

# ESCAPING A RUT WITH ARRAY THINKING

David Leibs  
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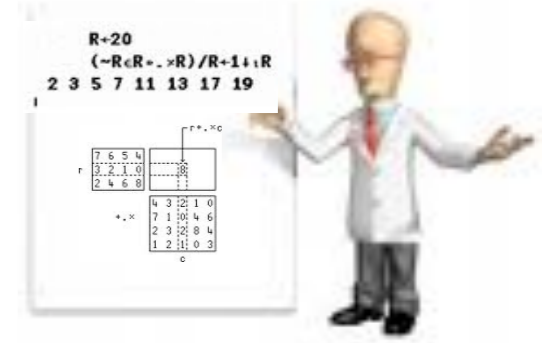
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## **Escaping a rut with Array Thinking**

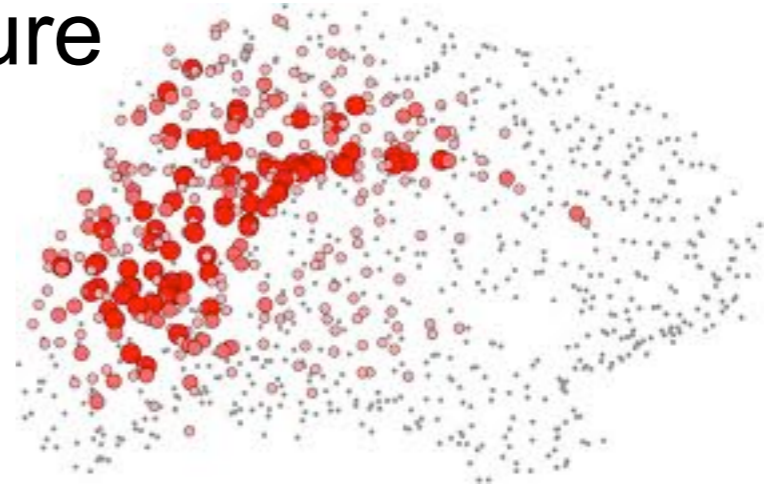
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# Agenda: We will discuss

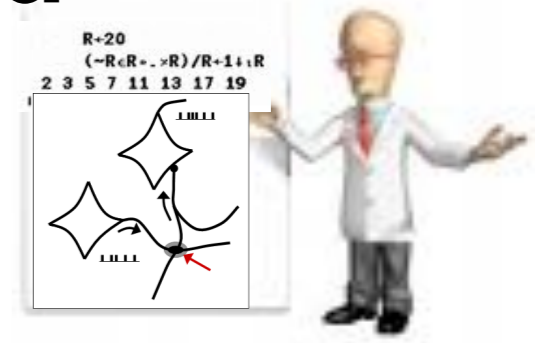


- Pseudo Neuroscience and metaphor
- Our propensity to stick with the groove
- Path Dependence
- Quick look at how I am wired
- A quick introduction to Array Programming
- Take a look at some ideas for the future

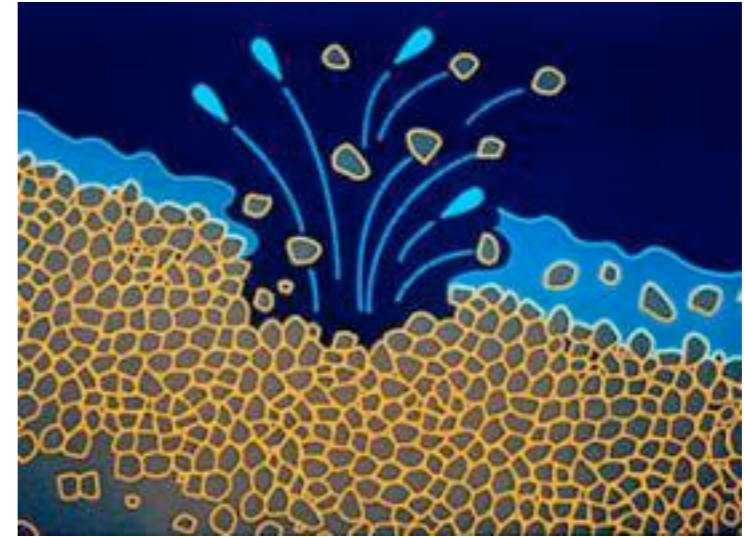




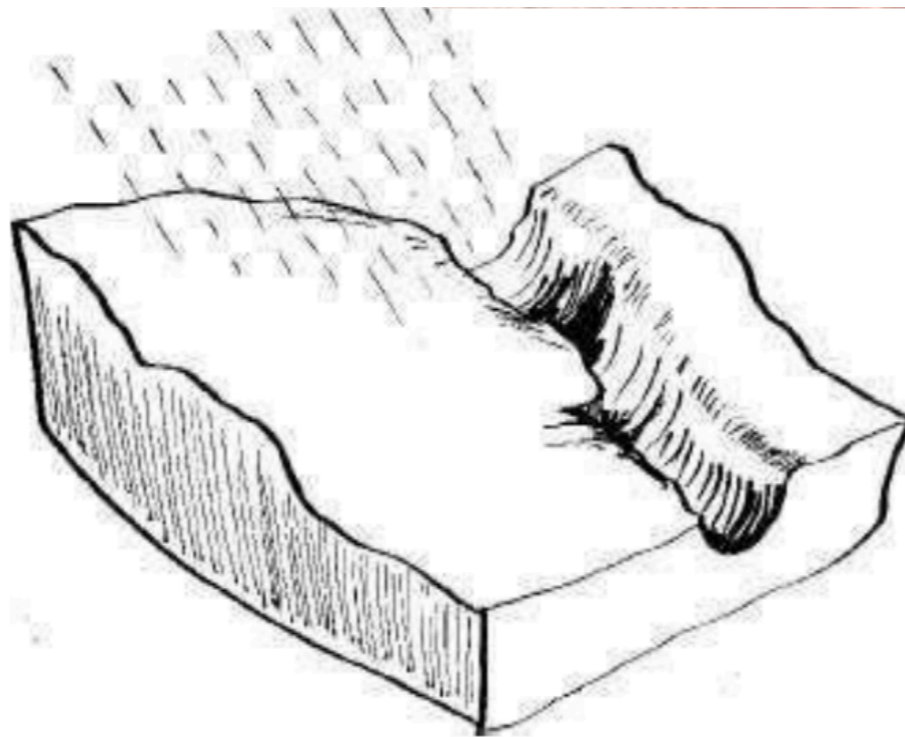
# A metaphor for our perception and learning



# Water shapes the land



- Water falls randomly
- Gravity starts a groove
- Once a groove starts it is reinforced
- It becomes a rut





# Over time water carves grand canyons





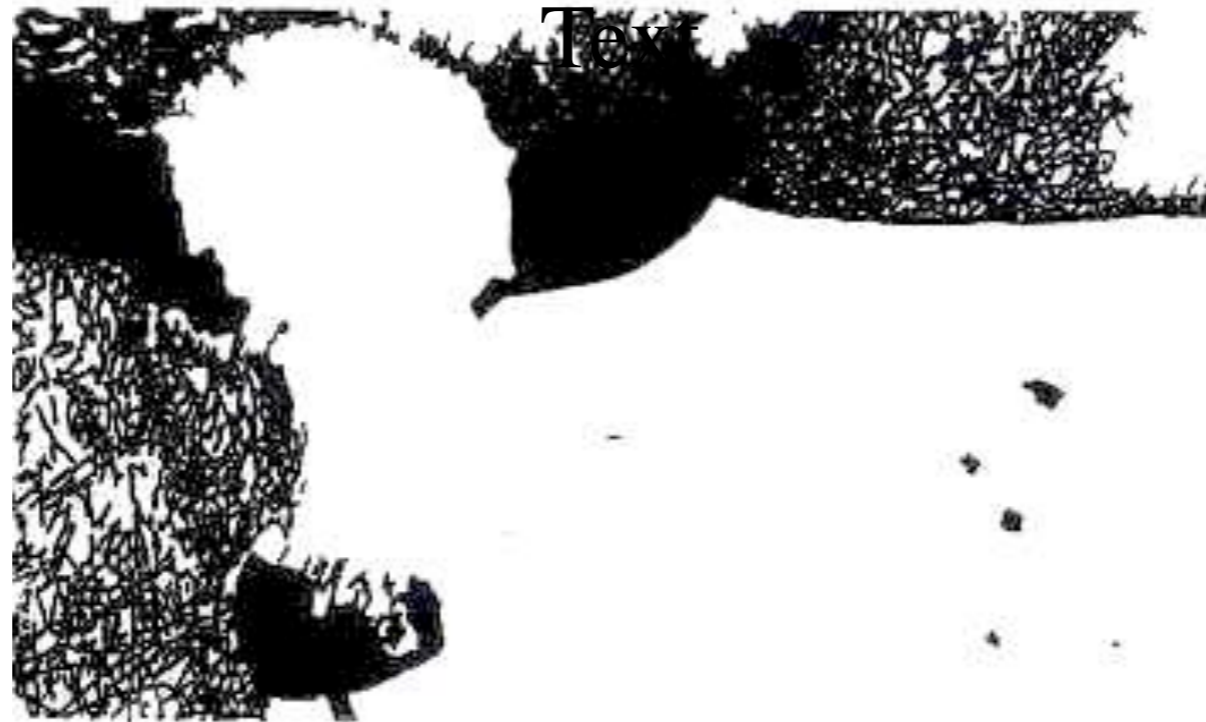
# Learning, Practice, and Perception

- We are very influenced by what we first learn
- As we practice that to which we are drawn to we “fall into a groove”



# Learning, Perception, and Practice

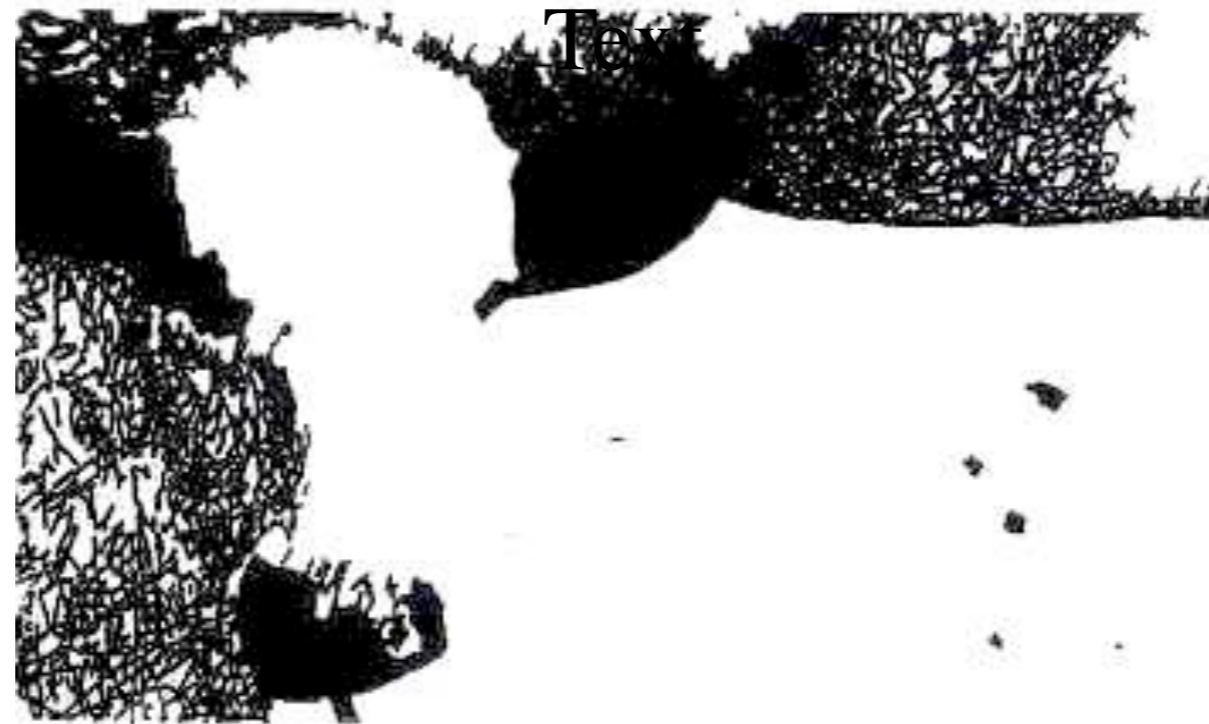
What Do You See?





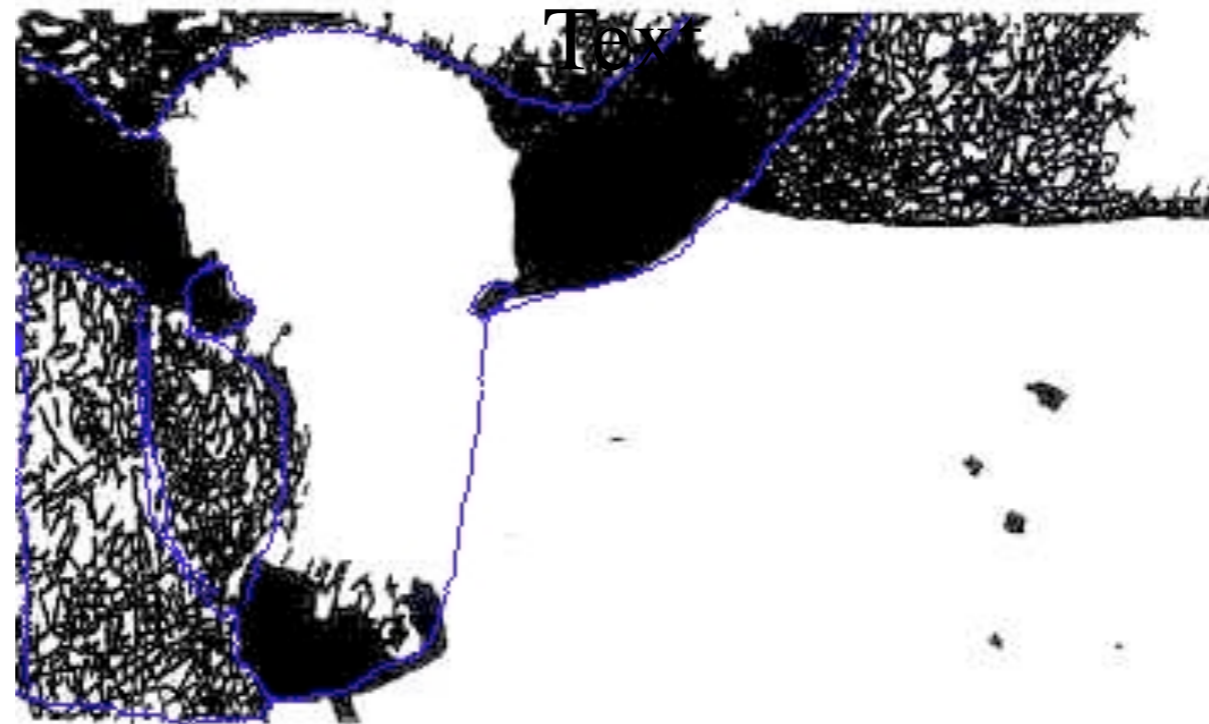
# Learning, Practice, and Perception

Can you see the cow?



# Learning, Practice, and Perception

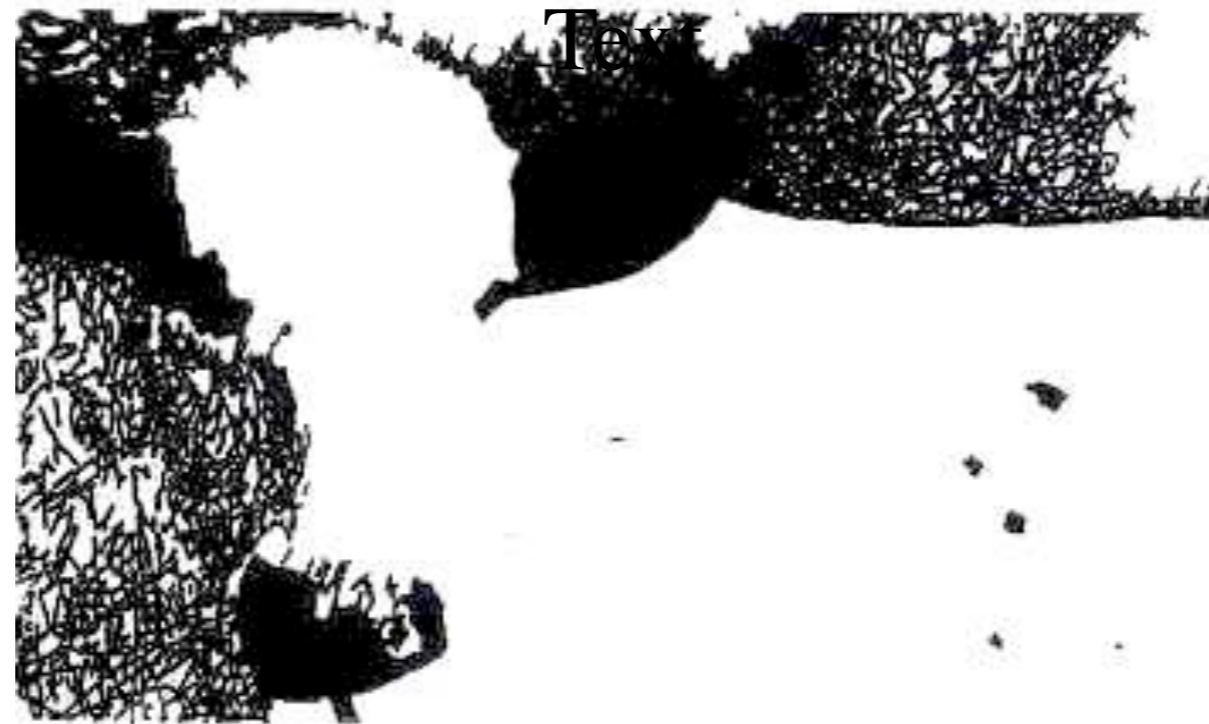
Can you see the cow?





# Learning, Practice, and Perception

Now, can you not see the cow?



# Ultimately we find ourselves at the bottom of a canyon






# And we find ourselves at the bottom of a for loop

To most programmers this looks normal

```
void Matrix_Mult(int a1[][3], int a2[][4], int a3[]
[4])
{
    int i = 0;
    int j = 0;
    int k = 0;
    for(i = 0; i < 2; i++)
        for( j = 0; j < 4; j++)
            for( k = 0; k < 3; k++)
                a3[i][j] += a1[i][k] * a2[k][j];
}
```

# And we find ourselves at the bottom of a ~~for loop~~ a canyon

```
void Matrix_Mult(int a1[3], int a2[4], int a3[4][4])  
{  
    int i = 0;  
    int j = 0;  
    int k = 0;  
    for(i = 0; i < 2; i++)  
        for(j = 0; j < 4; j++)  
            for(k = 0; k < 3; k++)  
                a3[i][j] += a1[i][k] * a2[k][j];  
}
```



```
int i = 0;  
int j = 0;  
int k = 0;  
for(i = 0; i < 5; i++)  
    for(j = 0; j < 4; j++)  
        for(k = 0; k < 3; k++)  
            a3[i][j] += a1[i][k] * a2[k][j];  
}
```



# It's important to remember to climb out and look at different canyons



**Because there is great beauty out there!**





# A quick look at how am I wired?

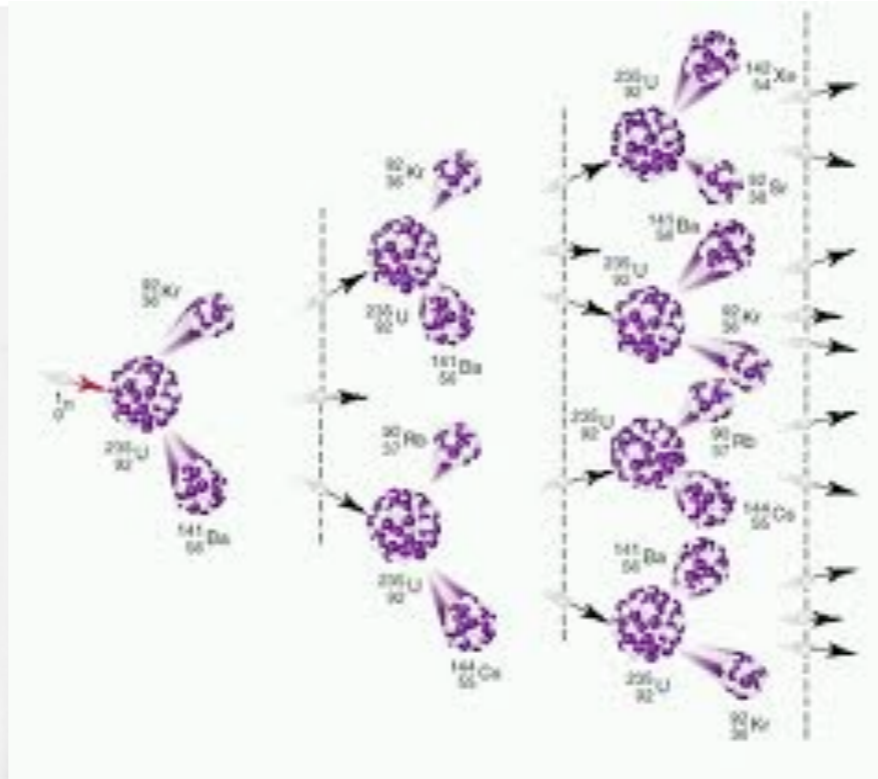




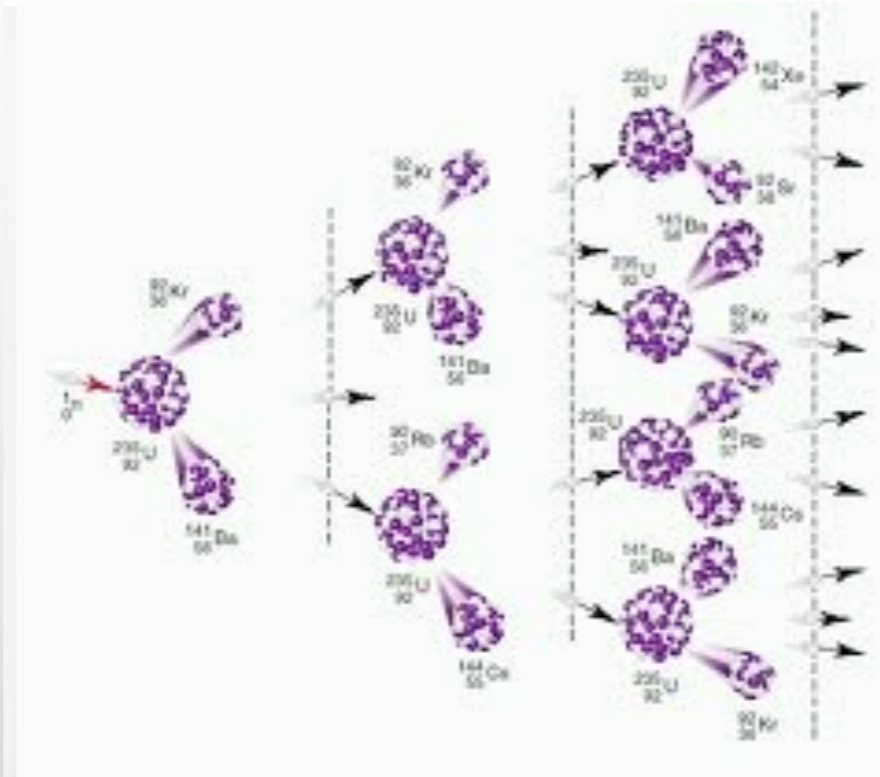
# I Played with clothespins and watched TV



# I set off chain reactions

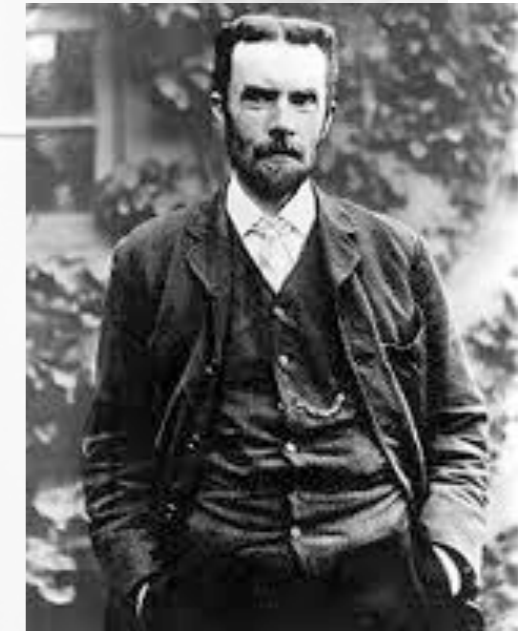
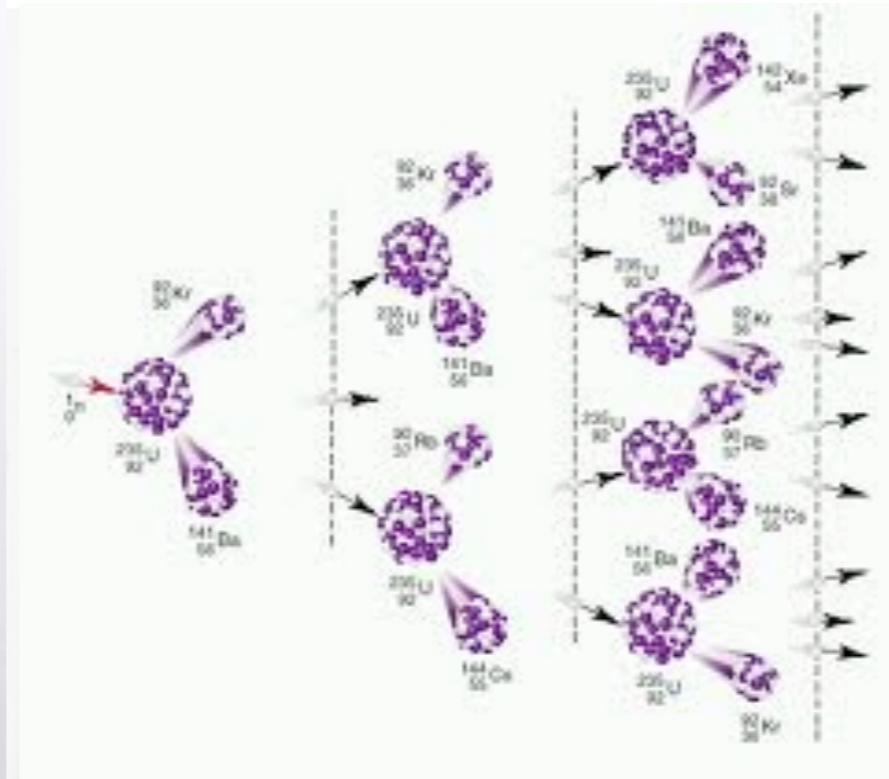


# And prepared to be a scientist (fight monsters)

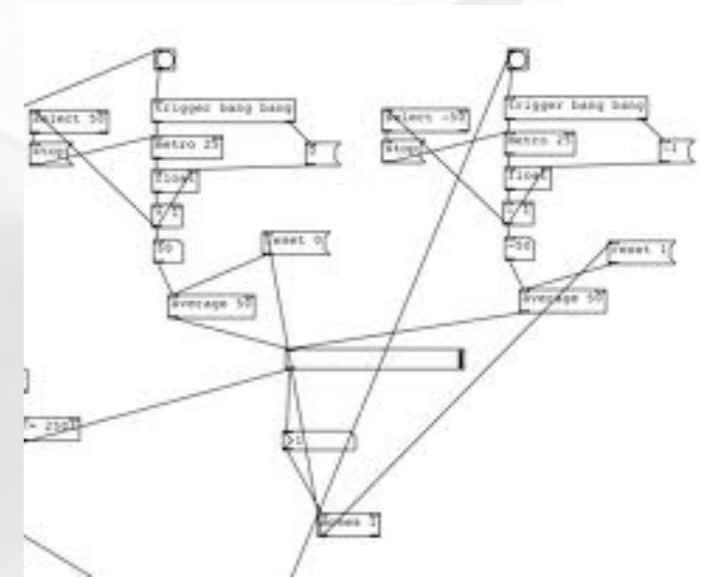




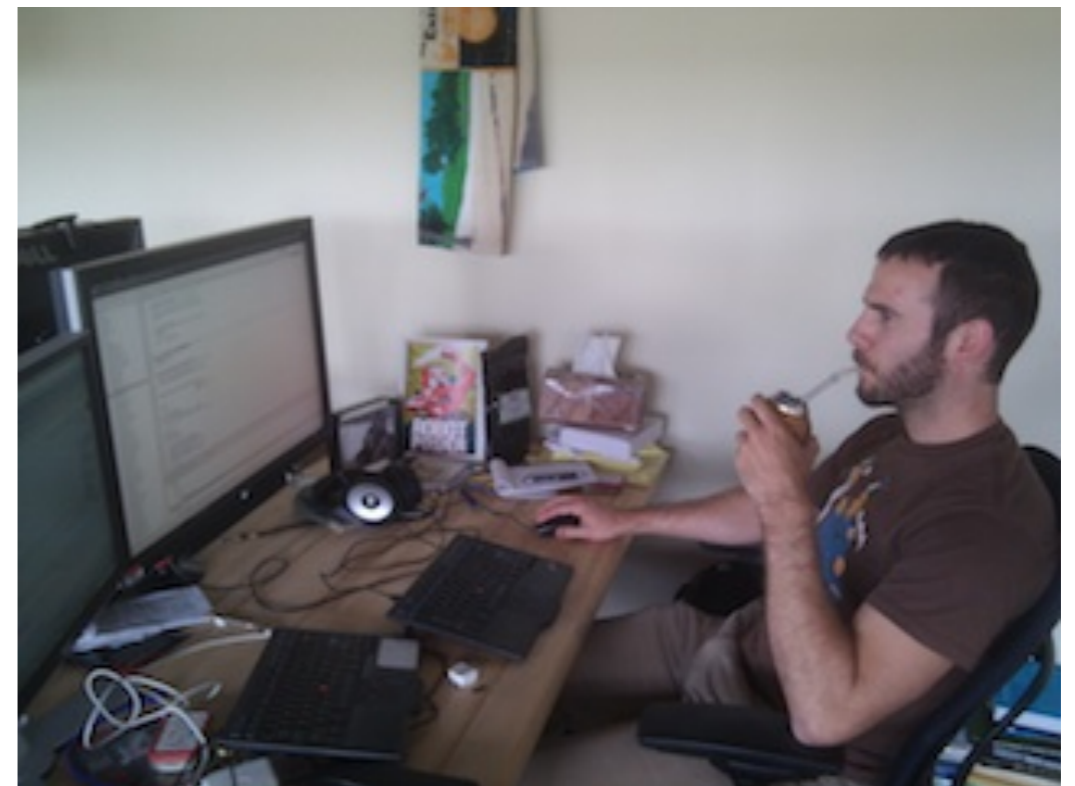
# Finally I was drawn to mathematics



# What became of such a neglected child?



# And look at what I did to my own child!





# Alright, about those grooves



# Let us look a something beautiful from our past



# Iverson Notation and APL

- Looked for a better notation for math
- Spent years on a paper design
- Wrote a wonderful book
- Didn't get tenure
- At IBM with Adin Falkoff created an executable math notation called "APL"





# Quick Overview

- Had hieroglyphic symbols
- Its own Selectric print head
- Its own keyboard
- No precedence rules for functions (just too many)
- Right to left evaluation
- Workspace
- Operate on multi-dimensional arrays



# Functions and Operators



- Functions defined on scalars
- Operators defined on functions
- Extended to Arrays in Four Ways
  - element-by-element with possible extension of rank
  - reduction
  - inner product
  - outer product

$$\nabla \cdot \mathbf{E} = \frac{\rho}{\epsilon_0}$$

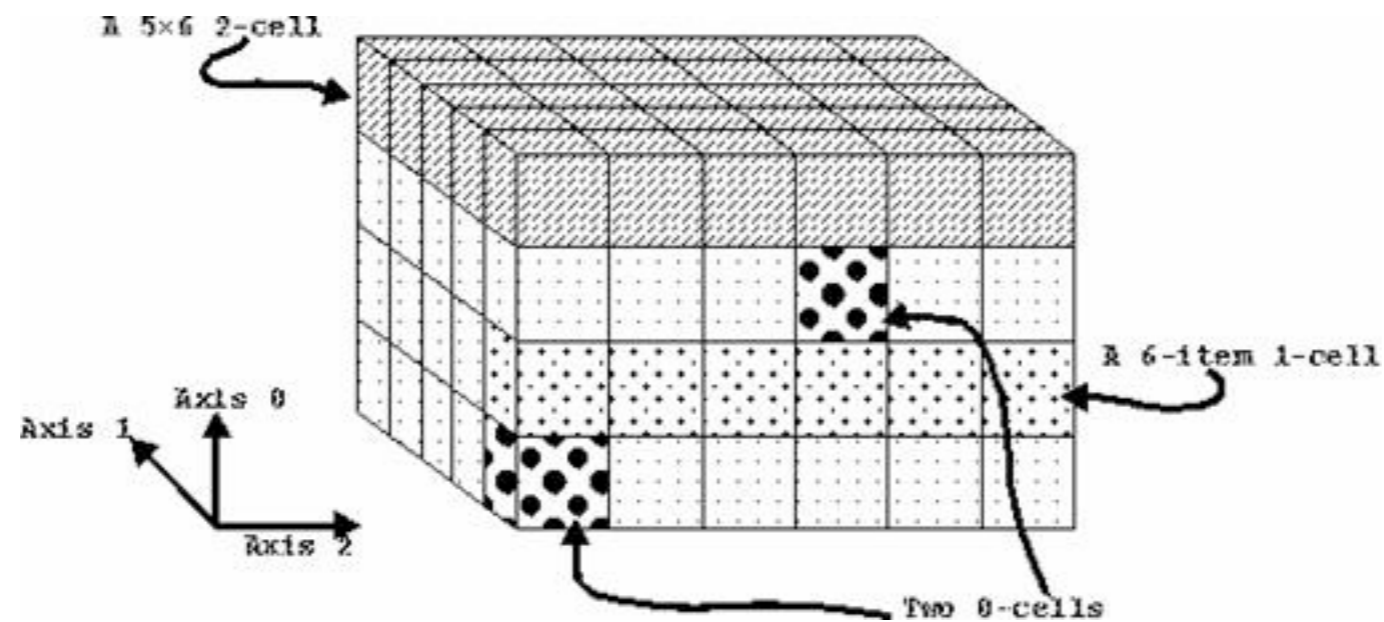
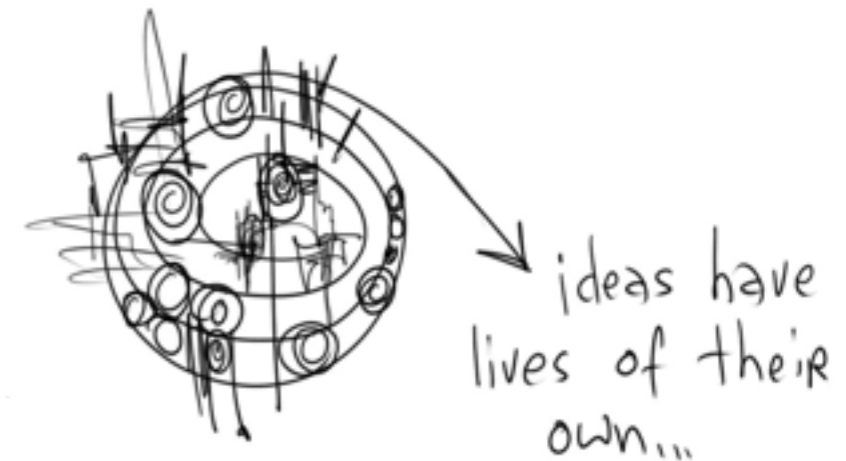
$$\nabla \cdot \mathbf{B} = 0$$

$$\nabla \times \mathbf{E} = -\frac{\partial \mathbf{B}}{\partial t}$$

$$\nabla \times \mathbf{B} = \mu_0 \mathbf{J} + \mu_0 \epsilon_0 \frac{\partial \mathbf{E}}{\partial t}$$

# APL's Great Idea

- Noun rank combines with verb rank
- Frames, Items, and Cells





# APL Performance



- Interpreted
- Lots of Optimized primitives
- The overhead of interpreted code was low relative to time spent in primitives (total = setup + execution)
  - setup ~ 2.5 milliseconds
  - execute time for scalar operation ~ 50 to 250 microseconds
  - ~ 1000 element arrays
  - ~  $(2500 + 150000) * 10^{-6}$
- Ran on Time Share system (50 users on IBM 360)
- Performance on iPhone is amazing

# What Ever Happened to APL



- APL grew rapidly in the 1970s and declined in 1980s
- Lots of use in Statistics, Actuarial, and Financial
- Array Languages are still somewhat popular
- Has descendants: A+, J, K, Q
- Influenced:
  - Fortran 90
  - MATLAB
  - R
  - MSFT Accelerator
  - Intel's Array Building Blocks



# State of the Art in APL is J

- It can look a bit “alien”
- Encourages programming without loops
- Encourages programming without variables
- My 10 by 3 working subset of R



am =: amean =: +/ % #	gm =: gmean =: # %: */	hm =: hmean =: % @ am @: %
dev =: - amean	ss =: +/ @: *: @ dev	var =: ssp % <: @ # ssp % <: @ #
sd =: %: @ var	fr =: +/"1 @ (=)	frtab =: [, fr
io =: [:<[:+/[<]	midpts =: [: -: 2: + ^]	FR =: [: +/"1 { @ [ = / ]
cfr =: i. @ (<: @ \$ @ [) fr io	cfrtab =: midpts @ [, cfr	EACH =: &>
bars =: #&'*' EACH @ fr	barchart =: (": EACH @ [) ,. [: ' '&, . bars	vbarchart =: [: l. [: l: [: '^&, . bars
barchartv =: (": EACH @ [) l. @ l: @ ,. [: ' '&, . bars	stem =: 10 &* @ <. @ % & 10	leaf =: 10 &l
SLtab =: ~. @ stem ; "0 stem </. leaf	stemfrtab =: ~. @ stem ,. stem #/. leaf	midindices =: (<. , >.) @ -: @ <: @ #
Q2 =: median =: [: am midindices { sort	Q1 =: [: median ] #~ median > ]	Q3 =: [: median ] #~ median < ]
five =: (<./, Q1, Q2, Q3, >./)	ArrayMaker =: ". ;. _2	mp =: dot =: +/ . *



# Optimizations: It can be fast

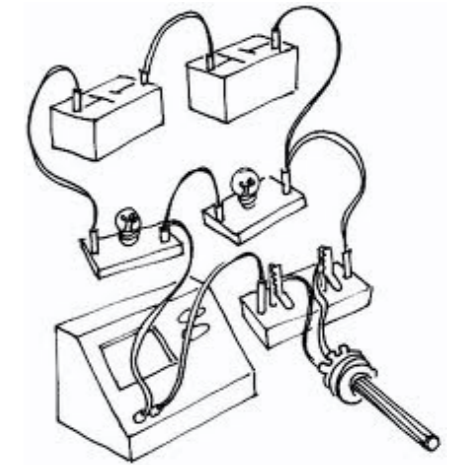


# Phil Abrams APL Machine (1970)

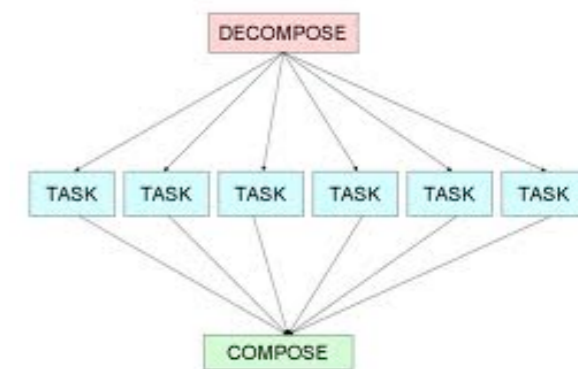


- High Level machine appropriate for APL1
- Drag-along
  - Defer the process of evaluation of operands and operators as long as possible (Lazy Evaluation)
  - `take(3, 2 * -V)`
  - `A+B+C+D`
- Beating
  - The transformation of code to reduce the amount of data manipulation during expression evaluation
- Envisioned “multiple copies of key evaluation algorithms working simultaneously on different parts of an expression”

# Most APL Primitives can be Parallel



- Willhoft-1991: Most APL2 Primitives Can Be Parallelized
  - “APL2 exhibits a high degree of parallelism”
  - “94 of the 101 primitives APL2 operations can be implemented in parallel”
  - “40-50 percent of the code in “real” applications is parallel code”
- Bernecky-1993
  - Good Properties for parallelism:
    - array orientation
    - adverbs and conjunctions
    - consistent syntax and semantics





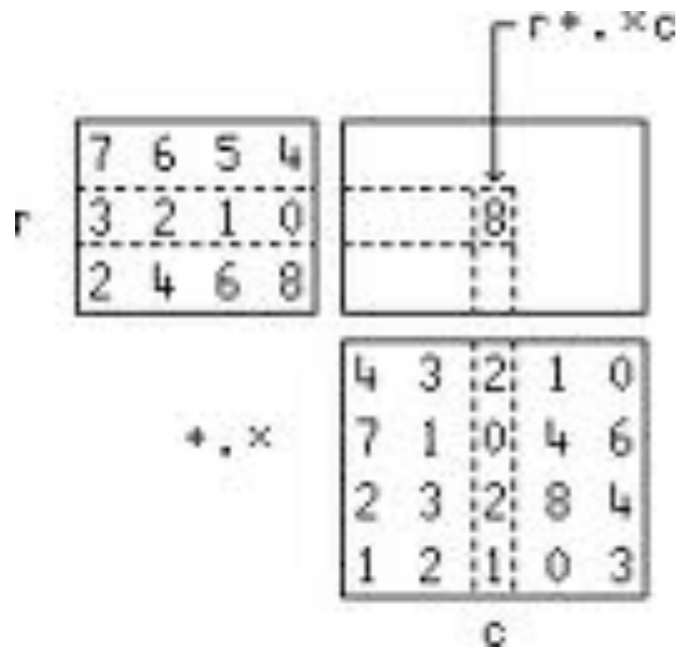
# Training Our Thinking



# Very useful for training data-para thinking



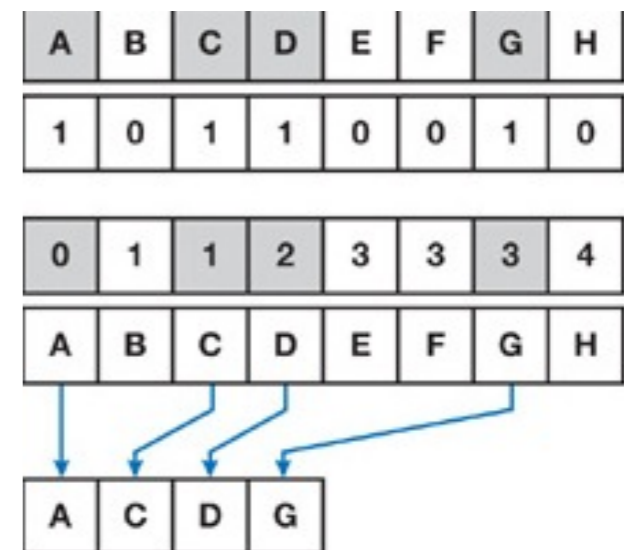
## Inner Product



## Outer Product

$$\begin{aligned}
 a &\leftarrow \begin{bmatrix} 1 & 1 & -23 & 4 \end{bmatrix} \\
 b &\leftarrow \begin{bmatrix} -3 & -1 & 2 \end{bmatrix} \\
 a \circledast b &= \begin{bmatrix} -3 & -1 & 2 \\ -3 & -1 & 2 \\ 69 & 23 & -46 \\ -12 & -4 & 8 \end{bmatrix}
 \end{aligned}$$

## Compress and Scan



# Array Programming Encourages Beautiful Loopless Big Thinking

Create a List of Prime Numbers

$$(\sim \mathbf{R} \in, \mathbf{R} \circ \cdot \times \mathbf{R}) / \mathbf{R} \leftarrow \mathbf{1} \downarrow \cup \mathbf{R}$$



1 2 3 4 5

x	2	3	4	5	6	7	8	9
2	4	6	8	10	12	14	16	18
3		9	12	15	18	21	24	27
4			16	20	24	28	32	36
5				25	30	35	40	45
6					36	42	48	54
7						49	56	63
8							64	72
9								81

1	2	3	4	5	6	7	8	9	10
11	12	13	14	15	16	17	18	19	20
21	22	23	24	25	26	27	28	29	30
31	32	33	34	35	36	37	38	39	40
41	42	43	44	45	46	47	48	49	50
51	52	53	54	55	56	57	58	59	60
61	62	63	64	65	66	67	68	69	70
71	72	73	74	75	76	77	78	79	80
81	82	83	84	85	86	87	88	89	90
91	92	93	94	95	96	97	98	99	100



# A Taste of Array Programming



# Simple Arithmetic

$$\boxed{3} \quad \boxed{+} \quad \boxed{4}$$

# Simple Arithmetic

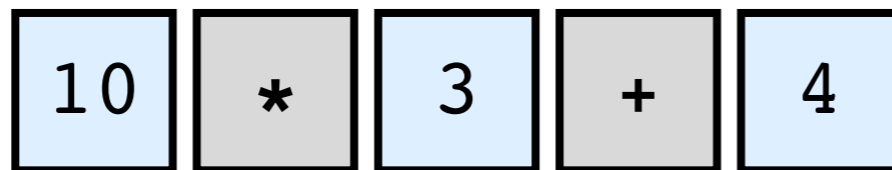




# Simple Arithmetic

$$\begin{array}{c} \boxed{3} \quad \boxed{+} \quad \boxed{4} \\ 7 \end{array}$$

# Evaluate right to left

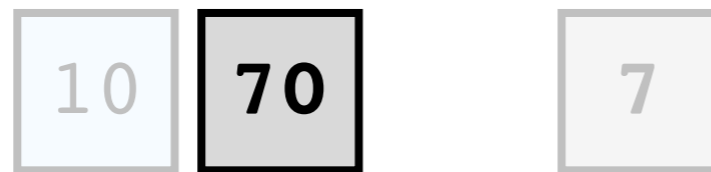


# Evaluate right to left

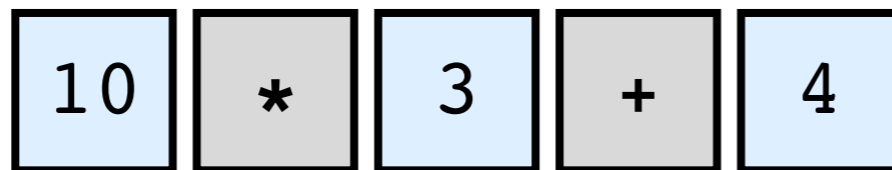




# Evaluate right to left

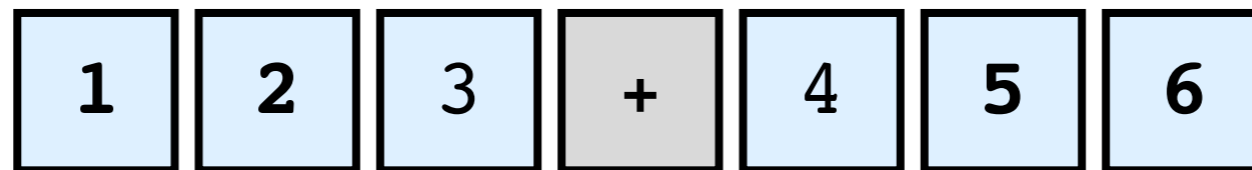


# Evaluate right to left



70

# Extends to arrays

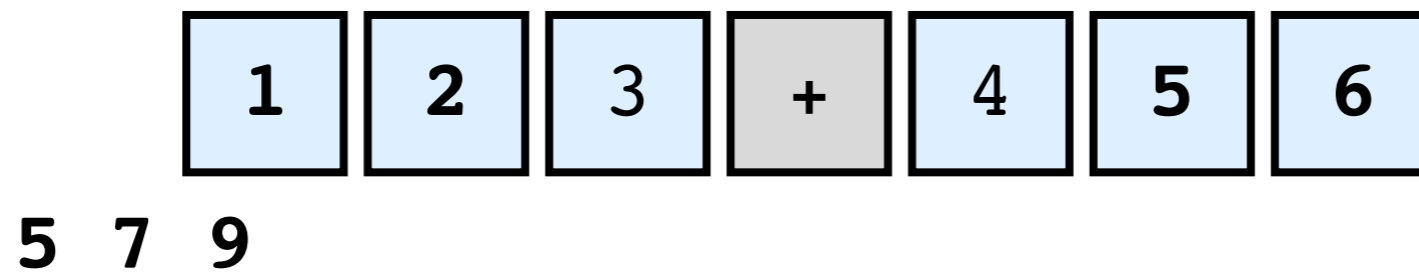




# Extends to arrays



# Extends to arrays



# Mix scalars and arrays



# Mix scalars and arrays

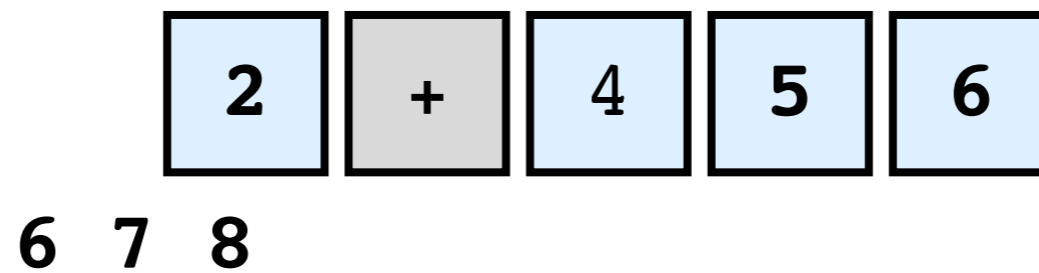




# Mix scalars and arrays



# Mix scalars and arrays



# Uniform

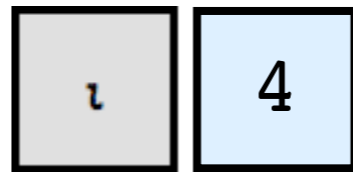
## Logicals

$=$	$<$	$>$
$\leq$	$\geq$	$\neq$

## Arithmetics

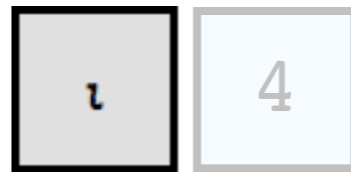
$+$	$\times$	$\div$
$-$	$ $	$\wedge$
$\lceil$	$\lfloor$	$\otimes$

# Generate Integers





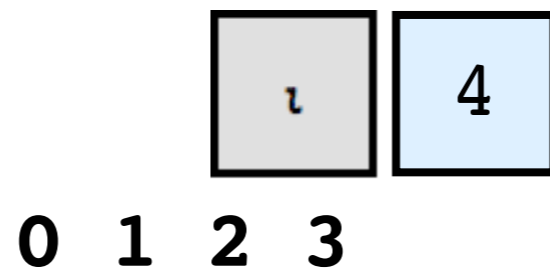
# Generate Integers



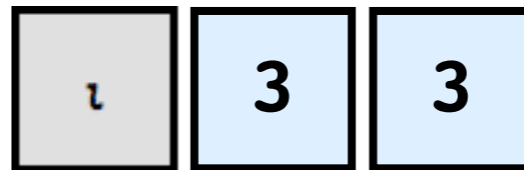
# Generate Integers



# Generate Integers



# Generate arrays of integers





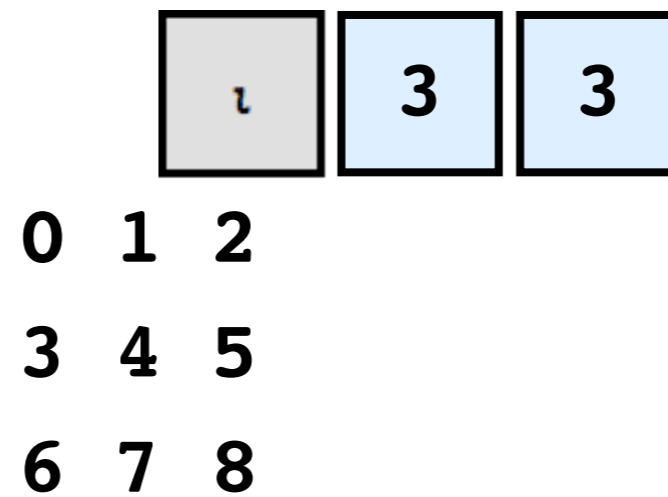
# Generate arrays of integers



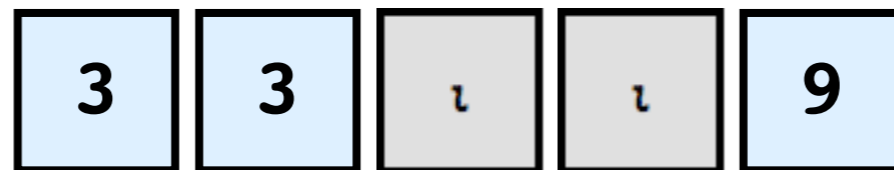
# Generate arrays of integers



# Generate arrays of integers

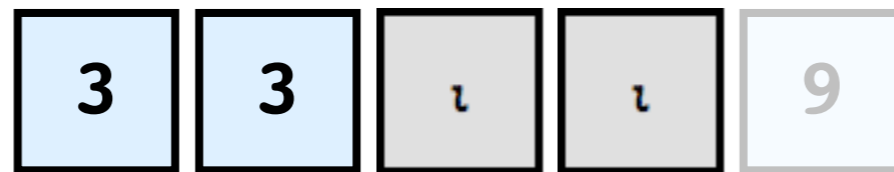


# Reshape Arrays

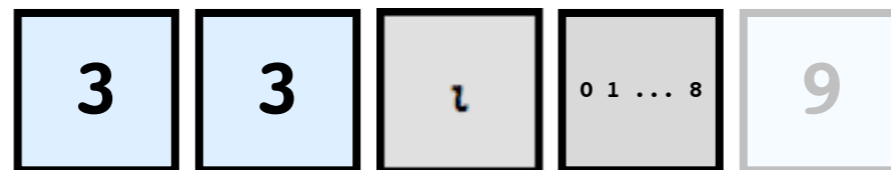




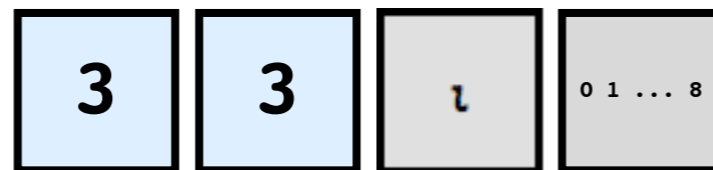
# Reshape Arrays



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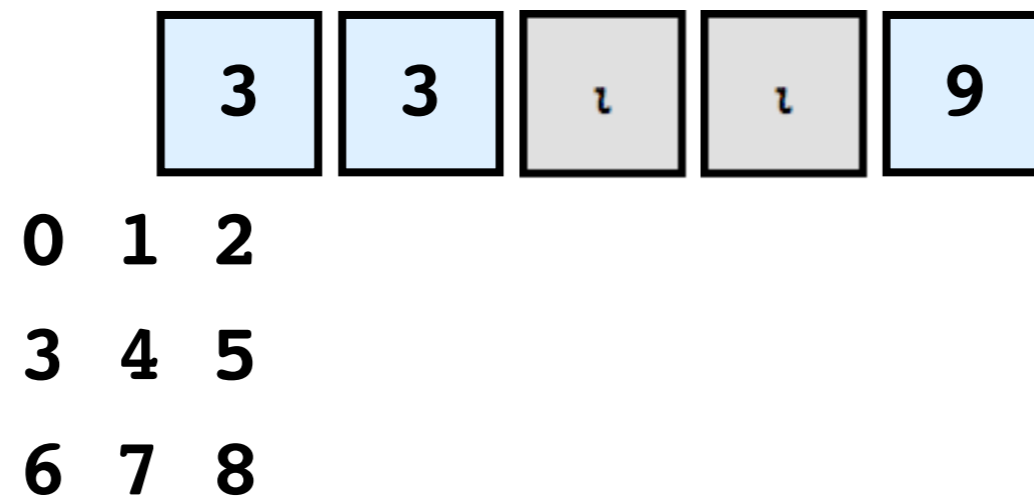


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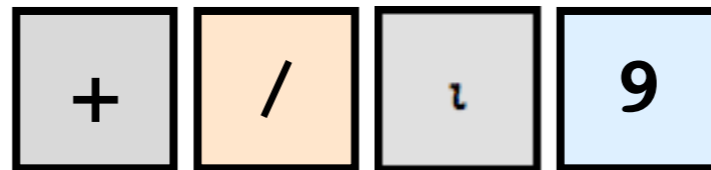




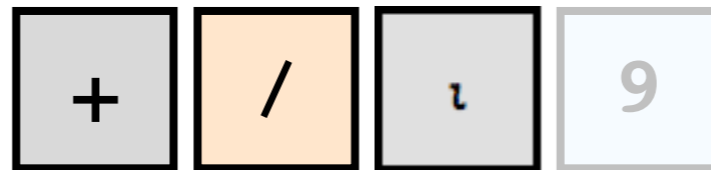
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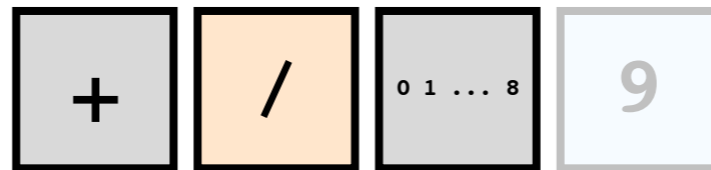
# Operators



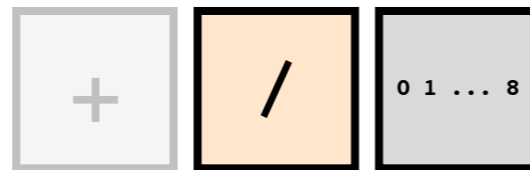
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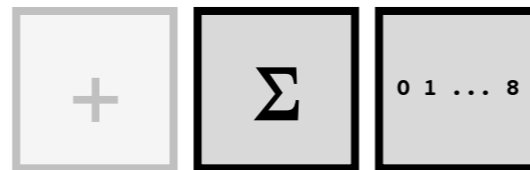
# Operators



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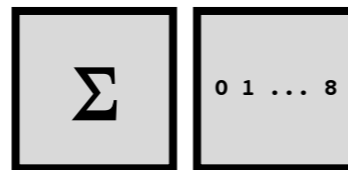


# Operators





# Operators



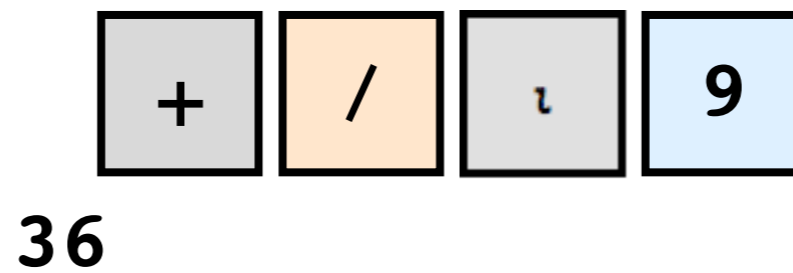
# Operators



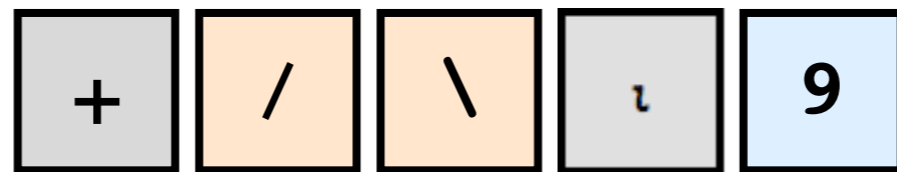
# Operators



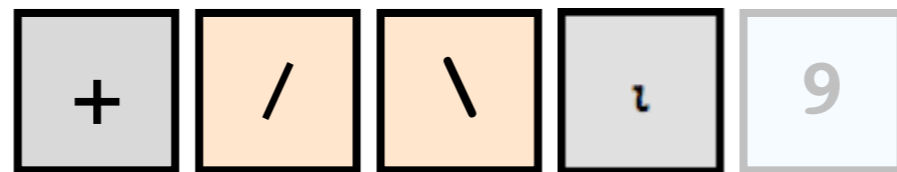
# Operators



# Prefix Scan Operator

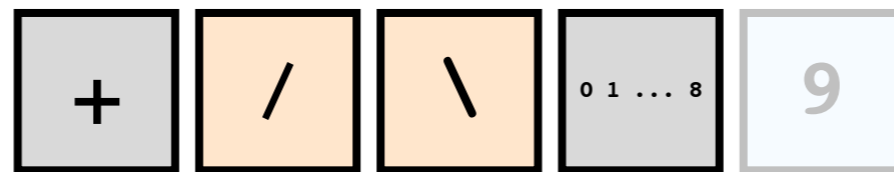


# Prefix Scan Operator

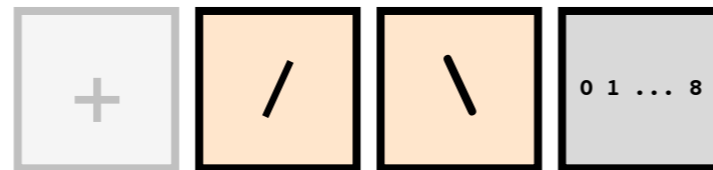




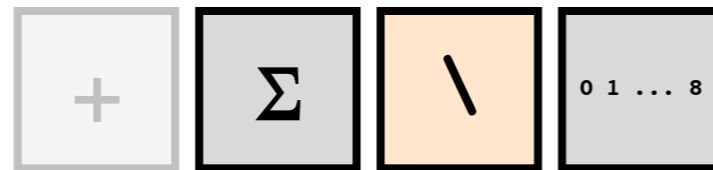
# Prefix Scan Operator



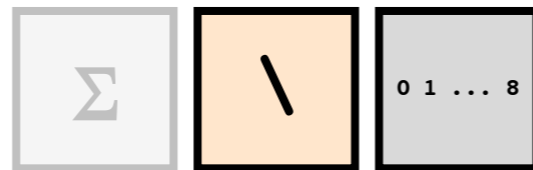
# Prefix Scan Operator



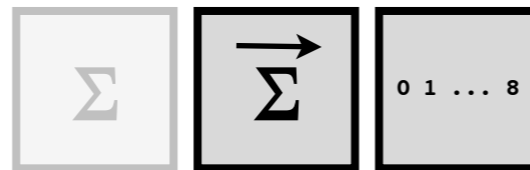
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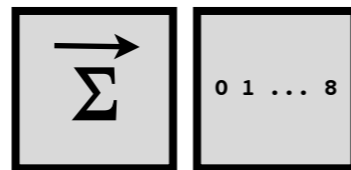
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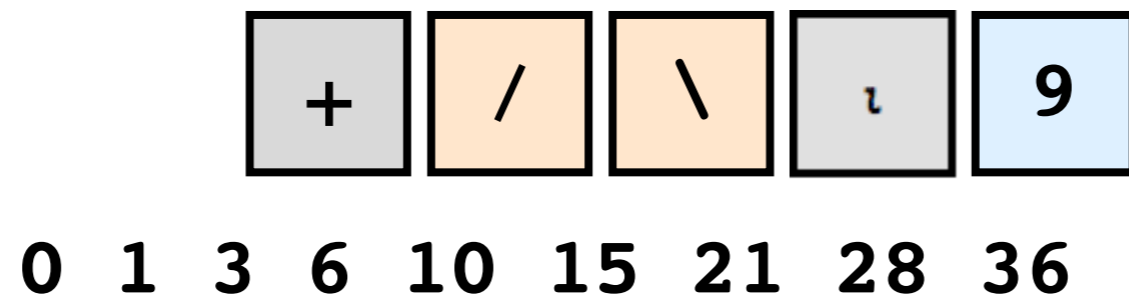




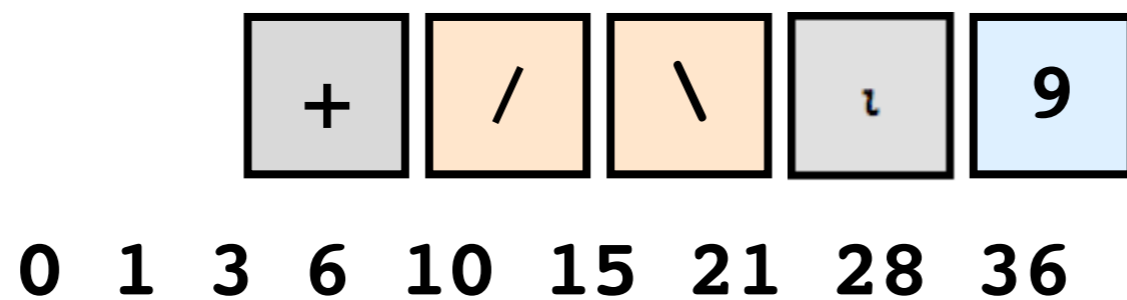
# Prefix Scan Operator



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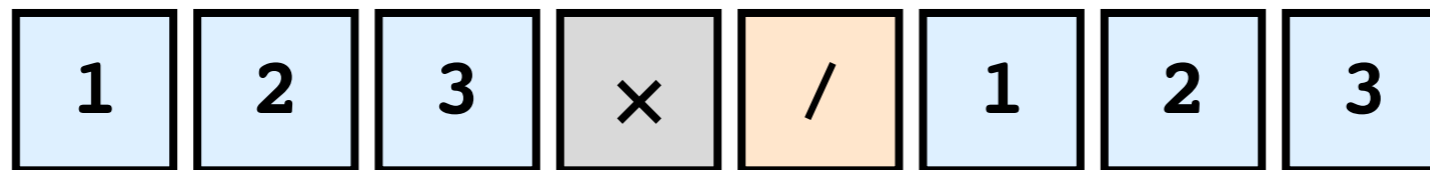
# Prefix Scan Operator



## Example

<b>x</b>	←	6	7	8				
<b>u</b>	←	1	0	1	0	0	1	0
<b>+/\u</b>								
1	1	2	2	2	3	3		
<b>u * +/\u</b>								
1	0	2	0	0	3	0		
<b>(u * +/\u) □ 0, x</b>								
6	0	7	0	0	8	0		

# Outer Product Operator



# Outer Product Operator



# Outer Product Operator

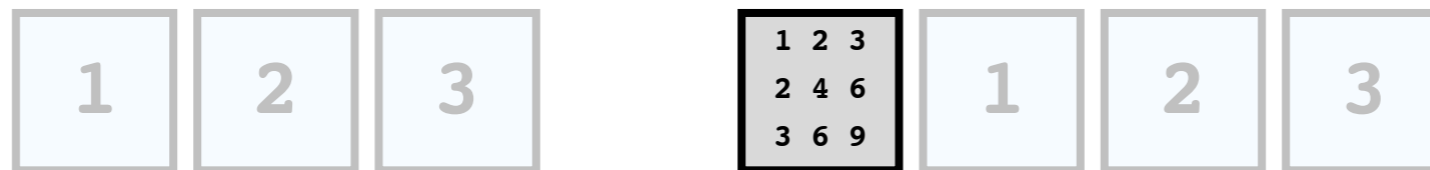


# Outer Product Operator

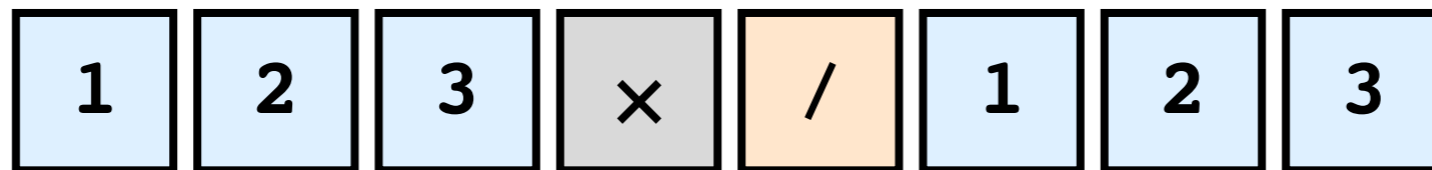




# Outer Product Operator



# Outer Product Operator

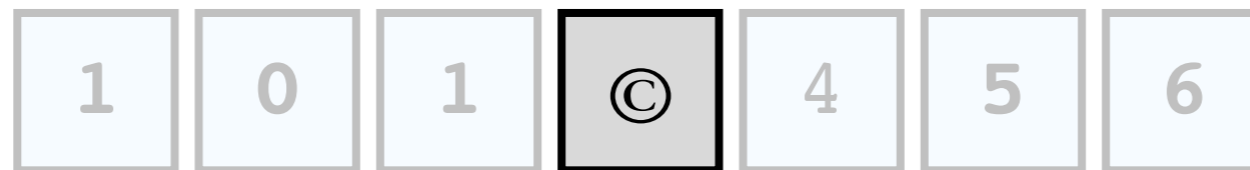


1 2 3  
2 4 6  
3 6 9

# Compression

1 0 1 © 4 5 6

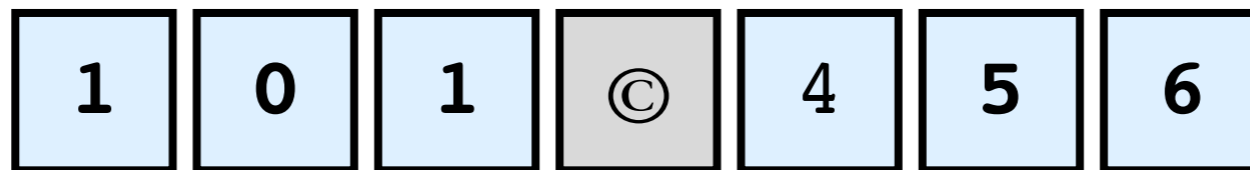
# Compression



# Compression

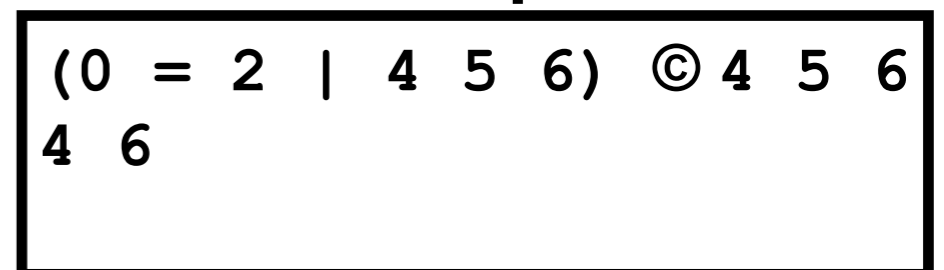


# Compression

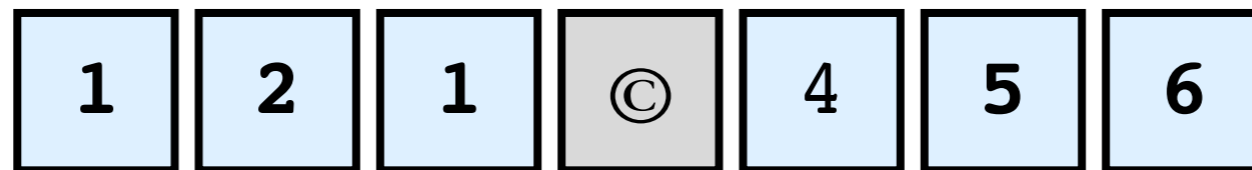


4 6

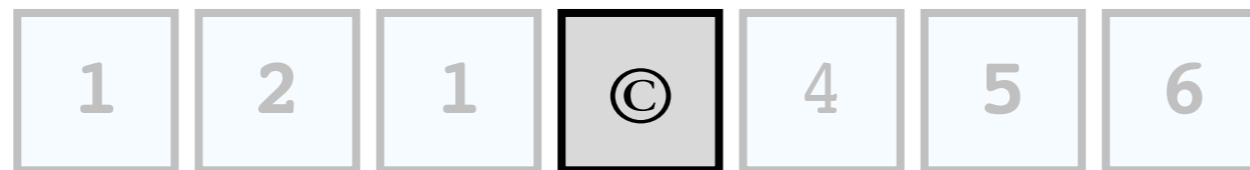
## Example



# Compression is copy



# Compression is copy

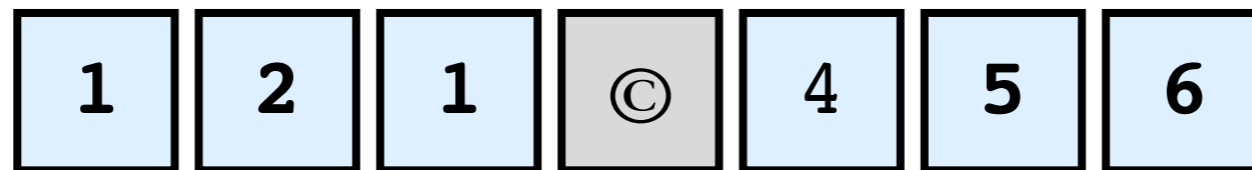




# Compression is copy



# Compression is copy



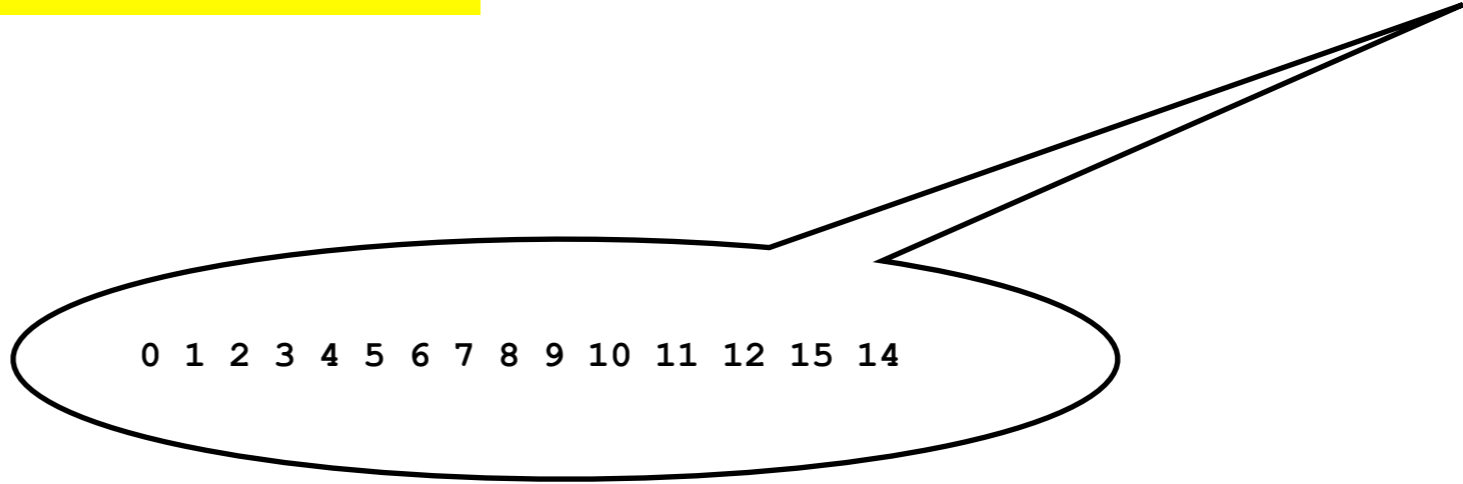
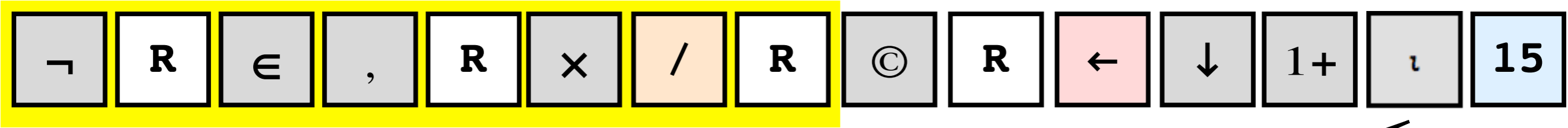
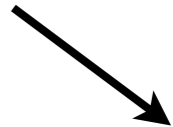
4 5 5 6

# First Primes

$\neg$  R  $\in$  , R  $\times$  / R  $\odot$  R  $\leftarrow$   $\downarrow$  1+  $\wr$  15

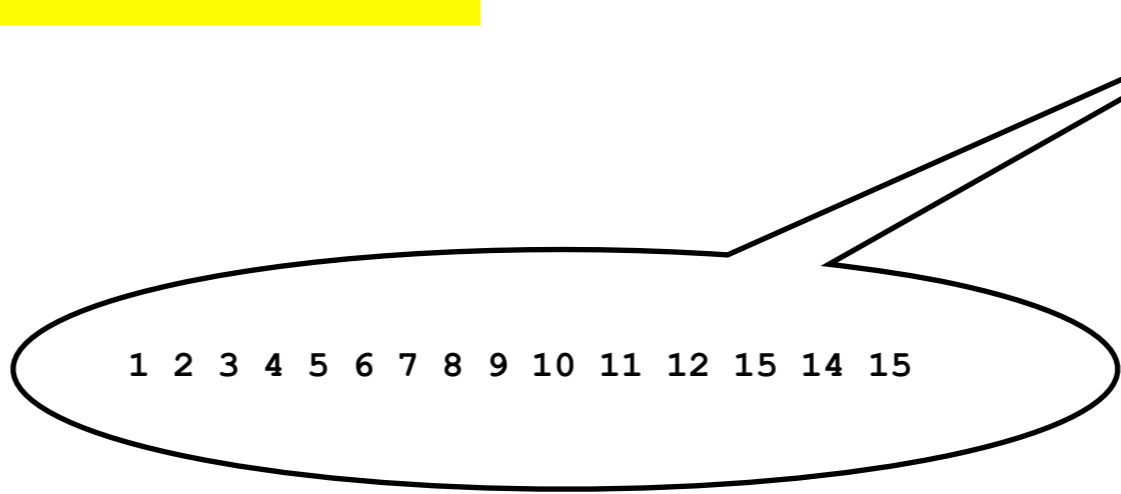
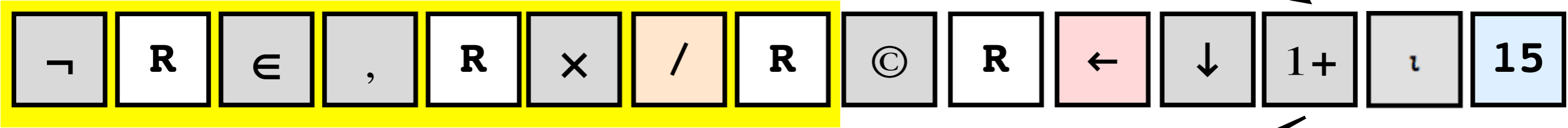
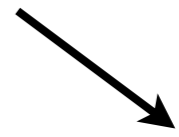
# First Primes

generate integers



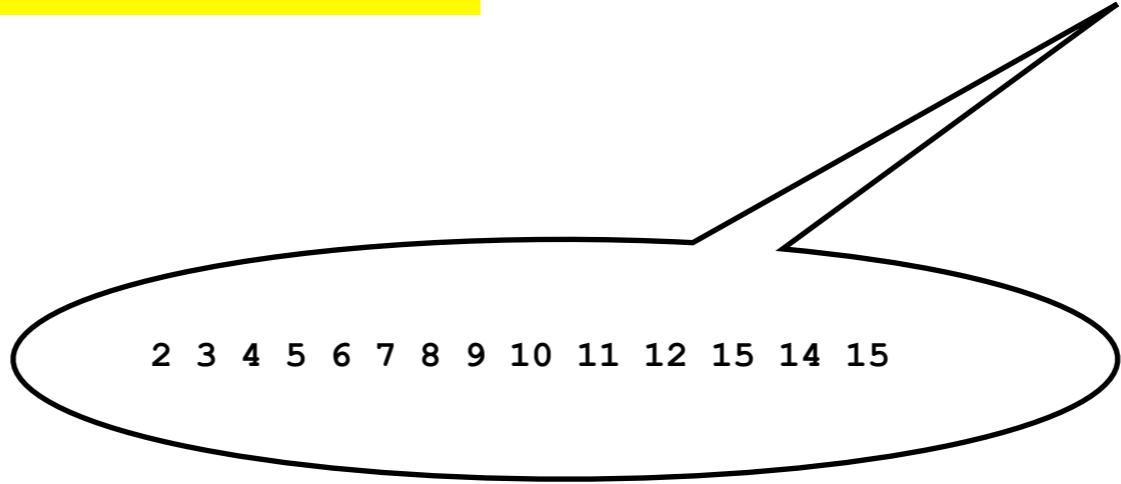
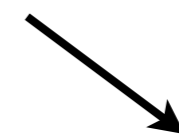
# First Primes

add 1 to each



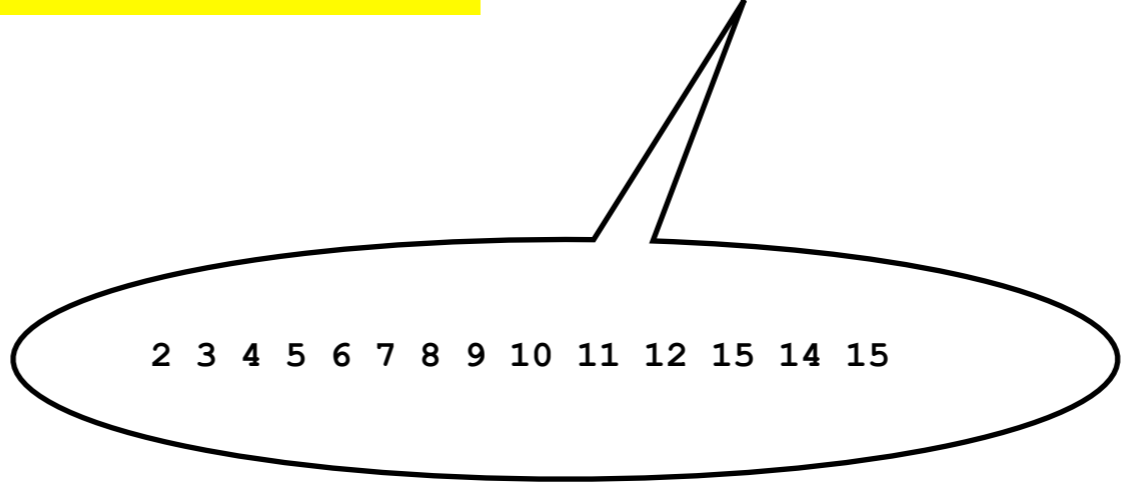
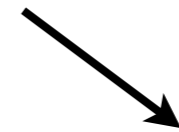
# First Primes

drop first



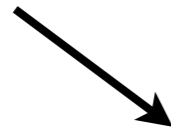
# First Primes

assign to R



# First Primes

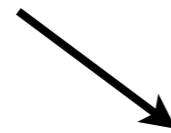
evaluate sub expression





# First Primes

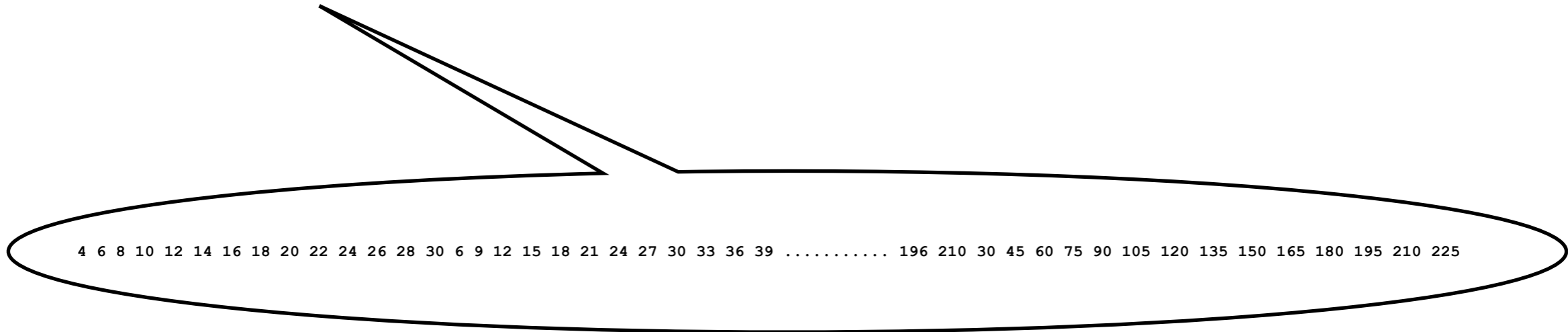
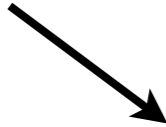
up the dimensionality with outer product



4	6	8	10	12	14	16	18	20	22	24	26	28	30
6	9	12	15	18	21	24	27	30	33	36	39	42	45
8	12	16	20	24	28	32	36	40	44	48	52	56	60
10	15	20	25	30	35	40	45	50	55	60	65	70	75
12	18	24	30	36	42	48	54	60	66	72	78	84	90
14	21	28	35	42	49	56	63	70	77	84	91	98	105
16	24	32	40	48	56	64	72	80	88	96	104	112	120
18	27	36	45	54	63	72	81	90	99	108	117	126	135
20	30	40	50	60	70	80	90	100	110	120	130	140	150
22	33	44	55	66	77	88	99	110	121	132	143	154	165
24	36	48	60	72	84	96	108	120	132	144	156	168	180
26	39	52	65	78	91	104	117	130	143	156	169	182	195
28	42	56	70	84	98	112	126	140	154	168	182	196	210
30	45	60	75	90	105	120	135	150	165	180	195	210	225

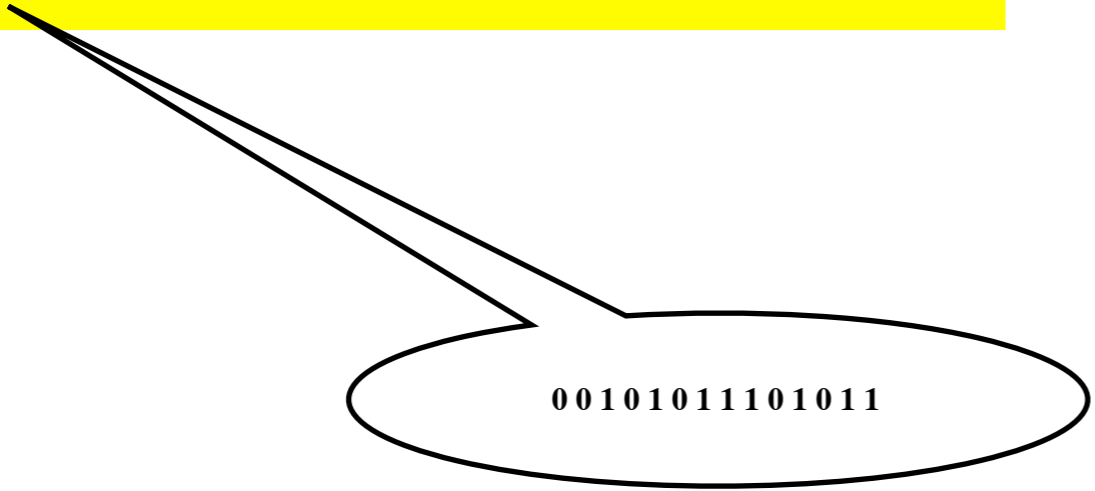
# First Primes

flatten with ravel



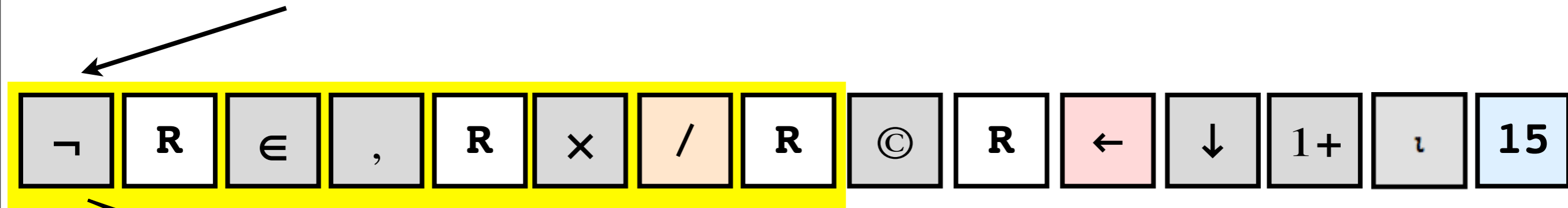
# First Primes

find members of R in products



# First Primes

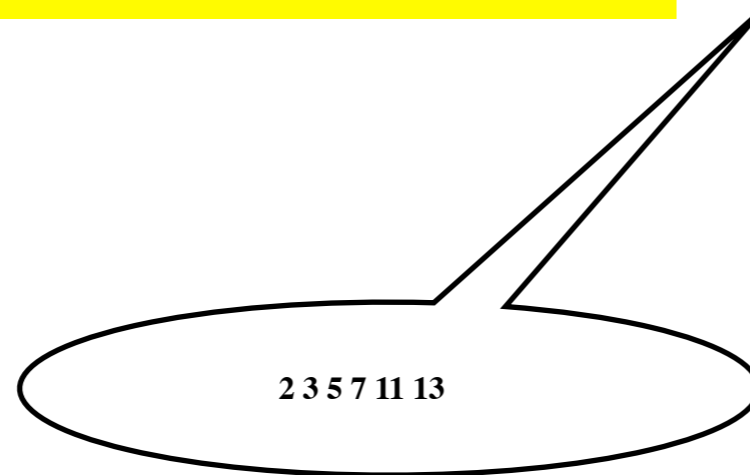
want members not in products so negate



11010100010100

# First Primes

select members not in products from R



# First Primes

$\neg$  R  $\in$  , R  $\times$  / R  $\odot$  R  $\leftarrow$   $\downarrow$  1+  $\wr$  15

2 3 5 7 11 13

## Examples without variable

```
((¬°(⊢ ∈ ,°(⊢ ×/ ⊢))) ⊙ ⊢) ↓ 1+ ∓ 15  
or in ascii J:  
((-.@:(⊂ e. ,@:(⊂ */ ⊂))) # ⊂) }. >: i. 100
```

# Remember those grooves



# I love APL, J and K but...

- It can look a bit “alien”
- Learning it is a bit prickly
- But it really will expand your brain!





# But can we escape the mother of all ruts?

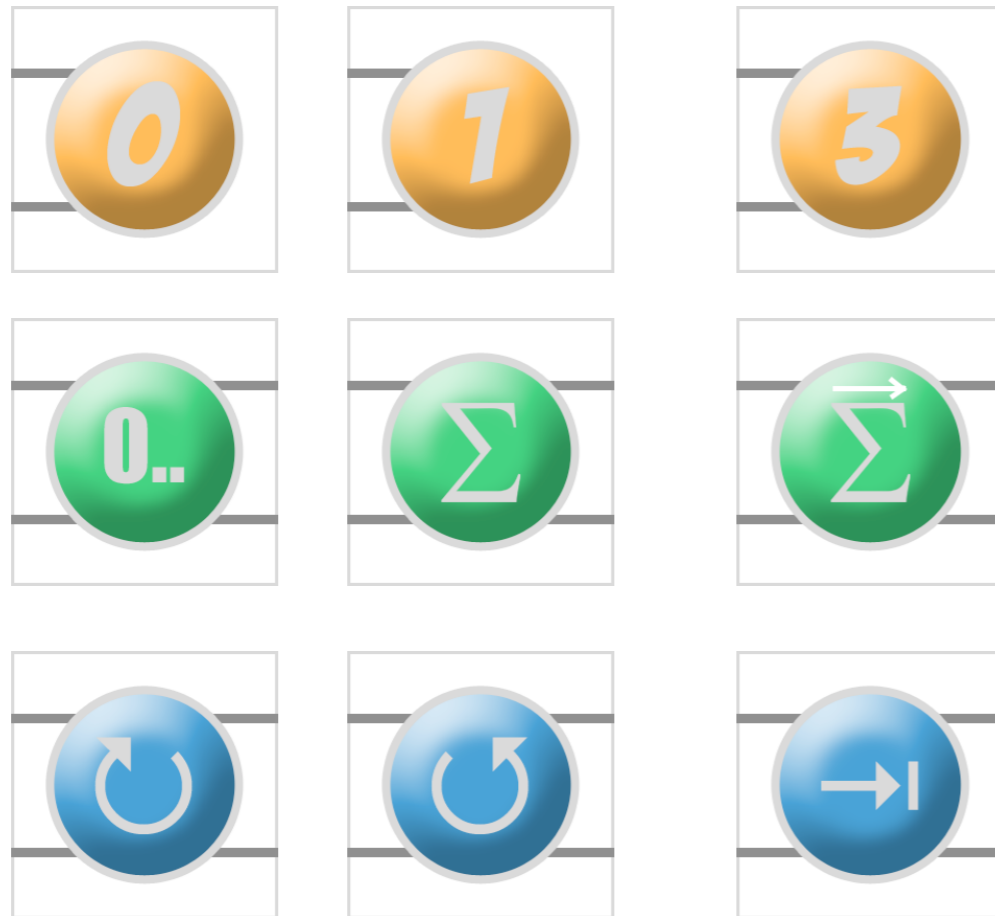


$$v_{\text{escape}} = 11.2 \text{ km/s}$$
$$\frac{1}{2}mv^2 = \frac{GMm}{r}$$
$$v_{\text{escape}} = \sqrt{\frac{2GM}{r}}$$

```
Terminal — bash — 80x24
bash
Last login: Fri Aug 12 12:10:40 on ttys000
~ dleibs$
```



# Candy colored tiles?

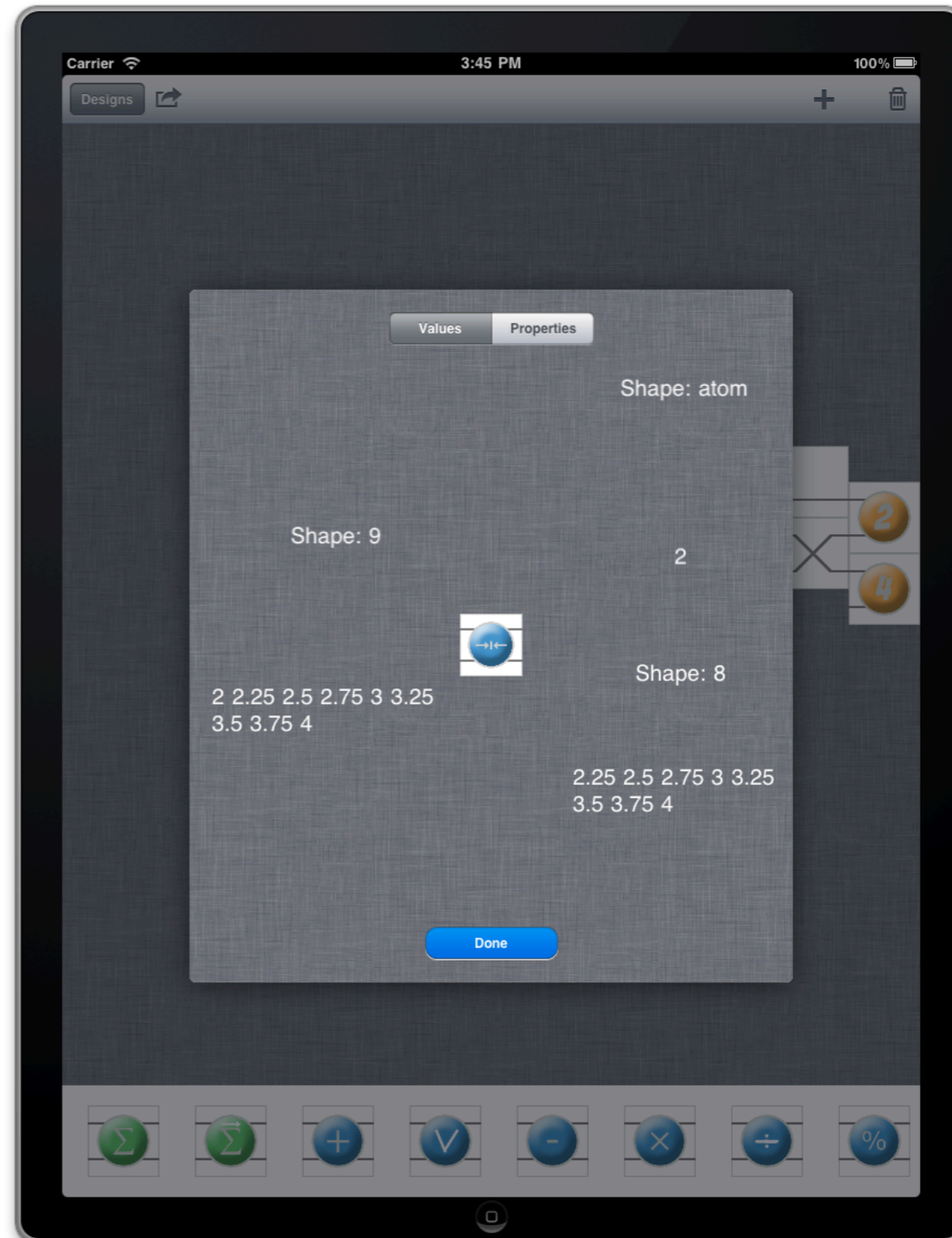
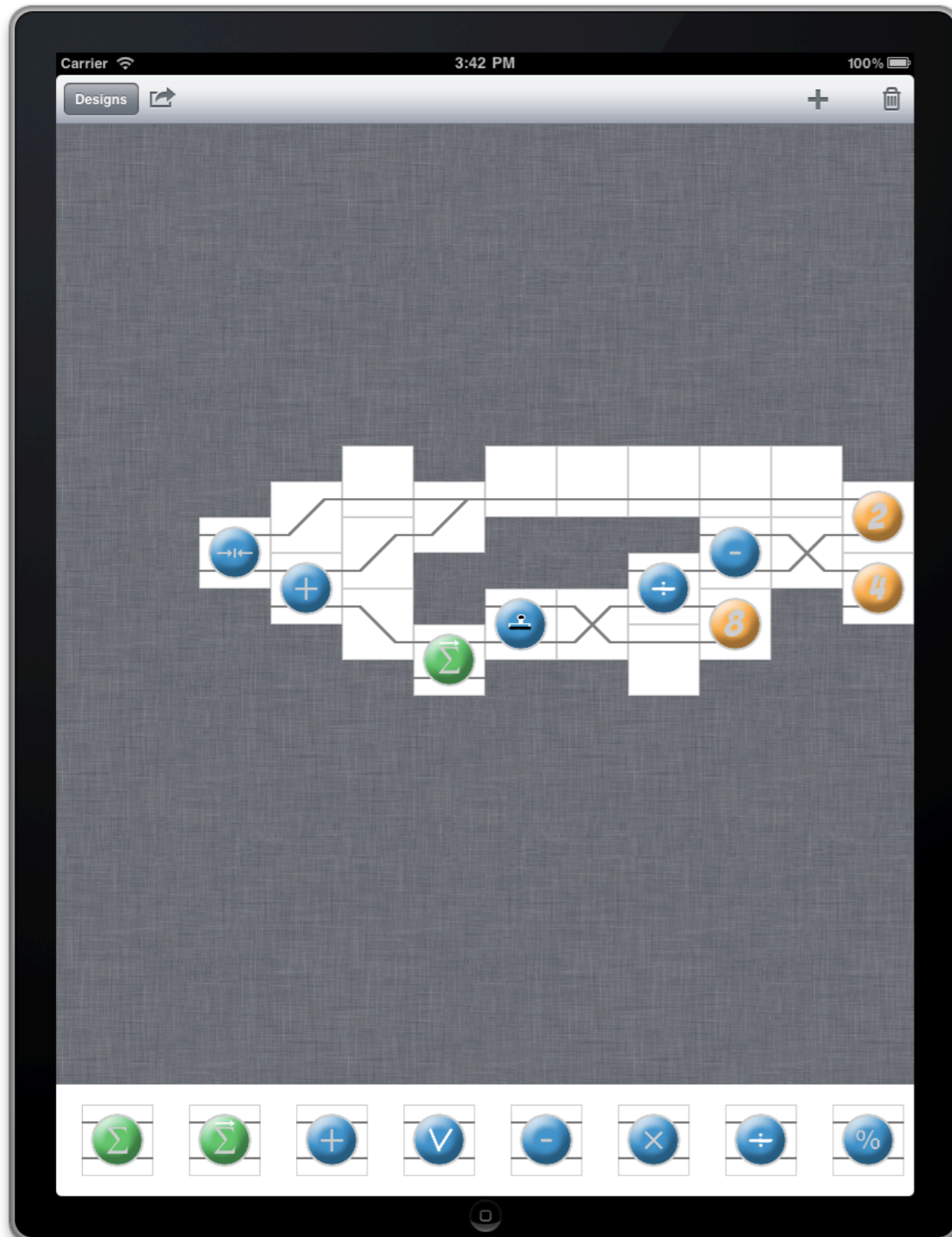


and an iPad App

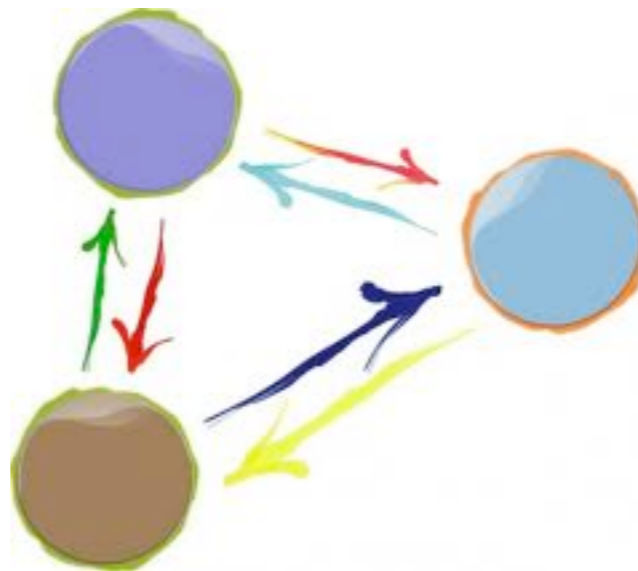




# Data Flow Puzzle Game?



# Some Interaction Ideas



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Carrier

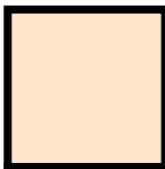
Pretend this is an iPad



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Carrier

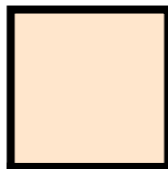




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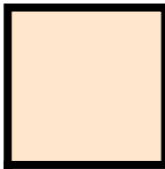
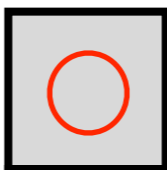
Carrier



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Carrier

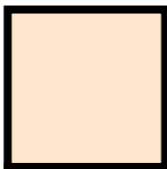
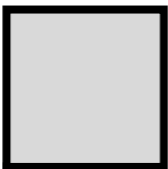
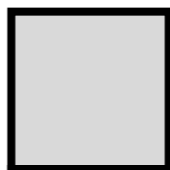




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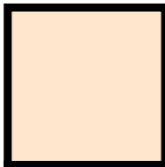
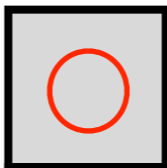
Carrier



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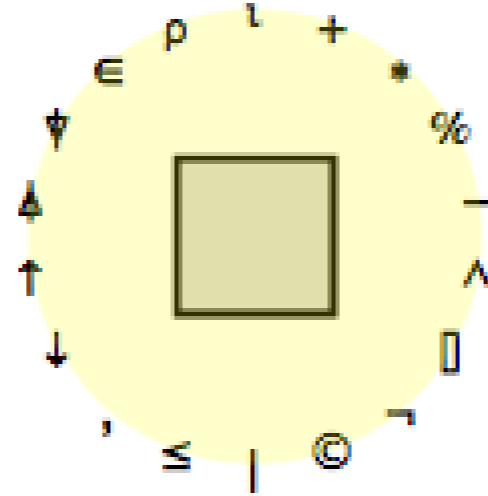
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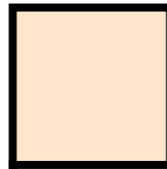
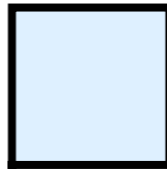
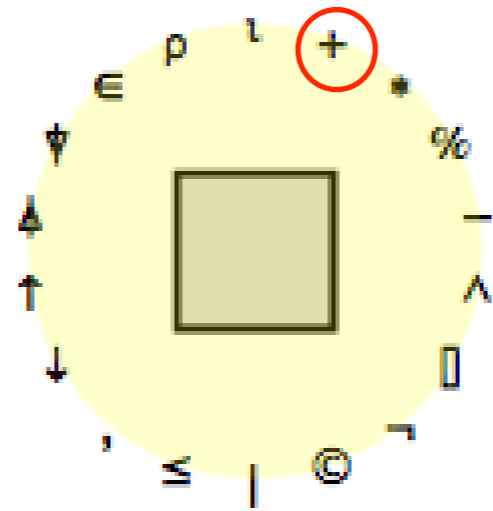
Carrier



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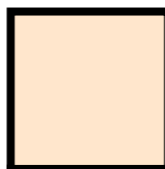
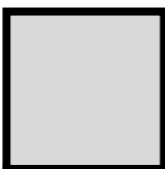
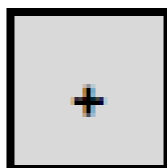
Carrier



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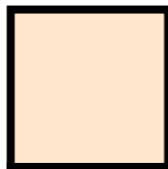
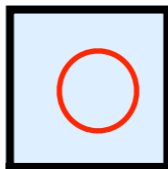
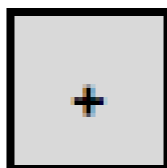
Carrier



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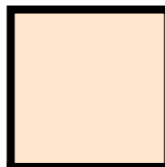
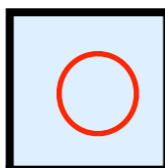
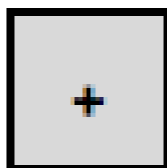
Carrier



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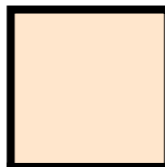
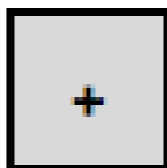
Carrier



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Carrier

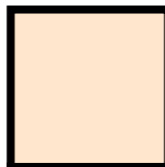
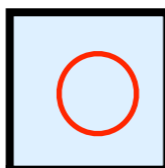
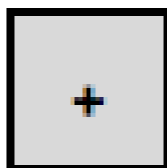




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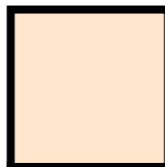
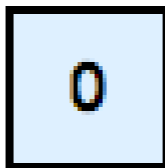
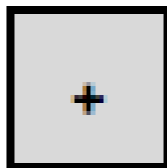
Carrier



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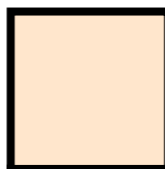
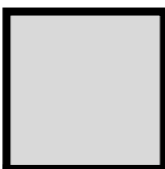
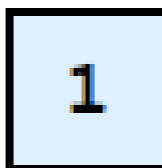
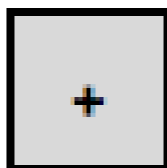
Carrier



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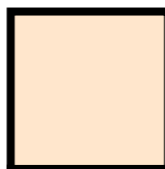
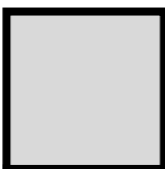
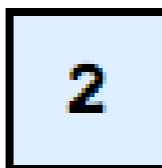
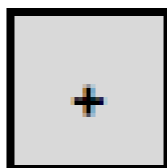
Carrier



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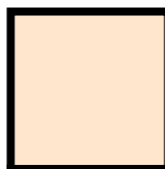
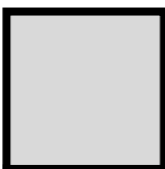
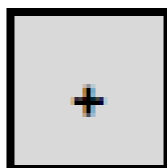
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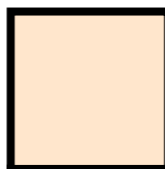
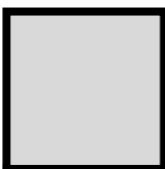
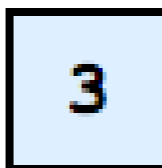
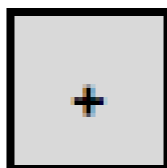
Carrier



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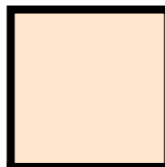
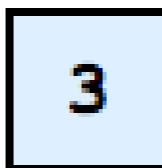
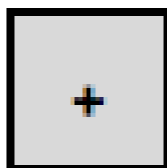
Carrier



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Carrier



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$$0 + 3$$

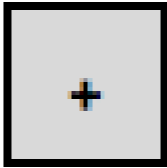
Carrier

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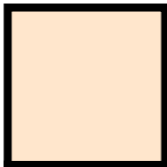
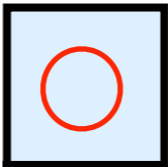
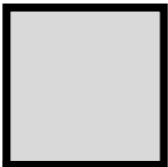


100%

9:16 AM



Carrier



100%

9:16 AM

Carrier

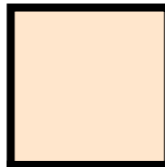
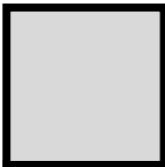


0

+

3

3



100%

9:16 AM

Carrier

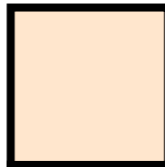


4

+

3

7



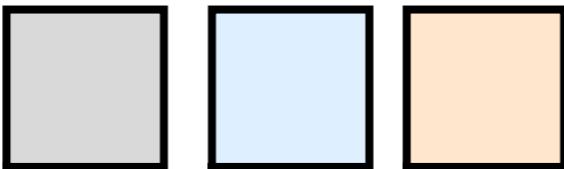
100%

9:16 AM

Carrier

7

$$4 + 3$$



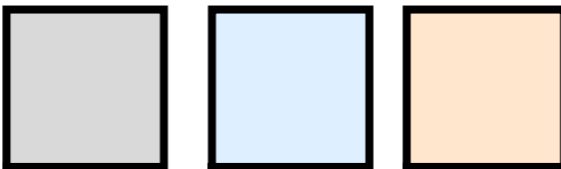
100%

9:16 AM

7

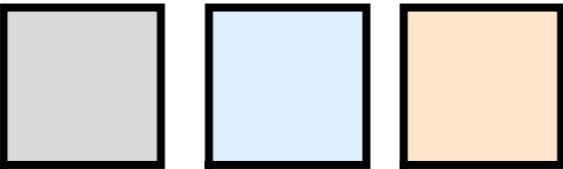
$$4 + 3$$

Carrier



7

$$4 + 3$$



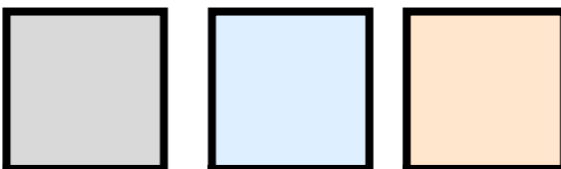
100%

9:16 AM

Carrier

8

$$4 + 4$$



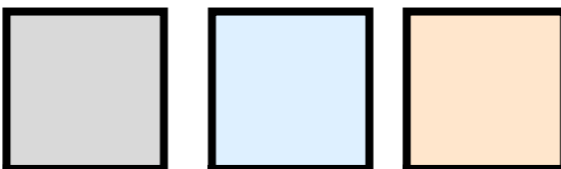
100%

9:16 AM

Carrier

8

$$4 + 4$$





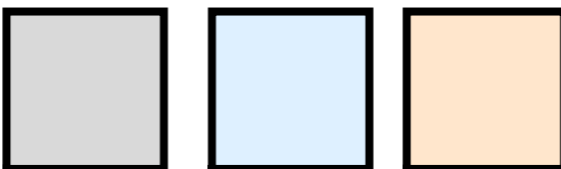
100%

9:16 AM

Carrier

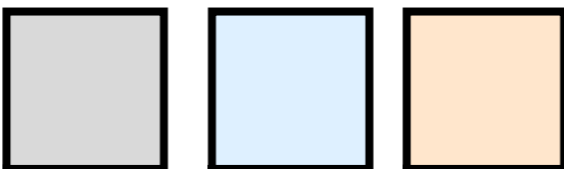
8

$$4 + 4$$



8

$$4 + 4 = 4$$



8 8

4 + 4 4

Grey square, Blue square, Orange square

8 8

4 + 4 4

8 8

4 4 + 4 4

□ □ □

8 8

4 4 + 4 4

Grey square, Light blue square, Orange square

8 8

4 4 + 4 4

□ □ □



5 4 + 4 4

9 8

Grey square, Light blue square, Orange square



9 8

$$54 + 44$$

Grey square, Light blue square, Orange square

100%

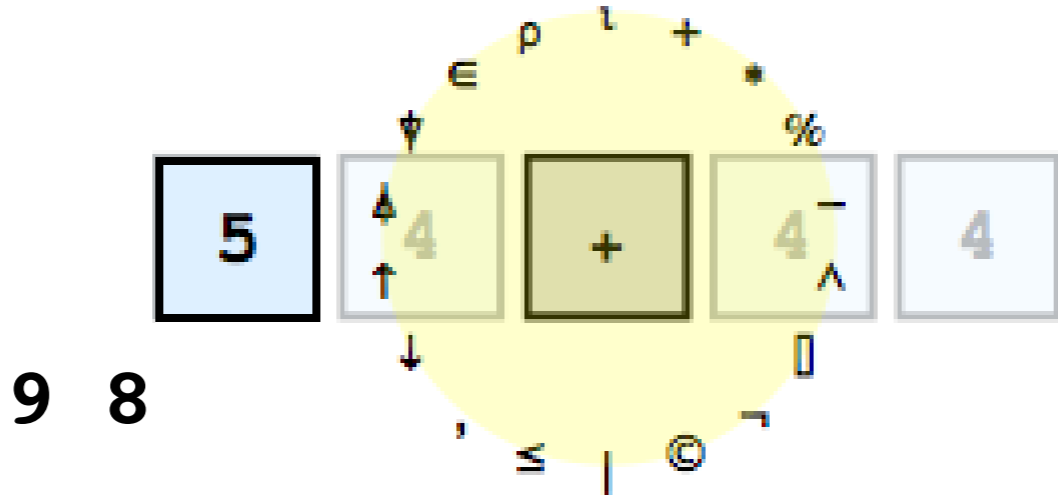
9:16 AM

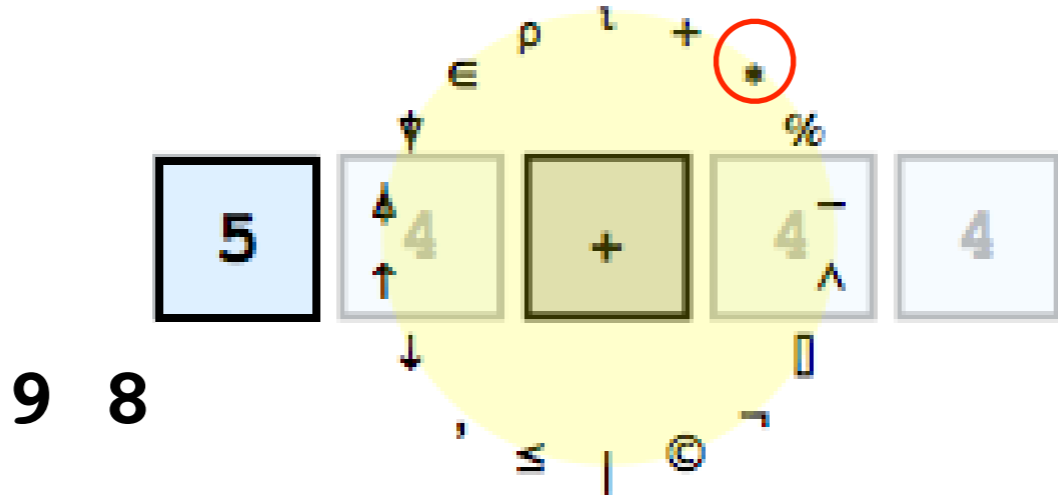
9 8

5 4 + 4 4

Carrier

Legend: Gray, Light Blue, Orange

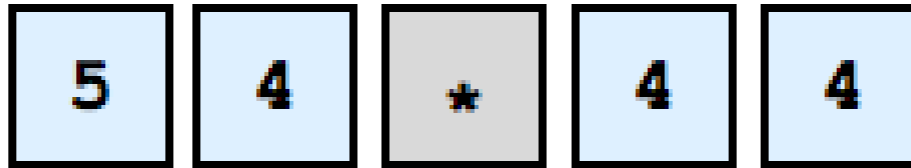




100%

9:16 AM

20 16



Carrier



100%

9:16 AM

5 4 \* 4 4  
20 16

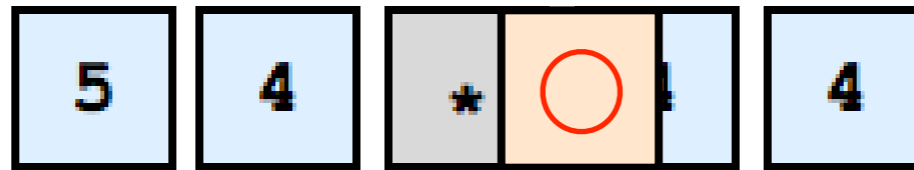
Carrier



100%

9:16 AM

20 16

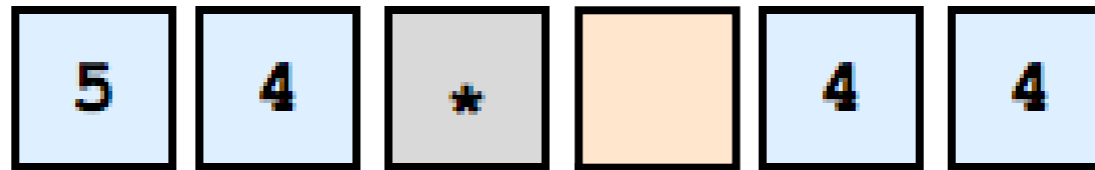


Carrier

100%

9:16 AM

20 16



Carrier



100%

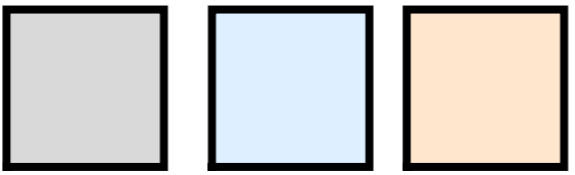
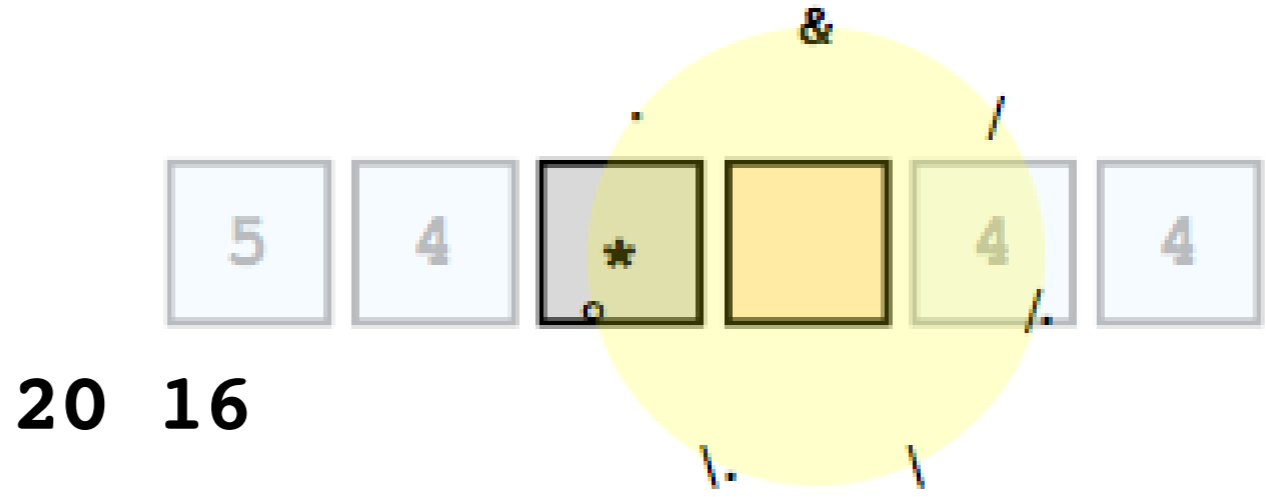
9:16 AM

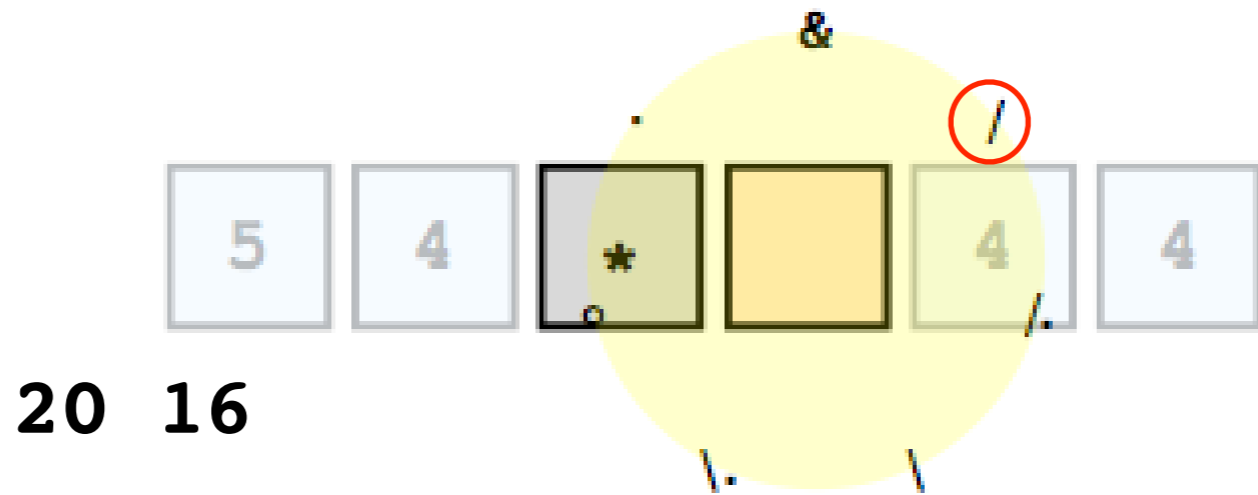
20 16

5 4 \* ○ 4 4

Carrier







100%

9:16 AM

5 4 \* / 4 4  
20 20  
16 16

Carrier



100%

9:16 AM

5 4 \* / 4 4  
20 20  
16 16

Carrier



5 4 \* / 4 4 4

20 20 20

16 16 16

□ □ □

100%

9:16 AM

Carrier

5 4 \* / 4 4 4

20 20 20

16 16 16

□ □ □

5 4 \* / 4 4 4

20 20 20

16 16 16

□ □ □



5 4 \* / 4 4 3



20 20 15  
16 16 12

Legend: [Grey box] [Blue box] [Orange box]

100%

9:16 AM

Carrier

5 4 \* / 4 4 3

20 20 15

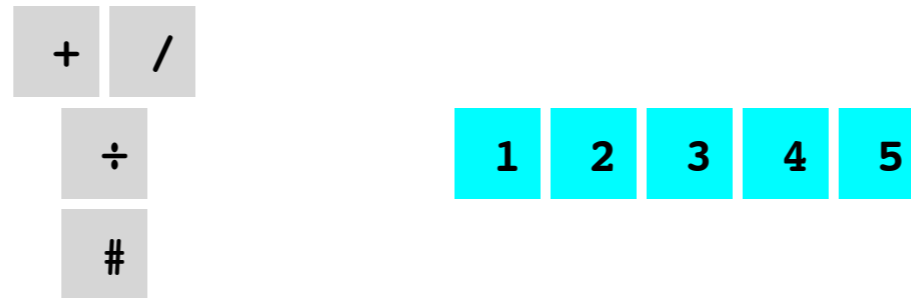
16 16 12

□ □ □

# Animation Ideas



# Arithmetic Mean



# Arithmetic Mean

/

÷

#

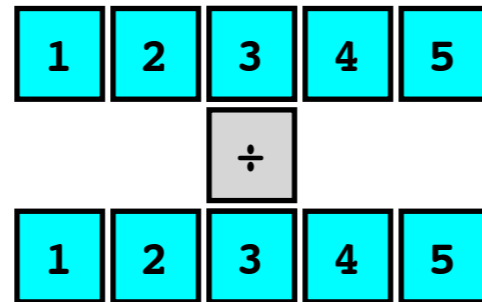
1 2 3 4 5

# Arithmetic Mean

$$\frac{\sum}{\div} \#$$

1 2 3 4 5

# Arithmetic Mean



# Arithmetic Mean

$$\frac{15}{5}$$



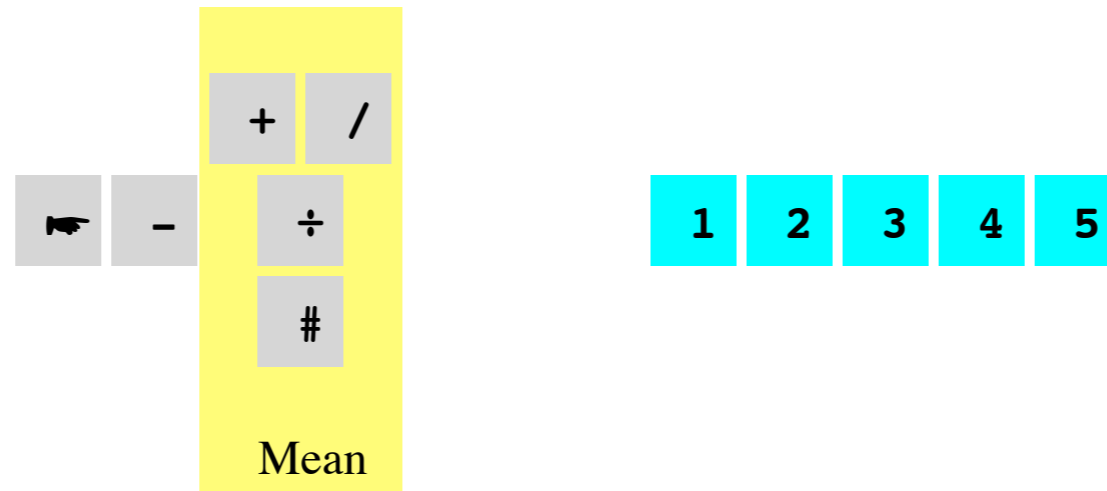
# Arithmetic Mean

5

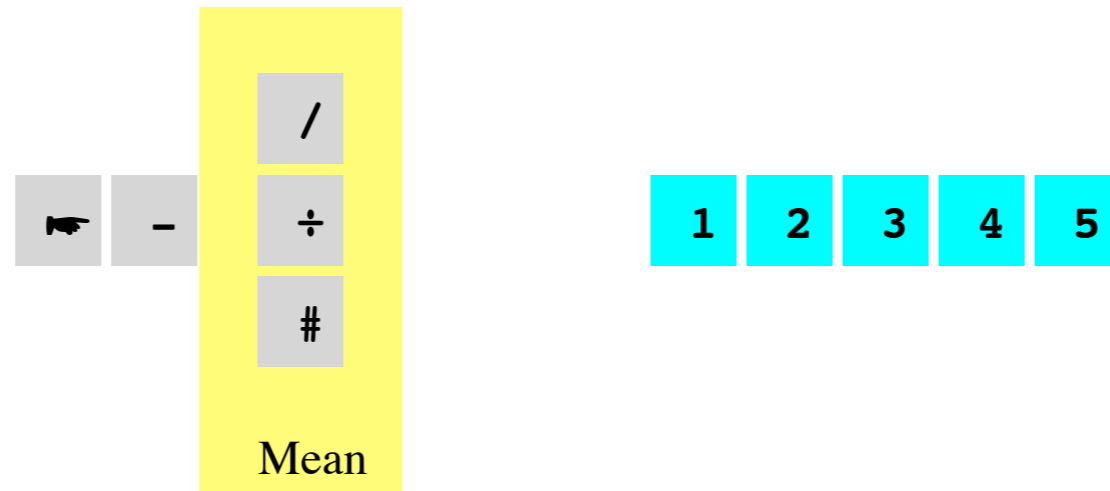
# Arithmetic Mean

3

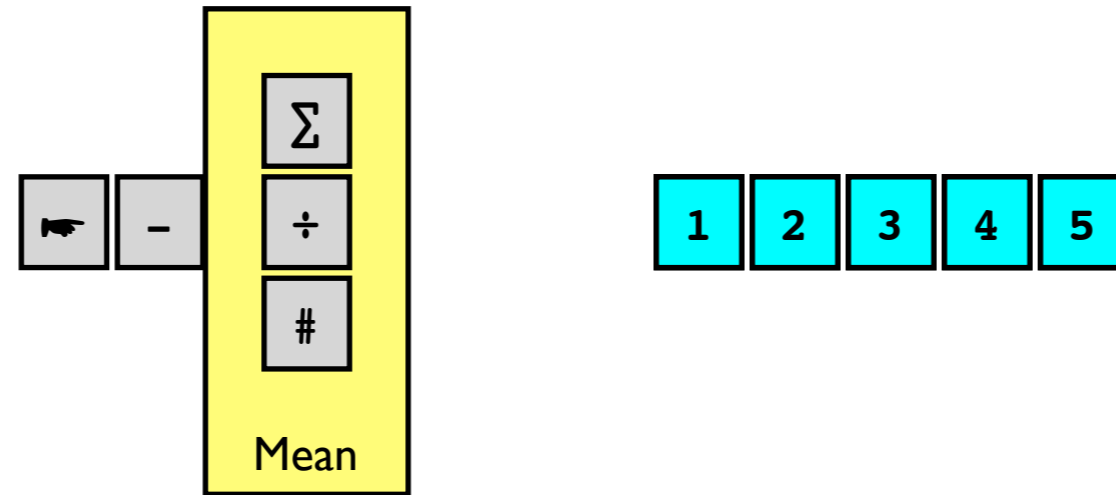
# Deviation



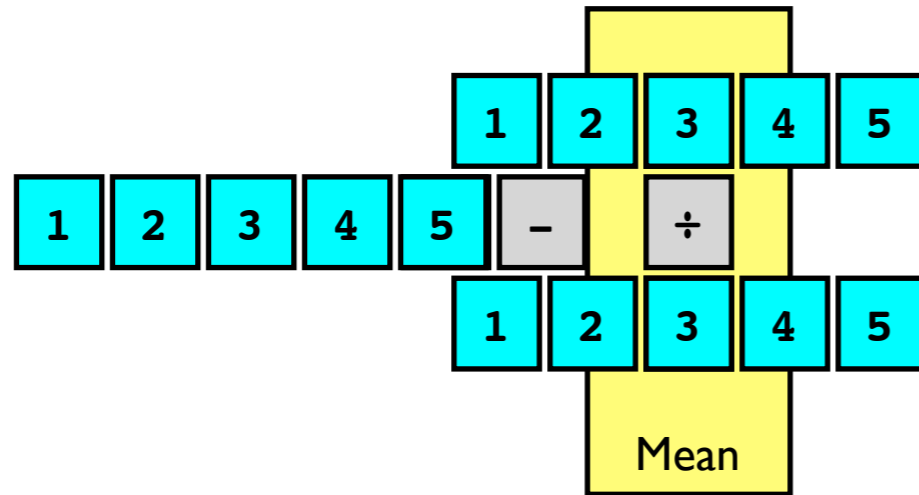
# Deviation



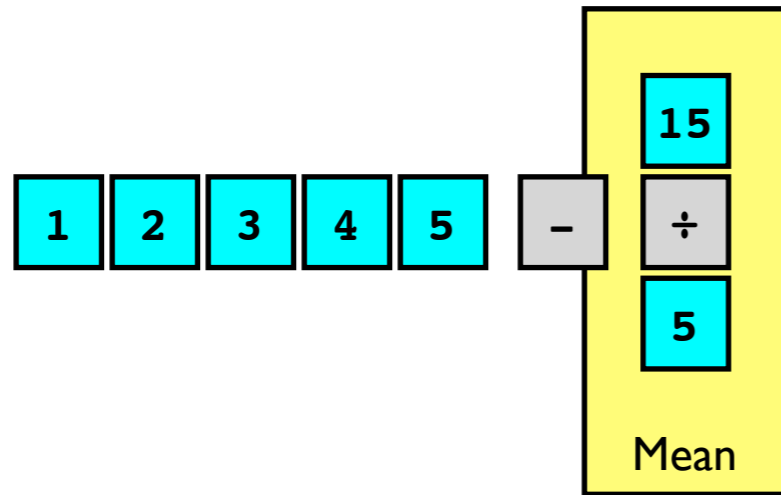
# Deviation



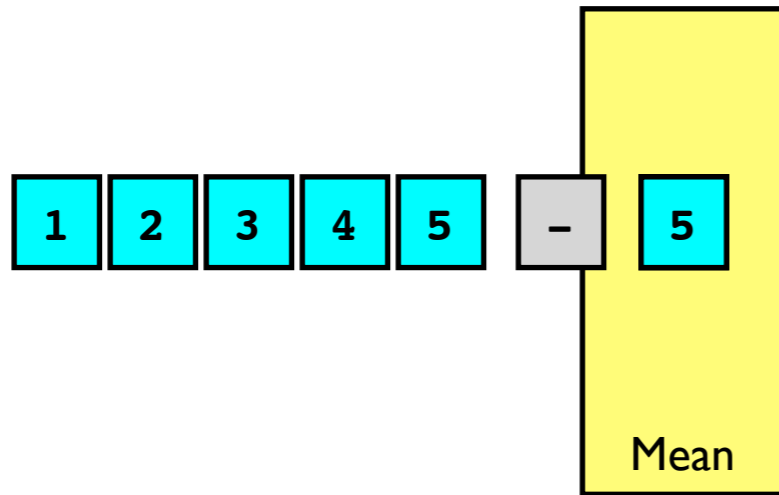
# Deviation



# Deviation



# Deviation





# Deviation

1 2 3 4 5 - 3

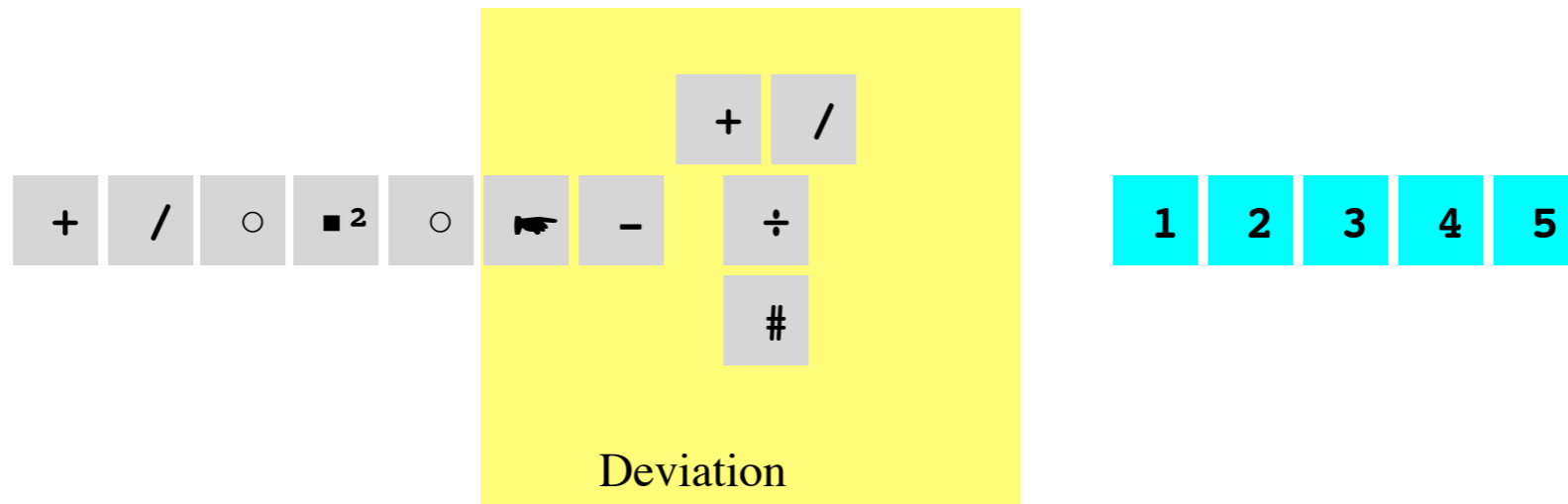
# Deviation

1 2 - 4 5

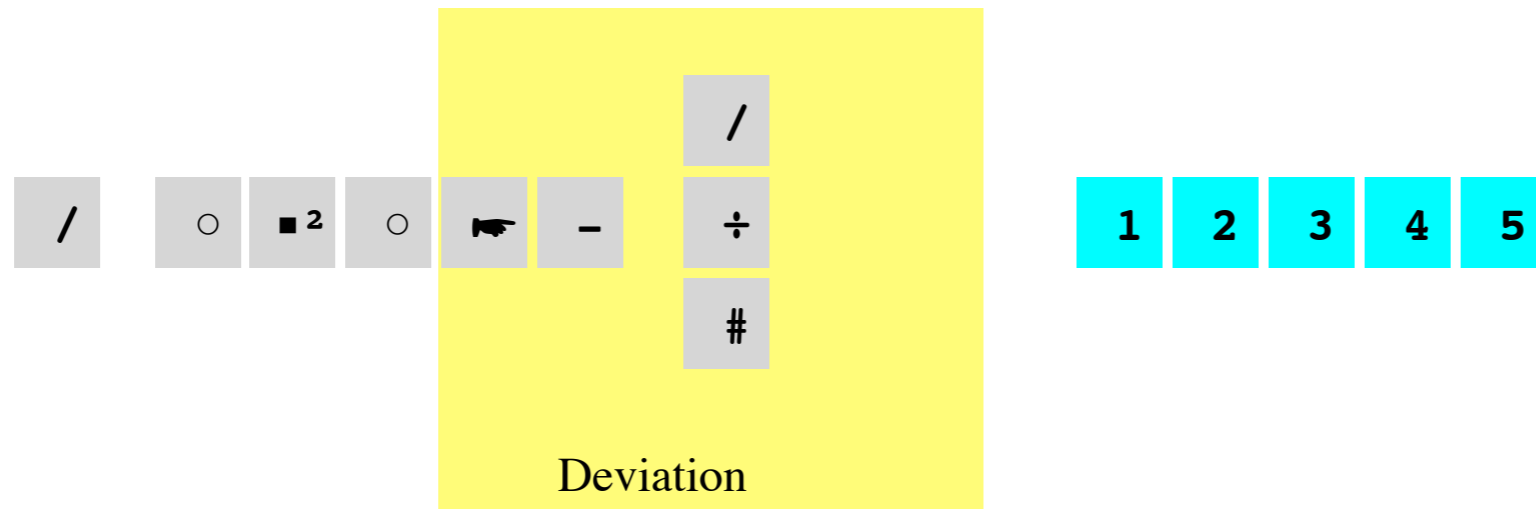
# Deviation

-2	-1	0	1	2
----	----	---	---	---

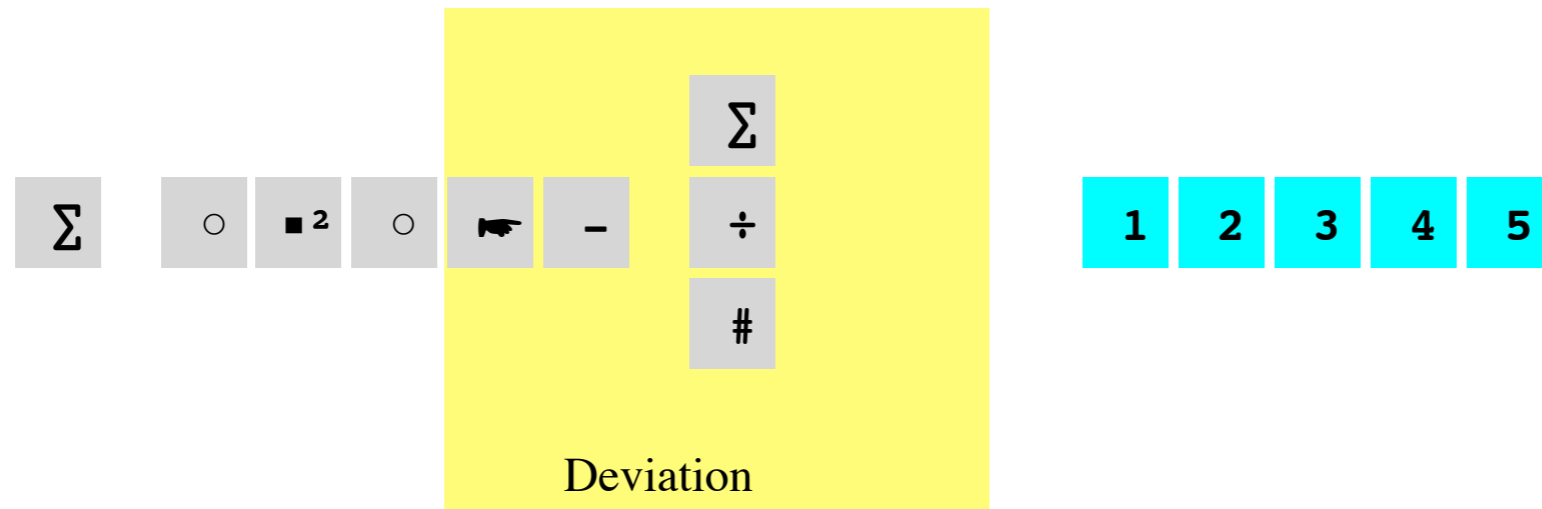
# Sum of Squared Deviation



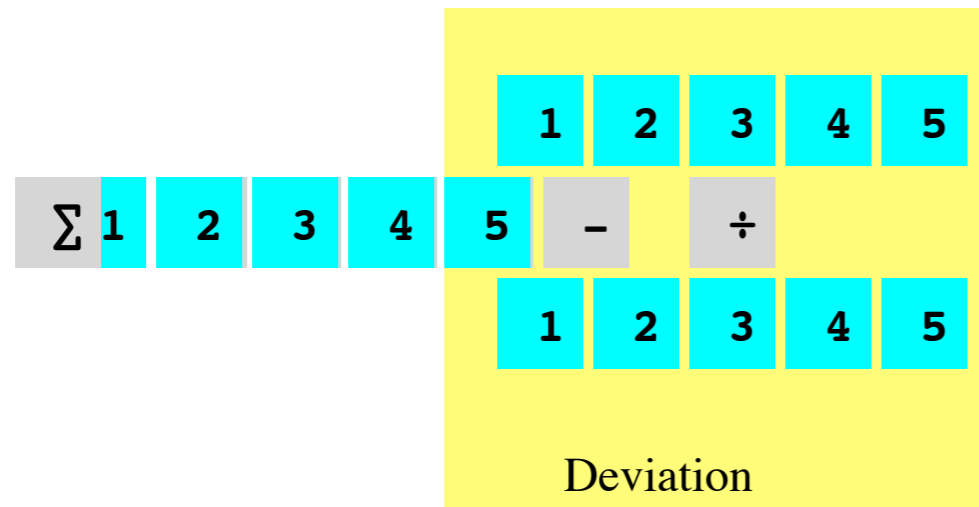
# Sum of Squared Deviation



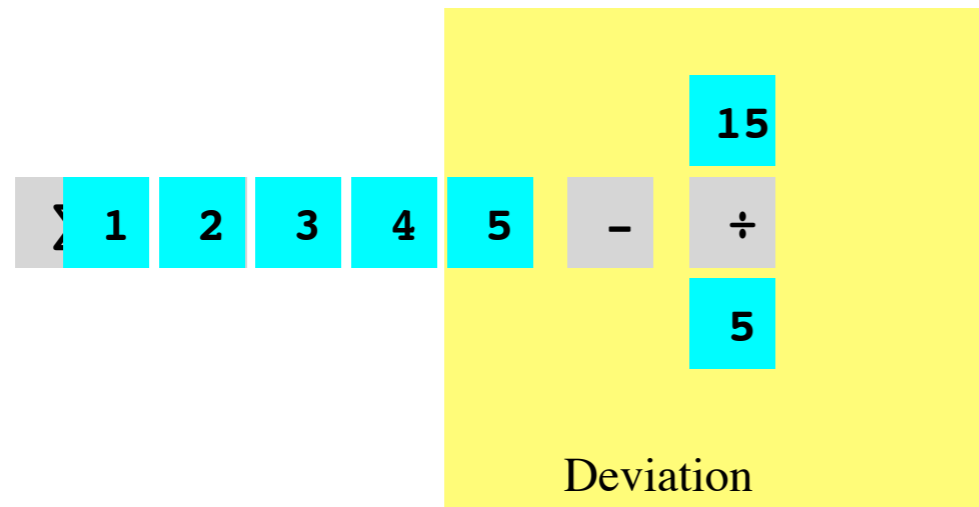
# Sum of Squared Deviation



# Sum of Squared Deviation

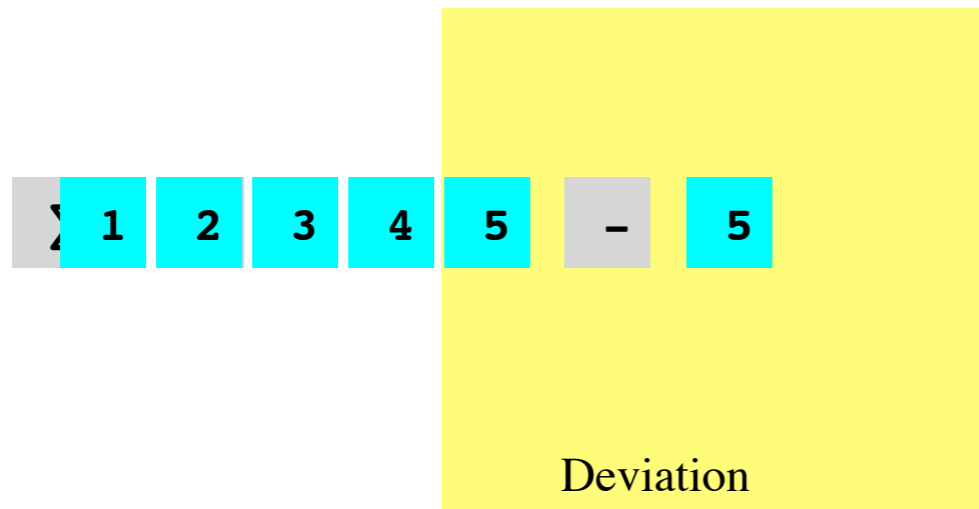


# Sum of Squared Deviation

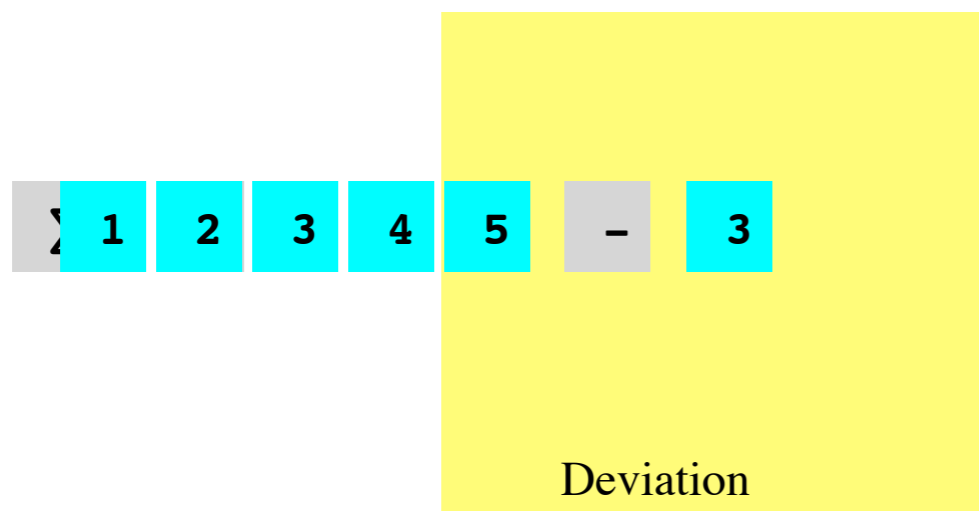




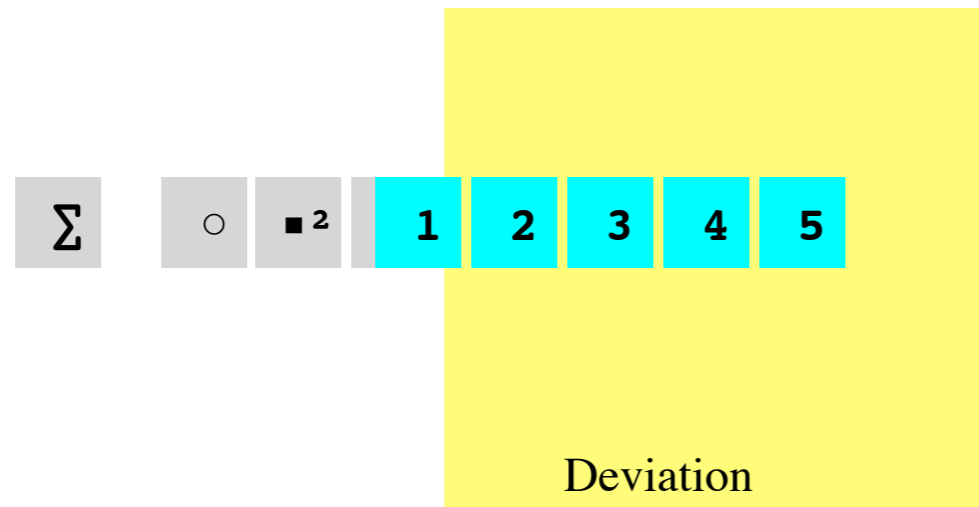
# Sum of Squared Deviation



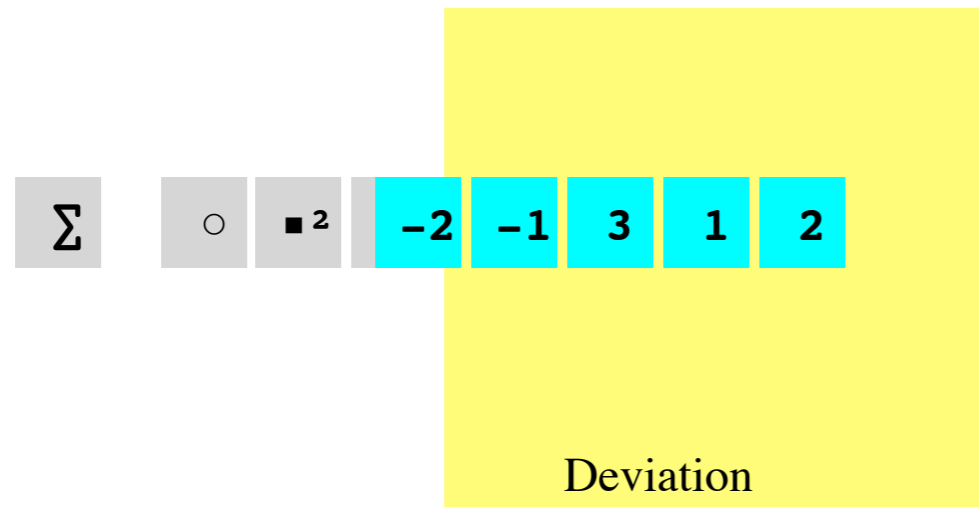
# Sum of Squared Deviation



# Sum of Squared Deviation



# Sum of Squared Deviation



# Sum of Squared Deviation

$$\sum \circ \blacksquare^2 \quad -2 \quad -1 \quad 3 \quad 1 \quad 2$$

# Sum of Squared Deviation

$$\sum \begin{matrix} -2 & -1 & 3 & 1 & 2 \end{matrix}$$

# Sum of Squared Deviation

$$\sum 4 \quad 1 \quad 9 \quad 1 \quad 2$$

# Sum of Squared Deviation

$$4 \quad 1 \quad \Sigma \quad 1 \quad 2$$

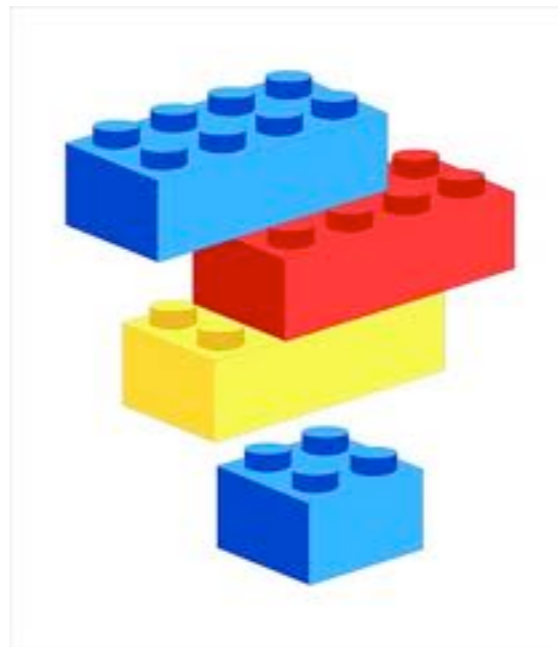


# Sum of Squared Deviation

15

178

A tangible futuristic idea



# We start with tangibles





# Carving a new groove





# Getting off the computer and down on the floor





# Lifting to the digital domain





# Lifting to the digital domain



# Lifted





# Resources

J

<http://www.jsoftware.com>

<http://www.jsoftware.com/help/jforc/contents.htm>

Notation as a Tool of Thought

<http://www.jsoftware.com/papers/tot.htm>

K and Q

<http://kx.com>

<http://code.kx.com/wiki/KB:QforMortals2/contents>

APL

<http://www.dyalog.com>

<http://www.dyalog.com/MasteringDyalogAPL/MasteringDyalogAPL.pdf>

The Cow

<http://www.visionarts.ca/photoillusion.htm>