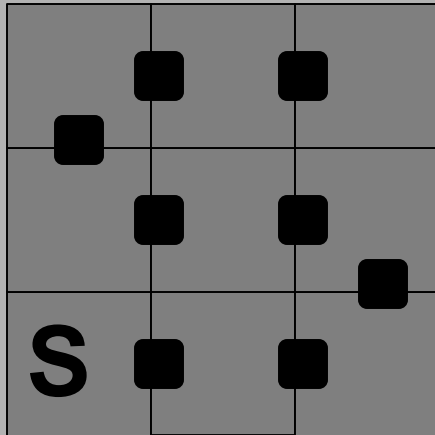
Time steps: 7



Run Time Model

Build a 3x3 square

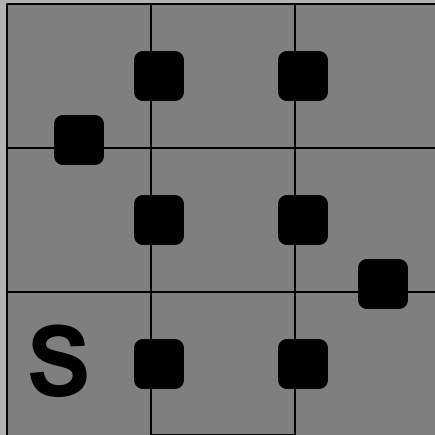
Time steps: 8



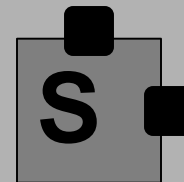
Run Time Model

Build a 3x3 square

Time steps: 8



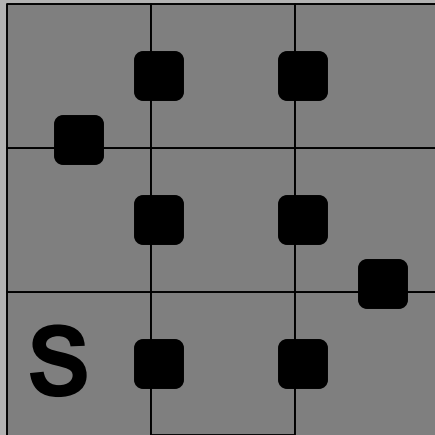
Time steps: 0



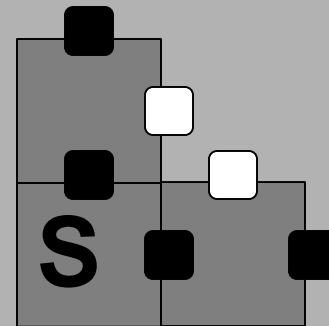
Run Time Model

Build a 3x3 square

Time steps: 8



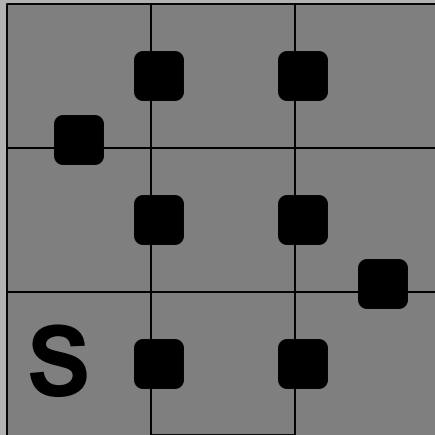
Time steps: 1



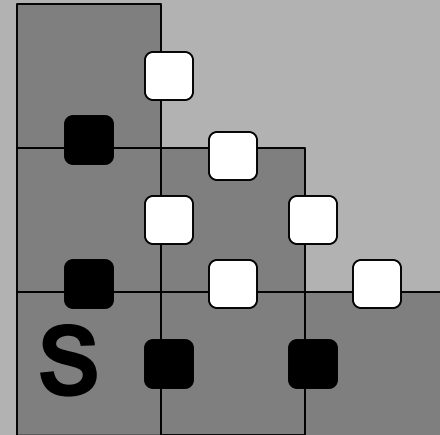
Run Time Model

Build a 3x3 square

Time steps: 8



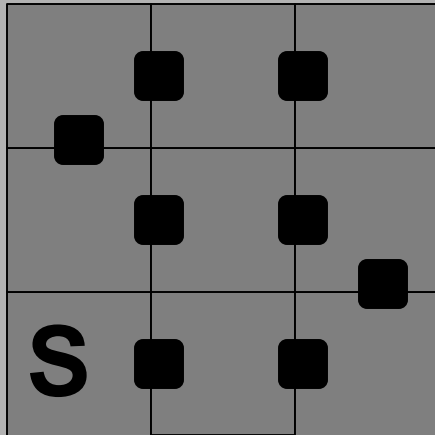
Time steps: 2



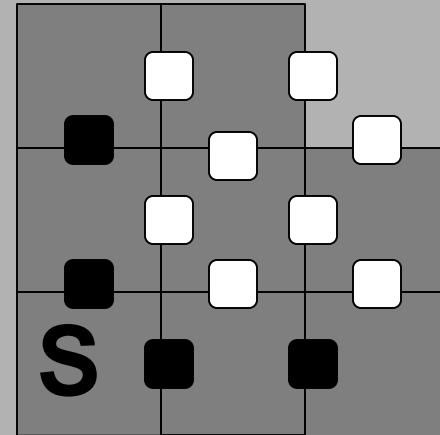
Run Time Model

Build a 3x3 square

Time steps: 8



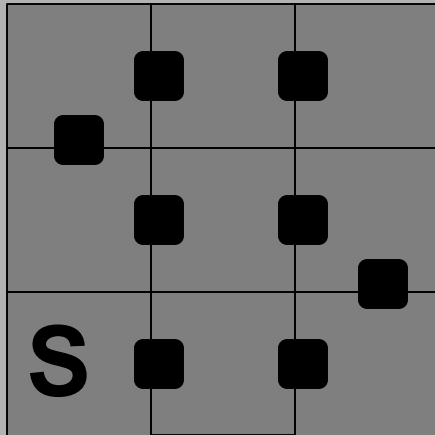
Time steps: 3



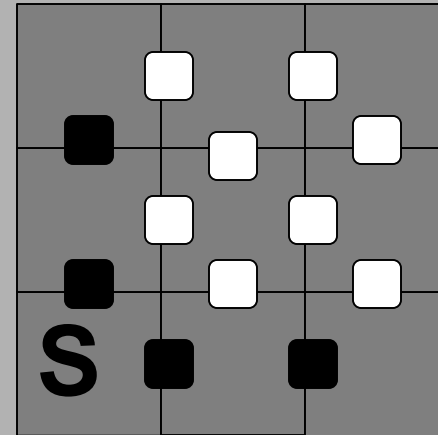
Run Time Model

Build a 3x3 square

Time steps: 8

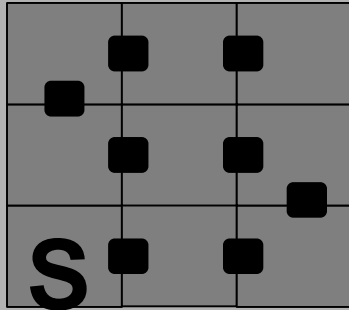


Time steps: 4

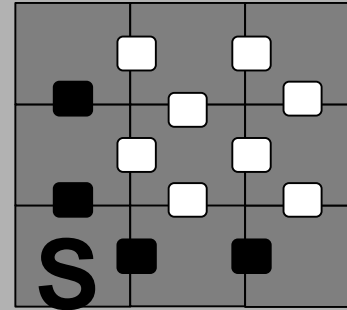


Run Time Model

Time steps: 8



Time steps: 4



Parallel timing model: [Becker et. al., 2006]

All attachable tiles attach in 1 time step.

- Simple

Continuous timing model: [Adleman et. al., 2001]

Assembly is modelled as a continuous time Markov process.

- More realistic

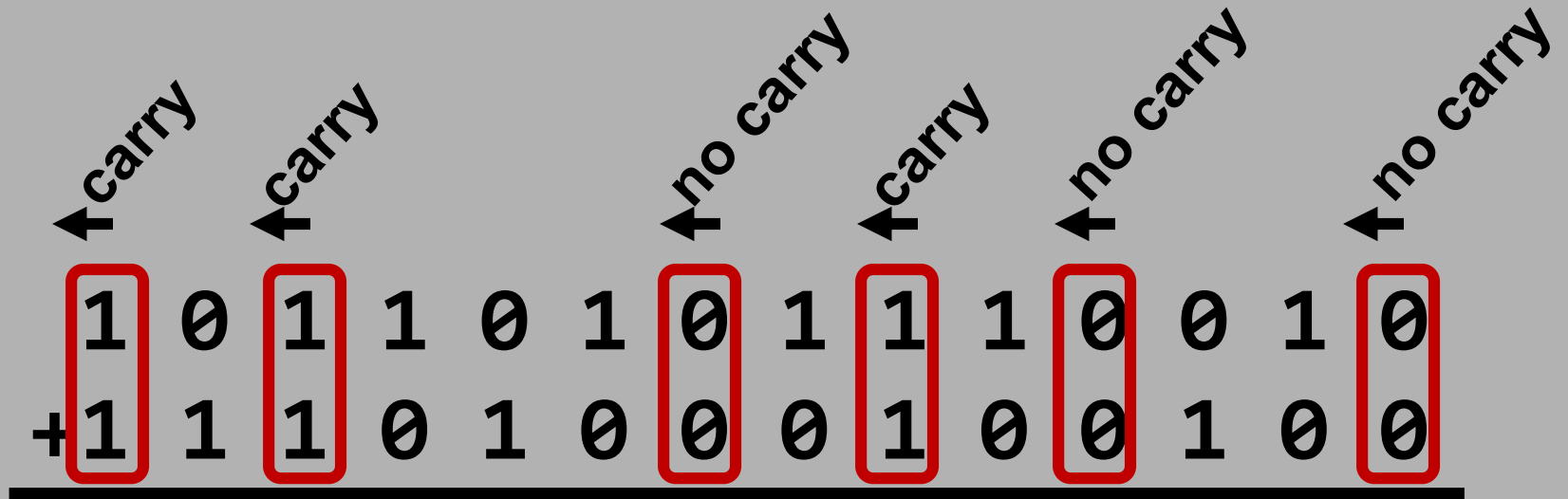
Our upper bounds hold
within both models

	Addition Algorithms	
	Worst case upper	Average case lower
[Brun 2007]	$O(n)$	$O(n)$
Average-case algorithm		
Worst-case algorithm		
Combo algorithm		
3D		

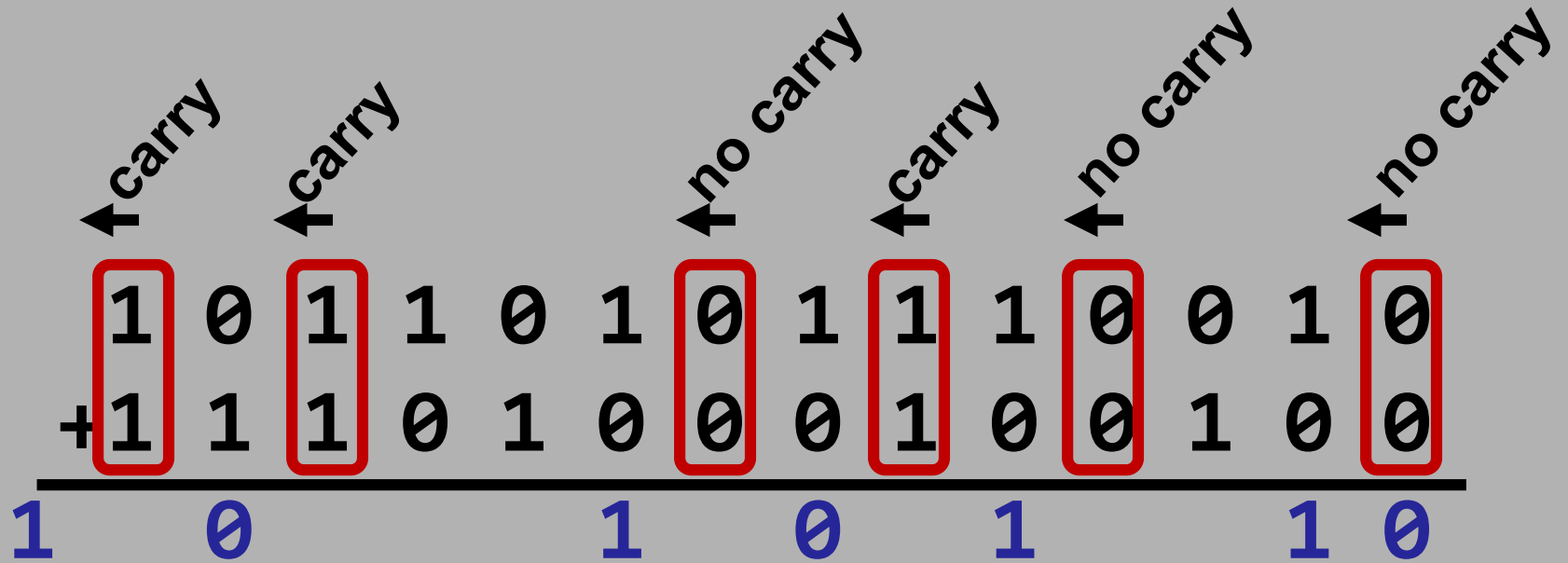
Addition Parallelization Scheme: average case

	1	0	1	1	0	1	0	1	1	1	0	0	1	0
+1	1	1	0	1	0	0	0	1	0	0	0	1	0	0

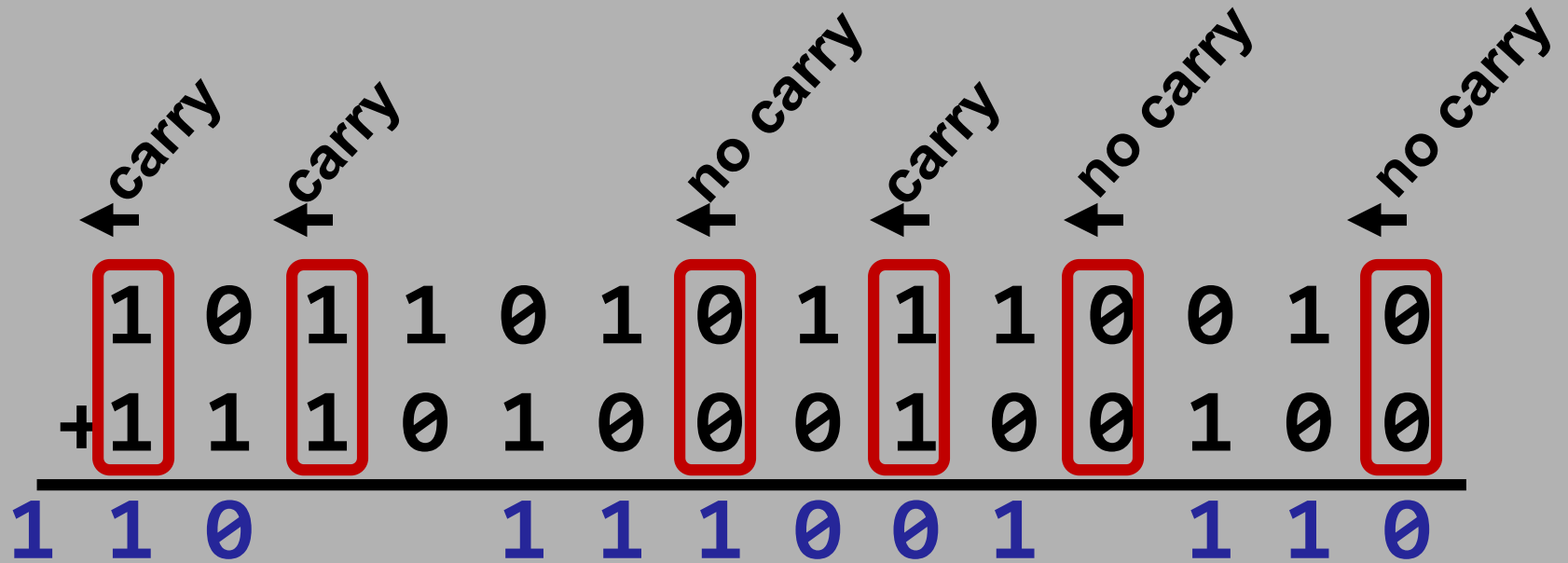
Addition Parallelization Scheme: average case



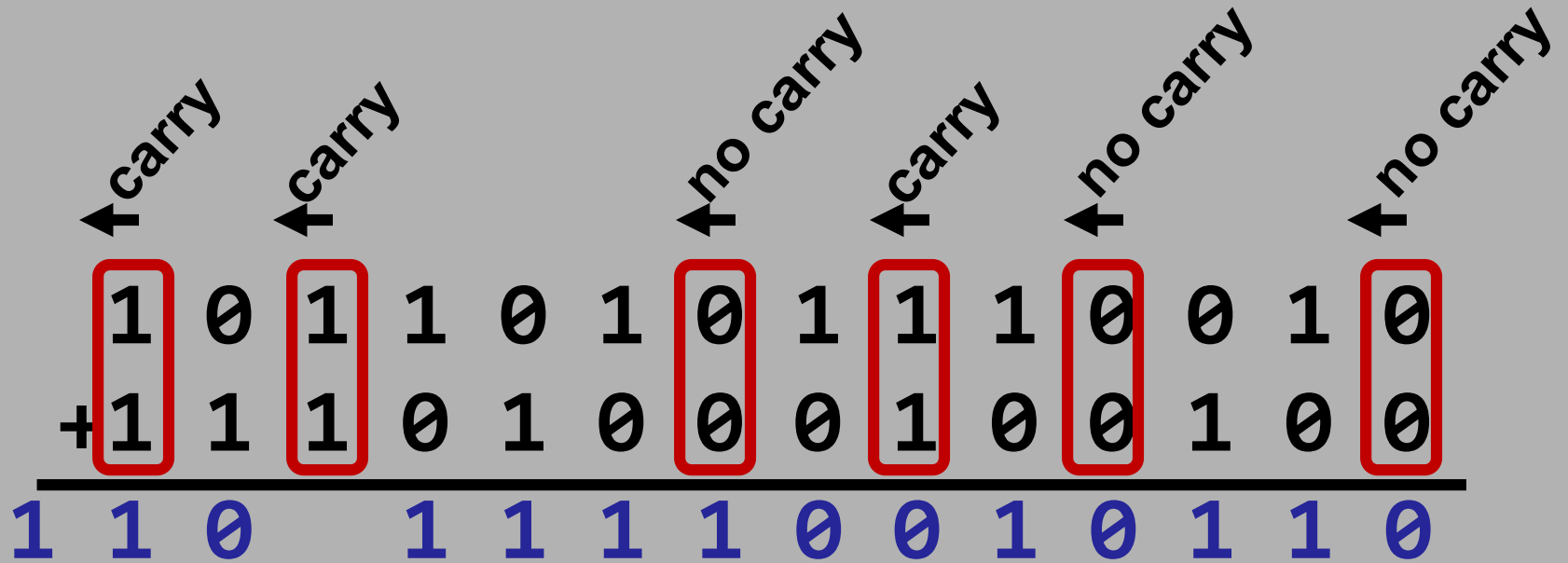
Addition Parallelization Scheme: average case



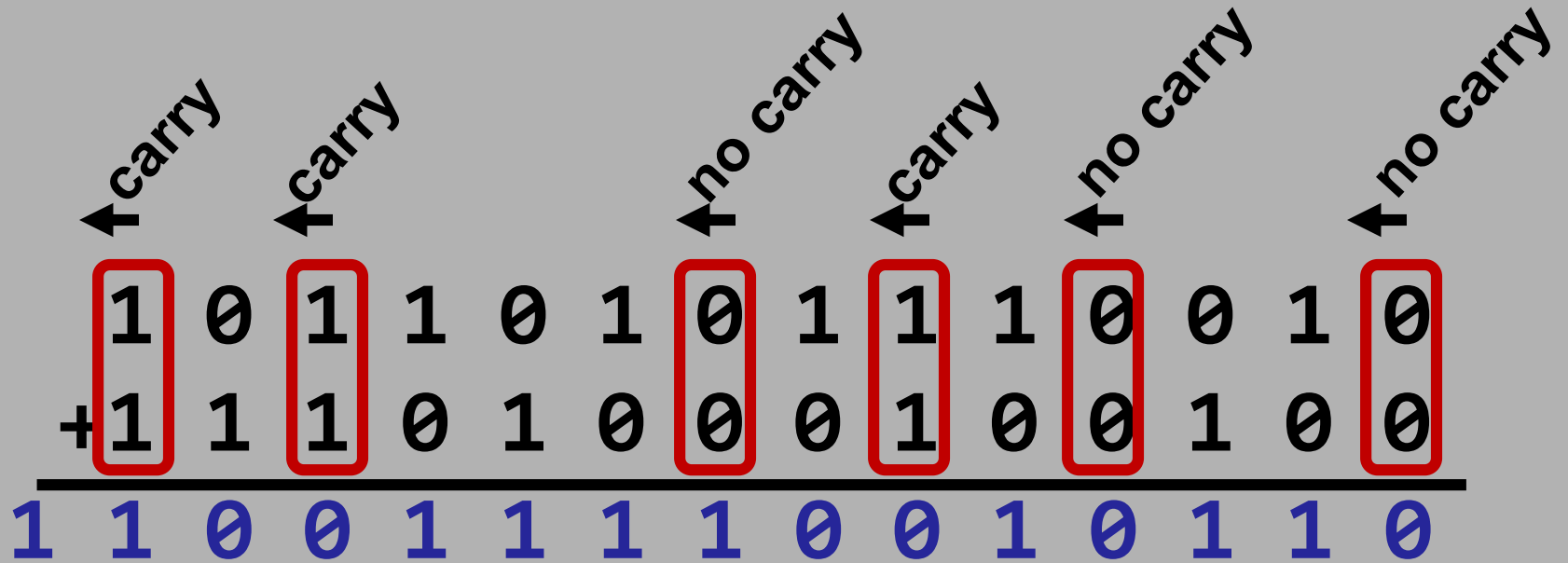
Addition Parallelization Scheme: average case



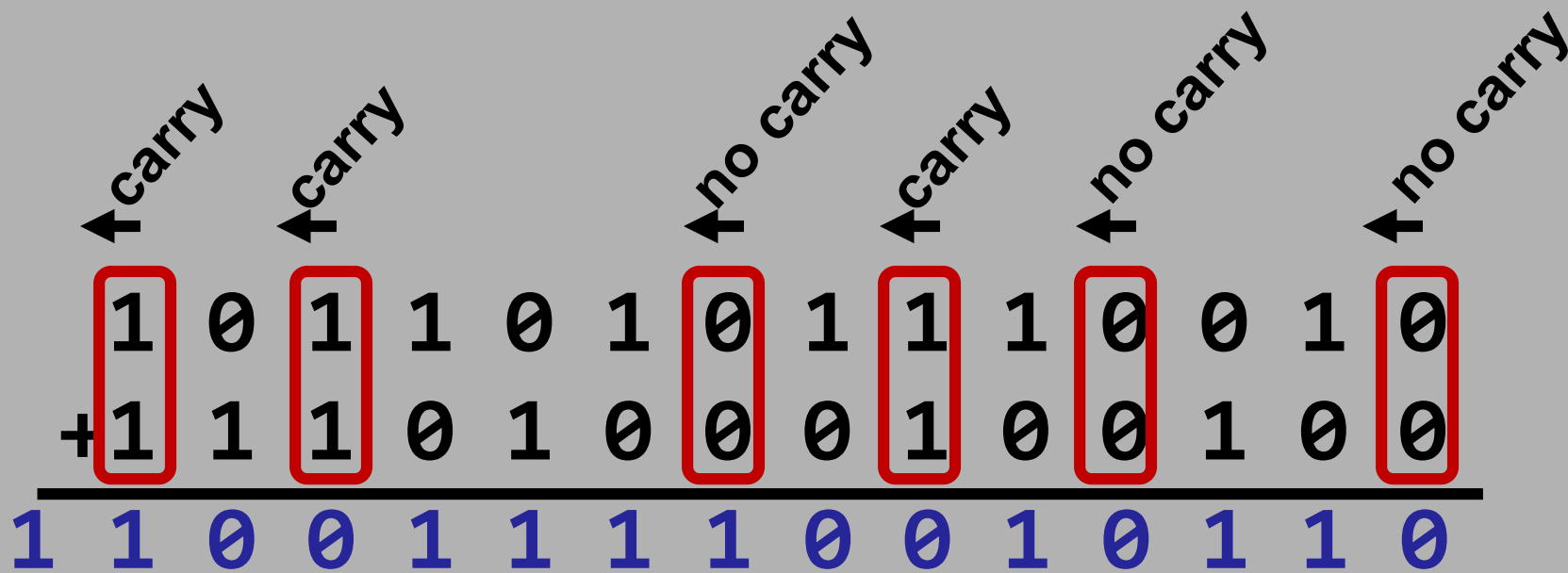
Addition Parallelization Scheme: average case



Addition Parallelization Scheme: average case



Addition Parallelization Scheme: average case



L: length of longest non-matching block

Run time: $O(L)$

Average run time: $O(\log n)$

Challenge:

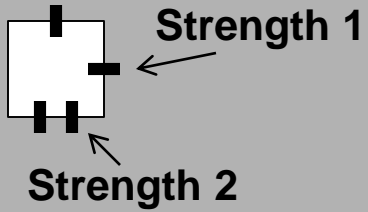
Can we implement this parallelization scheme within a tile system?

Addition

Faster average case

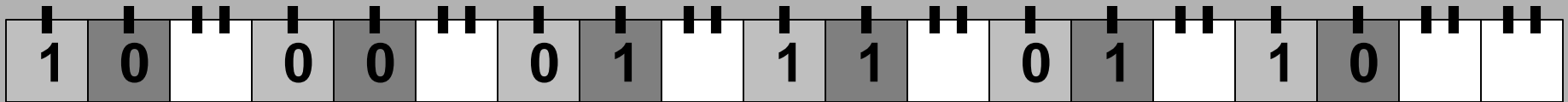
Temperature: 2

Notation:



$$\begin{array}{r} 100101 \\ + 001110 \\ \hline \end{array}$$

Seed input:

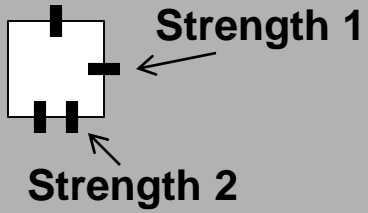


Addition

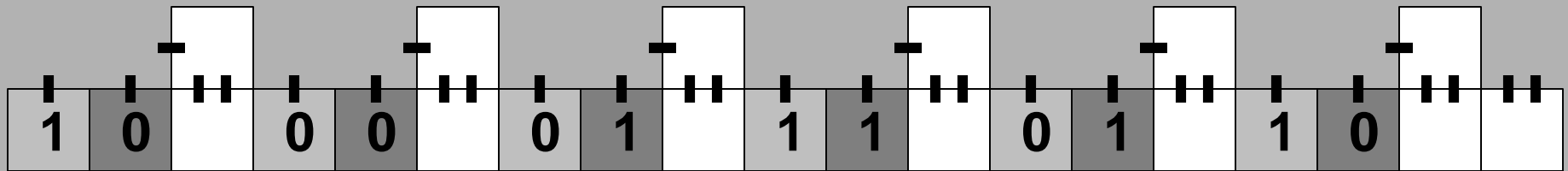
Faster average case

Temperature: 2

Notation:



$$\begin{array}{r} 100101 \\ + 001110 \\ \hline \end{array}$$

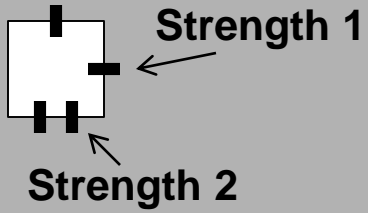


Addition

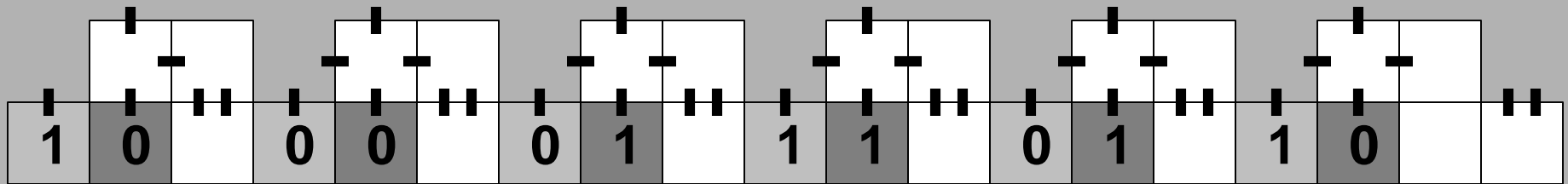
Faster average case

Temperature: 2

Notation:



$$\begin{array}{r} 100101 \\ + 001110 \\ \hline \end{array}$$

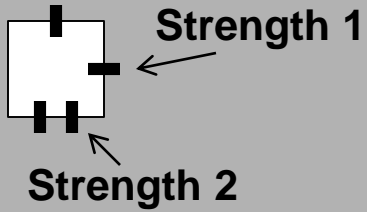


Addition

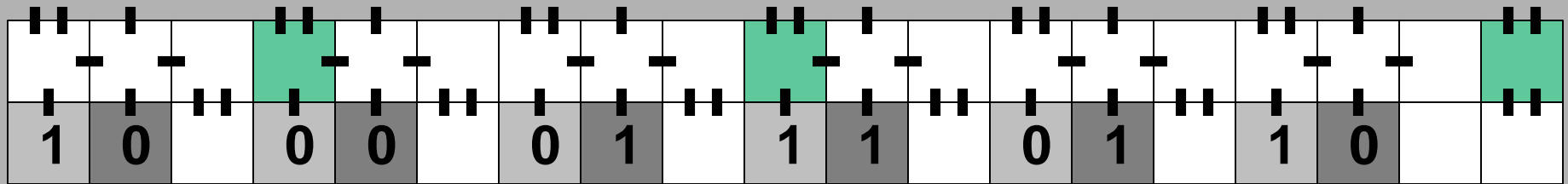
Faster average case

Temperature: 2

Notation:



$$\begin{array}{r} 100101 \\ + 001110 \\ \hline \hline \end{array}$$

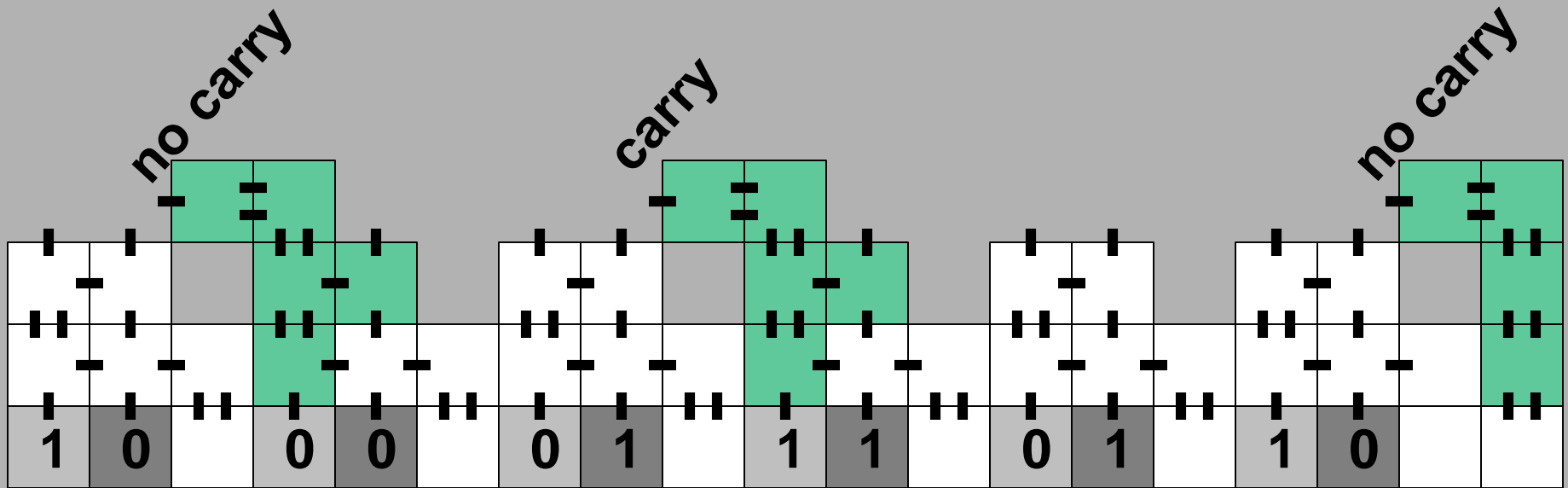


Addition

Faster average case

Temperature: 2

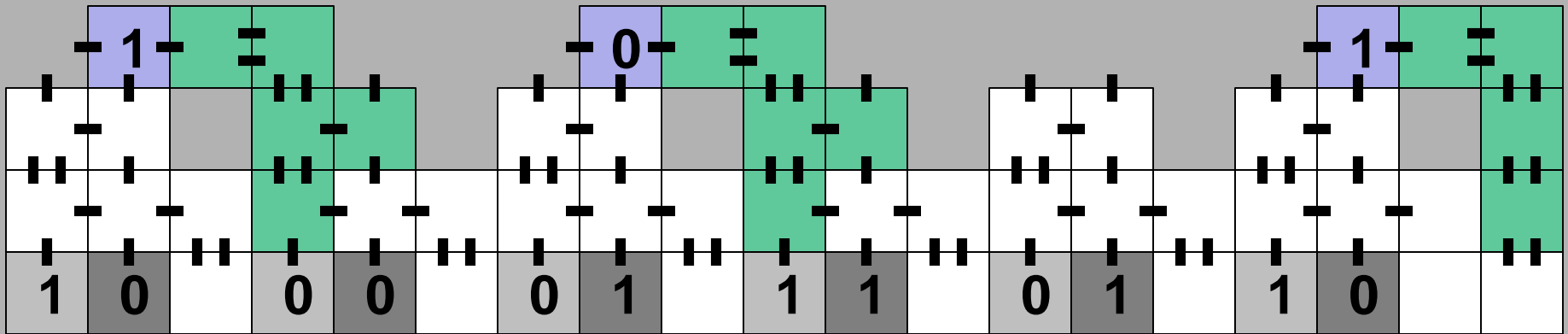
$$\begin{array}{r} 100101 \\ + 001110 \\ \hline \end{array}$$



Addition

Faster average case

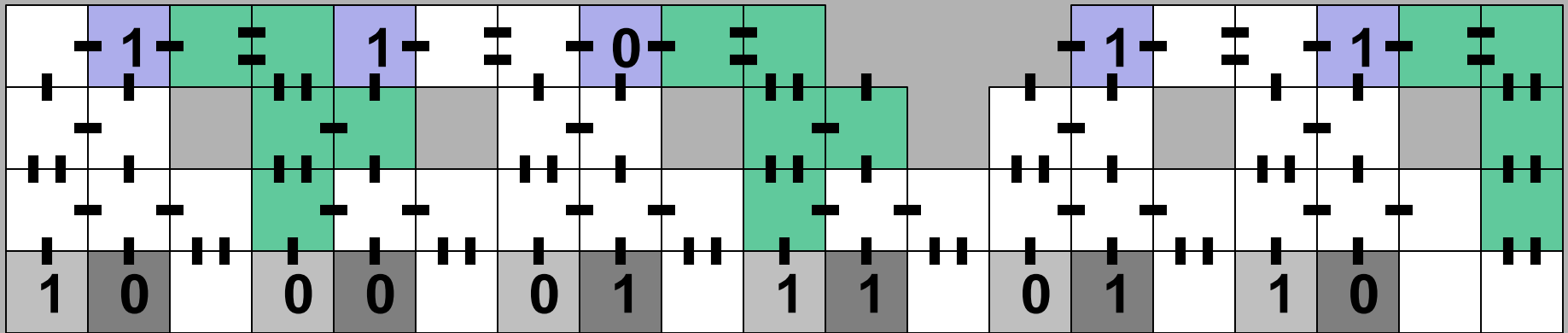
$$\begin{array}{r} 100101 \\ + 001110 \\ \hline 101 \end{array}$$



Addition

Faster average case

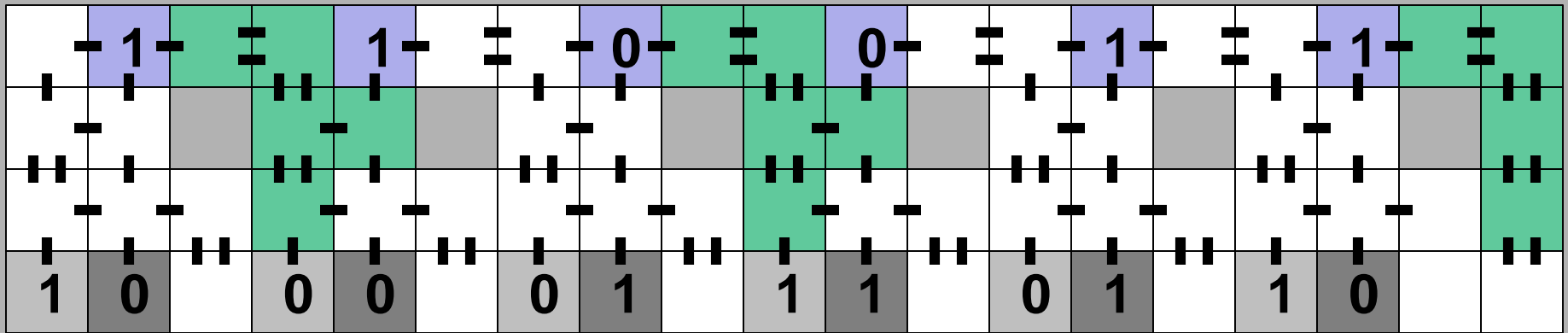
$$\begin{array}{r} 100101 \\ + 001110 \\ \hline 11011 \end{array}$$



Addition

Faster average case

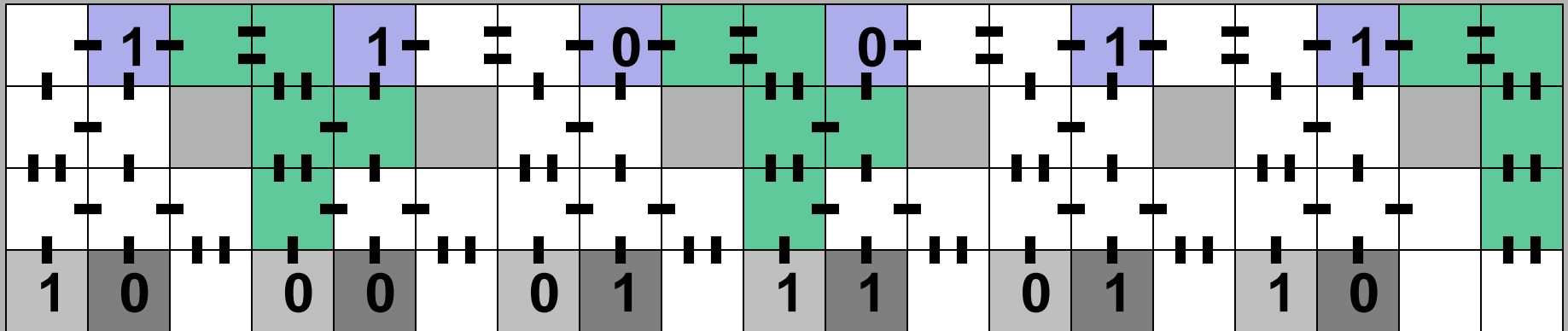
$$\begin{array}{r} 100101 \\ + 001110 \\ \hline 110011 \end{array}$$



Addition

Faster average case

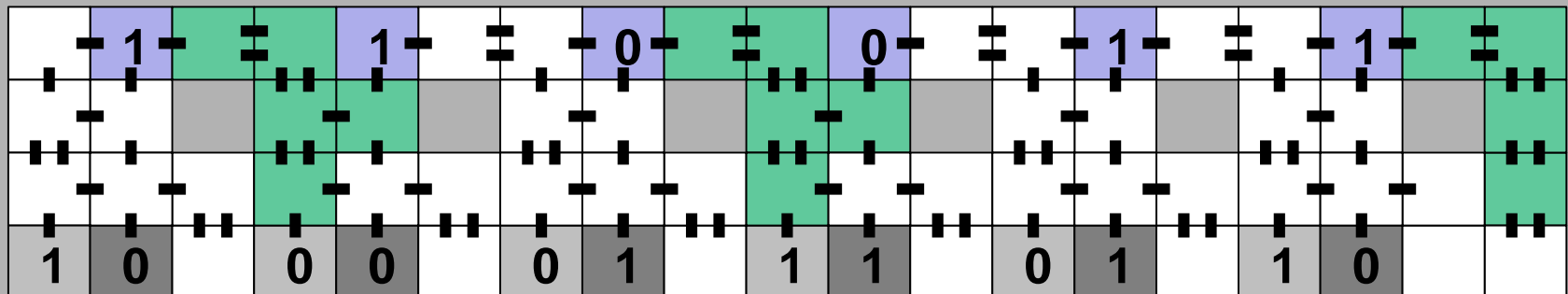
$$\begin{array}{r} 100101 \\ + 001110 \\ \hline 110011 \end{array}$$



Average case run time: $O(\log n)$

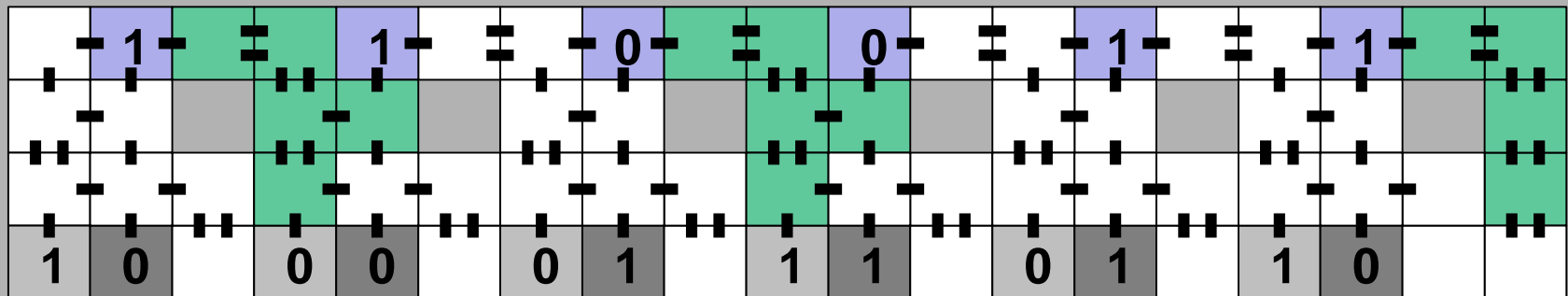
Addition Complexity

	Worst case		Average case
	upper	lower	
[Brun 2007]	$O(n)$		$O(n)$
Average-case algorithm	$O(n)$		$O(\log n)$
Worst-case algorithm			
Combo algorithm			
3D			



Addition Complexity

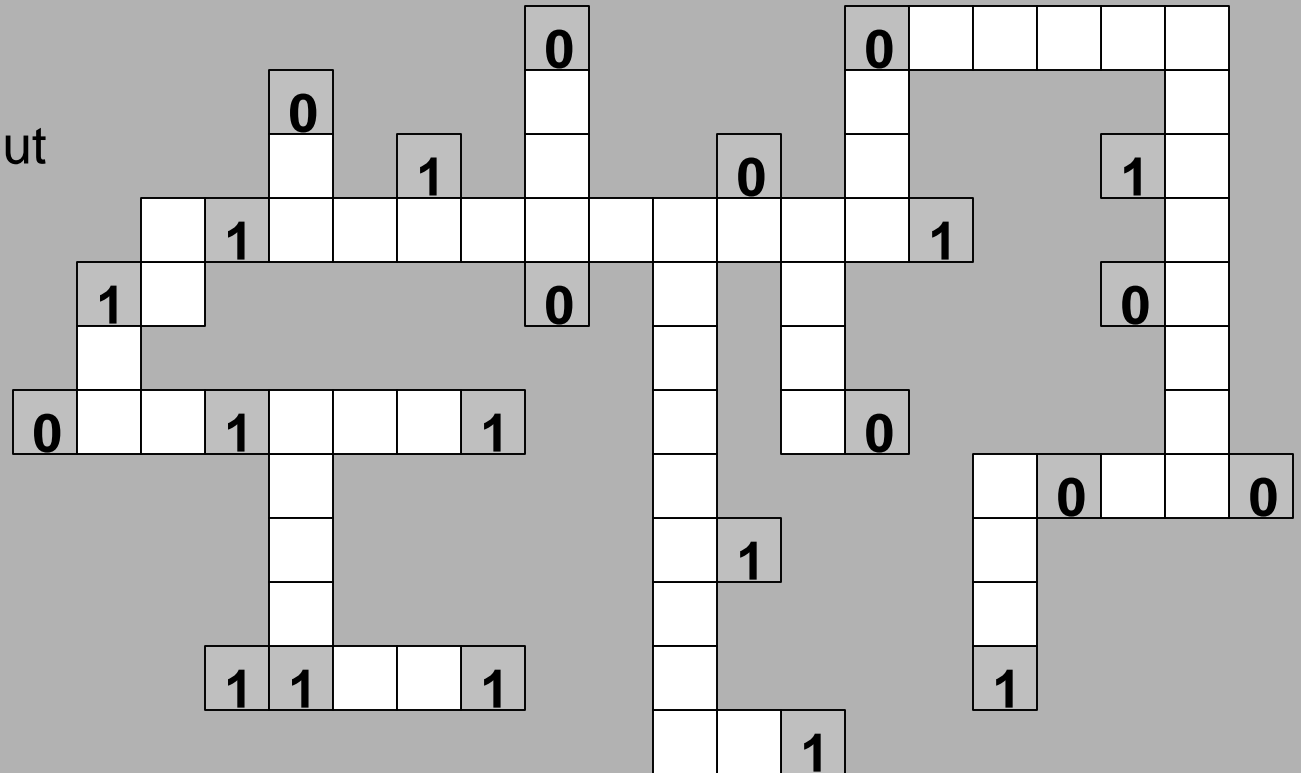
	Worst case		Average case
	upper	lower	
[Brun 2007]	$O(n)$		$O(n)$
Average-case algorithm	$O(n)$		$O(\log n)$
Worst-case algorithm		?	
Combo algorithm			
3D			



Addition

Worst Case Lower Bound

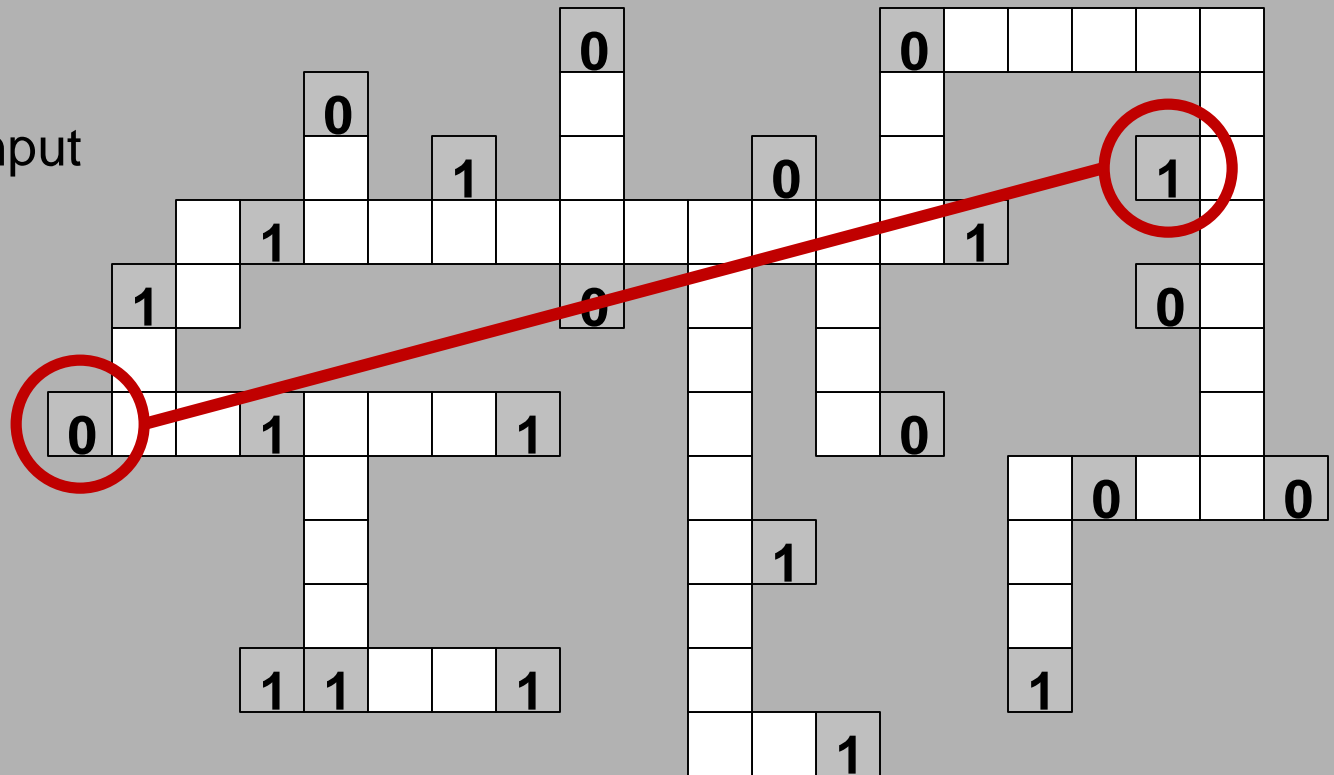
Some input seed:
n-bits of input



Addition

Worst Case Lower Bound

Some input seed:
n-bits of input

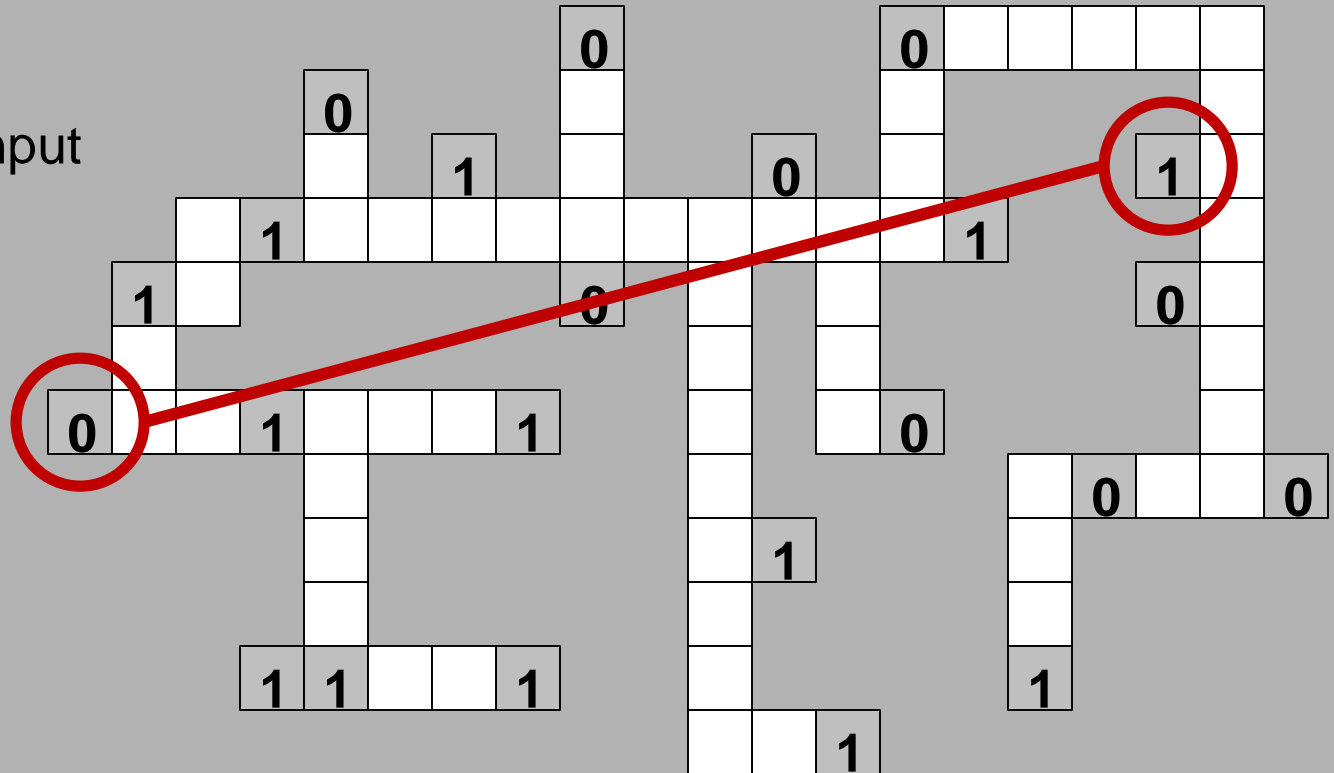


-Must be some bit-pair separated by \sqrt{n} distance (for a 2D seed).

Addition

Worst Case Lower Bound

Some input seed:
n-bits of input



-Must be some bit-pair separated by \sqrt{n} distance (for a 2D seed).

-Any function depending on the AND of these two bits requires:

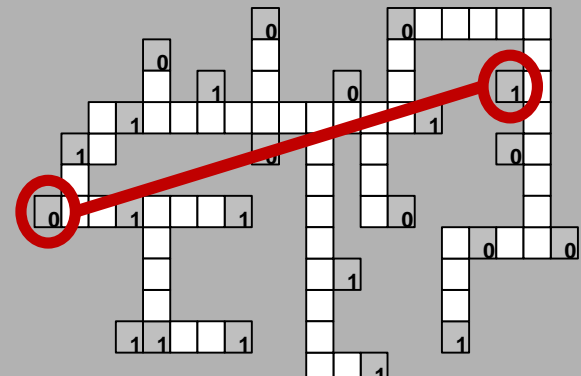
$\Omega(\sqrt{n})$ time in the worst case.

-includes addition, multiplication, and many other functions.

Addition Complexity

	Worst case		Average case
	upper	lower	
[Brun 2007]	$O(n)$		$O(n)$
Average-case algorithm	$O(n)$		$O(\log n)$
Worst-case algorithm	?	$\Omega(\sqrt{n})$	
Combo algorithm			
3D			

Is $O(\sqrt{n})$ achievable?



Addition Parallelization Scheme: worst case

Break into \sqrt{n}
subproblems

$$\begin{array}{r} 101 \quad 100 \quad 101 \\ +001 \quad 010 \quad 110 \\ \hline \end{array}$$

Run time:

Addition Parallelization Scheme: worst case

Break into \sqrt{n}
subproblems

$$\begin{array}{r} 101 \\ +001 \\ \hline \end{array}$$

$$\begin{array}{r} 100 \\ +010 \\ \hline \end{array}$$

$$\begin{array}{r} 101 \\ +110 \\ \hline \end{array}$$

Run time:

Addition Parallelization Scheme: worst case

Break into \sqrt{n}
subproblems

Compute subsums:
 $O(\sqrt{n})$

$$\begin{array}{r} 101 \\ +001 \\ \hline 110 \end{array}$$

$$\begin{array}{r} 100 \\ +010 \\ \hline 110 \end{array}$$

$$\begin{array}{r} 101 \\ +110 \\ \hline 1011 \end{array}$$

Run time:

Addition Parallelization Scheme: worst case

Break into \sqrt{n} subproblems

Compute subsums:
 $O(\sqrt{n})$

Increment:
 $O(\sqrt{n})$

Run time:

101	100	101
+001	+010	+110
<hr/>	<hr/>	<hr/>
110	110	1011
111	111	1100

Addition Parallelization Scheme: worst case

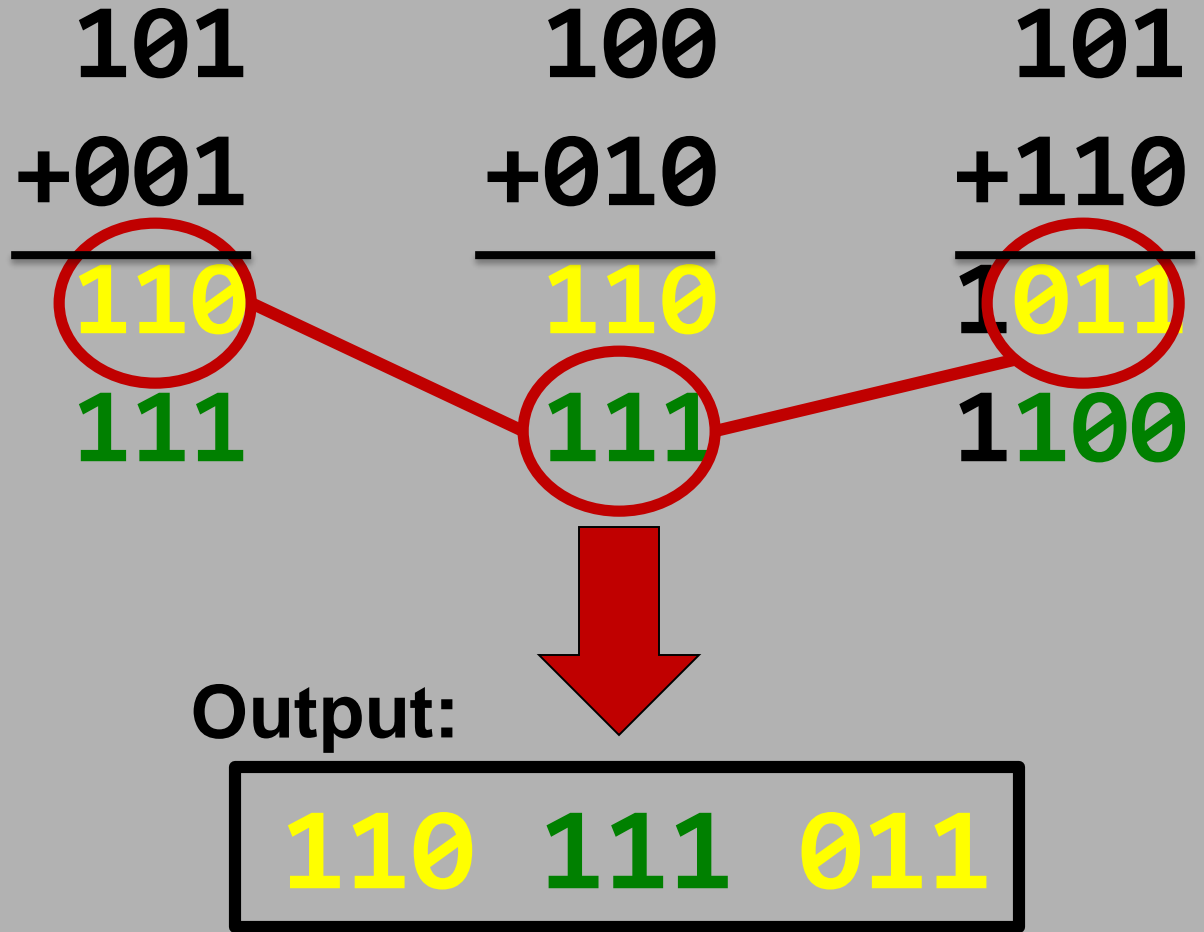
Break into \sqrt{n} subproblems

Compute subsums:
 $O(\sqrt{n})$

Increment:
 $O(\sqrt{n})$

Select correct Strings:
 $O(\sqrt{n})$

Run time:
 $O(\sqrt{n})$



Addition Parallelization Scheme: worst case

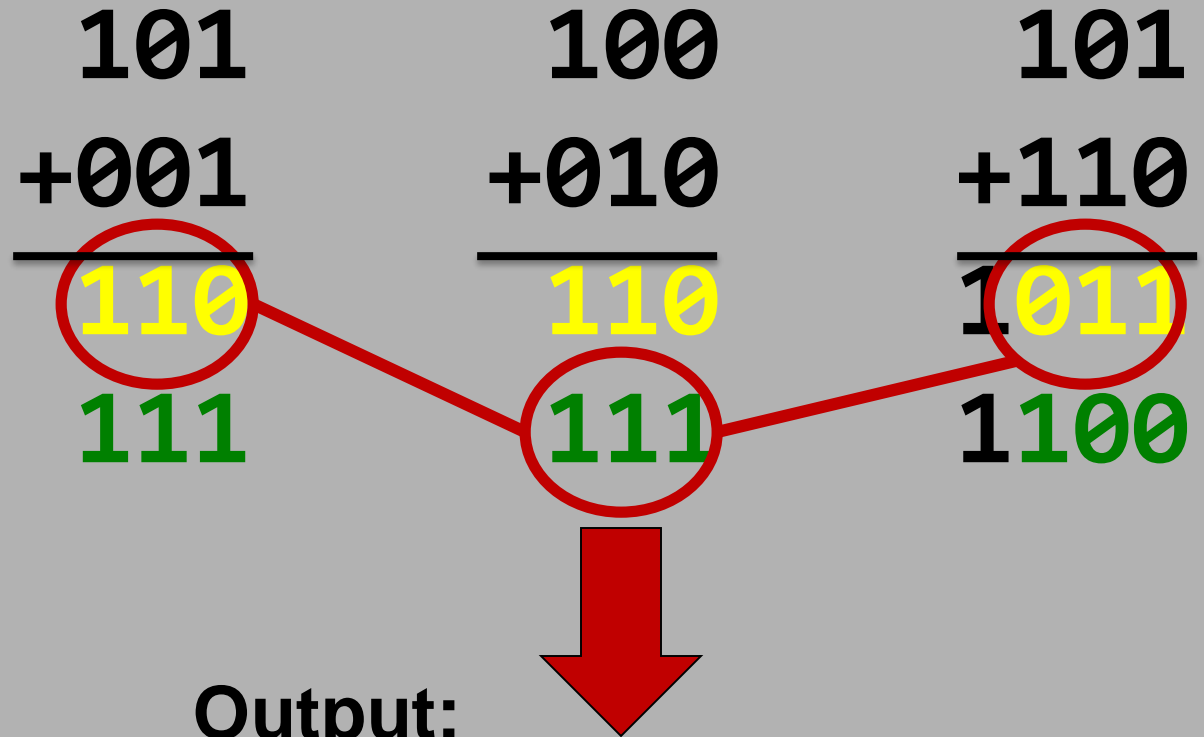
Break into \sqrt{n} subproblems

Compute subsums:
 $O(\sqrt{n})$

Increment:
 $O(\sqrt{n})$

Select correct Strings:
 $O(\sqrt{n})$

Run time:
 $O(\sqrt{n})$



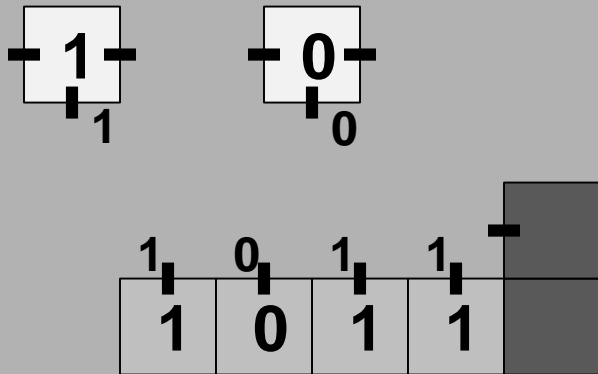
110 111 011

Challenge:

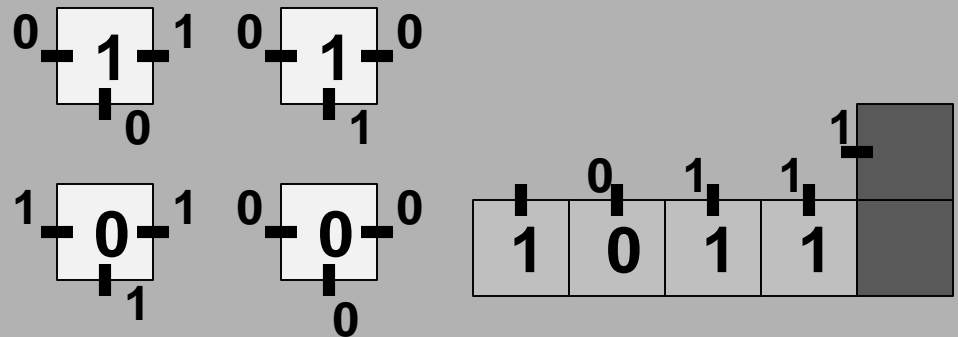
Can we implement this parallelization scheme within a tile system?

Yes. First, some primitives.

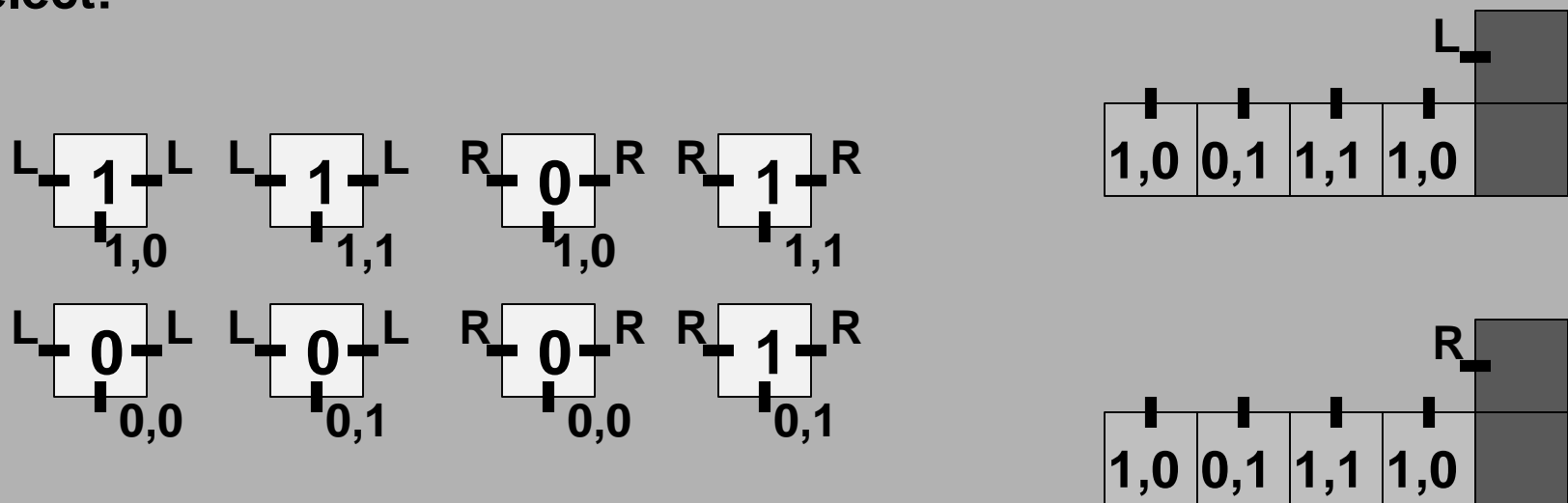
Copy:



Increment:

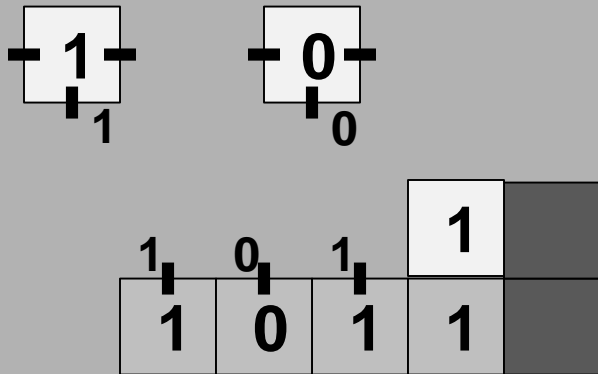


Select:

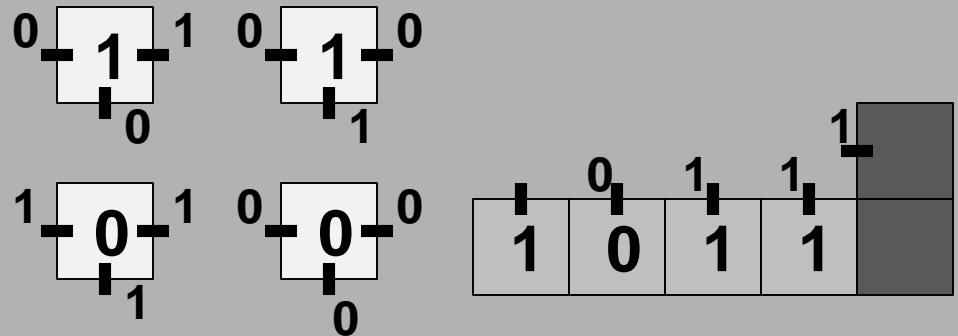


Yes. First, some primitives.

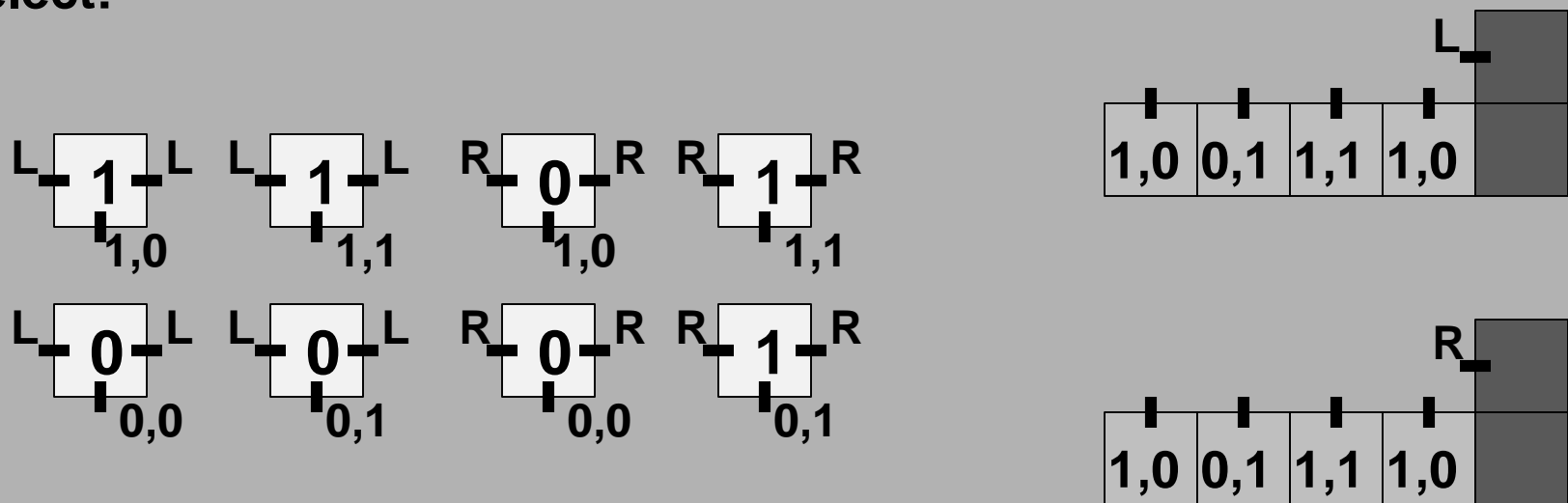
Copy:



Increment:

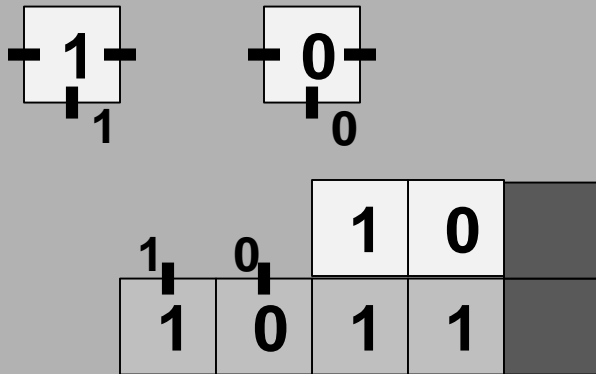


Select:

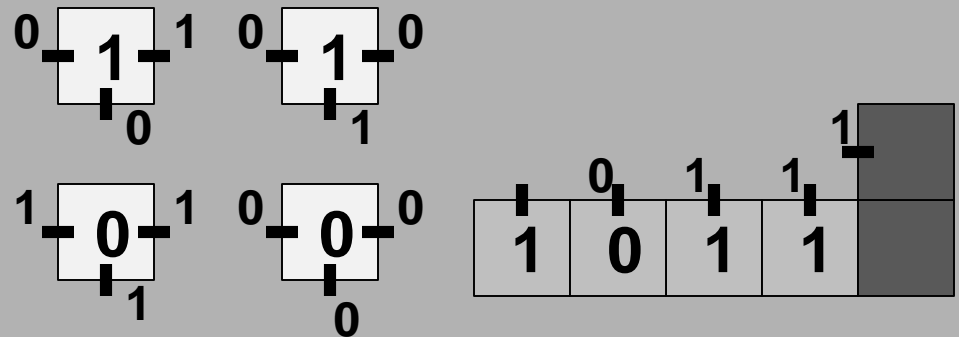


Yes. First, some primitives.

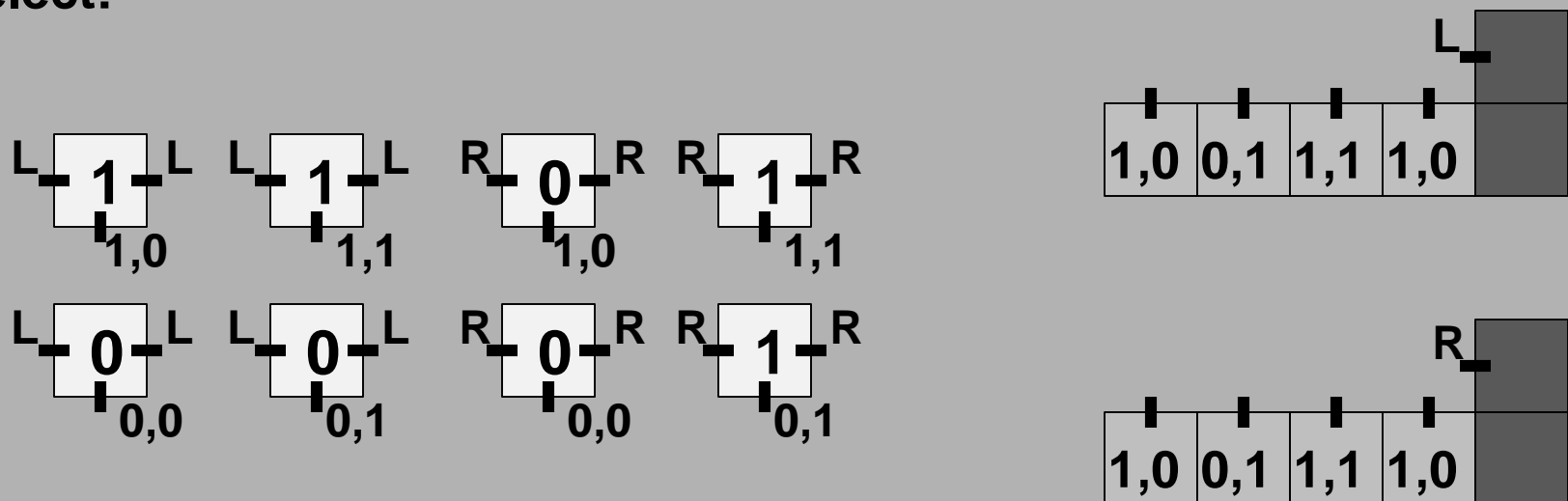
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Increment:

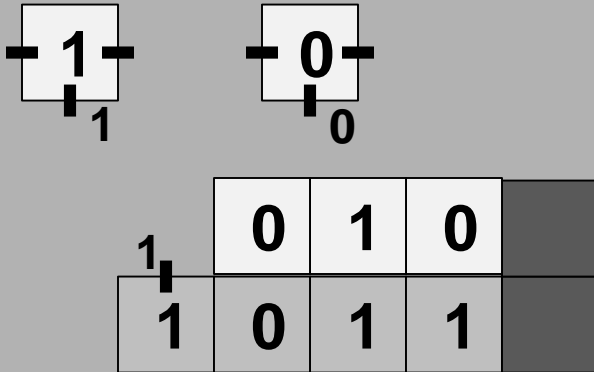


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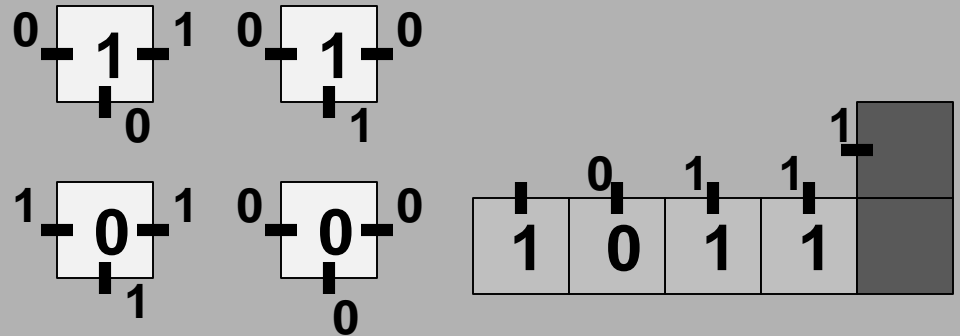


Yes. First, some primitives.

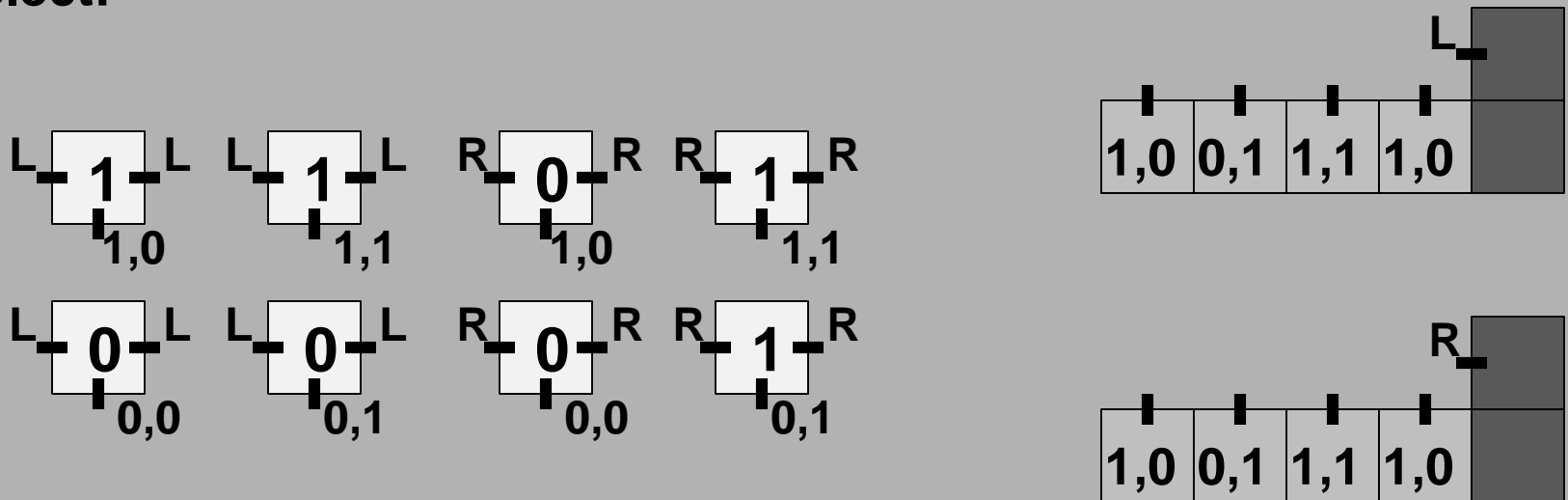
Copy:



Increment:

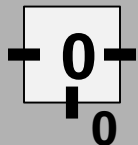
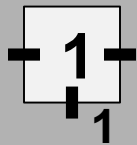


Select:



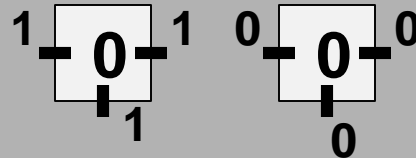
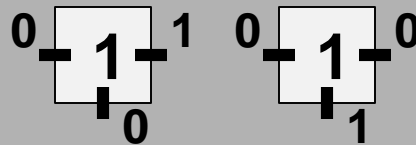
Yes. First, some primitives.

Copy:



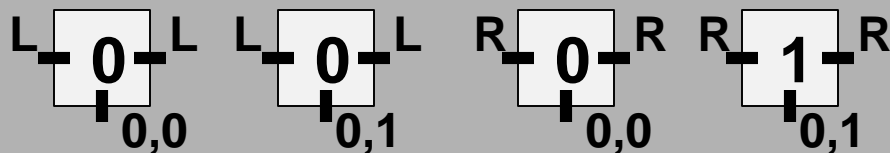
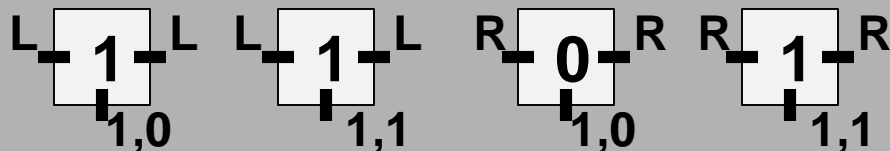
1	0	1	0	
1	0	1	1	

Increment:



	0	1	1	1
1	0	1	1	

Select:

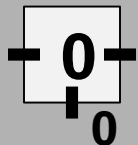
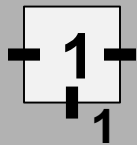


				L
1,0	0,1	1,1	1,0	

				R
1,0	0,1	1,1	1,0	

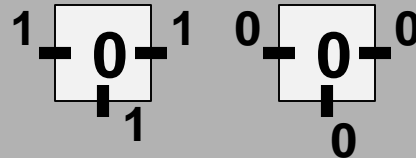
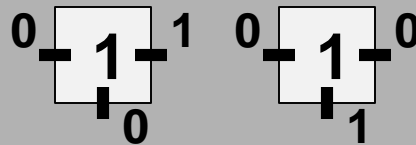
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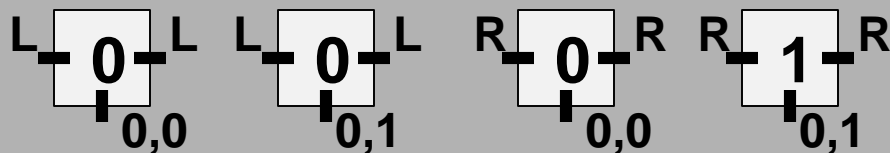
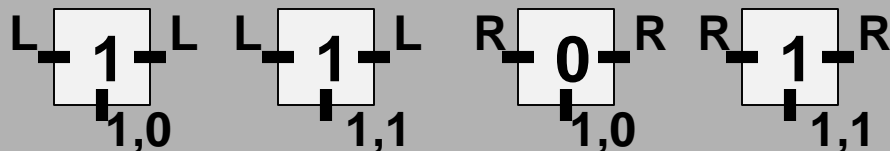
1	0	1	0	
1	0	1	1	

Increment:



			1	0	
1	0	1	1	1	

Select:

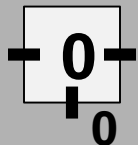
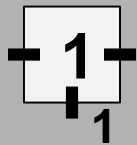


				L	
1,0	0,1	1,1	1,0		

				R	
1,0	0,1	1,1	1,0		

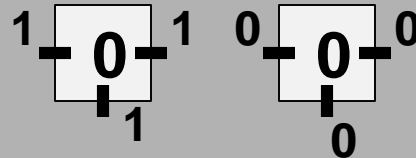
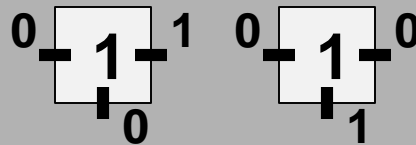
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Copy:



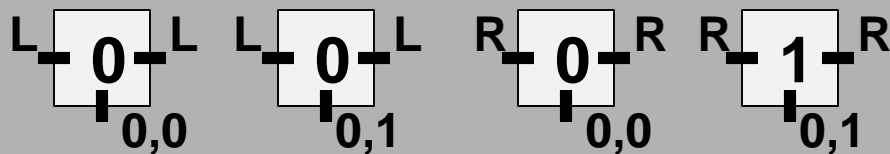
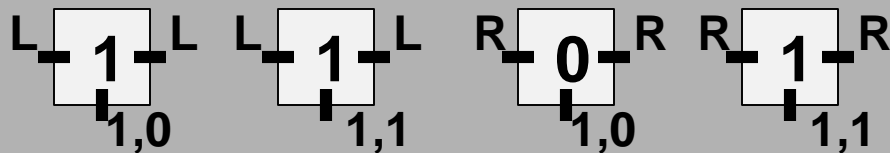
1	0	1	0	
1	0	1	1	

Increment:



		1	0	0	
1	0	1	1		

Select:

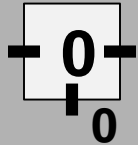
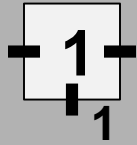


				L	
1,0	0,1	1,1	1,0		

				R	
1,0	0,1	1,1	1,0		

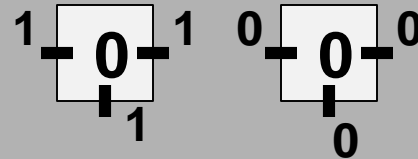
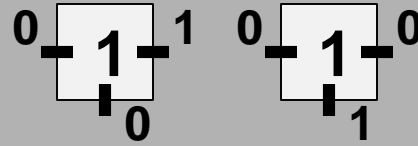
Yes. First, some primitives.

Copy:



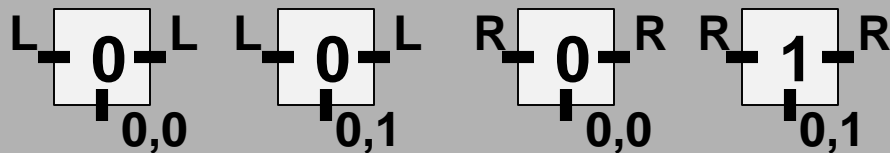
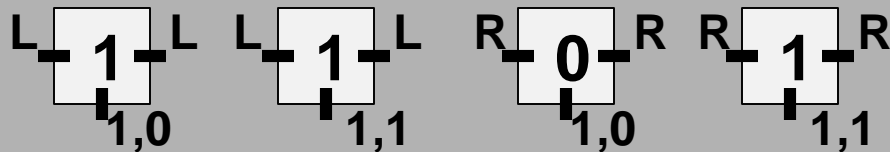
1	0	1	0	
1	0	1	1	

Increment:



	0	1	0	0	
1	1	0	1	1	

Select:

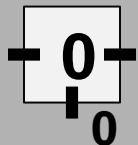
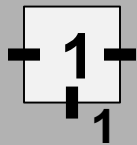


				L	
1,0	0,1	1,1	1,0		

				R	
1,0	0,1	1,1	1,0		

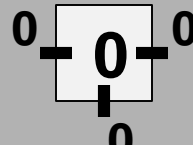
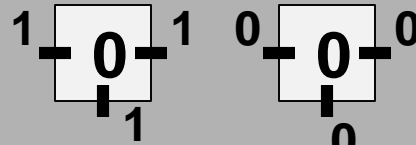
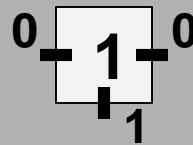
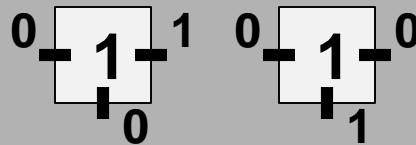
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Copy:



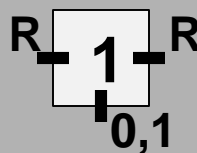
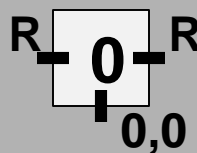
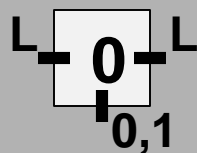
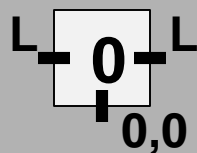
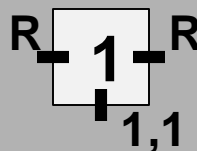
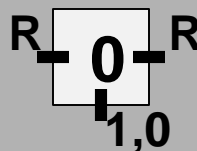
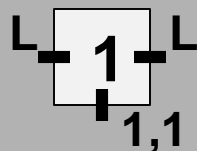
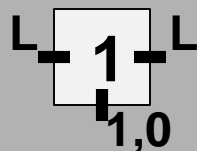
1	0	1	0	
1	0	1	1	

Increment:



1	1	0	0	
1	0	1	1	

Select:

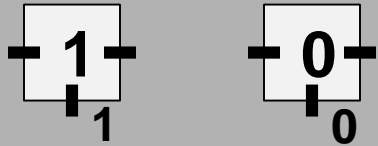


				L
1,0	0,1	1,1	1,0	

				R
1,0	0,1	1,1	1,0	

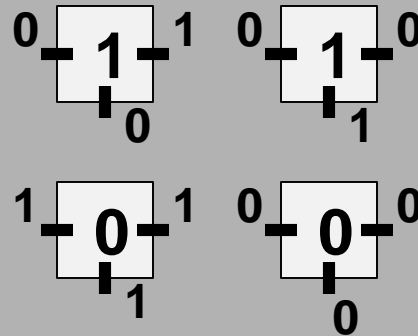
Yes. First, some primitives.

Copy:



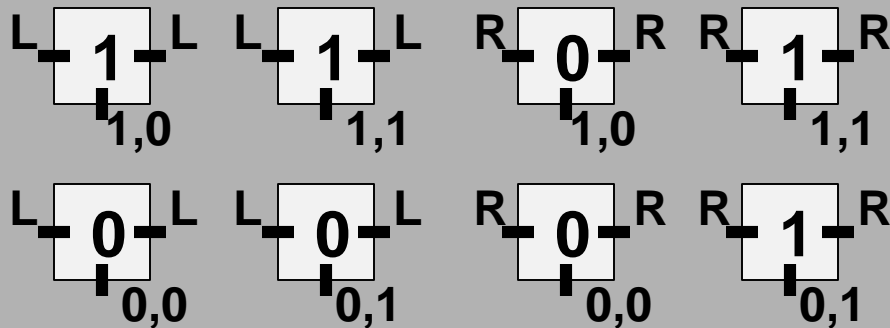
1	0	1	0	
1	0	1	1	

Increment:



1	1	0	0	
1	0	1	1	

Select:



1	0	1	1	L
1,0	0,1	1,1	1,0	

0	1	1	0	R
1,0	0,1	1,1	1,0	

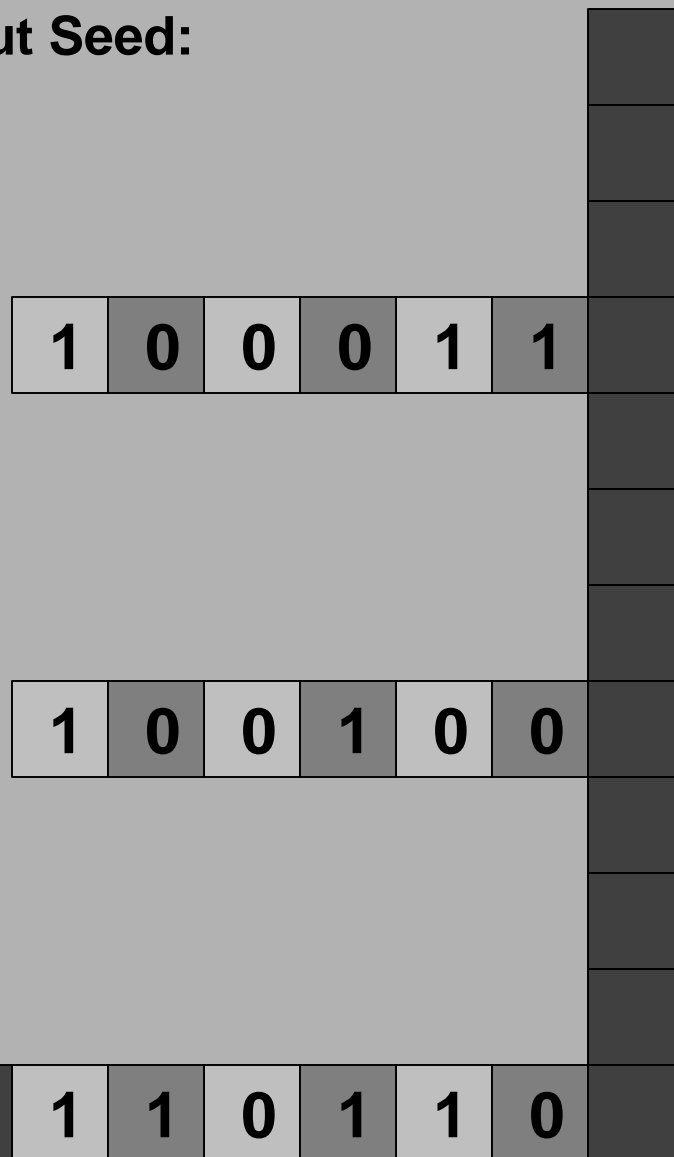
Addition

Faster **worst case**

Input Seed:

Break input in \sqrt{n} substrings:

	101	100	101
+	001	010	110

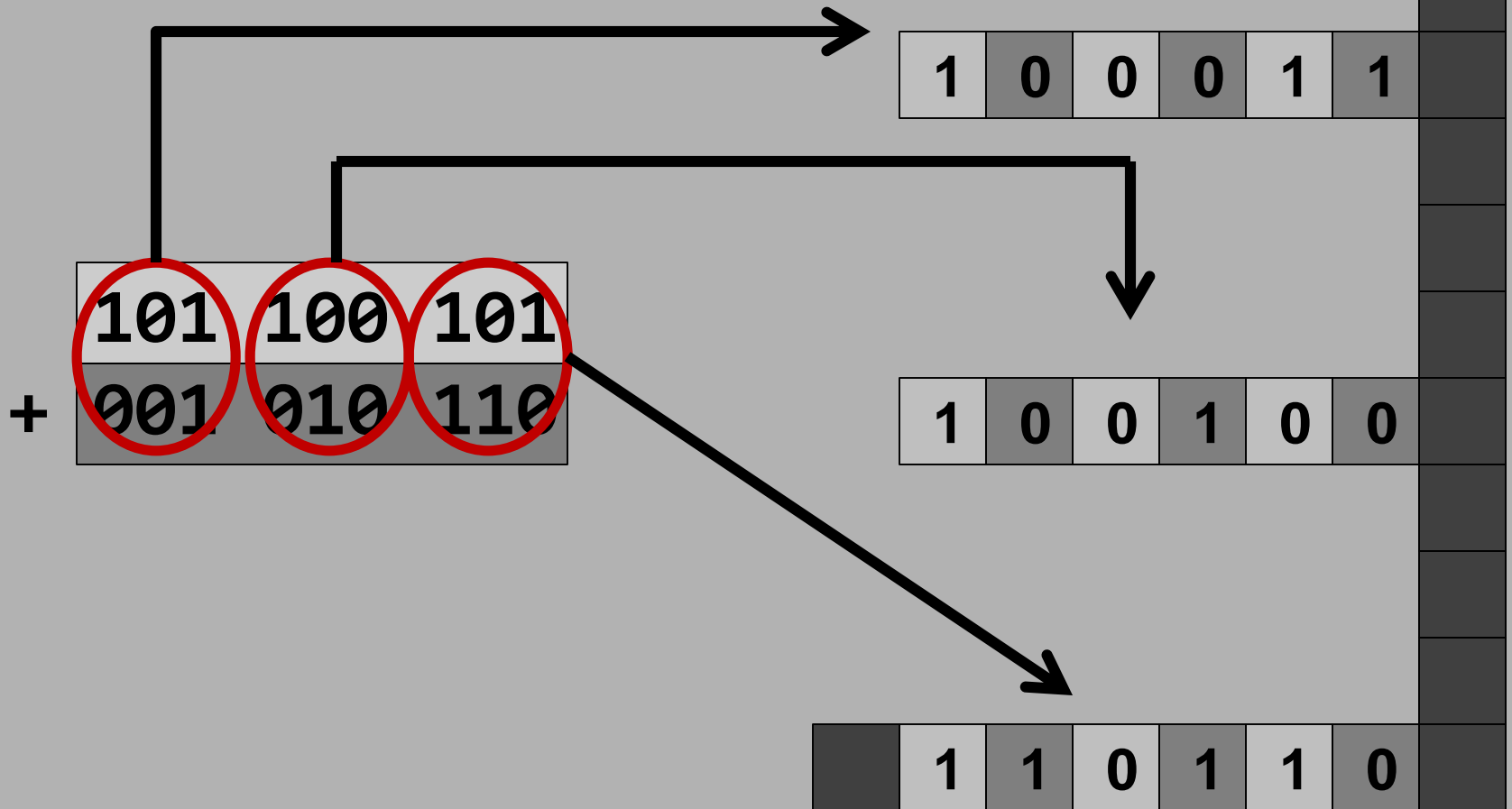


Addition

Faster **worst case**

Input Seed:

Break input in \sqrt{n} substrings:



Addition

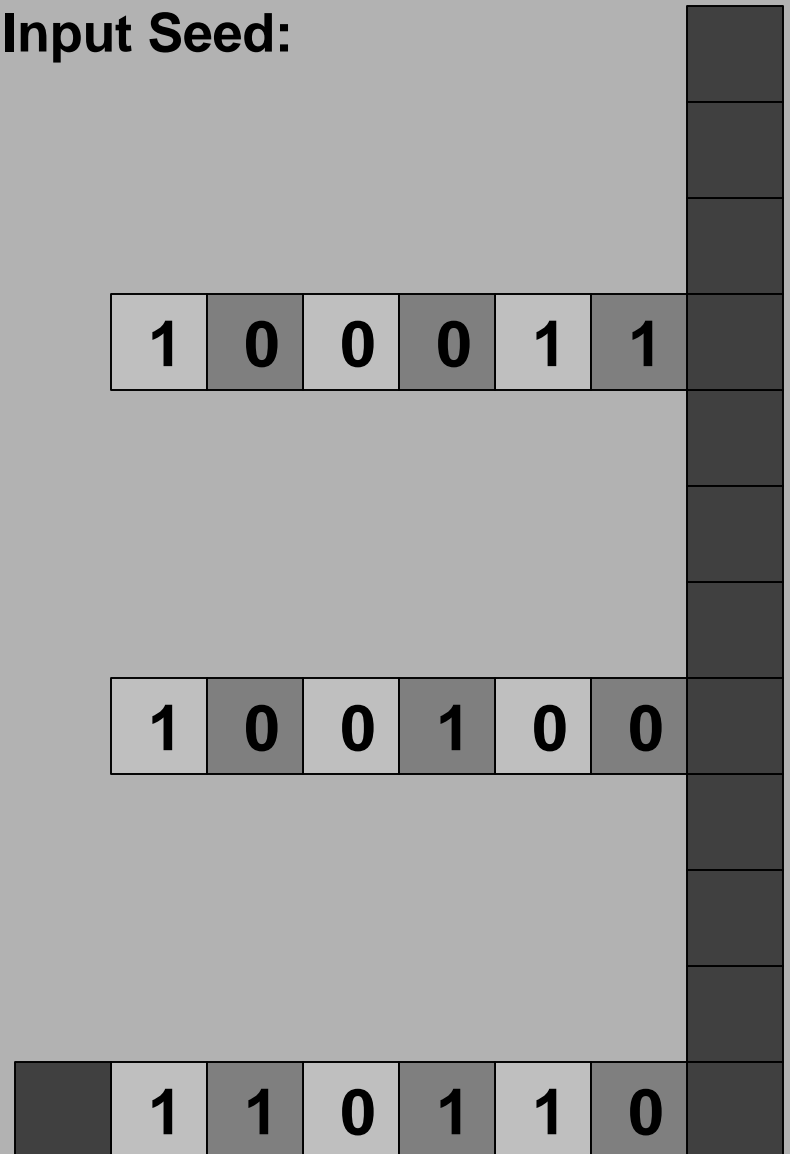
Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**
1.1 Sum each row

Phase 2:

Phase 3:

Input Seed:



Addition

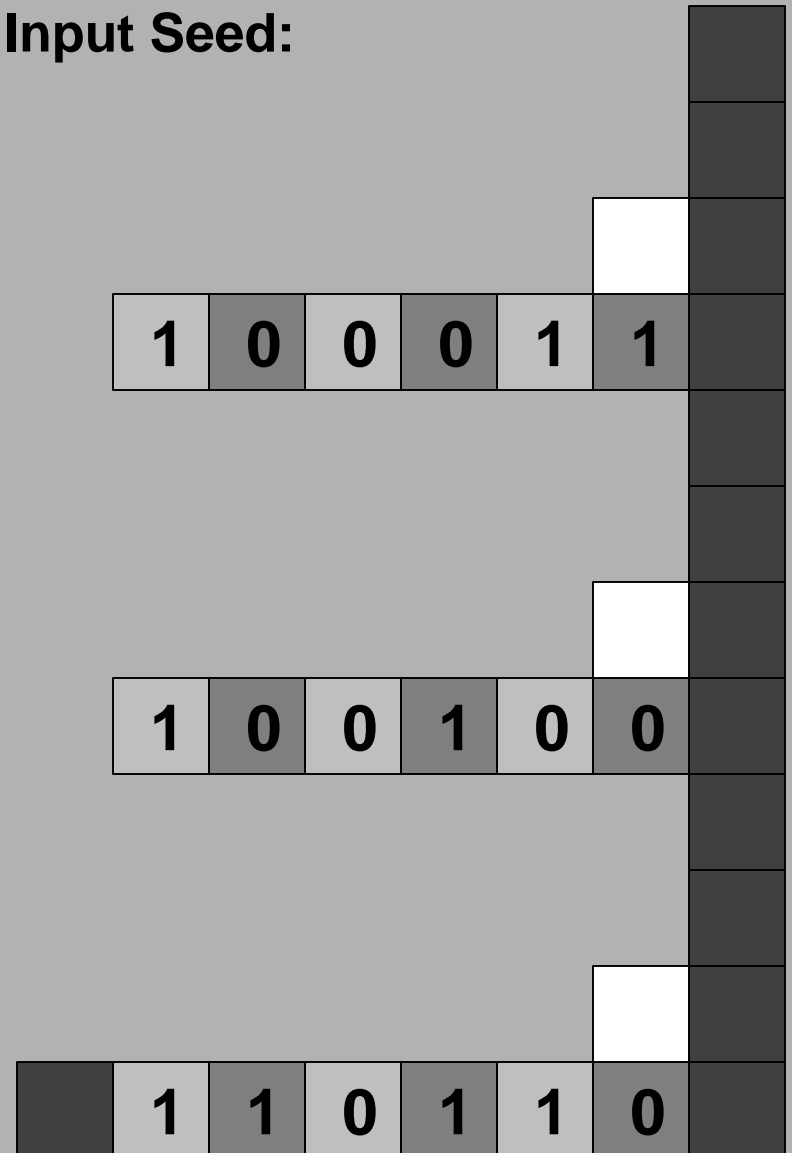
Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**
1.1 Sum each row

Phase 2:

Phase 3:

Input Seed:



Addition

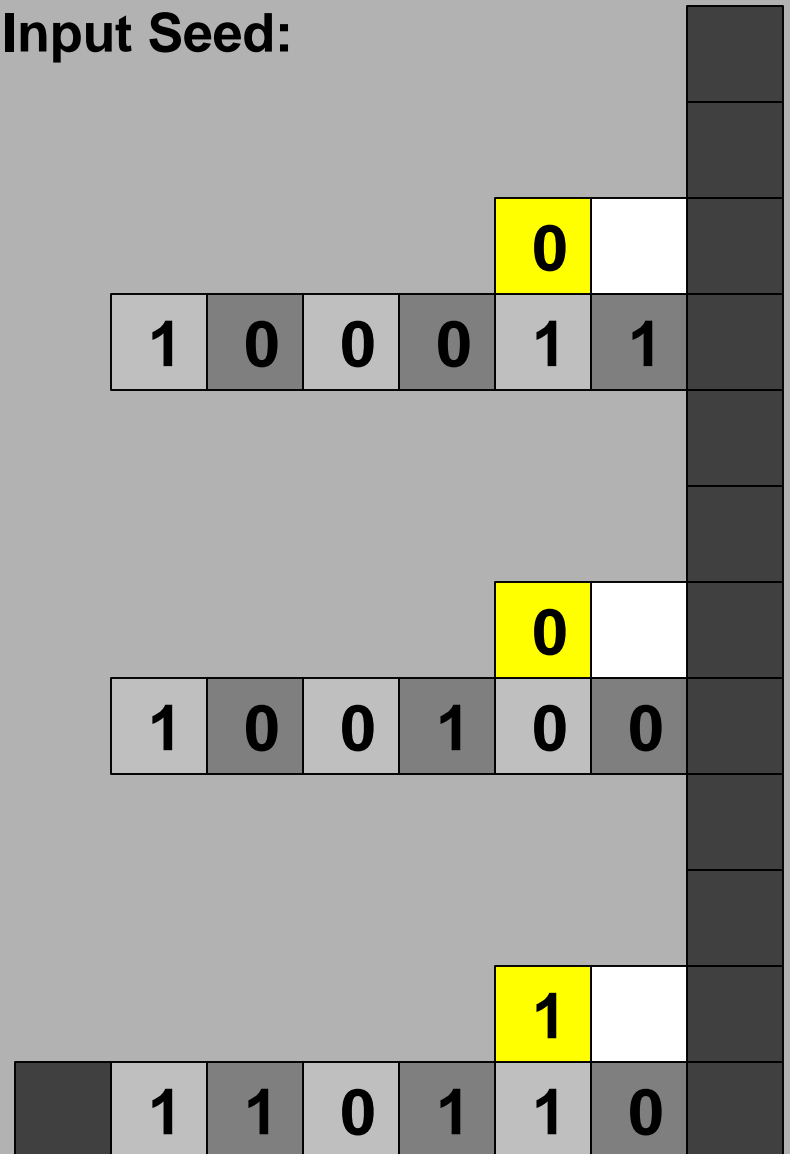
Faster **worst case**

$O(\sqrt{n})$ Phase 1:
1.1 Sum each row

Phase 2:

Phase 3:

Input Seed:



Addition

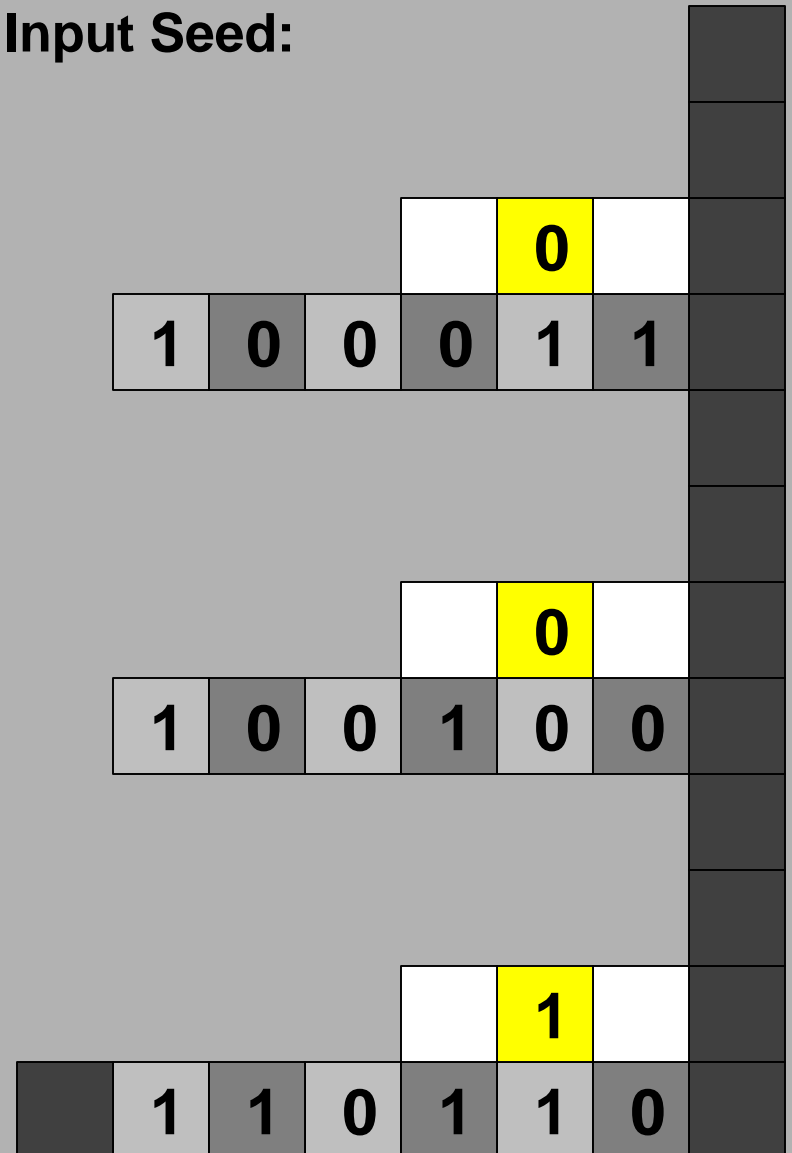
Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**
1.1 Sum each row

Phase 2:

Phase 3:

Input Seed:



Addition

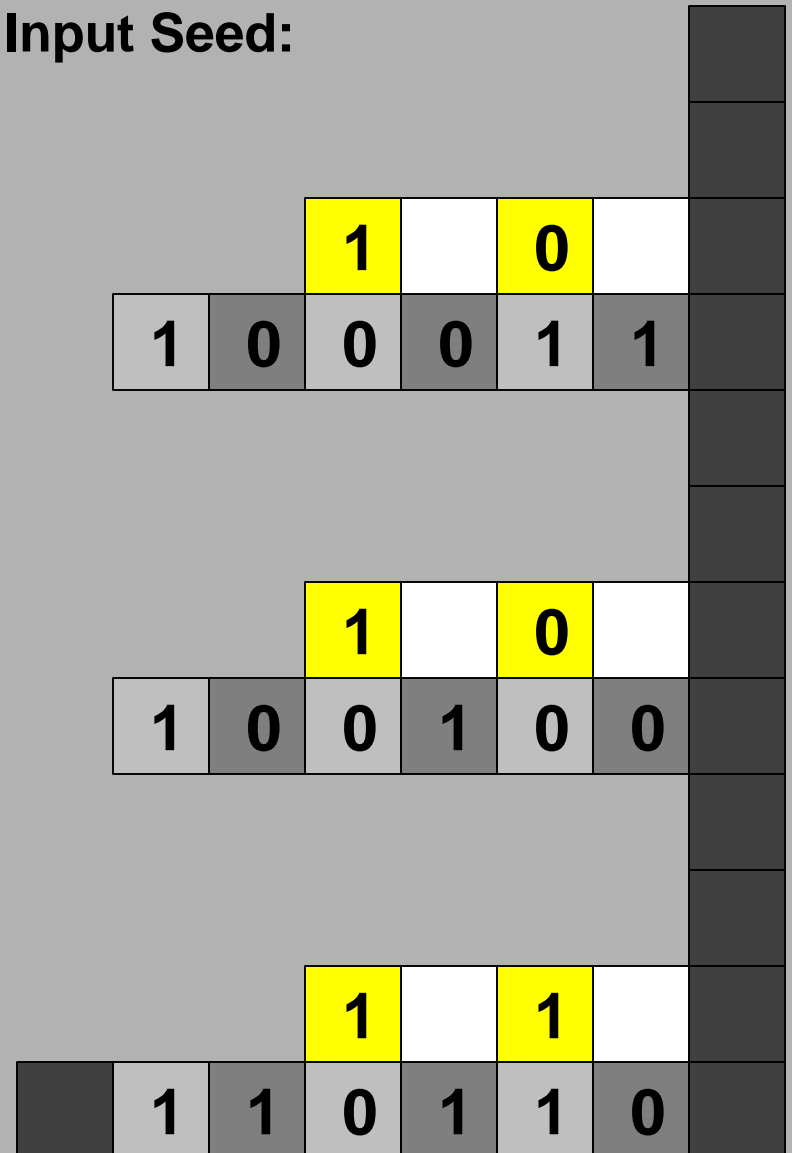
Faster **worst case**

$O(\sqrt{n})$ Phase 1:
1.1 Sum each row

Phase 2:

Phase 3:

Input Seed:



Addition

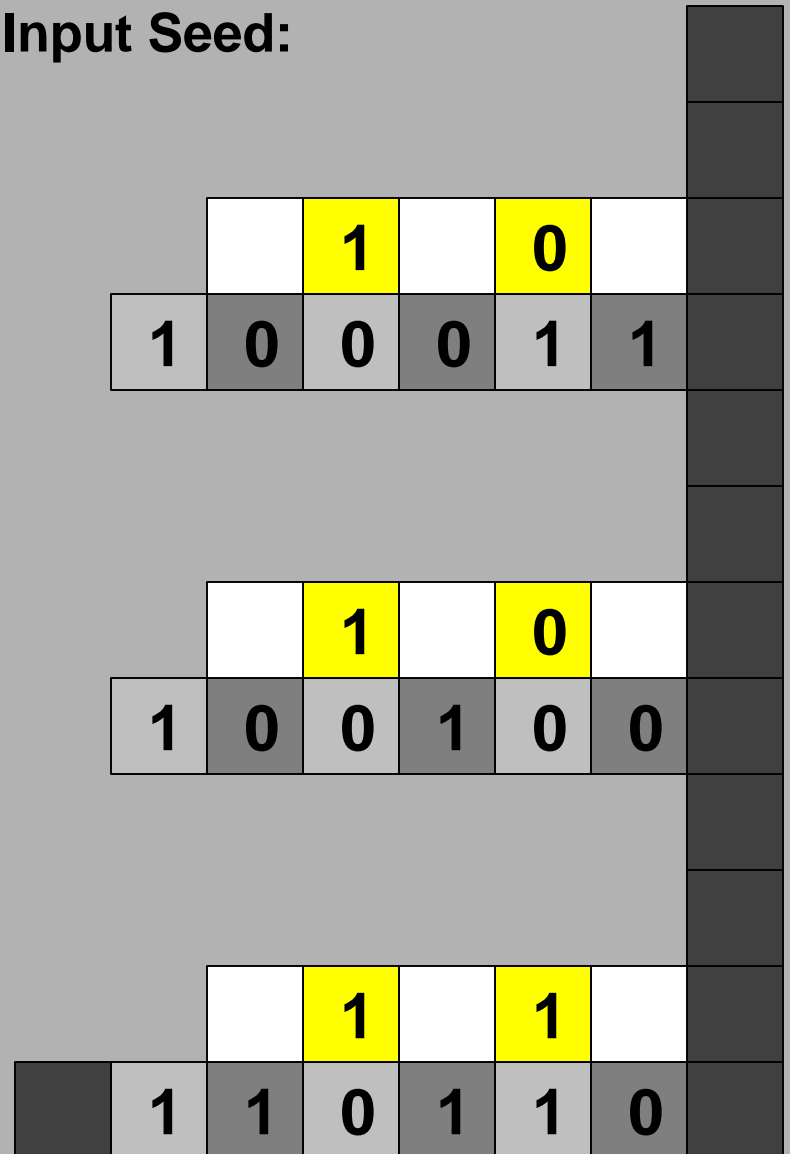
Faster **worst case**

$O(\sqrt{n})$ Phase 1:
1.1 Sum each row

Phase 2:

Phase 3:

Input Seed:



Addition

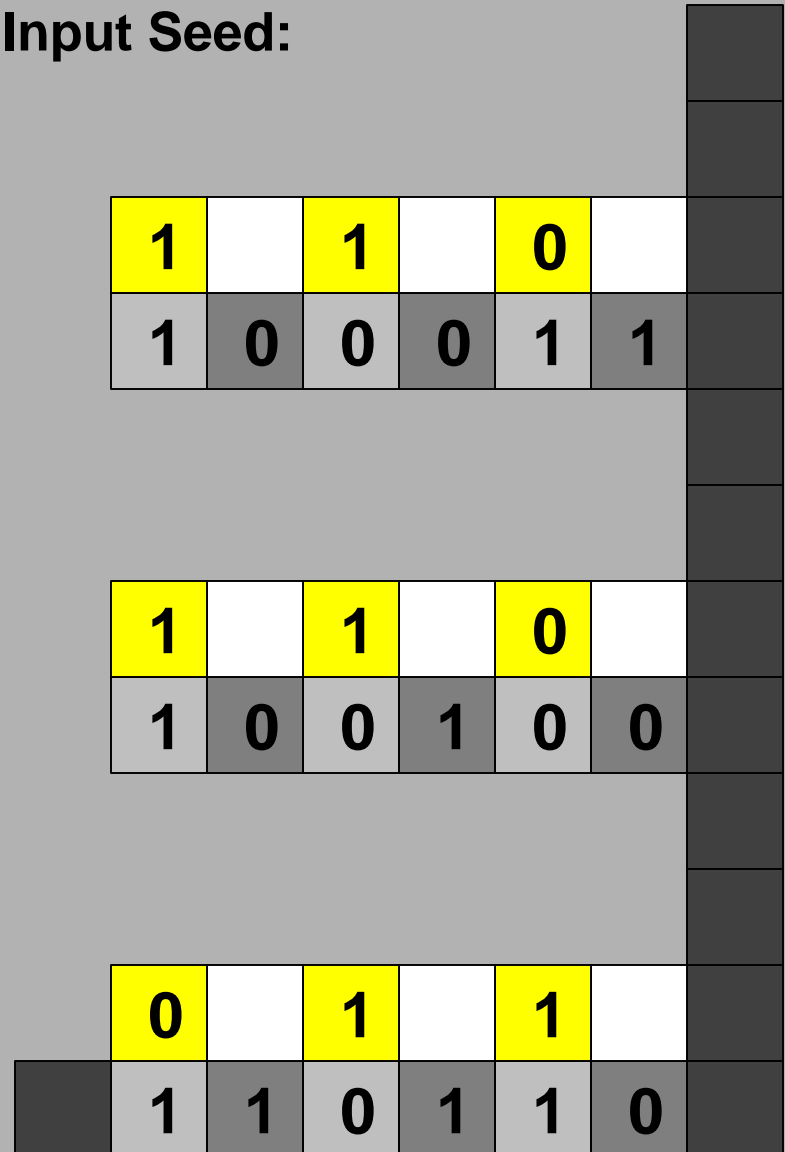
Faster **worst case**

$O(\sqrt{n})$ Phase 1:
1.1 Sum each row
1.2 **Increment/copy**

Phase 2:

Phase 3:

Input Seed:



Addition

Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**
1.1 Sum each row
1.2 **Increment/copy**

Phase 2:

Phase 3:

Input Seed:

						1,0			
	1		1		0				
	1	0	0	0	1	1			
						1,0			
	1		1		0				
	1	0	0	1	0	0			
						0,1			
	0		1		1				
	1	1	0	1	1	0			

Addition

Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**
 1.1 Sum each row
 1.2 **Increment/copy**

Phase 2:

Phase 3:

Input Seed:

			1,1		1,0		
1		1		0			
1	0	0	0	1	1		

			1,1		1,0		
1		1		0			
1	0	0	1	0	0		

			0,1		0,1		
0		1		1			
1	1	0	1	1	0		

Addition

Faster **worst case**

$O(\sqrt{n})$ Phase 1:

1.1 Sum each row

1.2 Increment/copy

$O(\sqrt{n})$ Phase 2:

Grow carry-selector

Phase 3:



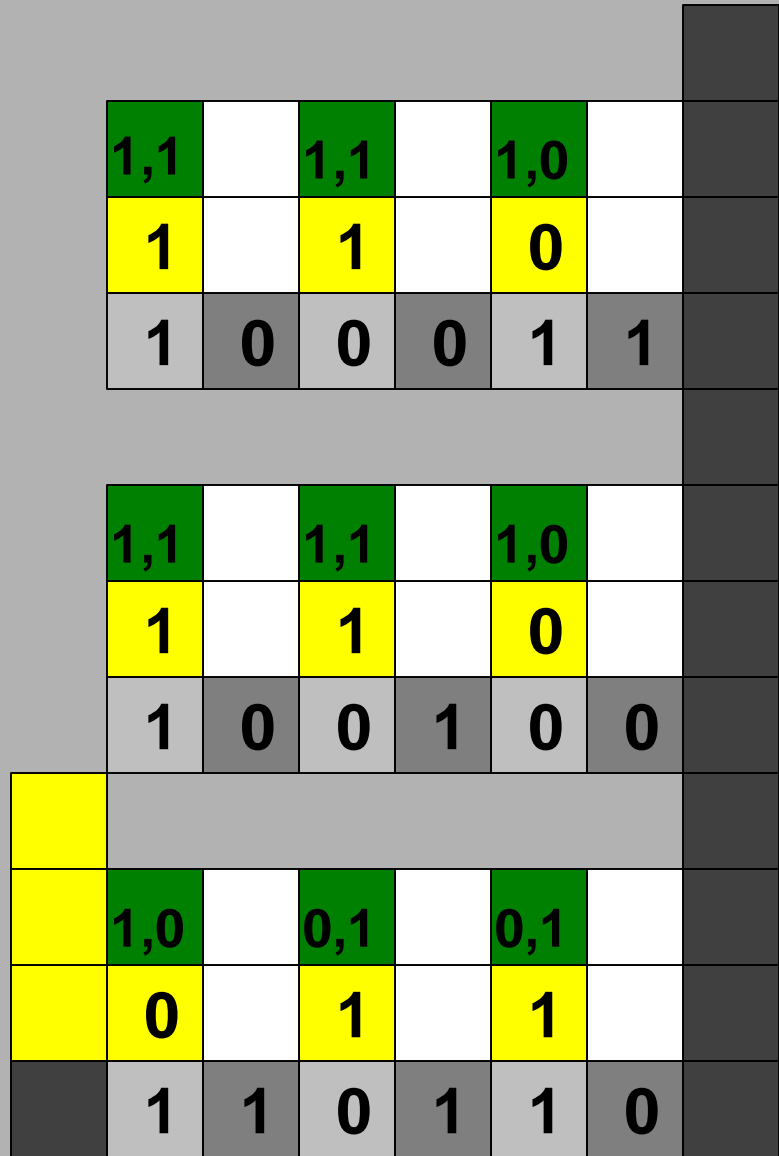
Addition

Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**
 1.1 Sum each row
 1.2 Increment/copy

$O(\sqrt{n})$ **Phase 2:**
Grow carry-selector

Phase 3:



Addition

Faster **worst case**

$O(\sqrt{n})$ Phase 1:

1.1 Sum each row

1.2 Increment/copy

$O(\sqrt{n})$ Phase 2:

Grow carry-selector

Phase 3:

	1,1		1,1		1,0		
	1		1		0		
	1	0	0	0	1	1	
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	1	0	0	
	1,0		0,1		0,1		
	0		1		1		
	1	1	0	1	1	0	

Addition

Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**

1.1 Sum each row

1.2 Increment/copy

$O(\sqrt{n})$ **Phase 2:**

Grow carry-selector

$O(\sqrt{n})$ **Phase 3:**

Extract each row's output

	1,1		1,1		1,0		
	1		1		0		
	1	0	0	0	1	1	
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	1	0	0	
	1,0		0,1		0,1		
	0		1		1		
	1	1	0	1	1	0	

Addition

Faster **worst case**

- $O(\sqrt{n})$ **Phase 1:**
 - 1.1 Sum each row
 - 1.2 Increment/copy

- $O(\sqrt{n})$ **Phase 2:**
 - Grow carry-selector

- $O(\sqrt{n})$ **Phase 3:**
 - Extract each row's output

	1						
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	0	1	1	
	1						
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	1	0	0	
	0						
	1,0		0,1		0,1		
	0		1		1		
	1	1	0	1	1	0	

Addition

Faster **worst case**

- $O(\sqrt{n})$ **Phase 1:**
 - 1.1 Sum each row
 - 1.2 Increment/copy
- $O(\sqrt{n})$ **Phase 2:**
 - Grow carry-selector
- $O(\sqrt{n})$ **Phase 3:**
 - Extract each row's output

	1						
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	0	1	1	
	1						
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	1	0	0	
	0						
	1,0		0,1		0,1		
	0		1		1		
	1	1	0	1	1	0	

Addition

Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**

- 1.1 Sum each row
- 1.2 Increment/copy

$O(\sqrt{n})$ **Phase 2:**

Grow carry-selector

$O(\sqrt{n})$ **Phase 3:**

Extract each row's output

	1		1				
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	0	1	1	
	1		1				
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	1	0	0	
	0		1				
	1,0		0,1		0,1		
	0		1		1		
	1	1	0	1	1	0	

Addition

Faster **worst case**

$O(\sqrt{n})$ **Phase 1:**

- 1.1 Sum each row
- 1.2 Increment/copy

$O(\sqrt{n})$ **Phase 2:**

Grow carry-selector

$O(\sqrt{n})$ **Phase 3:**

Extract each row's output

	1		1				
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	0	1	1	
	1		1				
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	1	0	0	
	0		1				
	1,0		0,1		0,1		
	0		1		1		
	1	1	0	1	1	0	

Addition

Faster **worst case**

- $O(\sqrt{n})$ **Phase 1:**
 - 1.1 Sum each row
 - 1.2 Increment/copy

- $O(\sqrt{n})$ **Phase 2:**
 - Grow carry-selector

- $O(\sqrt{n})$ **Phase 3:**
 - Extract each row's output

	1		1		0		
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	0	1	1	
	1		1		1		
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	1	0	0	
	0		1		1		
	1,0		0,1		0,1		
	0		1		1		
	1	1	0	1	1	0	

Addition

Faster **worst case**

$O(\sqrt{n})$ Phase 1:

1.1 Sum each row

1.2 Increment/copy

$O(\sqrt{n})$ Phase 2:

Grow carry-selector

$O(\sqrt{n})$ Phase 3:

Extract each row's output

Total run-time:

$O(\sqrt{n})$

	1		1		0		
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	0	1	1	
	1		1		1		
	1,1		1,1		1,0		
	1		1		0		
	1	0	0	1	0	0	
	0		1		1		
	1,0		0,1		0,1		
	0		1		1		
	1	1	0	1	1	0	

Addition Complexity

	Worst case		Average case
	upper	lower	
[Brun 2007]	$O(n)$		$O(n)$
Average-case algorithm	$O(n)$		$O(\log n)$
Worst-case algorithm		$\Theta(\sqrt{n})$ optimal!	
Combo algorithm			
3D			

	Addition Complexity	
	Worst case upper	Average case lower
[Brun 2007]	$O(n)$	$O(n)$
Average-case algorithm	$O(n)$	$O(\log n)$
Worst-case algorithm	$\Theta(\sqrt{n})$ optimal!	
Combo algorithm		
3D		

Can we get a great average case and an optimal worst case?

	Addition Complexity		
	Worst case upper	lower	Average case
[Brun 2007]	$O(n)$		$O(n)$
Average-case algorithm	$O(n)$		$O(\log n)$
Worst-case algorithm		$\Theta(\sqrt{n})$ optimal!	
Combo algorithm		$\Theta(\sqrt{n})$ optimal!	$O(\log n)$
3D			

Can we get a great average case and an optimal worst case?

-Yes.

	Addition Complexity		
	Worst case upper	lower	Average case
[Brun 2007]	$O(n)$		$O(n)$
Average-case algorithm	$O(n)$		$O(\log n)$
Worst-case algorithm		$\Theta(\sqrt{n})$ optimal!	
Combo algorithm		$\Theta(\sqrt{n})$ optimal!	$O(\log n)$
3D			

Well, what about 3D?

- lower bound is $\Omega(n^{\frac{1}{3}})$
- can it be achieved?

	Addition Complexity		
	Worst case upper	lower	Average case
[Brun 2007]	$O(n)$		$O(n)$
Average-case algorithm	$O(n)$		$O(\log n)$
Worst-case algorithm		$\Theta(\sqrt{n})$ optimal!	
Combo algorithm		$\Theta(\sqrt{n})$ optimal!	$O(\log n)$
3D		$\Theta(n^{1/3})$ optimal!	$O(\log n)$

Well, what about 3D?

- lower bound is $\Omega(n^{\frac{1}{3}})$
- can it be achieved?

	Addition Complexity		
	Worst case upper	lower	Average case
[Brun 2007]	$O(n)$		$O(n)$
Average-case algorithm	$O(n)$		$O(\log n)$
Worst-case algorithm	$\Theta(\sqrt{n})$ optimal!		
Combo algorithm	$\Theta(\sqrt{n})$ optimal!		$O(\log n)$
3D	$\Theta(n^{1/3})$ optimal!		$O(\log n)$

Ok... what about multiplication?

	Addition Complexity	
	Worst case upper	Average case lower
[Brun 2007]	$O(n)$	$O(n)$
Average-case algorithm	$O(n)$	$O(\log n)$
Worst-case algorithm	$\Theta(\sqrt{n})$ optimal!	
Combo algorithm	$\Theta(\sqrt{n})$ optimal!	$O(\log n)$
3D	$\Theta(n^{1/3})$ optimal!	$O(\log n)$

		Multiplication Complexity	
2D	[Brun 2007]	$O(n)$	$\Omega(\sqrt{n})$
3D		$O(n^{5/6})$	$\Omega(n^{1/3})$

Open Questions

- Multiplication
 - Can you beat $O(n^{\frac{5}{6}})$ in 3D?
 - Can you beat $O(n)$ in 2D?
 - Better lower bound for multiplication?
- Sorting
 - $O(\sqrt{n} \log n)$ in 3D
- Other metrics
 - Space used up
 - Modularity
- Computing other functions
 - This is just a jumping off point.

Thanks for listening. Questions?

Alexandra Keenan
 Robert Schweller
 Michael Sherman
 Xingsi Zhong

Wyle Science Technology and Engineering Group
 University of Texas - Pan American
 Amazon
 Clemson University

	Addition Complexity	
	Worst case upper	Average case lower
[Brun 2007]	$O(n)$	$O(n)$
Average-case algorithm	$O(n)$	$O(\log n)$
Worst-case algorithm	$\Theta(\sqrt{n})$ optimal!	
Combo algorithm	$\Theta(\sqrt{n})$ optimal!	$O(\log n)$
3D	$\Theta(n^{1/3})$ optimal!	$O(\log n)$

	Multiplication Complexity	
2D [Brun 2007]	$O(n)$	$\Omega(\sqrt{n})$
3D	$O(n^{5/6})$	$\Omega(n^{1/3})$