

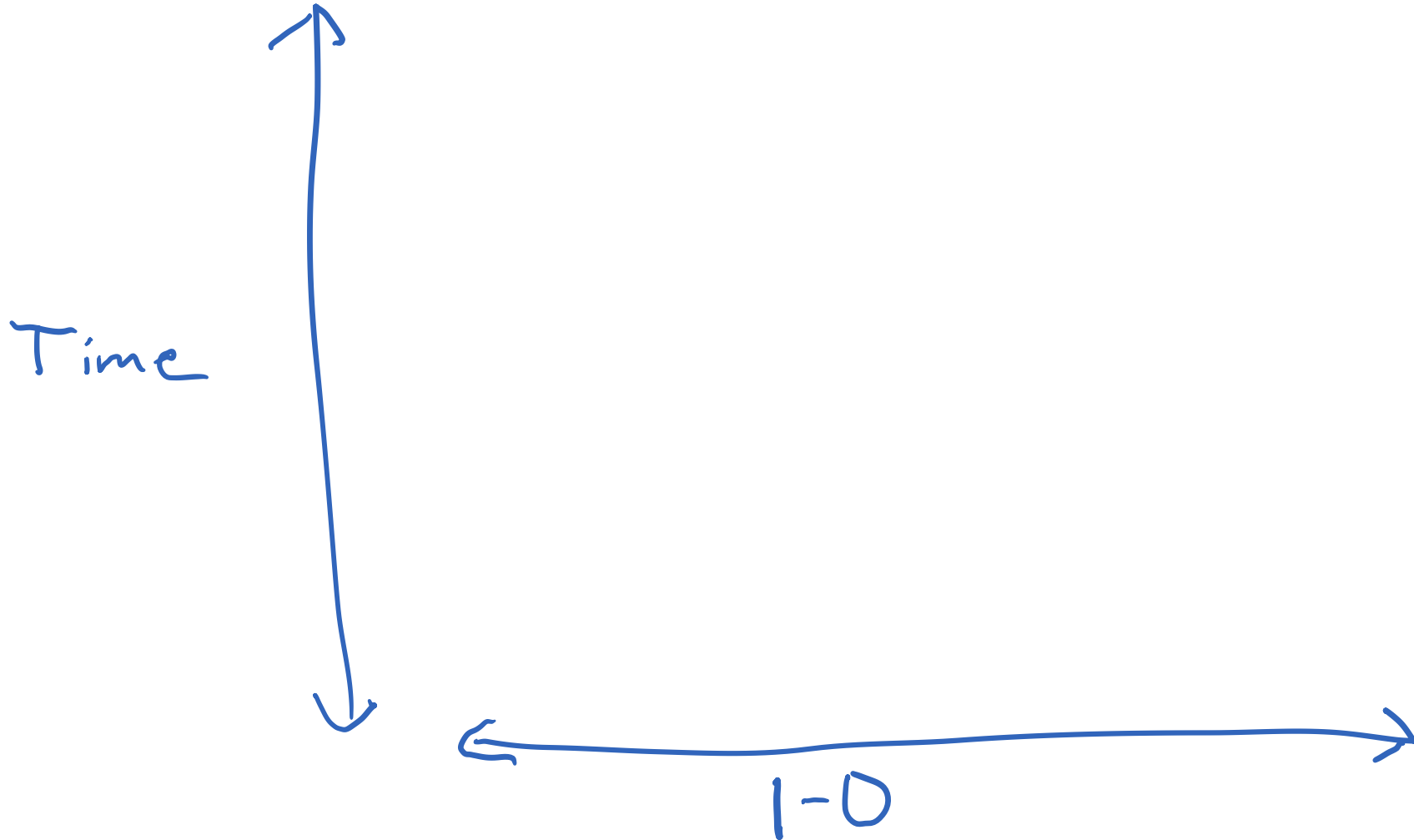
The Geometry of Data Structures

John Iacono

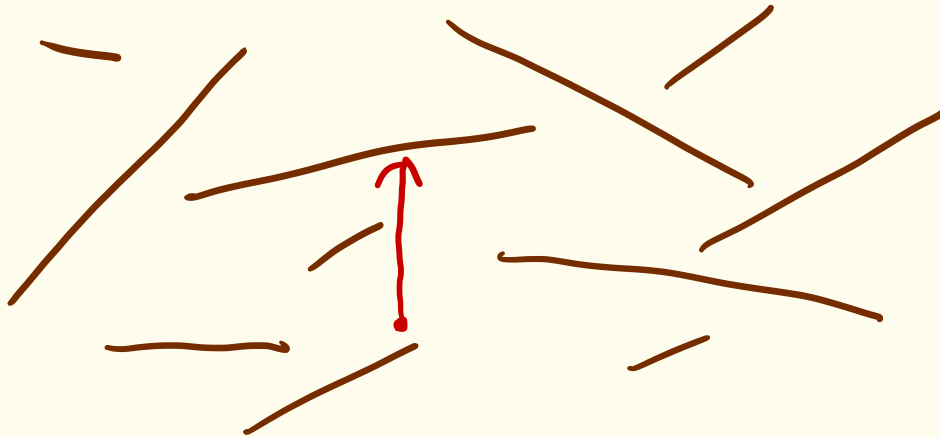
Université Libre
de Bruxelles

1-D Data Structure + Time = 2D

1-D Data Structure + Time = 2D

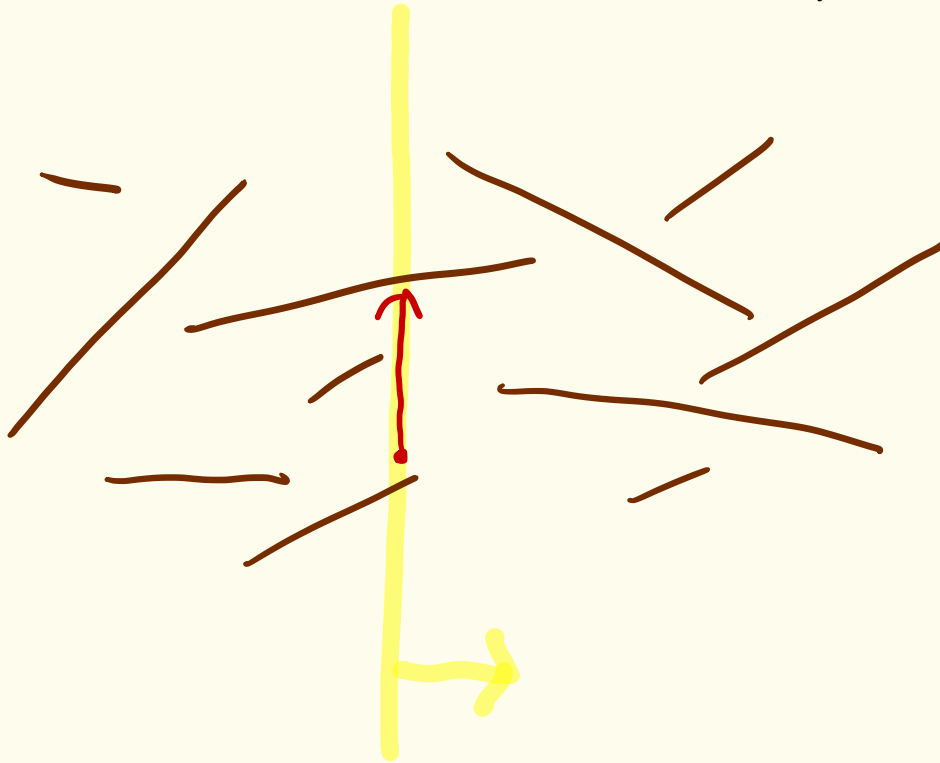


Classic example: Line Sweep



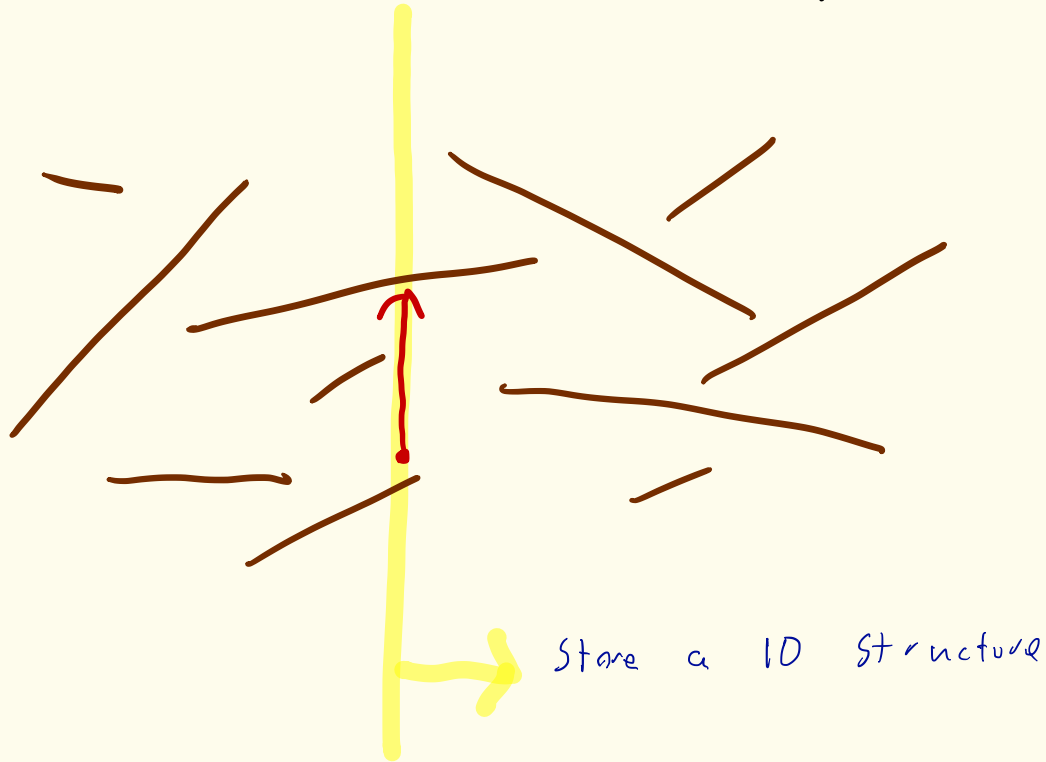
Persistent search Trees [Sarnak + Tarjan 86]

Classic example: Line Sweep



Persistent search Trees [Sarnack + Turjan 86]

Classic example: Line Sweep



Persistent search Trees [Sarnak + Turjan 86]

Line Sweep: Use 1-D "standard" Data Structures to solve geometric problems

Here: Use 2D geometry to solve "standard" data structure problems

Why?

Why?

- Can simplify
- Can see things that would be hard to see otherwise
- Can use standard geometric tools and intuition

OUTLINE

- Binary Search Trees

≡ Persistent Cache-Oblivious

≡ Forbidden Submatrices
and friends

Part

—

Binary. Search Trees

Part — Binary Search Trees

Many collaborators

P.J. Bose

M.L. Fredman

E.D. Demaine

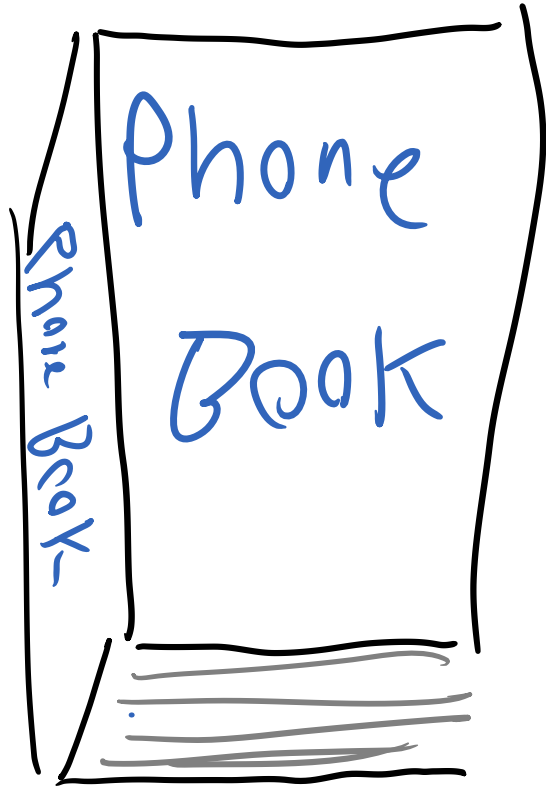
S. Langerman

M. Patrascu

D. Harman

1 8 7 8

1 8 7 8



How To Find a Name in a Phone Book

How To Find a Name in a Phone Book

- Method 1: Read it like a book

How To Find a Name in a Phone Book

- Method 1: Read it like a book

- Method 2: Look in the middle,
Throw away half the book

How To Find a Name in a Phone Book

- Method 1: Read it like a book

Phone Book Doubles in size: Twice as much time

- Method 2: Look in the middle,
Throw away half the book

Phone Book Doubles in size: One more lookup

How To Find a Name in a Phone Book

- Method 1: Read it like a book

Phone Book Doubles in size: Twice as much time

1000000 names \rightarrow 1000000 lookups

- Method 2: Look in the middle,

Throw away half the book

Phone Book Doubles in size: One more lookup

1000000 names \rightarrow 20 lookups

How To Find a Name in a Phone Book

- Method 1: Read it like a book

Phone Book Doubles in size: Twice as much time

1000000 names \rightarrow 1000000 lookups

- Method 2: Look in the middle,

Throw away half the book

Phone Book Doubles in size: One more lookup

1000000 names \rightarrow 20 lookups

BETTER

How about a Flow Chart?

Search in: A B C D E F G

How about a Flow Chart?

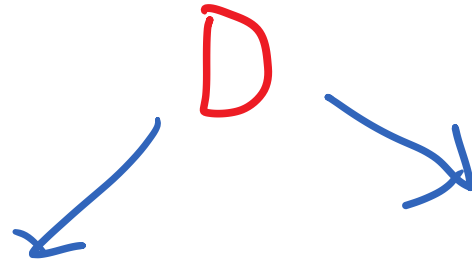
Search in: A B C D E F G



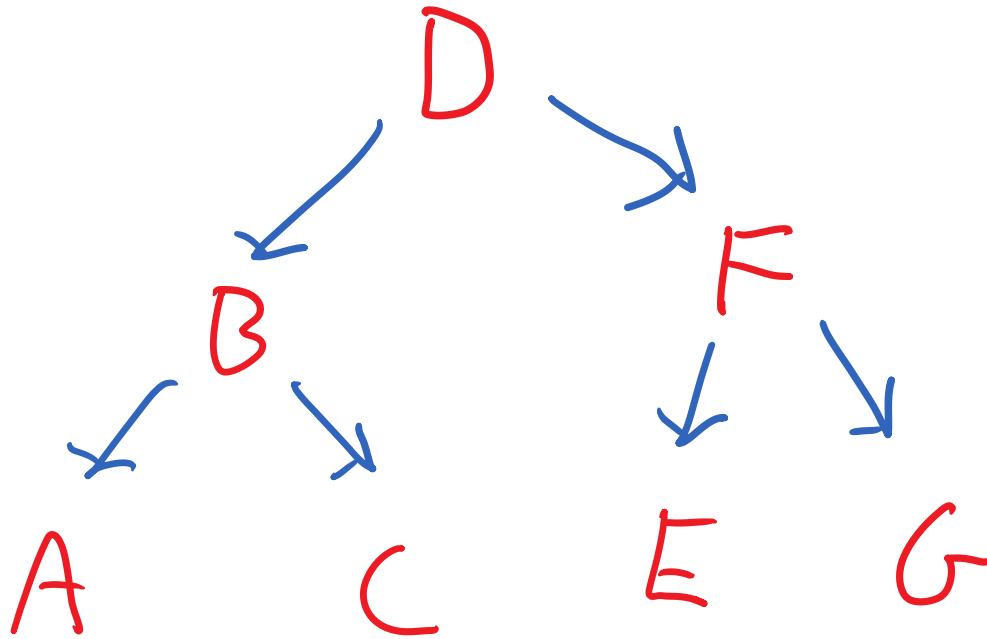
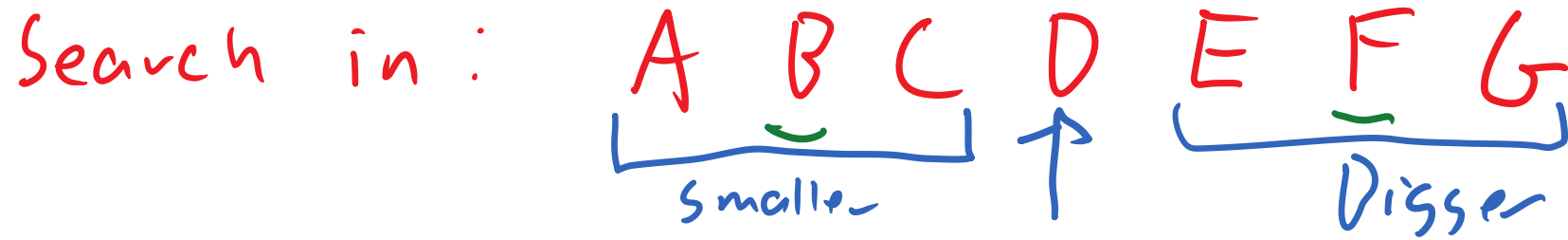
D

How about a Flow Chart?

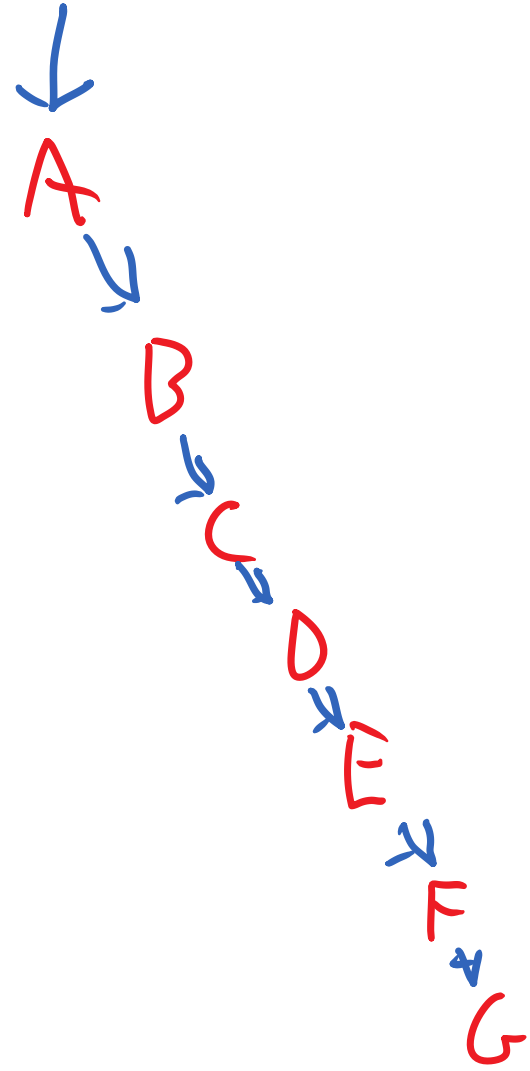
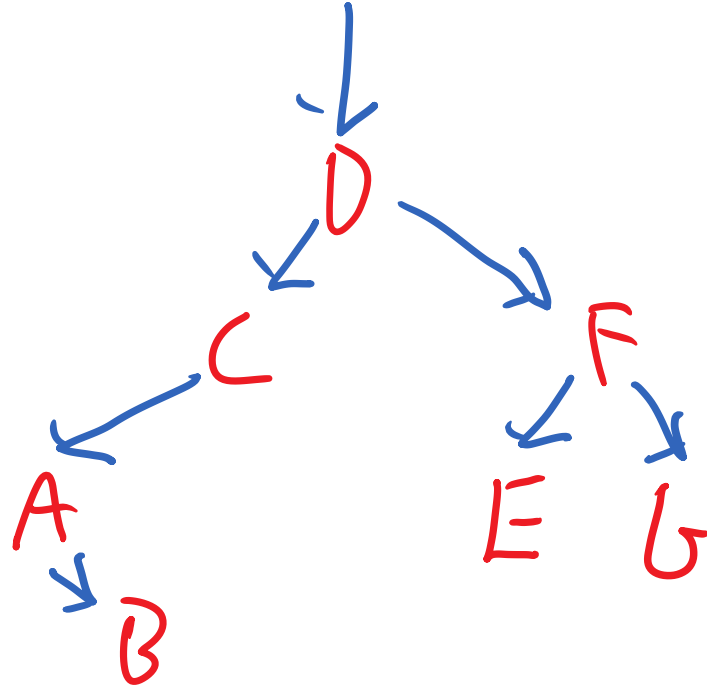
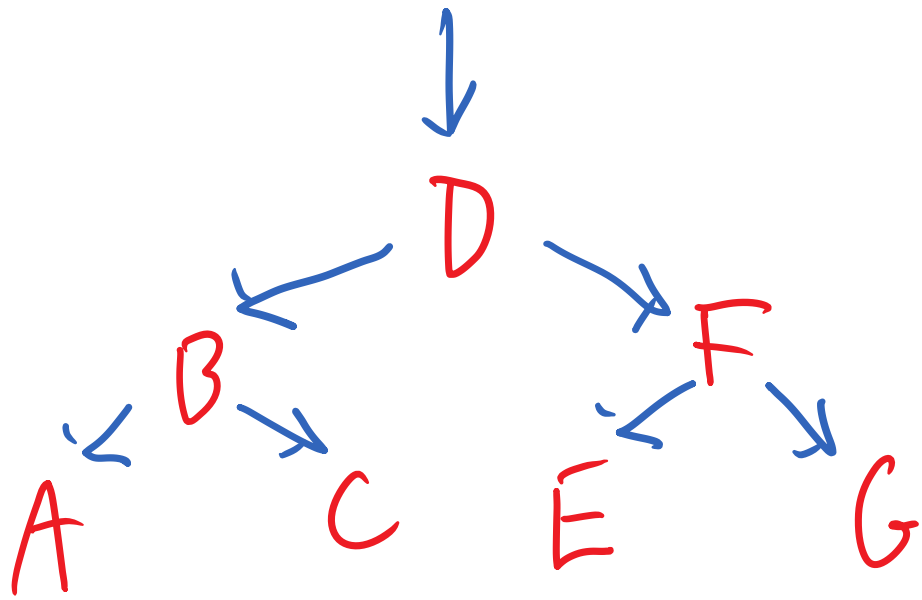
Search in: A B C D E F G
└───┬───┘ ↑ └───┬───┘
Smaller Bigger



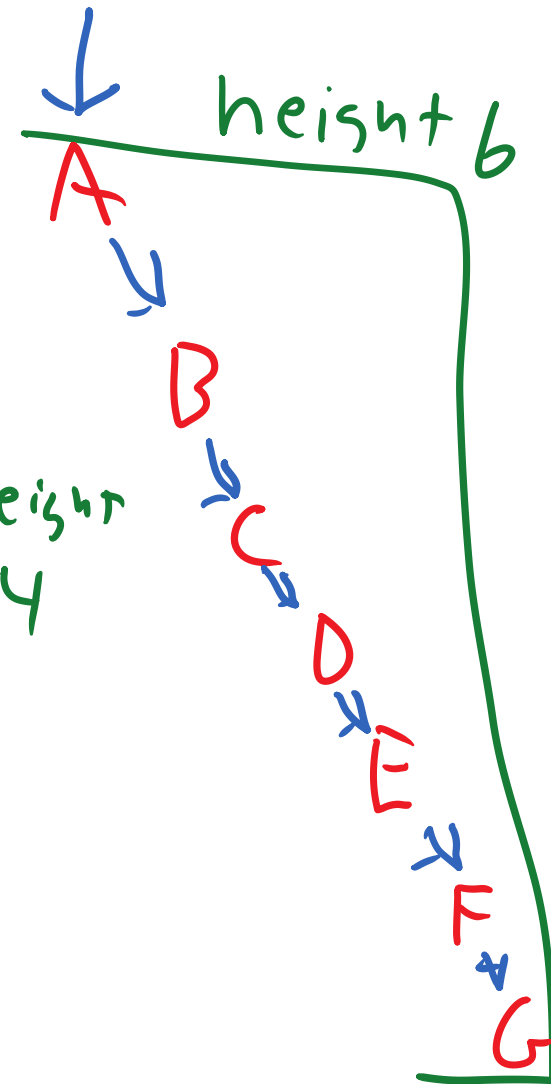
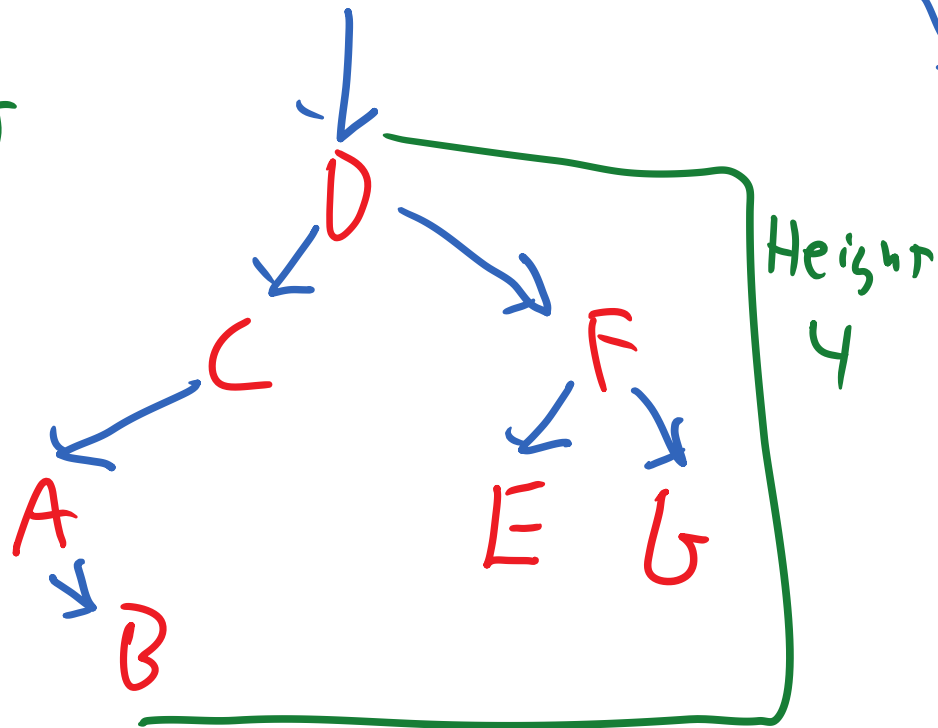
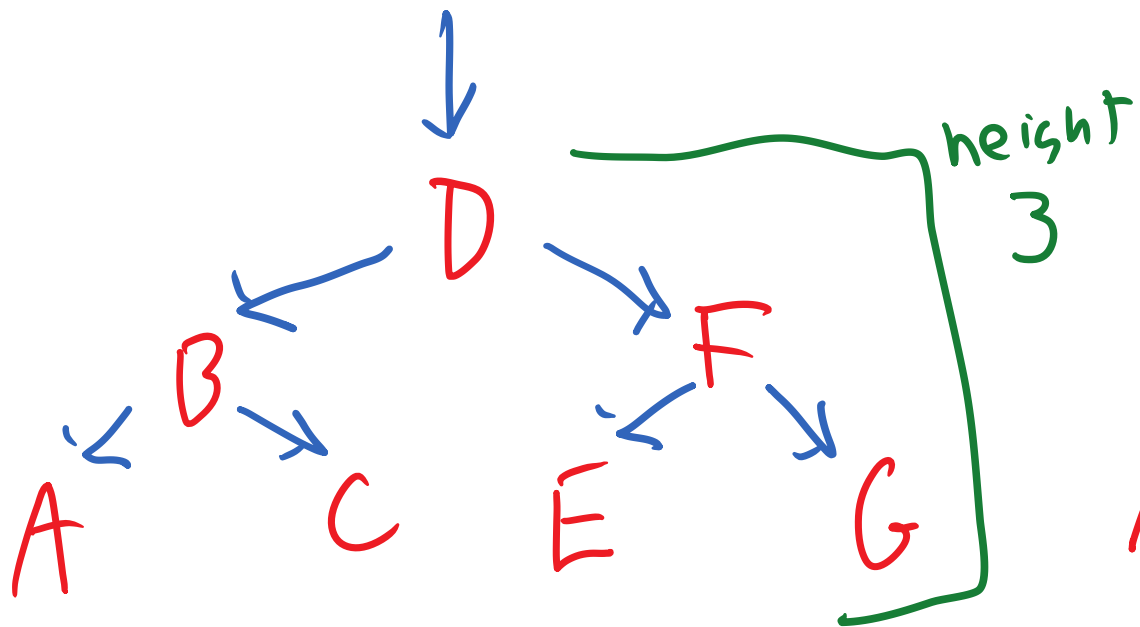
How about a Flow Chart?



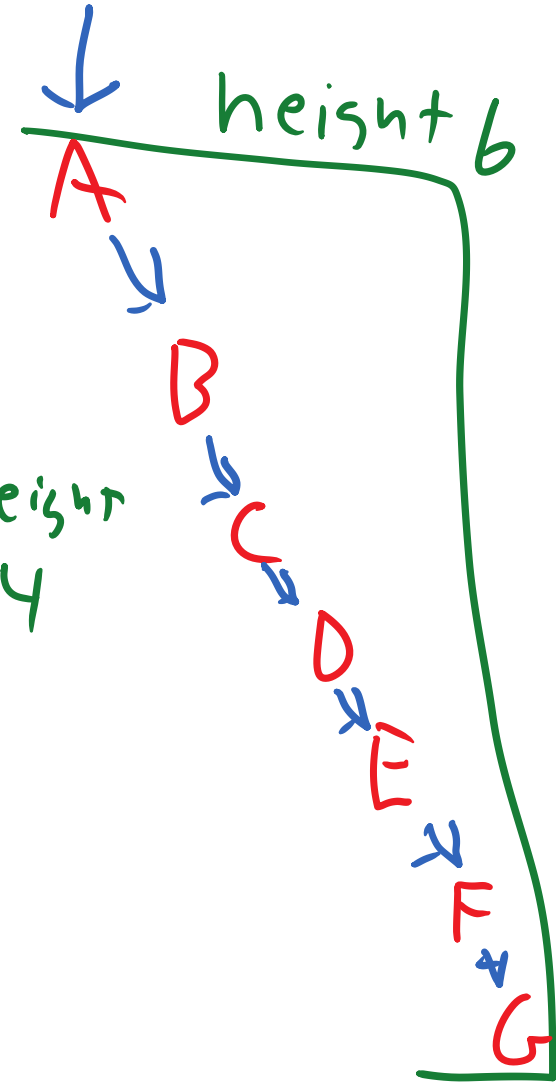
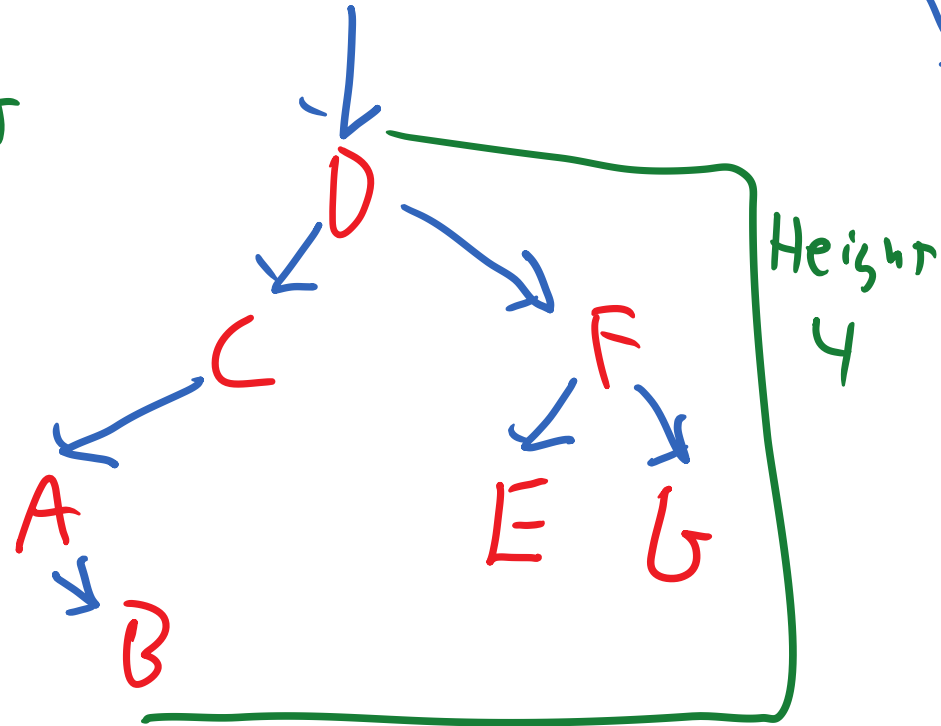
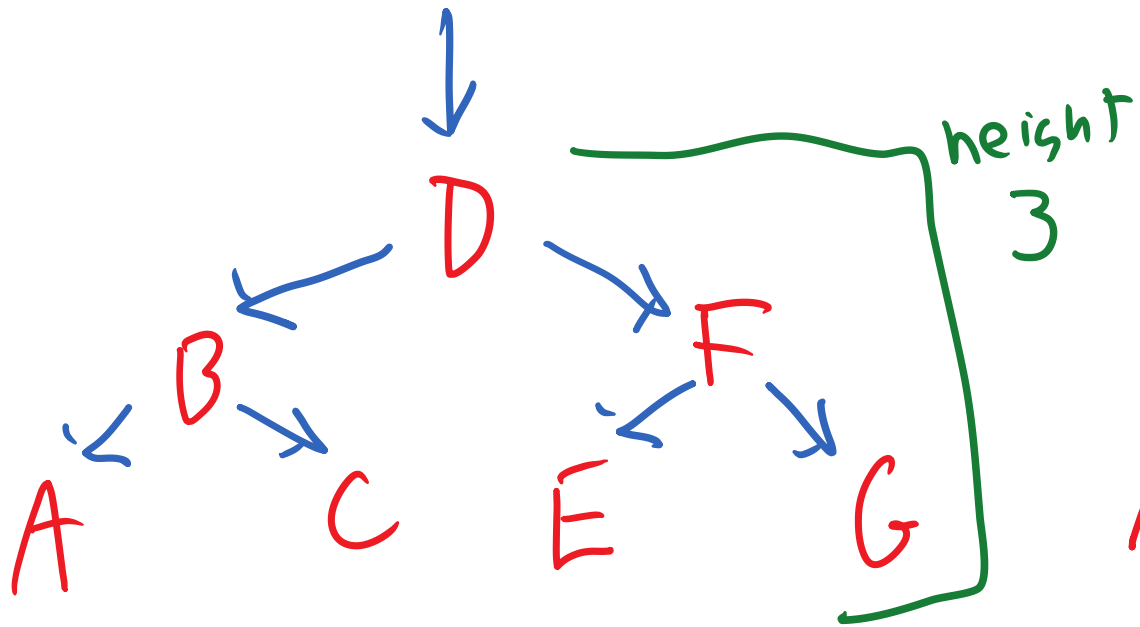
Which is better?



Which is better?

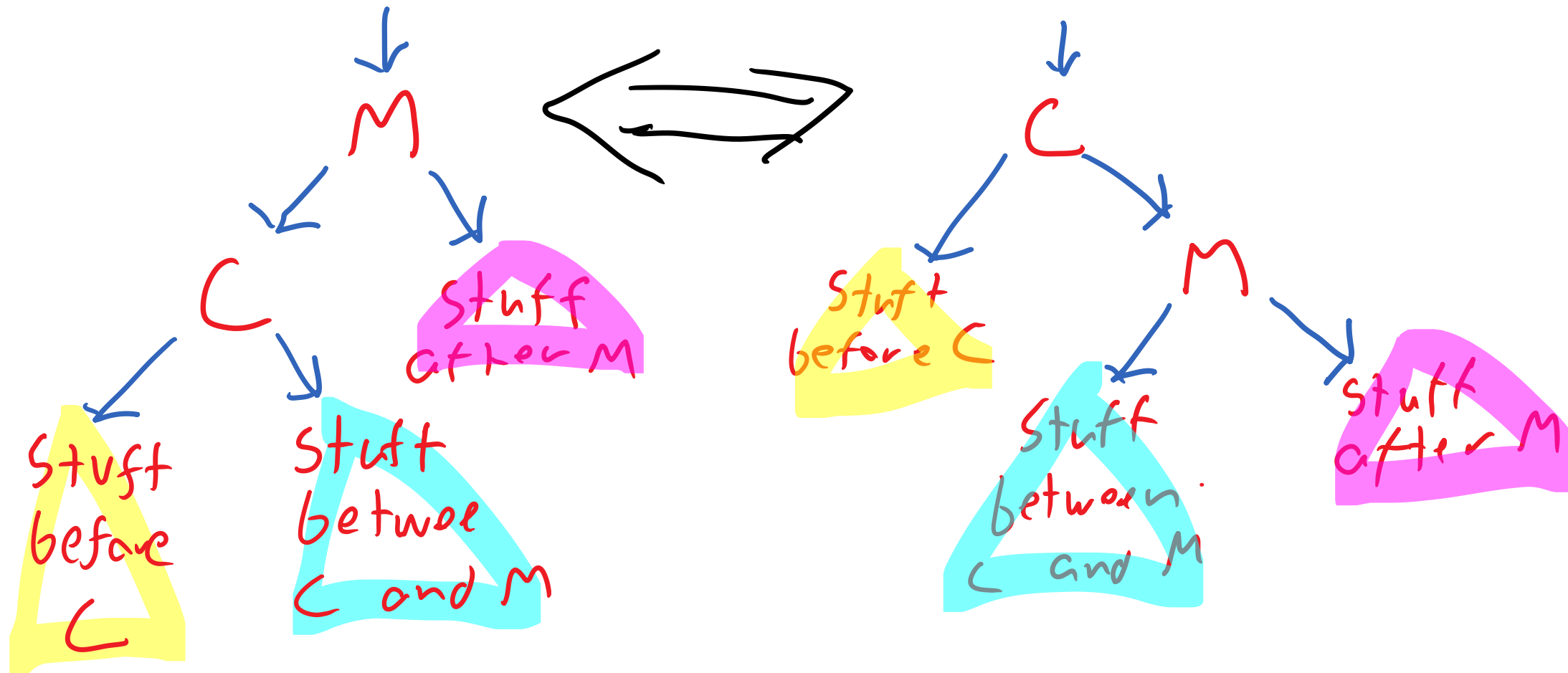


Which is better?

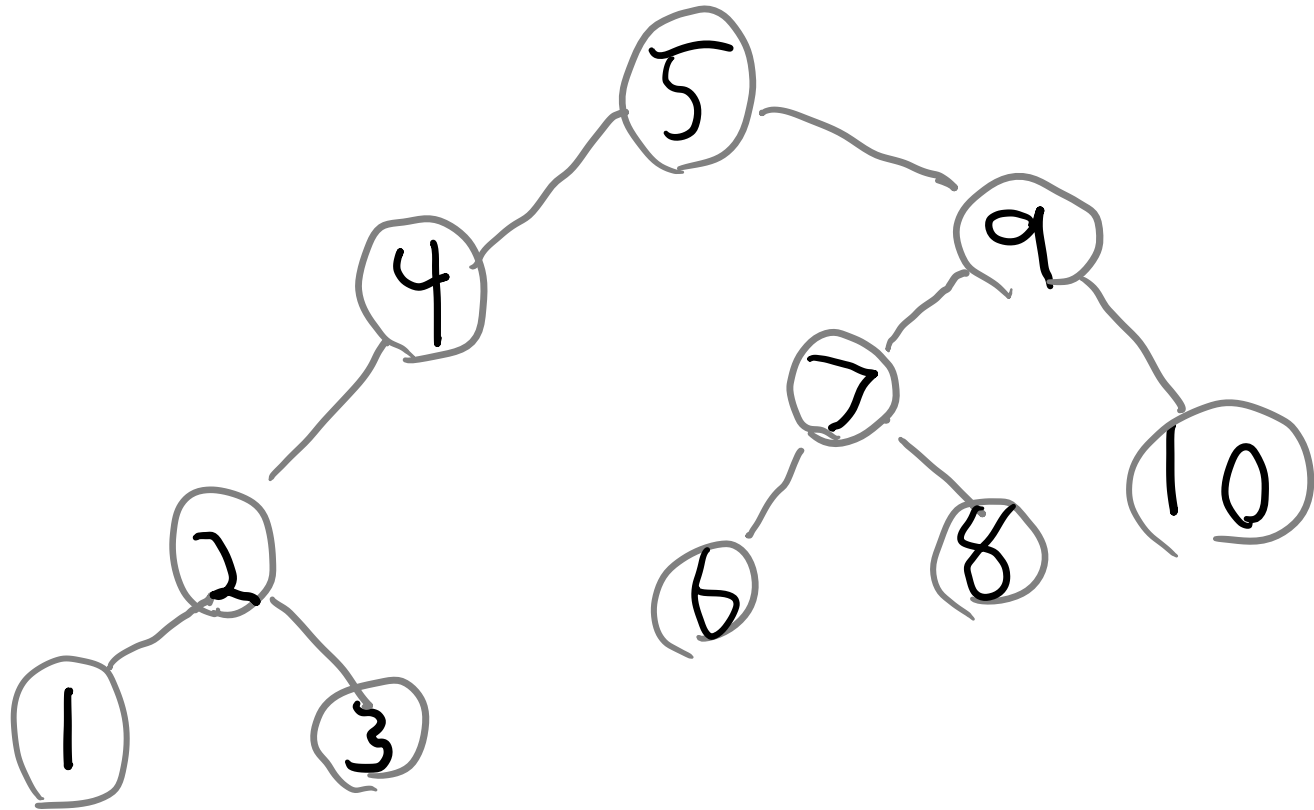


But what if we only search for A?

Changing Your Mind on How to Search



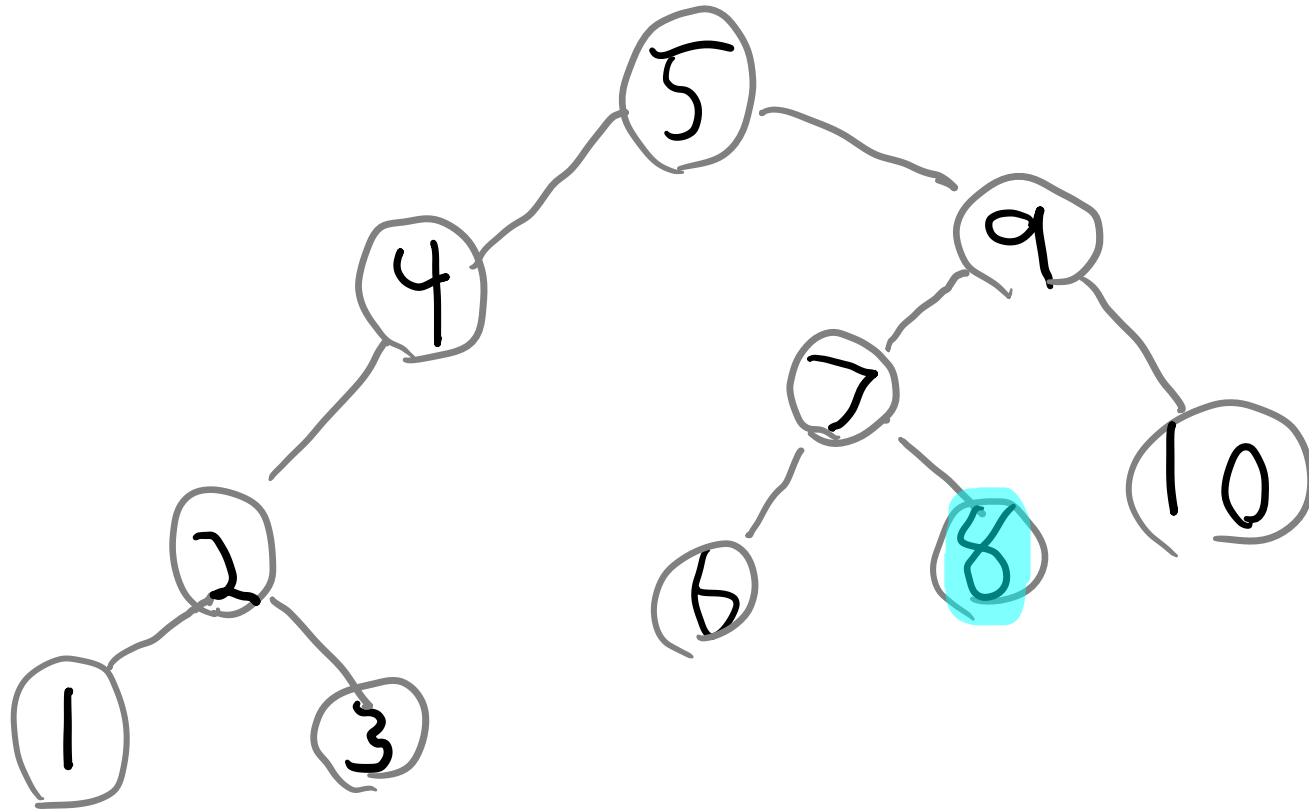
Binary Search Tree Model



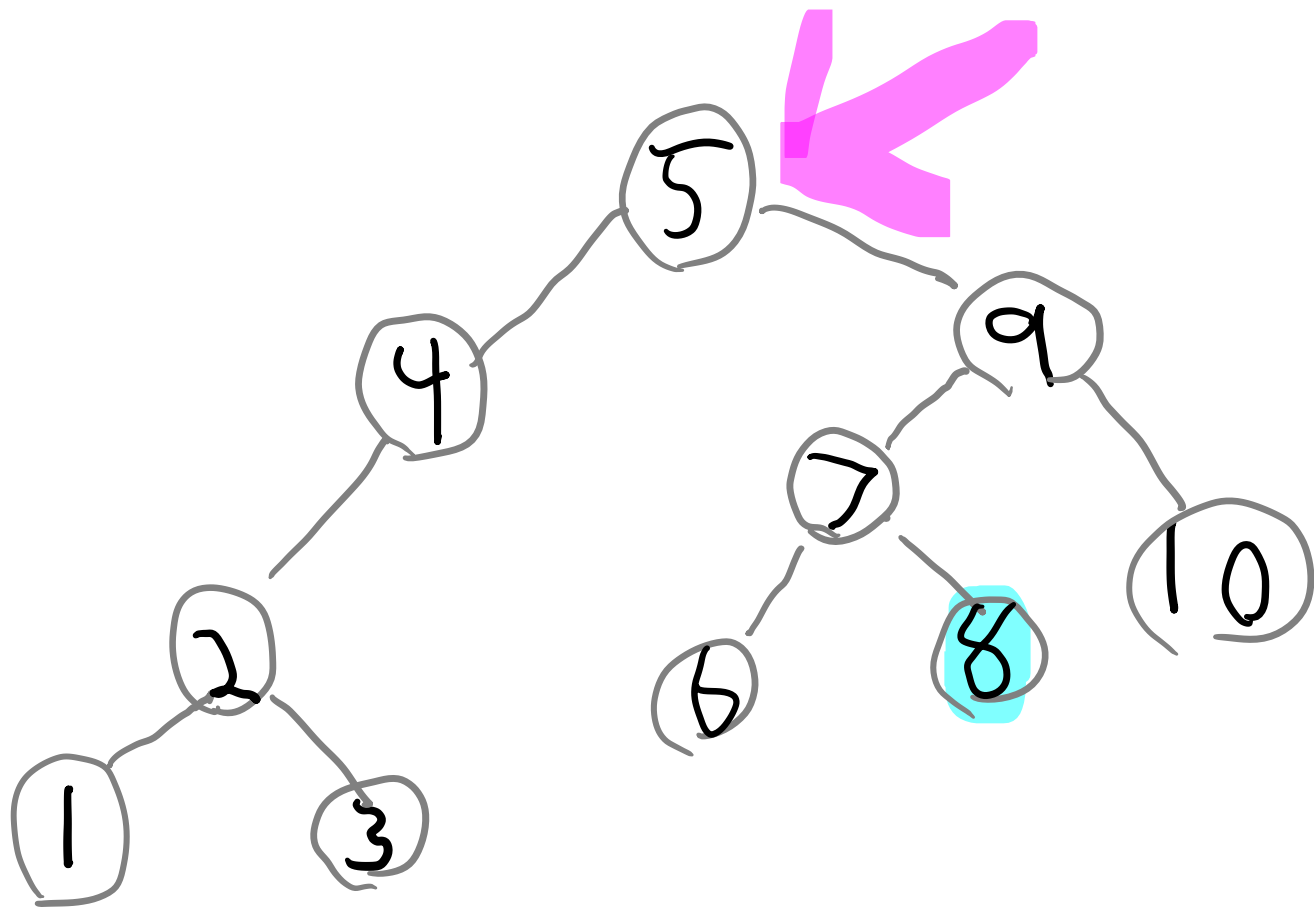
Binary Search Tree Model

Executes Searches

EG search for 8



Binary Search Tree Model

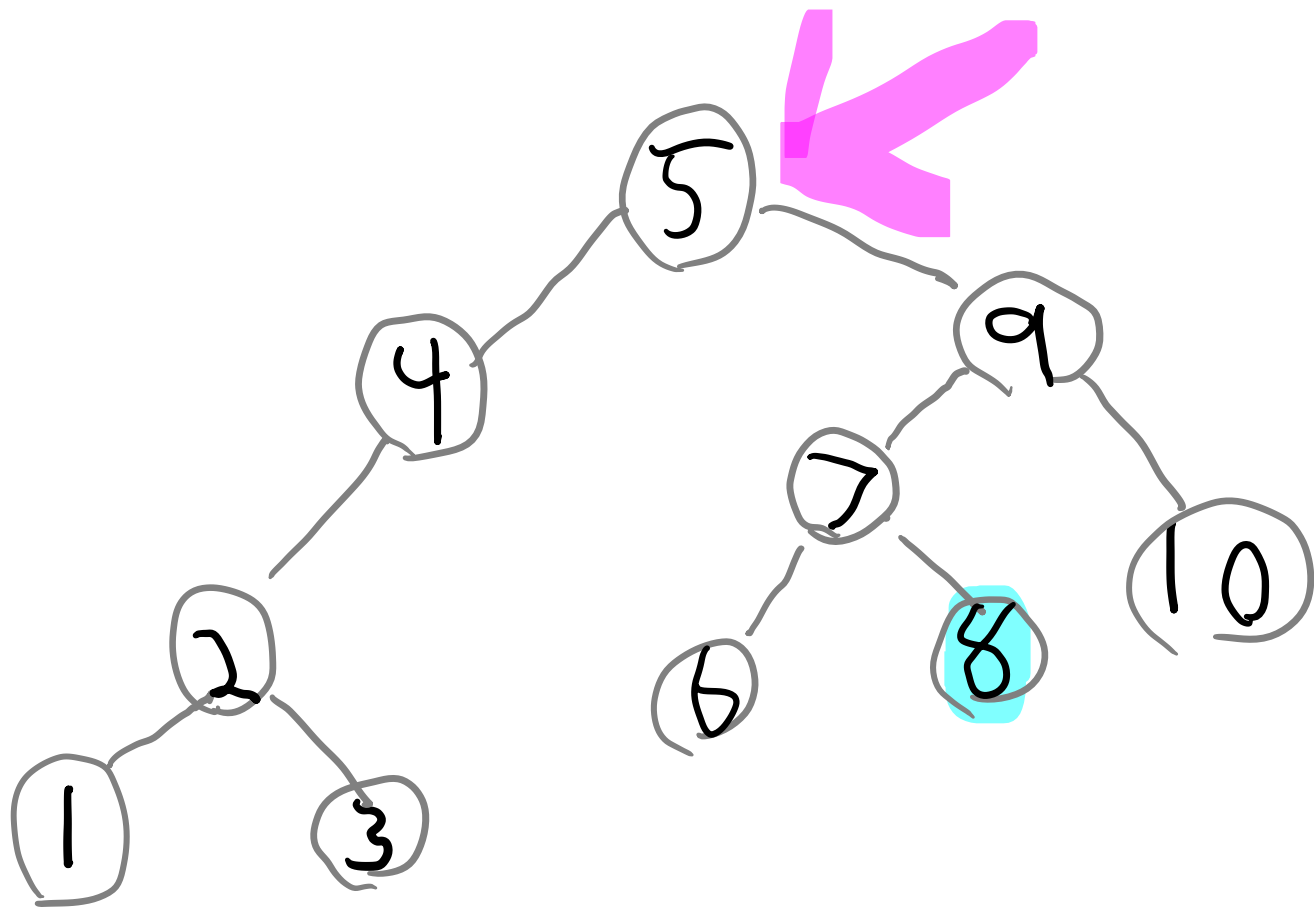


Executes Searches

EG search for 8

Single pointer, starts
each search at root

Binary Search Tree Model



Executes Searches

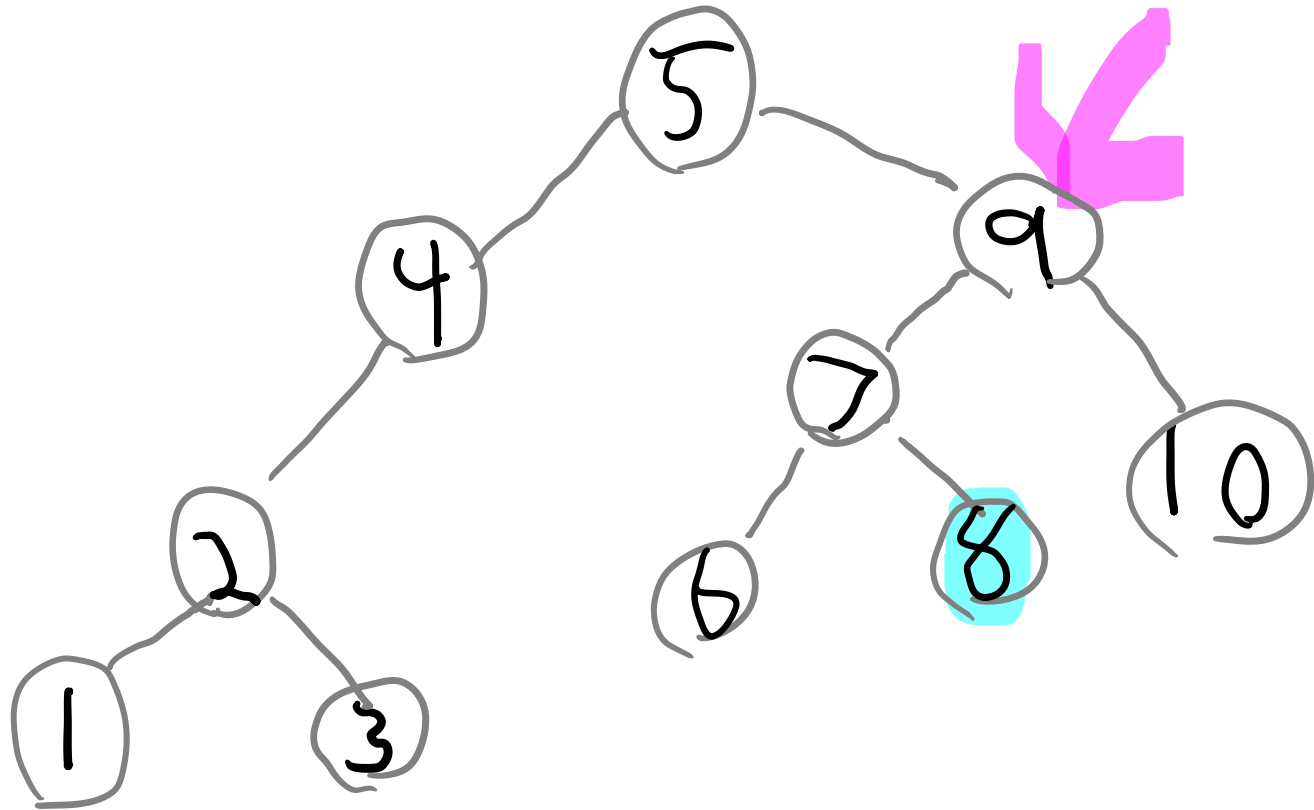
EG search for 8

Single pointer, starts
each search at root

Can move pointer

Left, Right, Up at Unit Cost

Binary Search Tree Model



Executes Searches

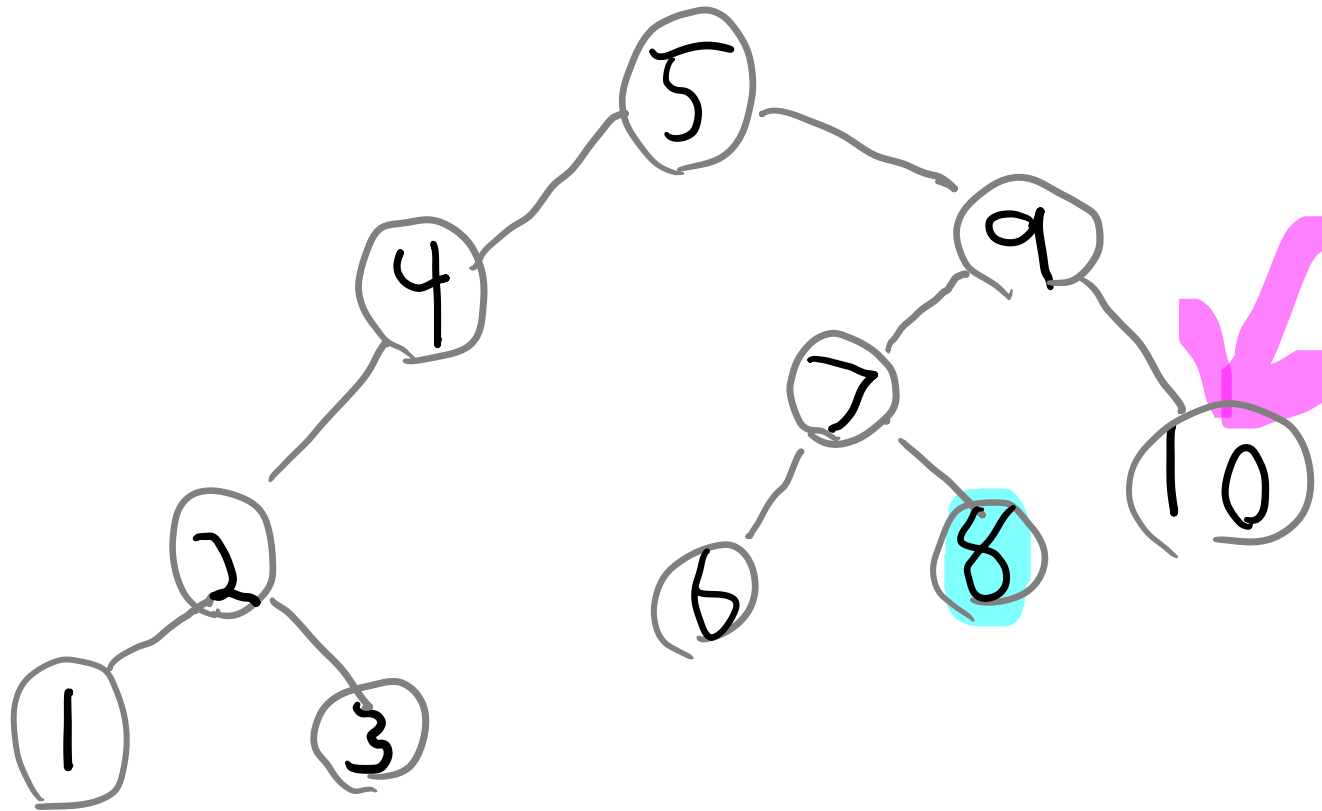
EG search for 8

Single pointer, starts
each search at root

Can move pointer

Left, Right, Up at Unit Cost

Binary Search Tree Model



Executes Searches

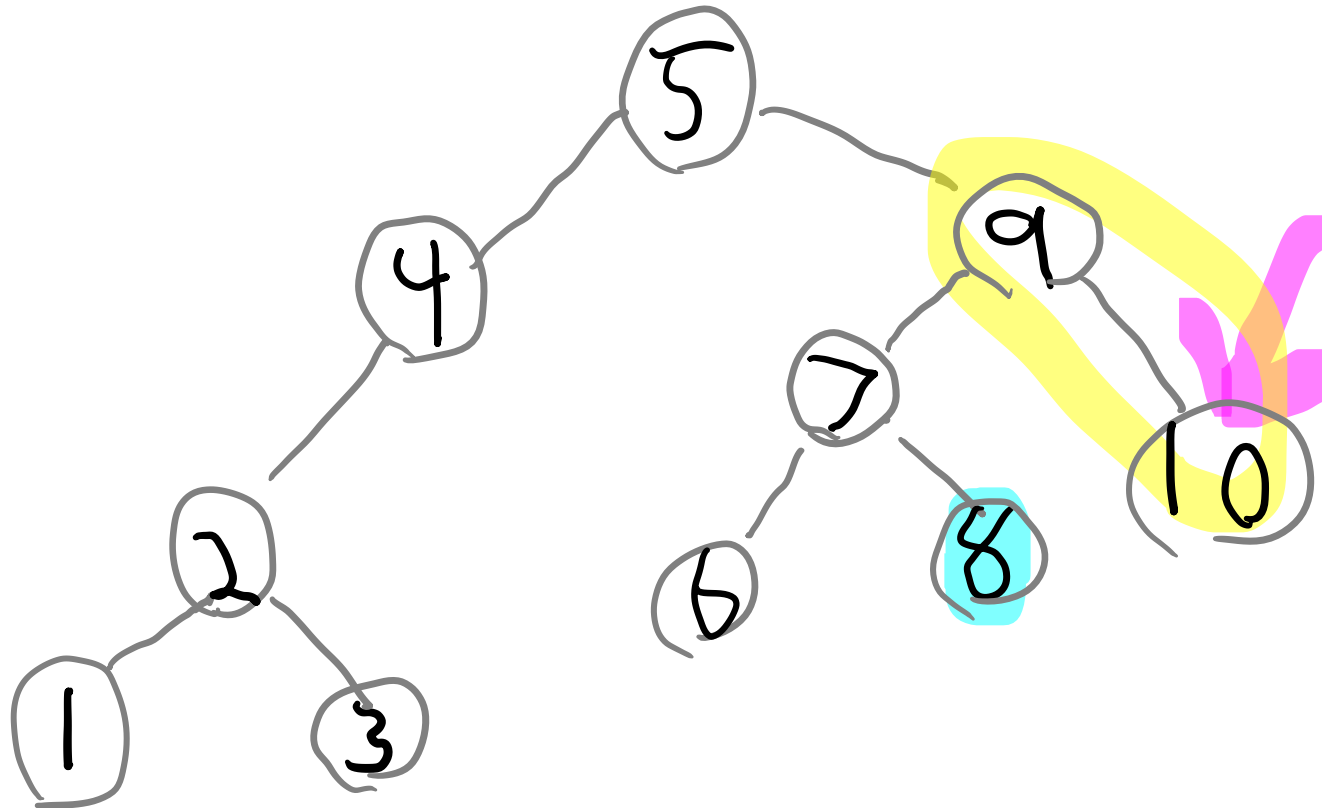
EG search for 8

Single pointer, starts
each search at root

Can move pointer

Left, Right, Up at Unit Cost

Binary Search Tree Model



Executes Searches

EG search for 8

Single pointer, starts
each search at root

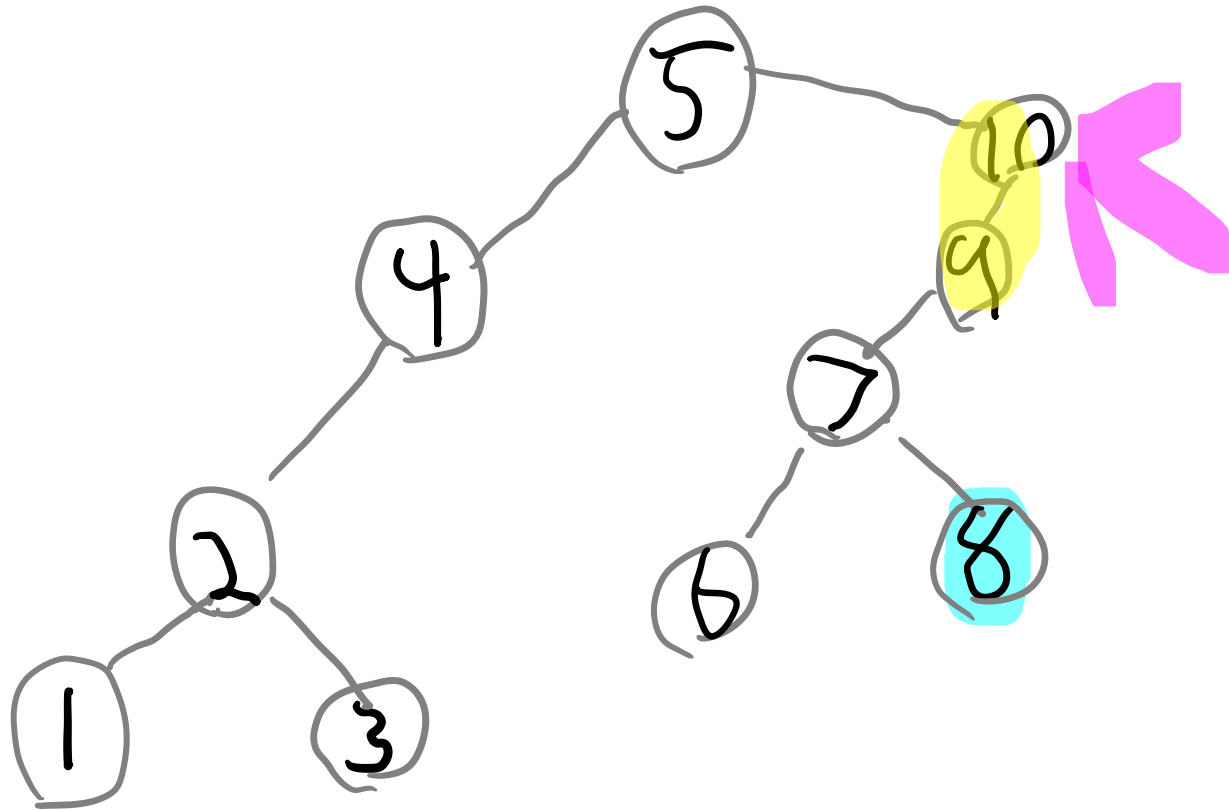
Can move pointer

Left, Right, Up at Unit Cost

Can rotate with parent

at Unit Cost

Binary Search Tree Model



Executes Searches

EG search for 8

Single pointer, starts
each search at root

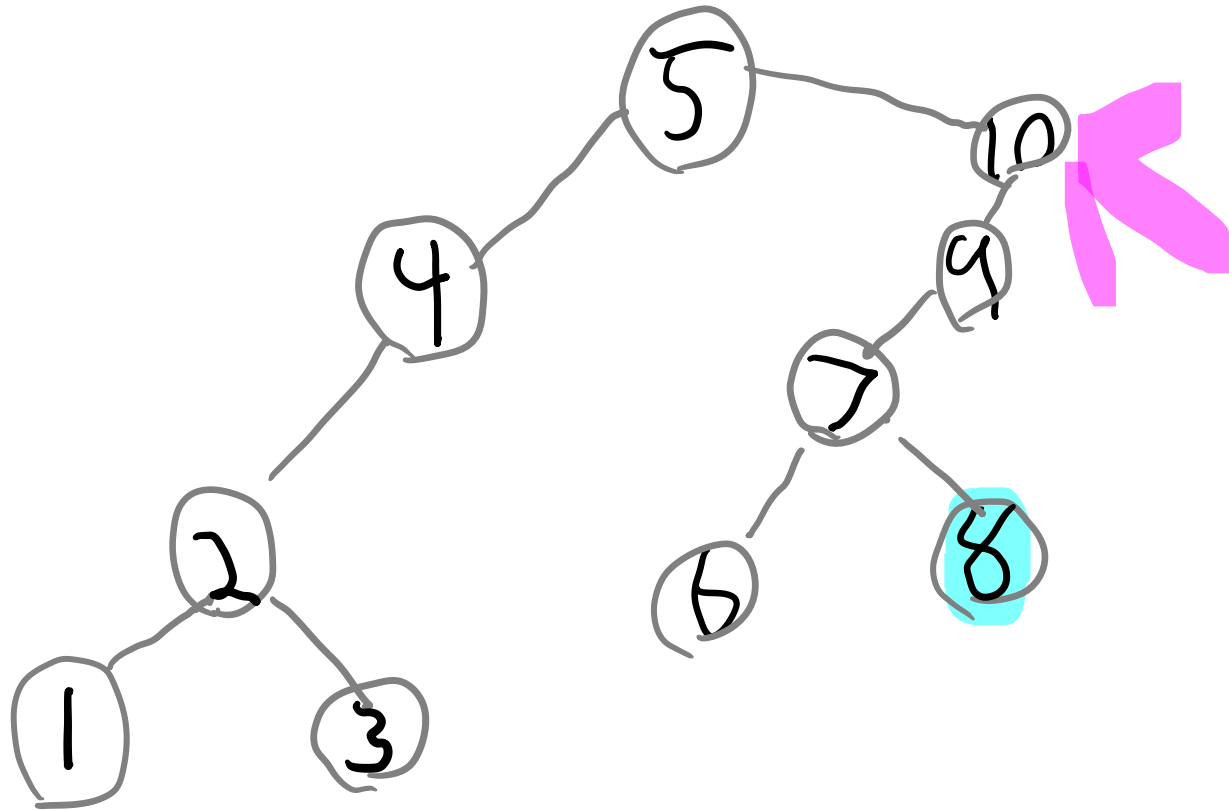
Can move pointer

Left, Right, Up at unit cost

Can rotate with parent

at unit cost

Binary Search Tree Model



Executes Searches

EG search for 8

Single pointer, starts
each search at root

Can move pointer

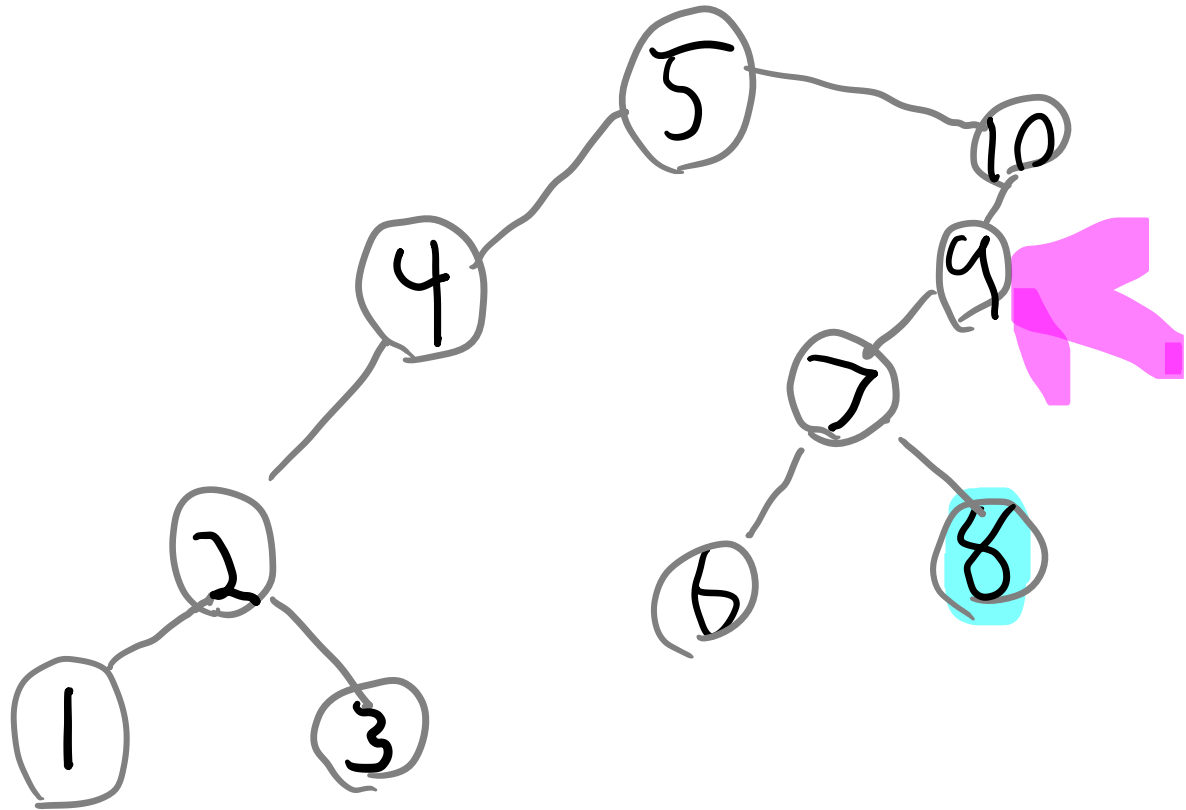
Left, Right, Up at unit cost

Can rotate with parent

Must go to the searched item

at unit cost

Binary Search Tree Model



Executes Searches

EG search for 8

Single pointer, starts
each search at root

Can move pointer

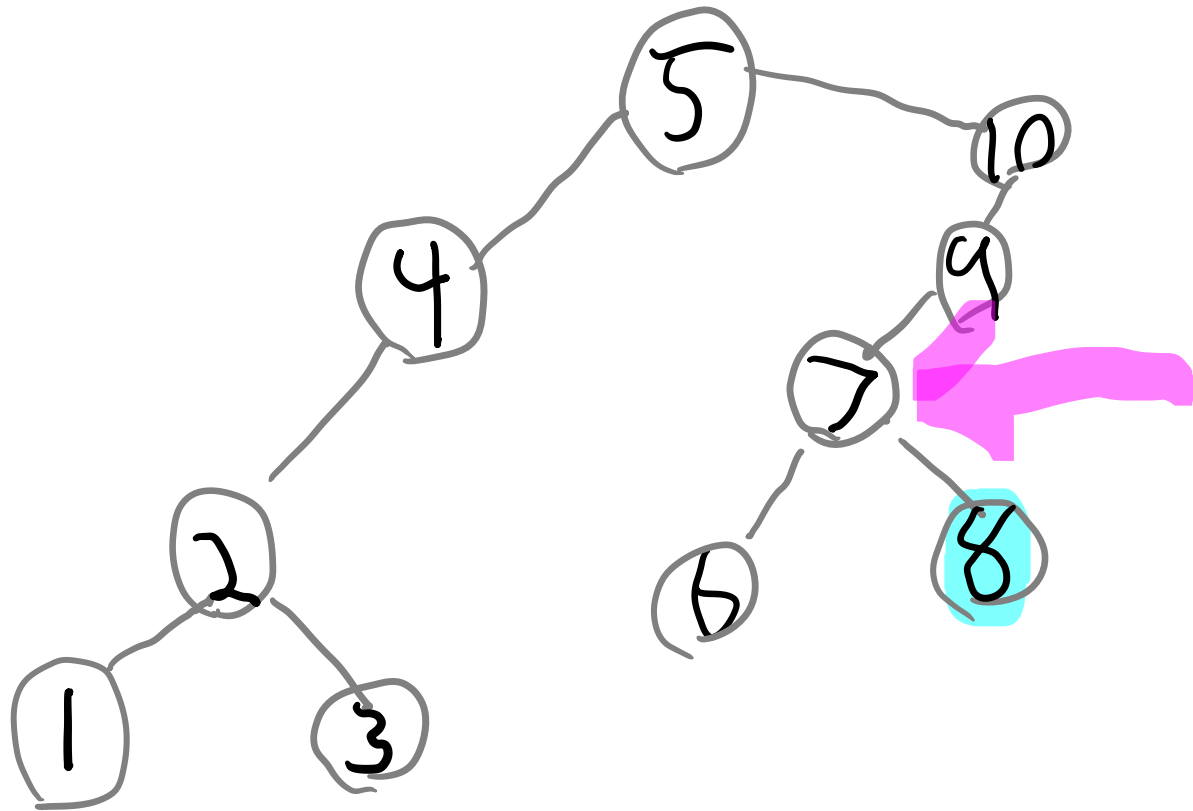
Left, Right, Up at Unit Cost

Can rotate with parent

Must go to the searched item

at Unit Cost

Binary Search Tree Model



Executes Searches

EG search for 8

Single pointer, starts
each search at root

Can move pointer

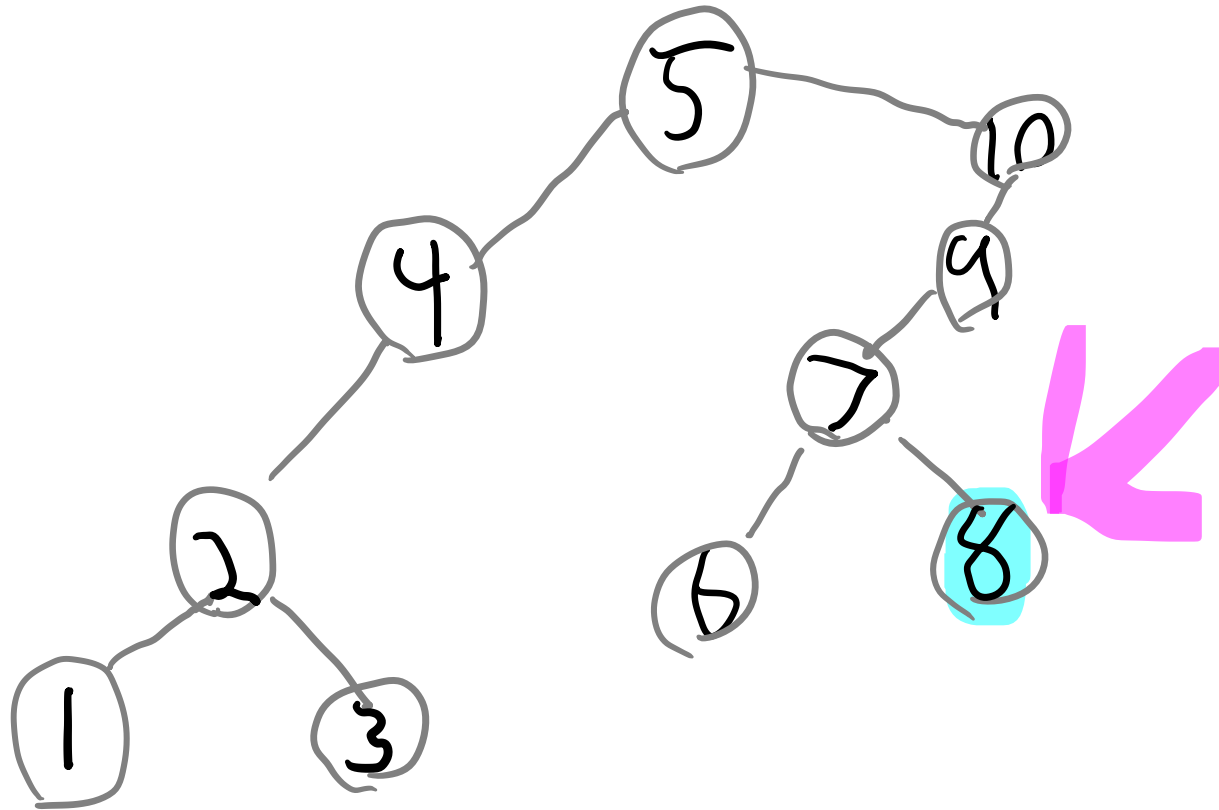
Left, Right, Up at Unit Cost

Can rotate with parent

Must go to the searched item

at Unit Cost

Binary Search Tree Model



Executes Searches

EG search for 8

Single pointer, starts
each search at root

Can move pointer

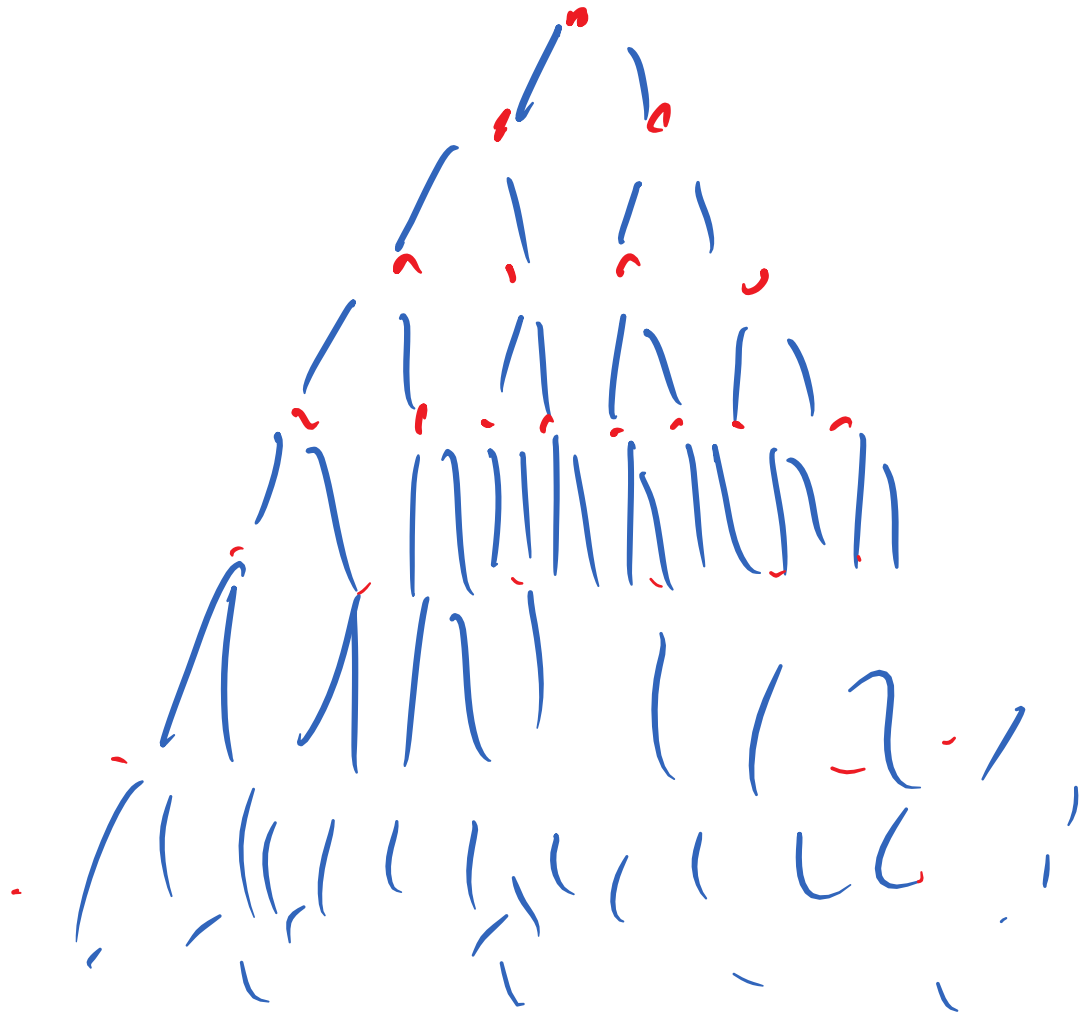
Left, Right, Up at unit cost

Can rotate with parent

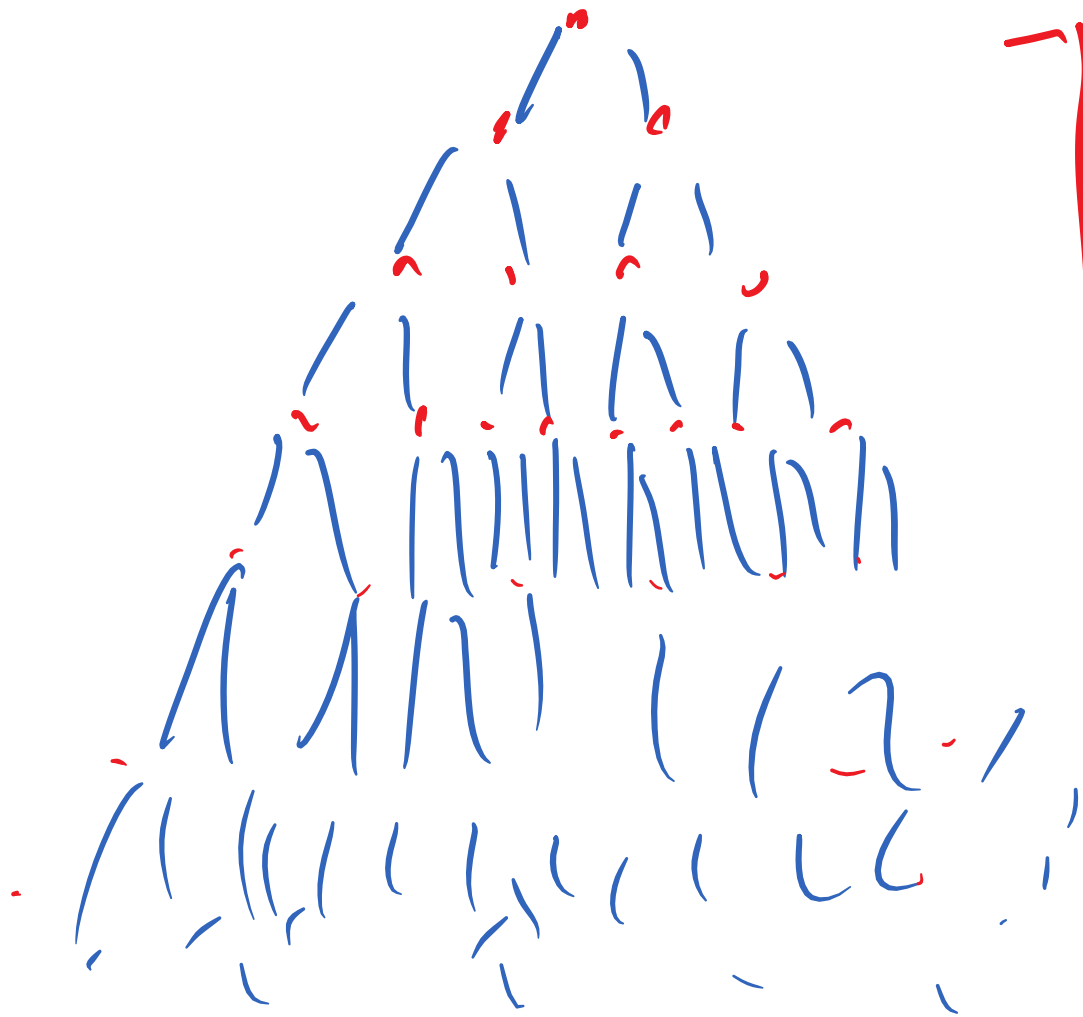
Must go to the searched item

at unit cost

How would you arrange your stuff



How would you arrange your stuff

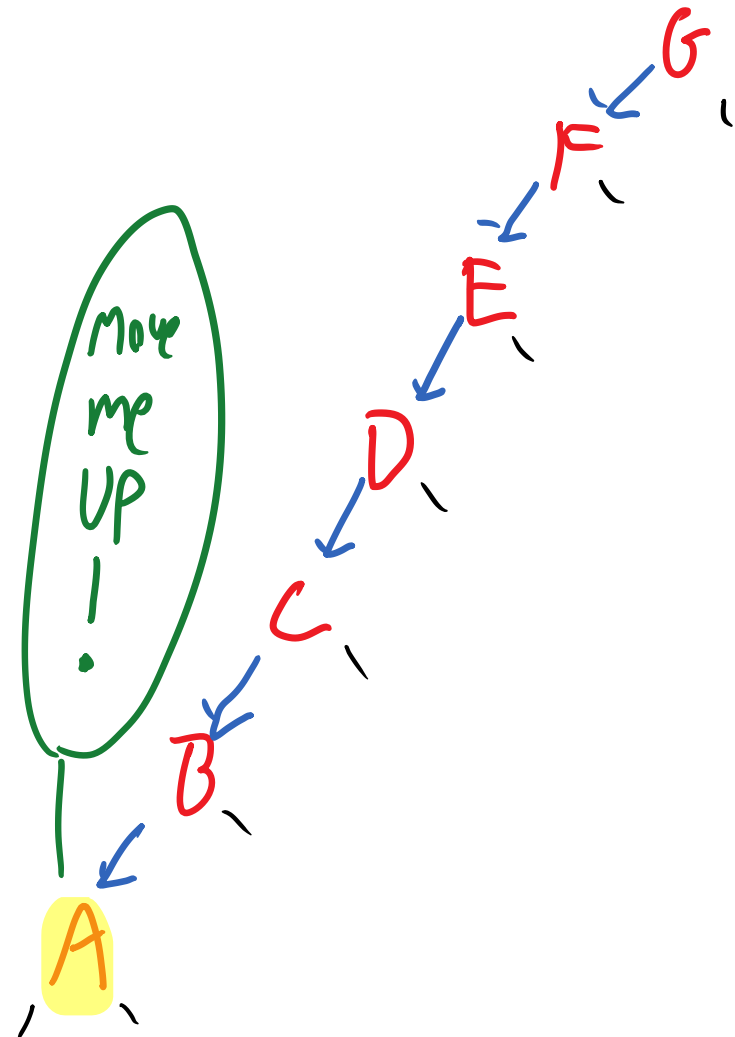


↑ stuff you access frequently

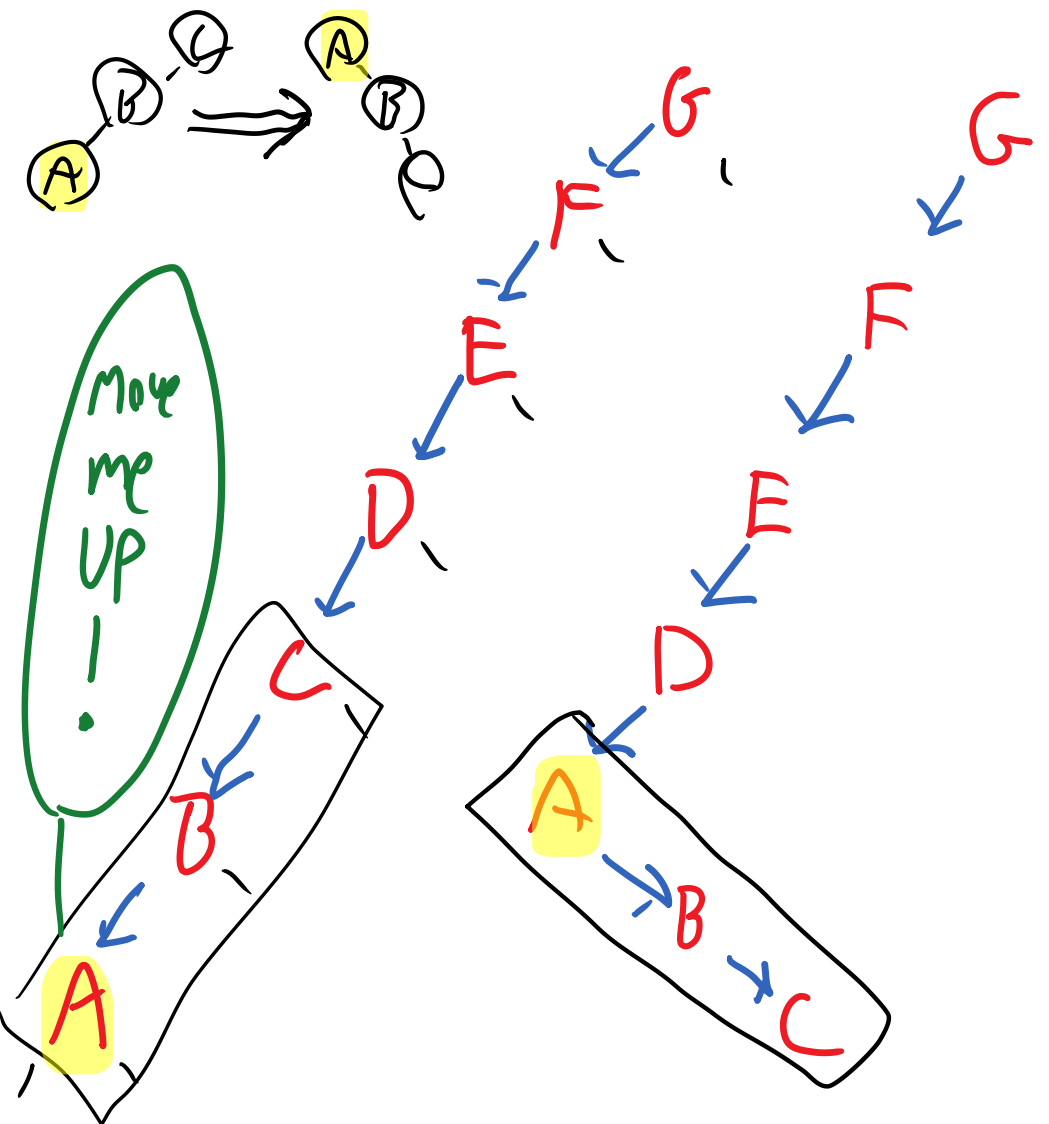
↓ stuff you never access

Idea: When you find something
move it to the top

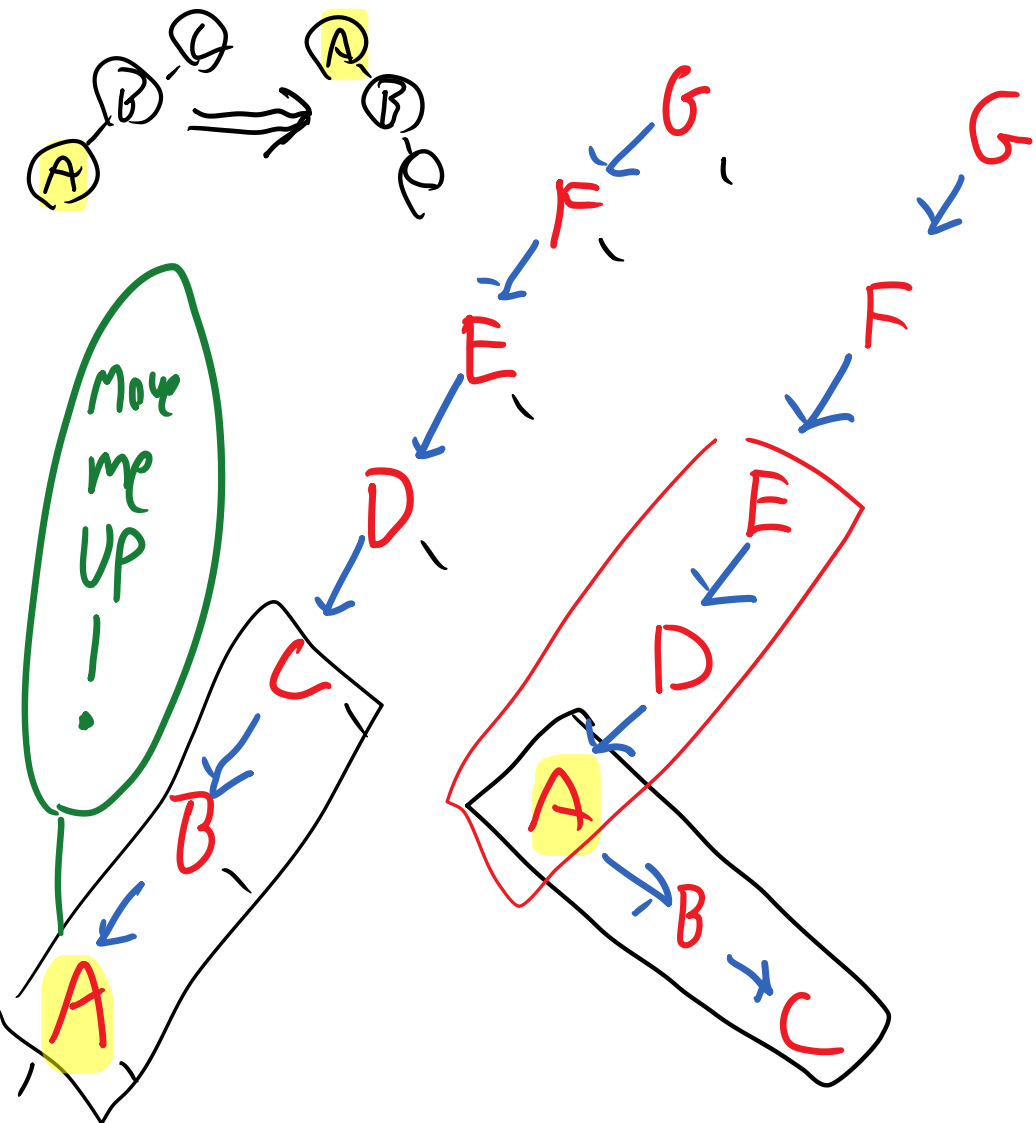
Idea: When you find something
move it to the top



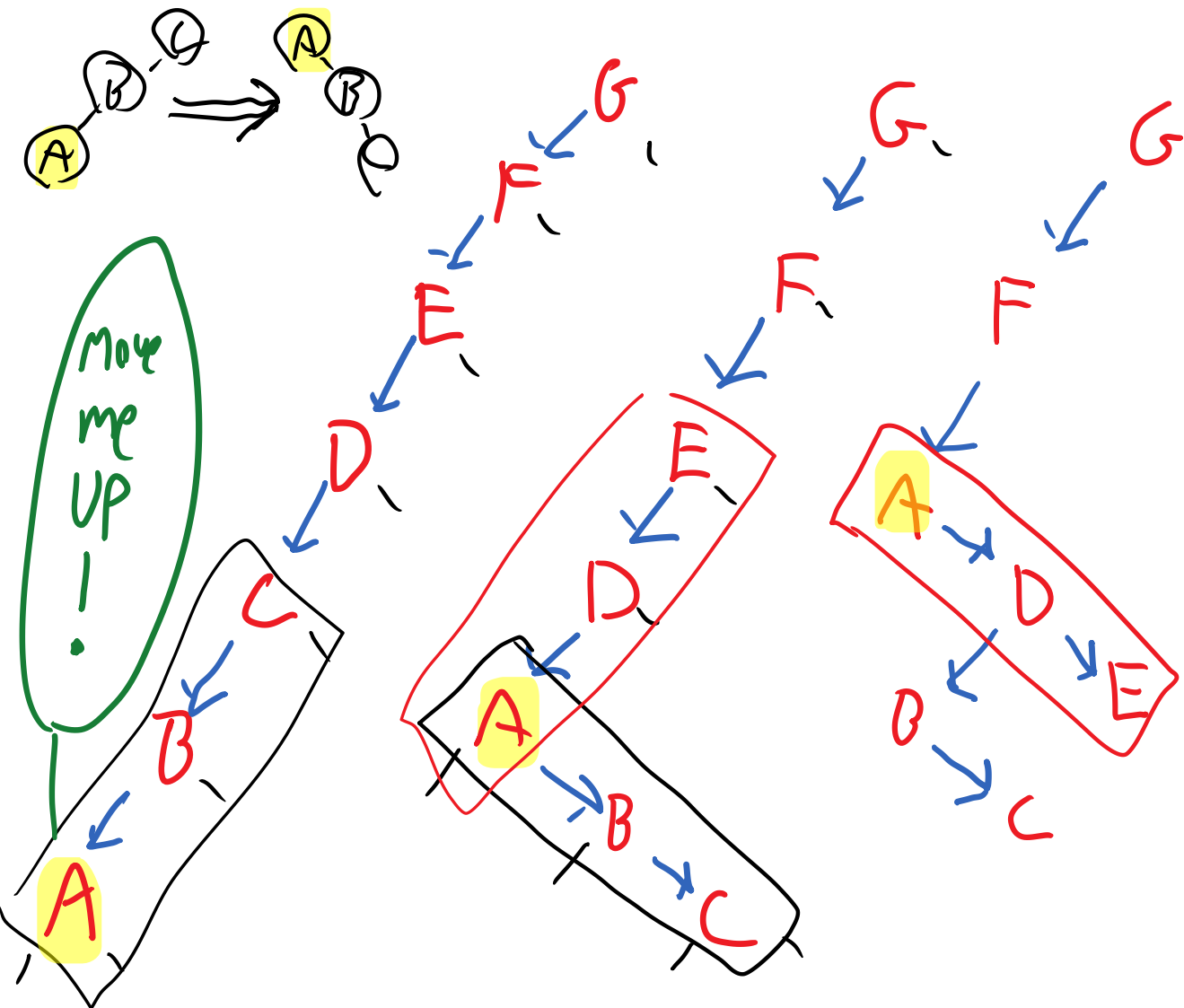
Idea: When you find something
Move it to the top



Idea: When you find something
Move it to the top

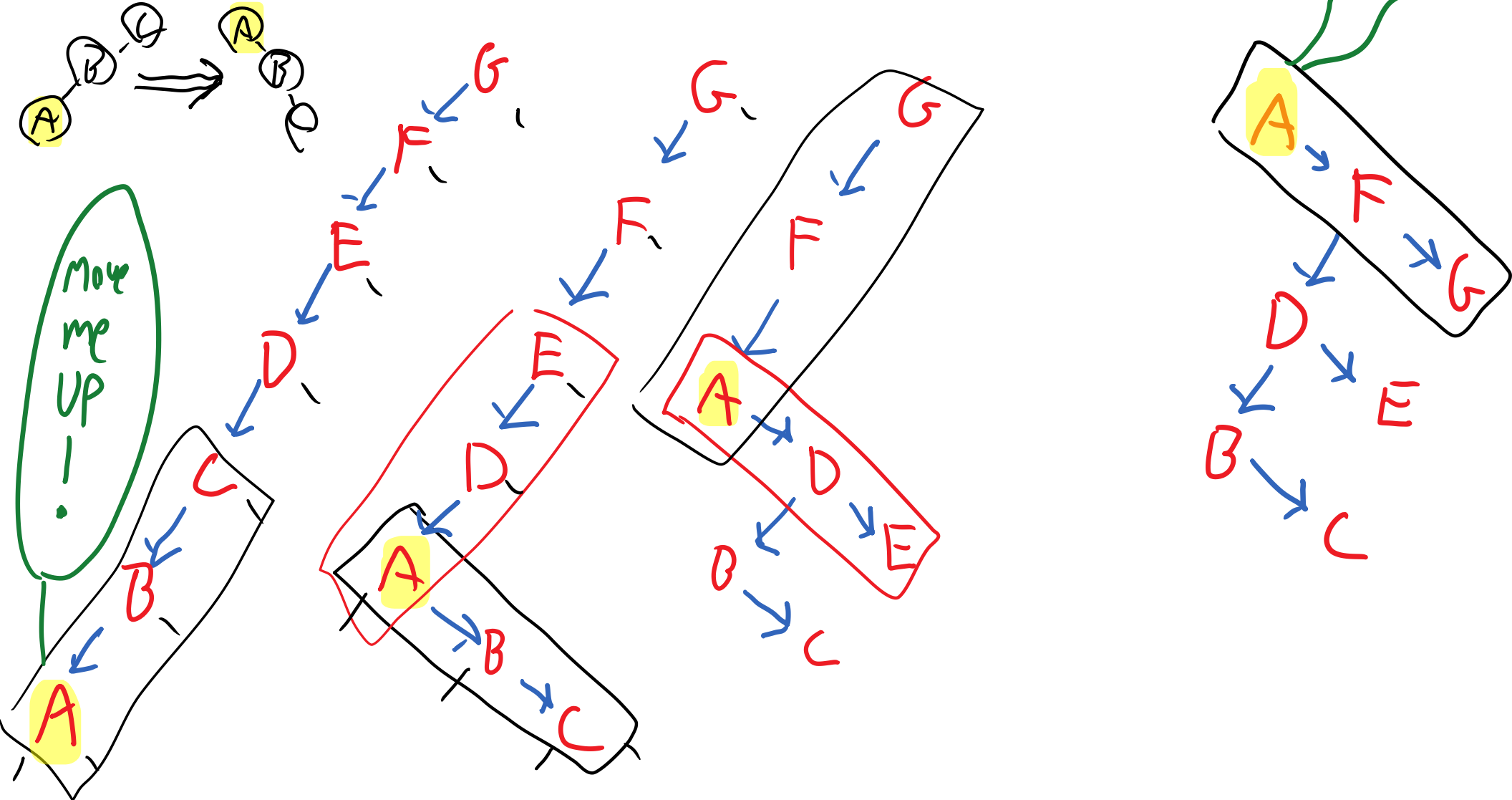


Idea: When you find something
Move it to the top

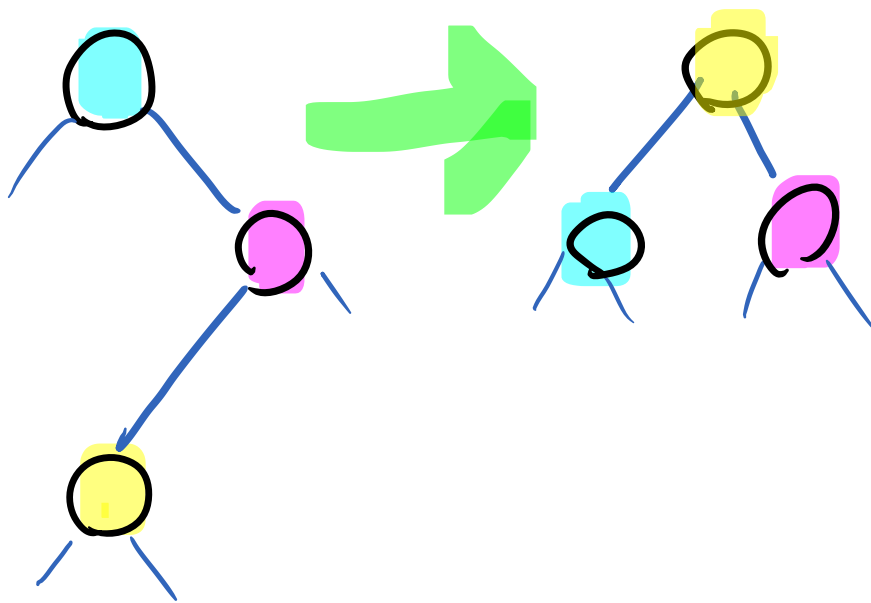
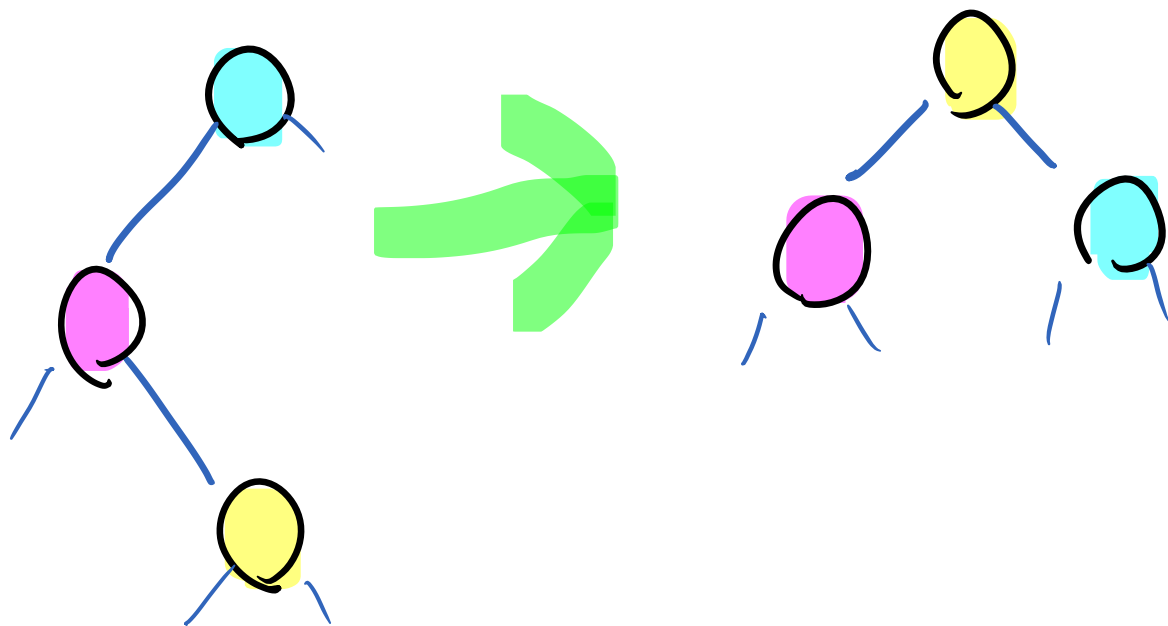
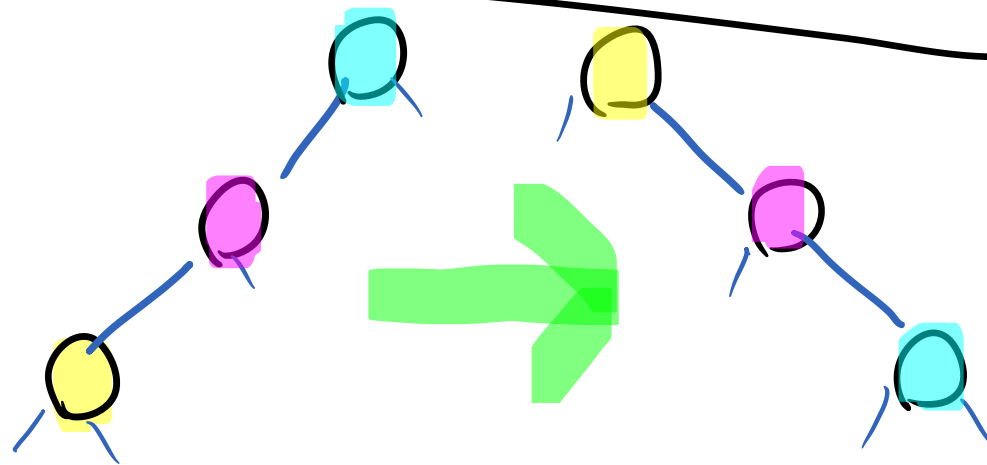
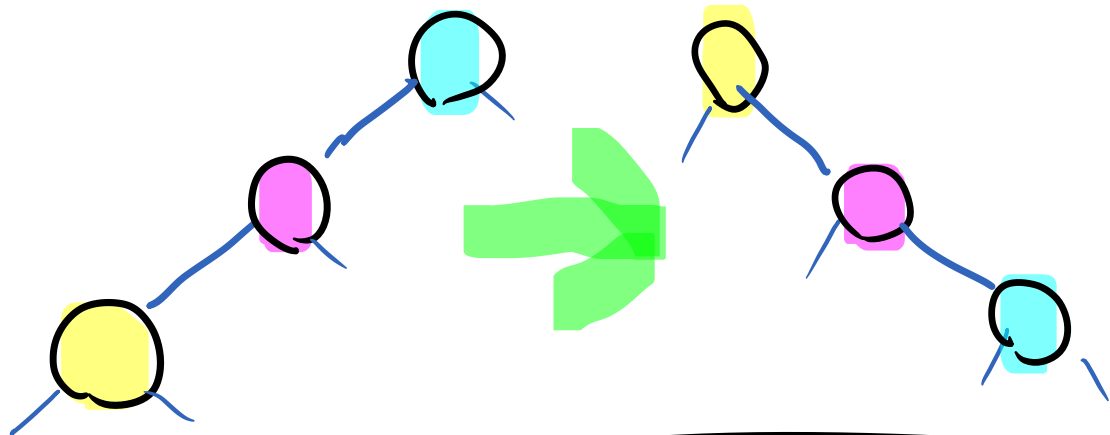


Idea: When you find something
Move it to the top

I'm at the top



Details



- Moving what you are looking for to the top by moving up two at a time works pretty well.

- Name of this idea:

Splay trees

Sleator + Tarjan 84

What if you knew the future?

What if you knew the future?

Searches: A, B, D, B, D, C, C, C, C, C

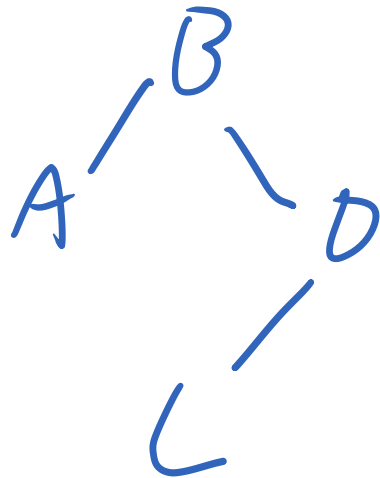
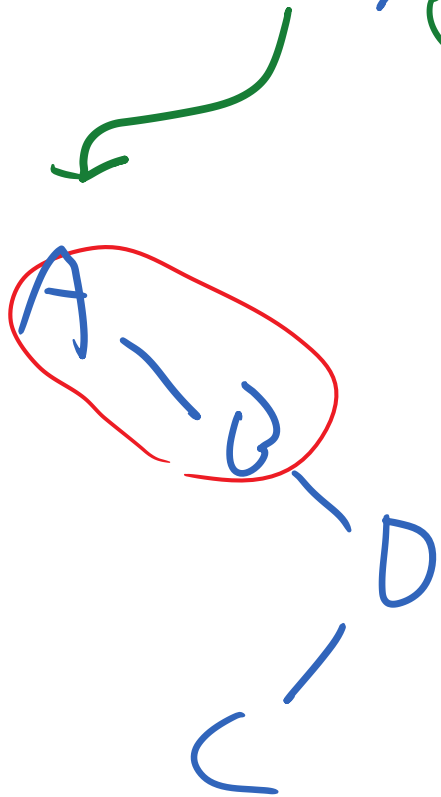
What if you knew the future?

Searches: A, B, D, B, D, C, C, C, C, C



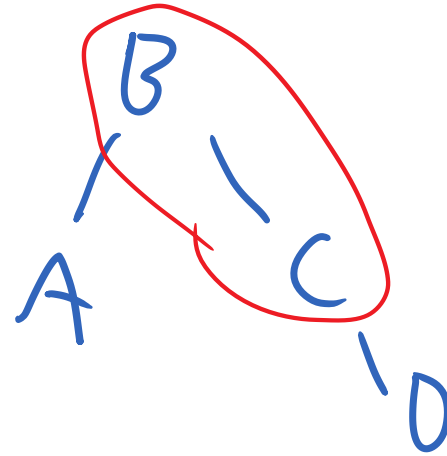
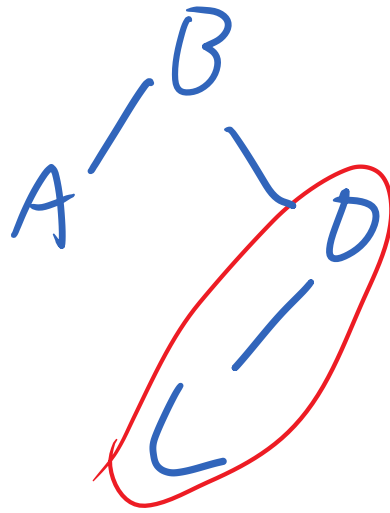
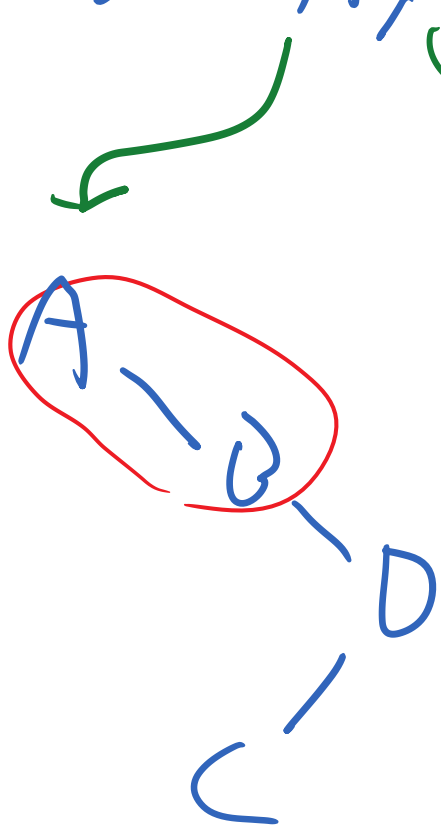
What if you knew the future?

Searches: A, B, D, B, D, C, C, C, L, L



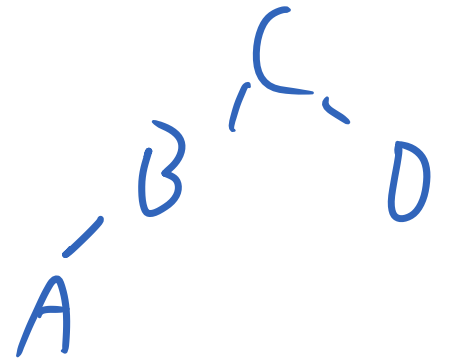
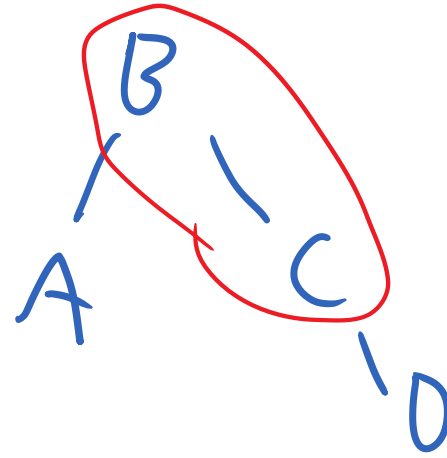
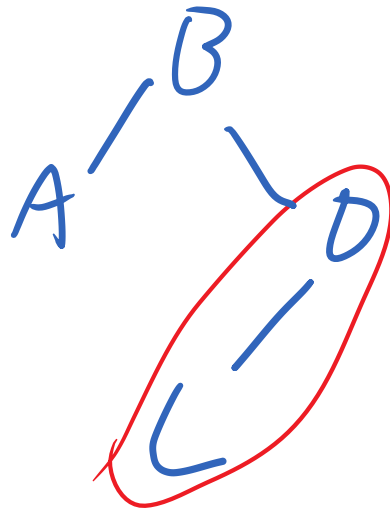
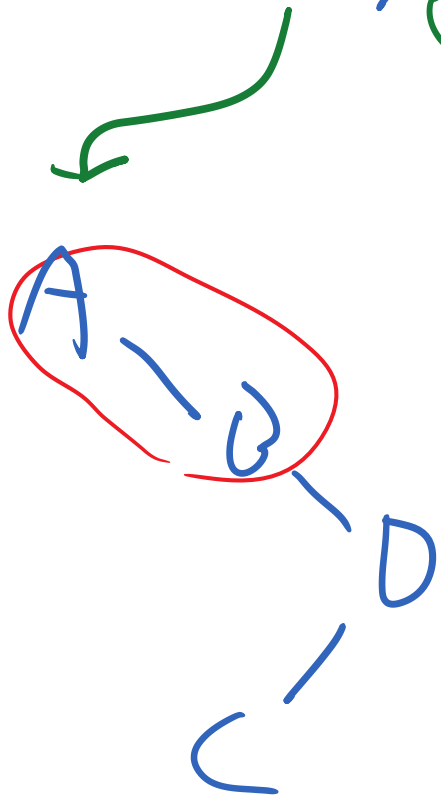
What if you knew the future?

Searches: A, B, D, B, D, C, C, C, L, L



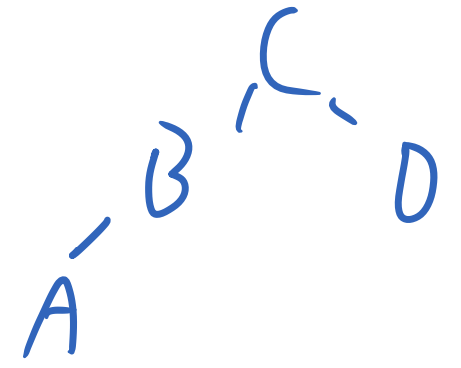
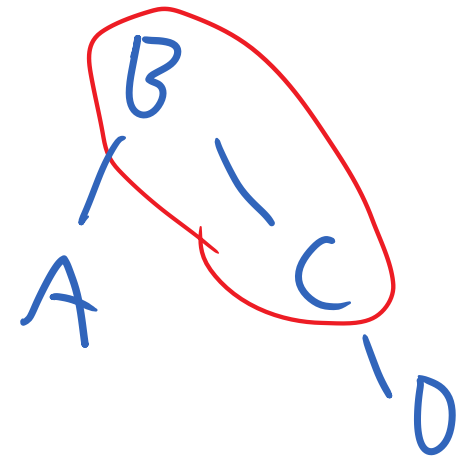
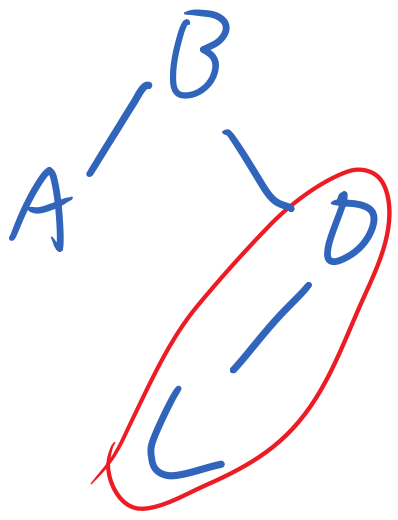
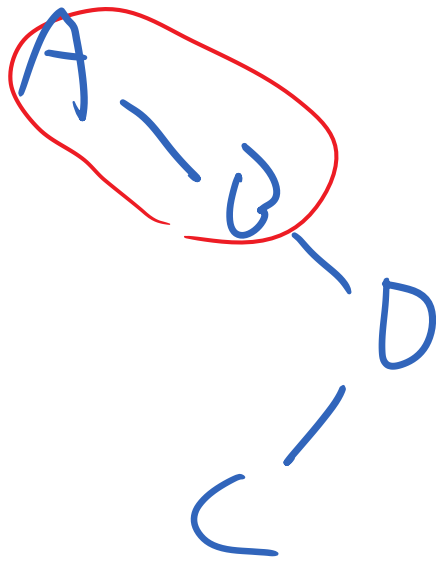
What if you knew the future?

Searches: A, B, D, B, D, C, C, C, L, L



What if you knew the future?

Searches: $A, B, D, B, D, C, C, C, L, L$ ≈ 12 searches
 $+ 3$ changes
15 COST



Dynamic Optimality Conjecture

Cost to run splay trees
on a sequence

is at most

something like double the

smallest cost possible

for that sequence even knowing
the future

Notions of Optimality

$N = \#$ of items in tree

$X = x_1, x_2, x_3 \dots x_m$ Searches

$R_A(X) =$ Time to execute X using Alg A

Notions of Optimality

$N = \#$ of items in tree

$X = x_1, x_2, x_3 \dots x_m$ Searches

$R_A(X) =$ Time to execute X using Alg A

Amortized worst-case $WC(N) = \min_A \lim_{m \rightarrow \infty} \frac{\max_{X, |X|=m} R_A(X)}{m}$

Notions of Optimality

$N = \#$ of items in tree

$X = x_1, x_2, x_3 \dots x_m$ Searches

$R_A(X) =$ Time to execute X using Alg A

Amortized worst-case $WC(N) = \min_A \lim_{m \rightarrow \infty} \frac{\max_{X, |X|=m} R_A(X)}{m} = O(m \log n)$

For BST: $WC(N) = \lceil \log_2(N+1) \rceil$

Notions of Optimality

$N = \#$ of items in tree

$X = x_1, x_2, x_3 \dots x_m$ Searches

$R_A(X) =$ Time to execute X using Alg A

Amortized Worst-Case $WC(N) = \min_A \lim_{m \rightarrow \infty} \frac{\max_{X, |X|=m} R_A(X)}{m}$

Instance-Based Optimality $OPT(X) = \min_A R_A(X)$

Online vs Offline

$X = x_1, x_2, x_3 \dots x_m$ sequence of operations

Alg A is Online: Executes x_i based on
 $x_1, x_2 \dots x_i$ only.

Alg A is Offline: Executes x_i based on
all of X .

Dynamic Optimality

$$\text{OPT}(x) = \min_A R_A(x)$$

Algorithm A is Dynamically Optimal if

$$\forall x \quad R_A(x) = O(\text{OPT}(x))$$

Dynamic Optimality

$$\text{OPT}(x) = \min_A R_A(x)$$

Different A for each x

Algorithm A is Dynamically Optimal if

One A for all x

$$\forall x \quad R_A(x) = O(\text{OPT}(x))$$

Dynamic Optimality

$$\text{OPT}(x) = \min_A R_A(x)$$

Different A for each x

Algorithm A is Dynamically Optimal if

One A for all x

$$\forall x \quad R_A(x) = O(\text{OPT}(x))$$

Interesting even if A is offline

... more interesting if A is online ...

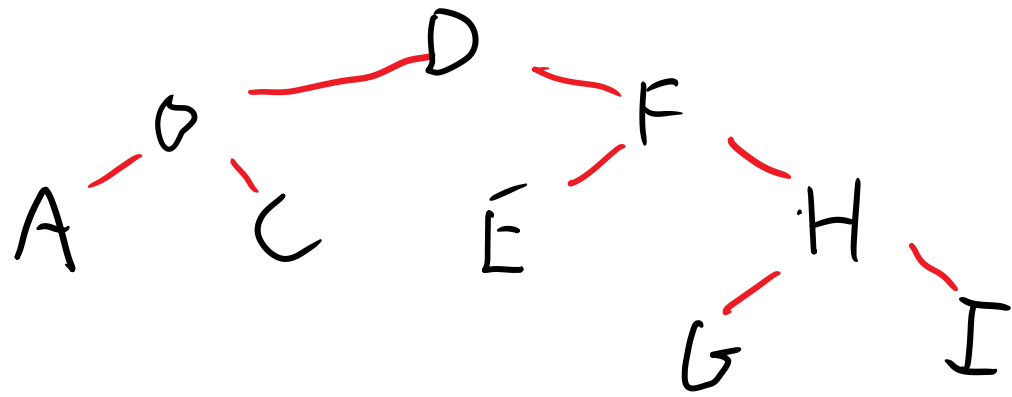
If this were true:

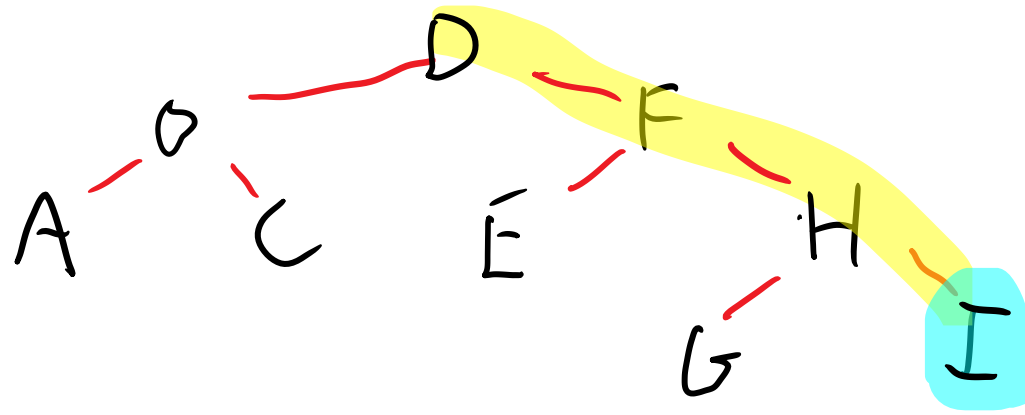
Knowing the future
is useless.

If at first you don't understand...

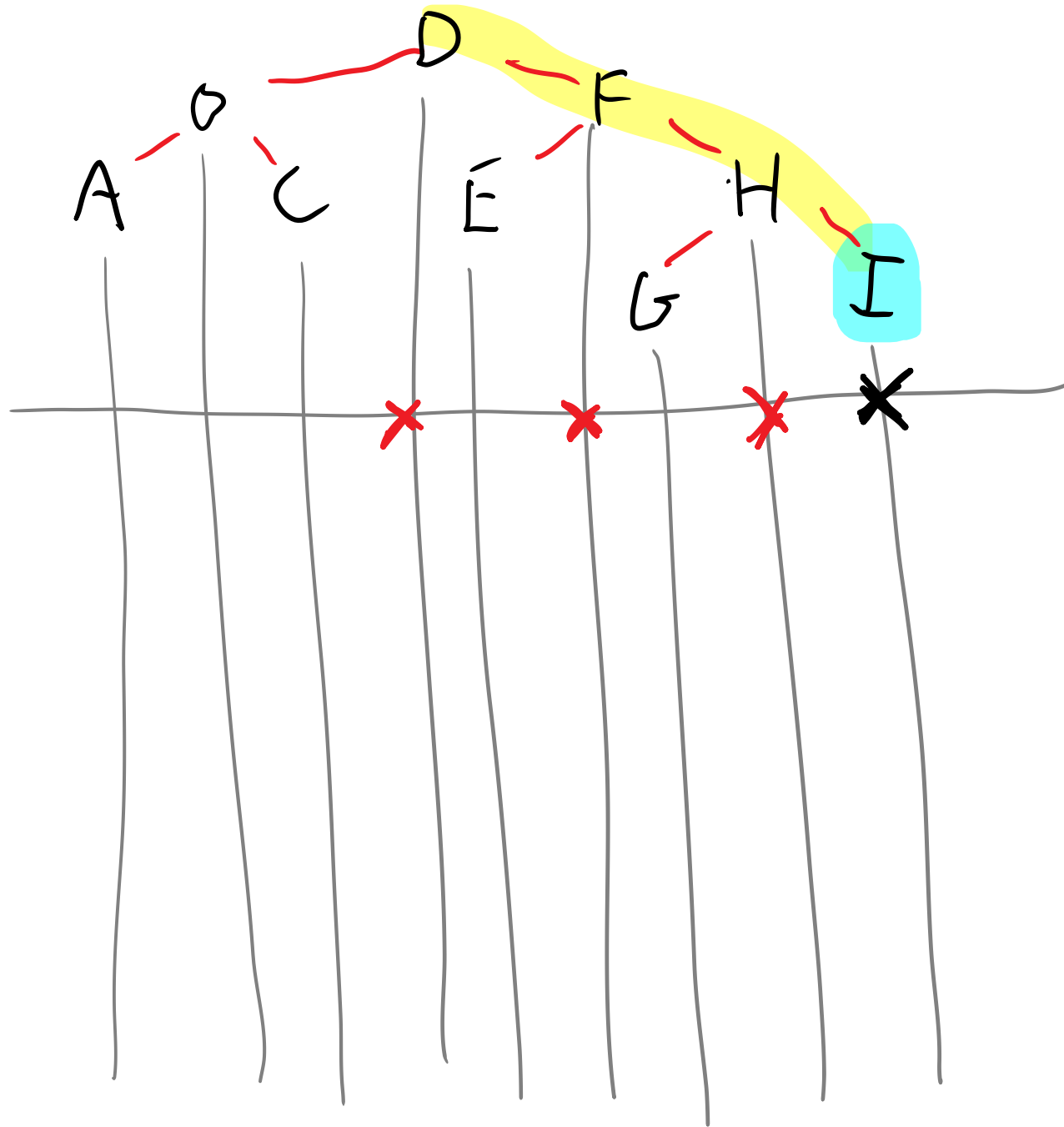
If at first you don't understand...

Draw a Different Picture

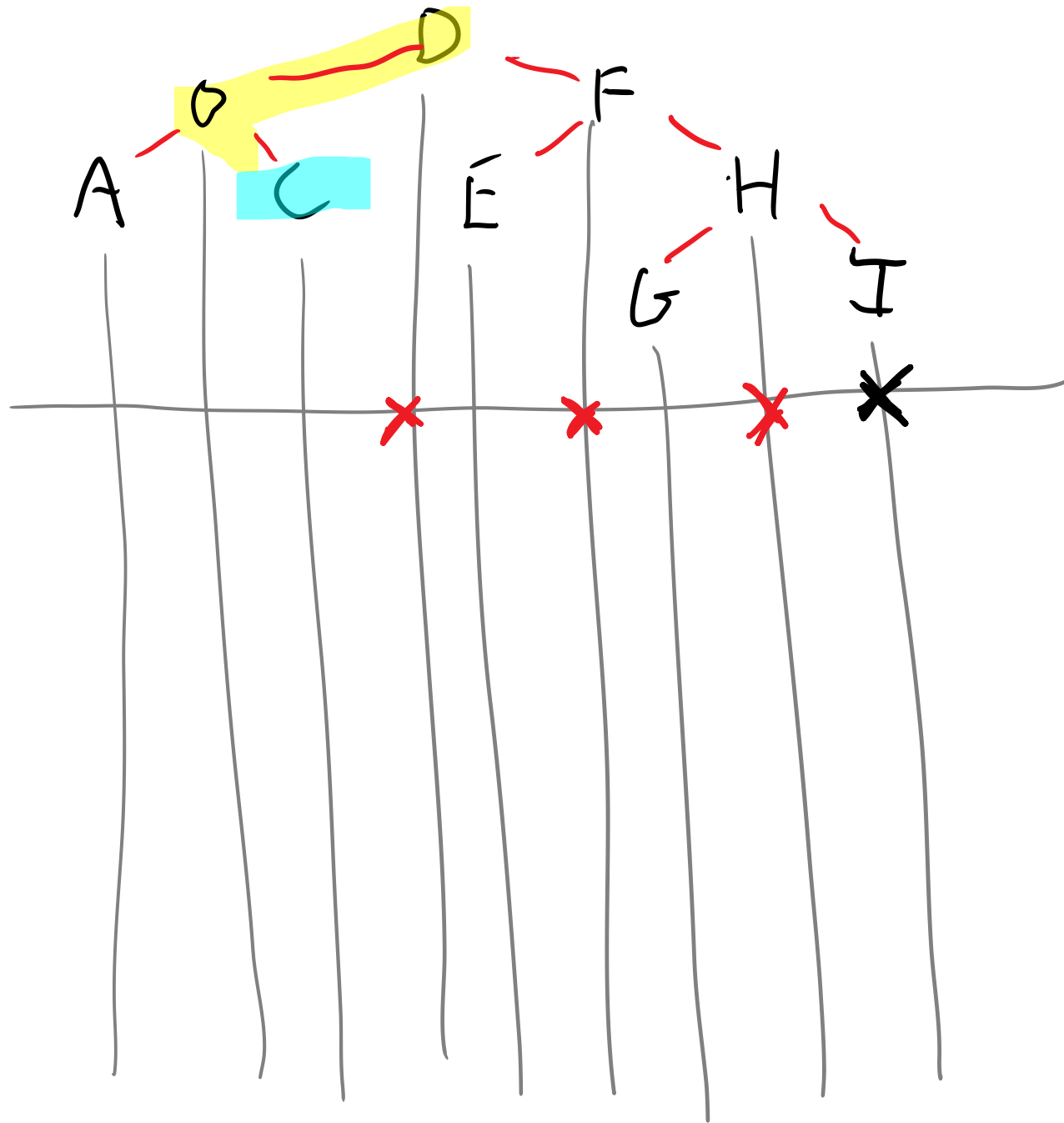




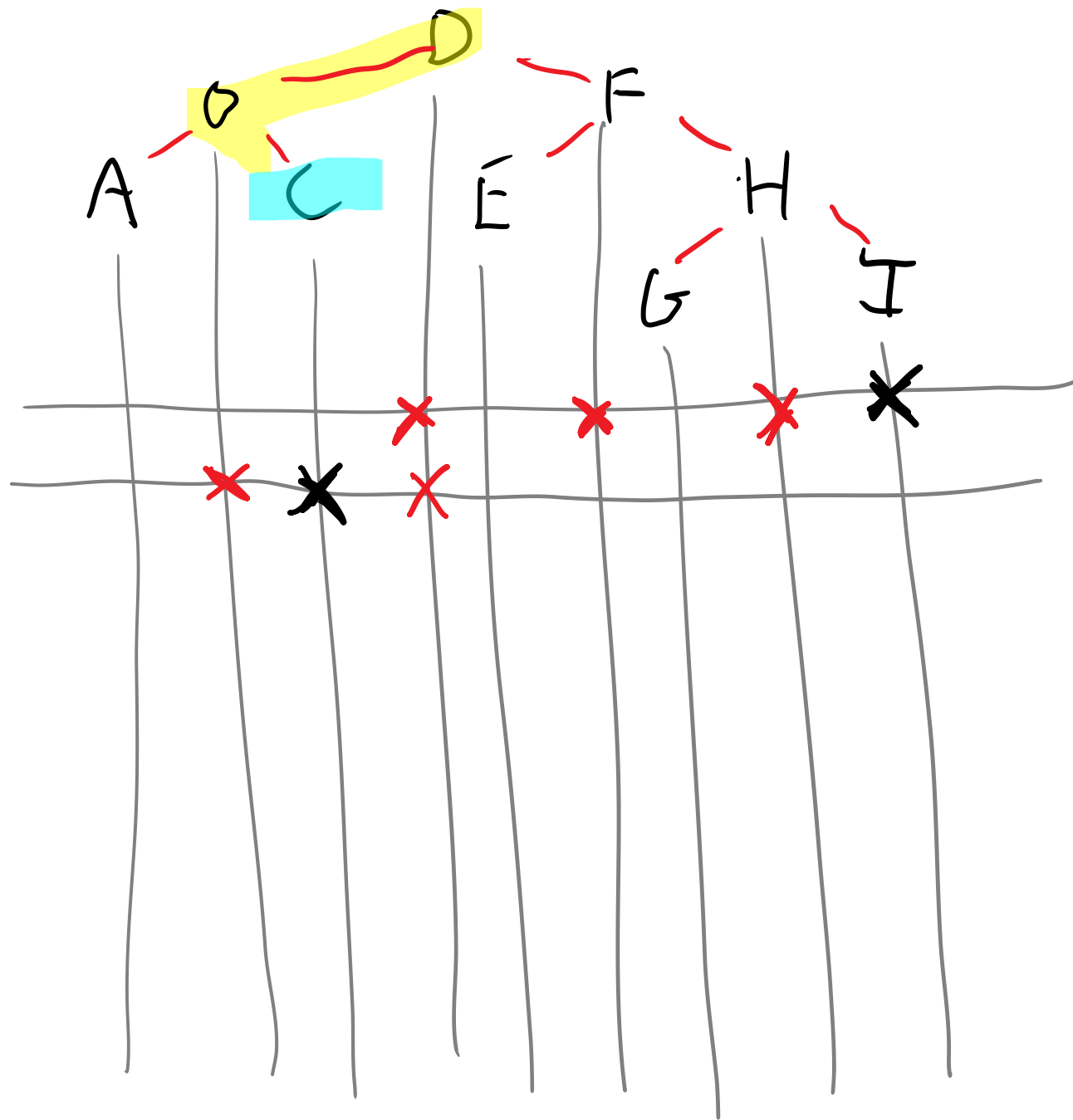
Search
for I



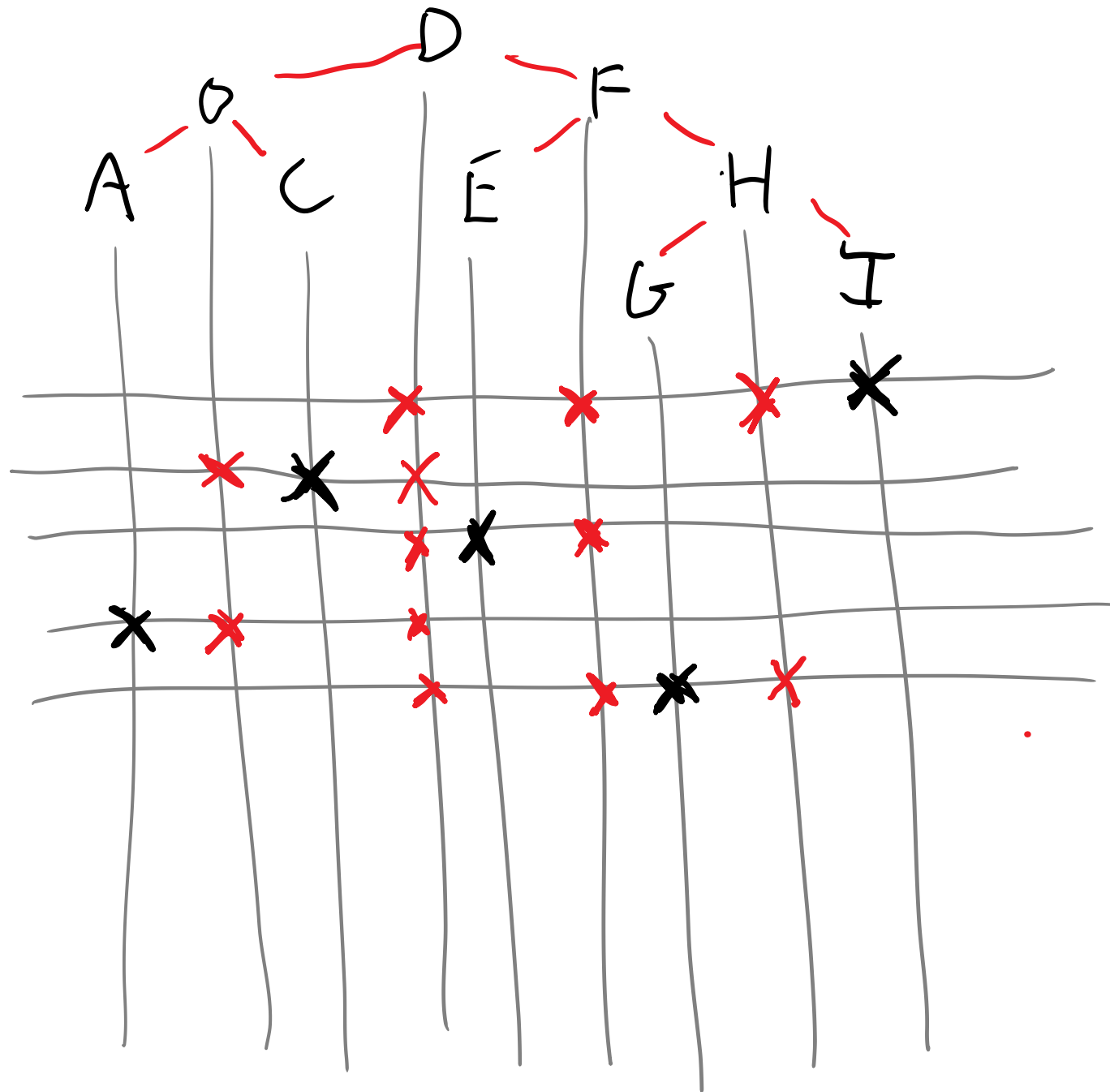
Search
for I



Search for
C

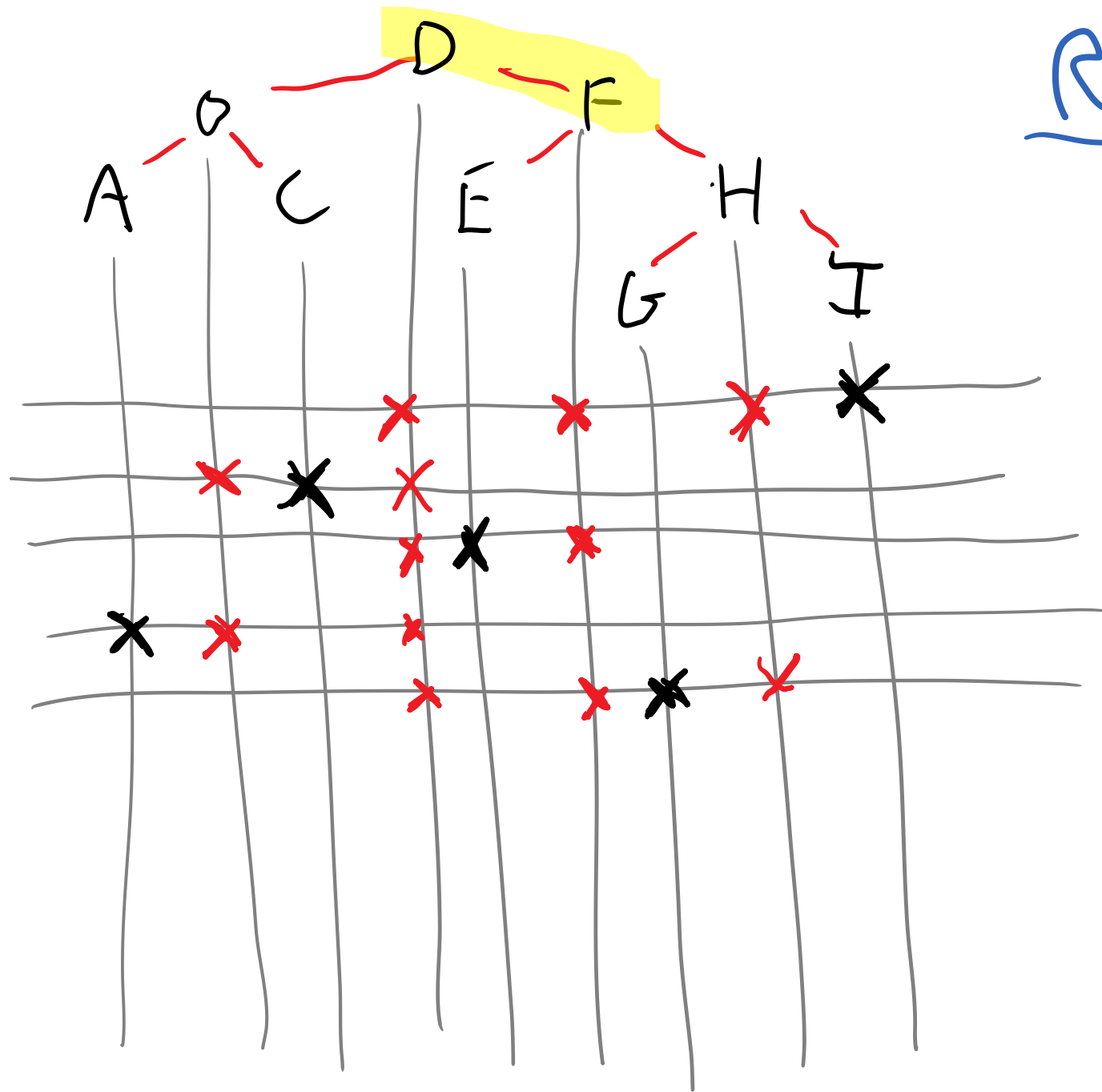


Search for
C

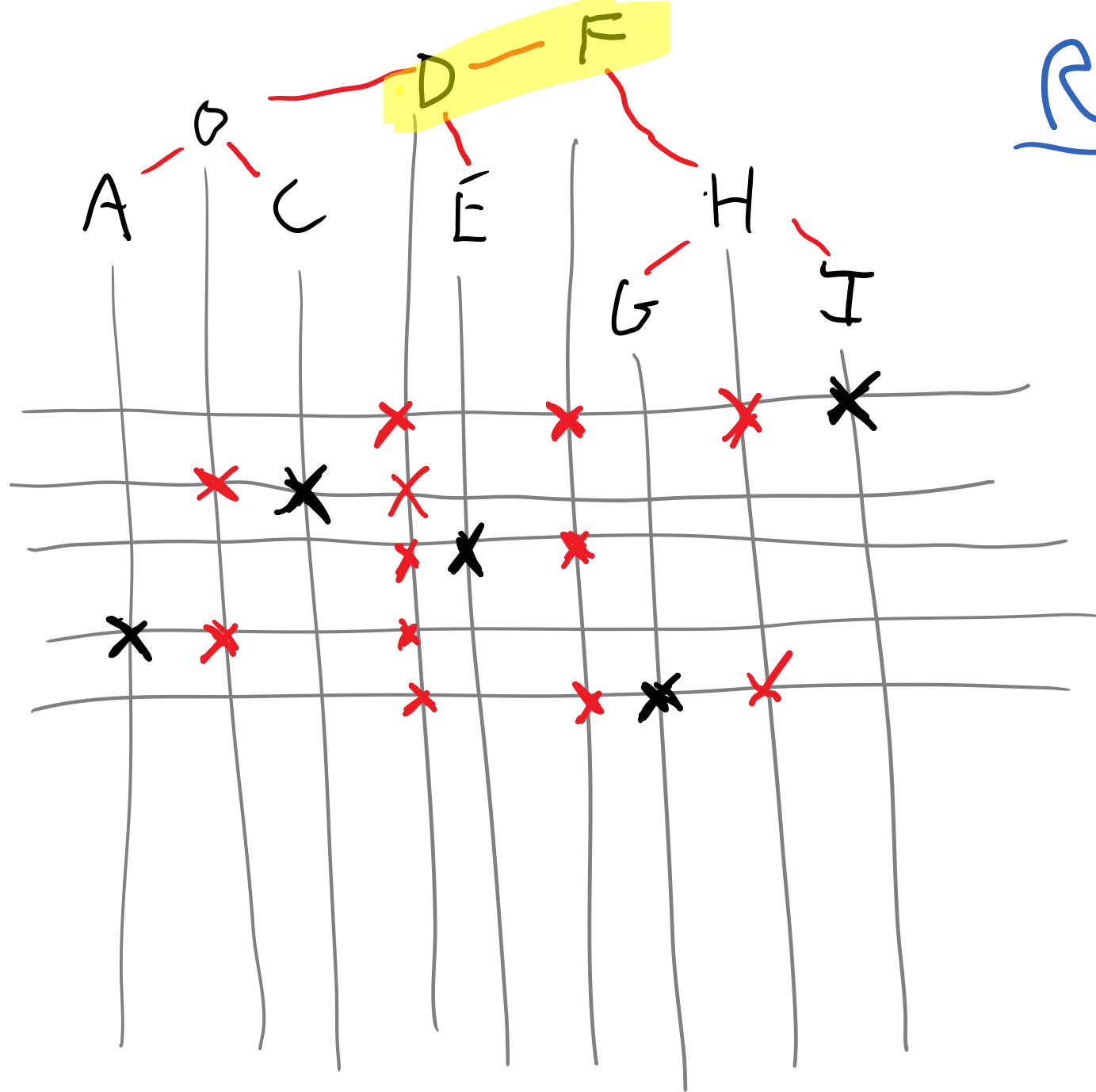


Search for

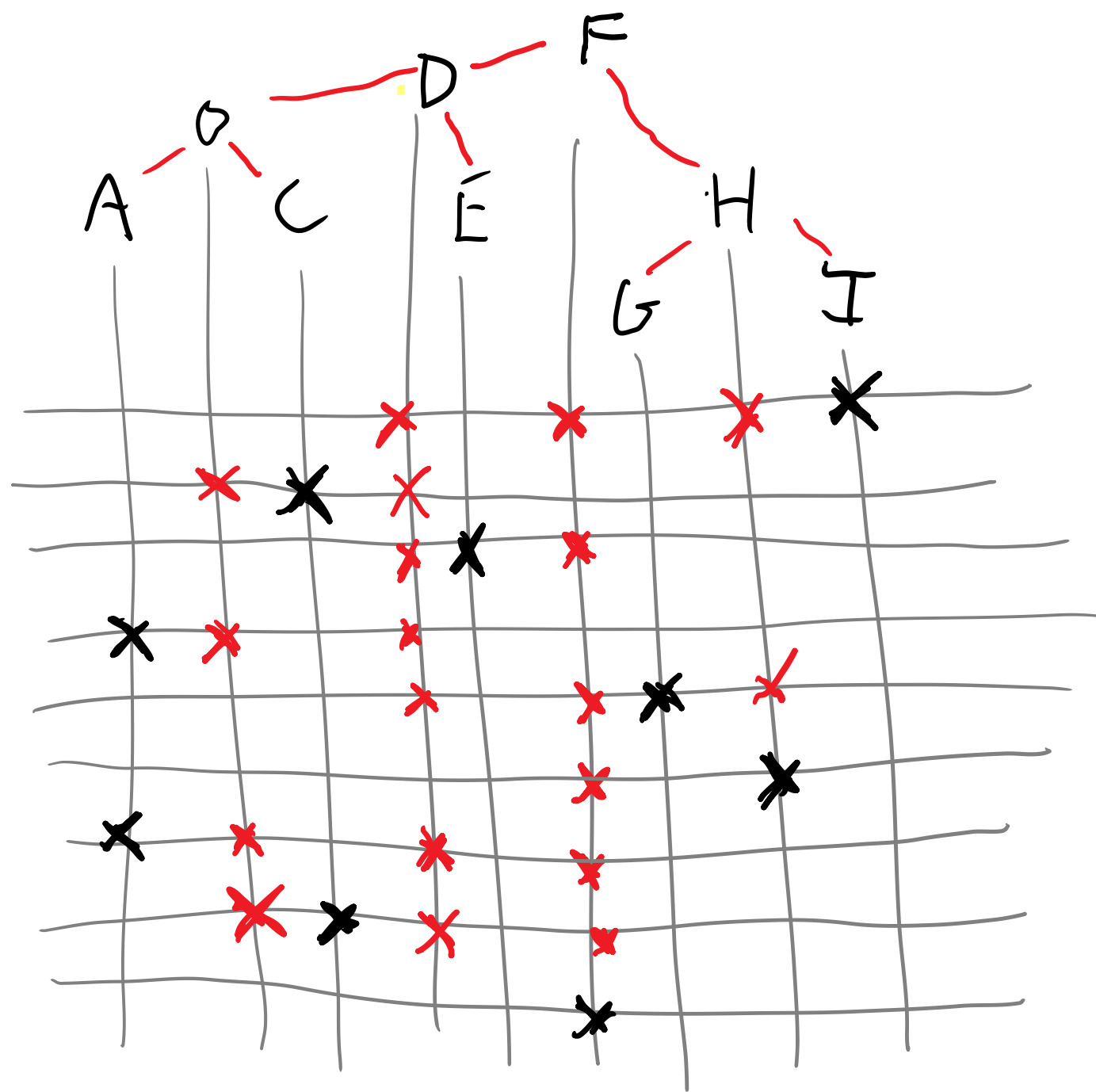
E
A
G



Rotate!

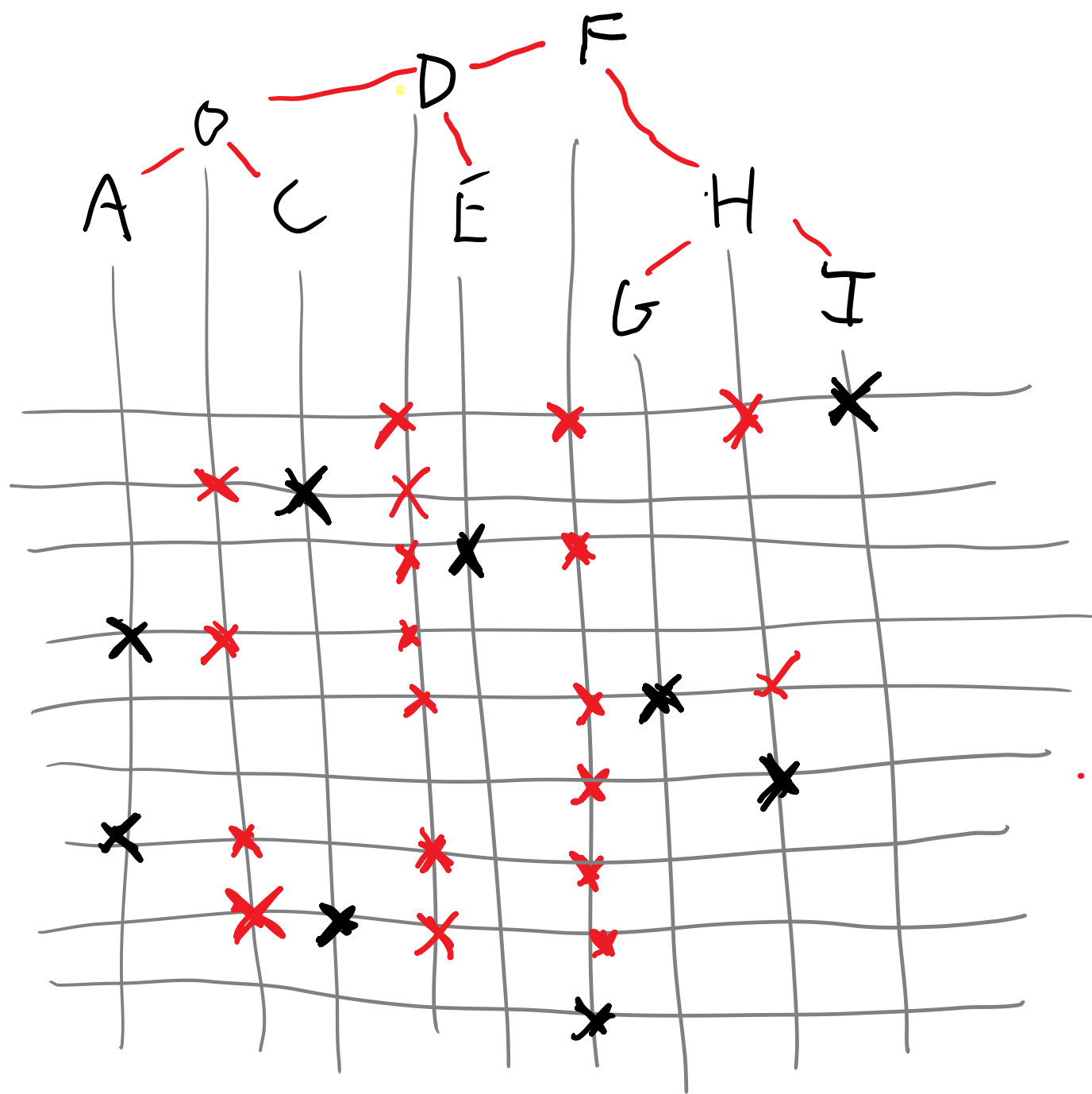


Rotate!



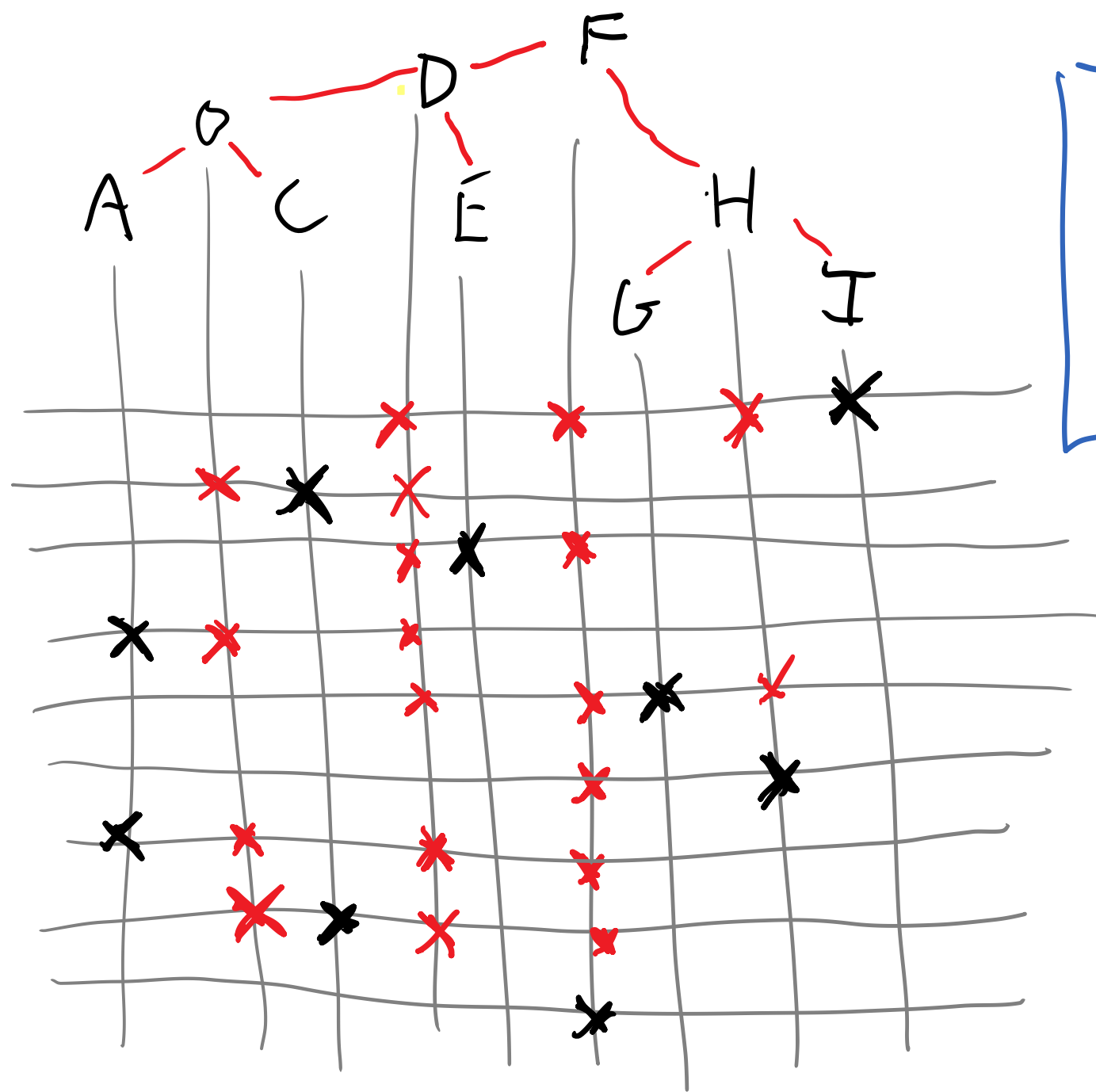
Search for

ITCII



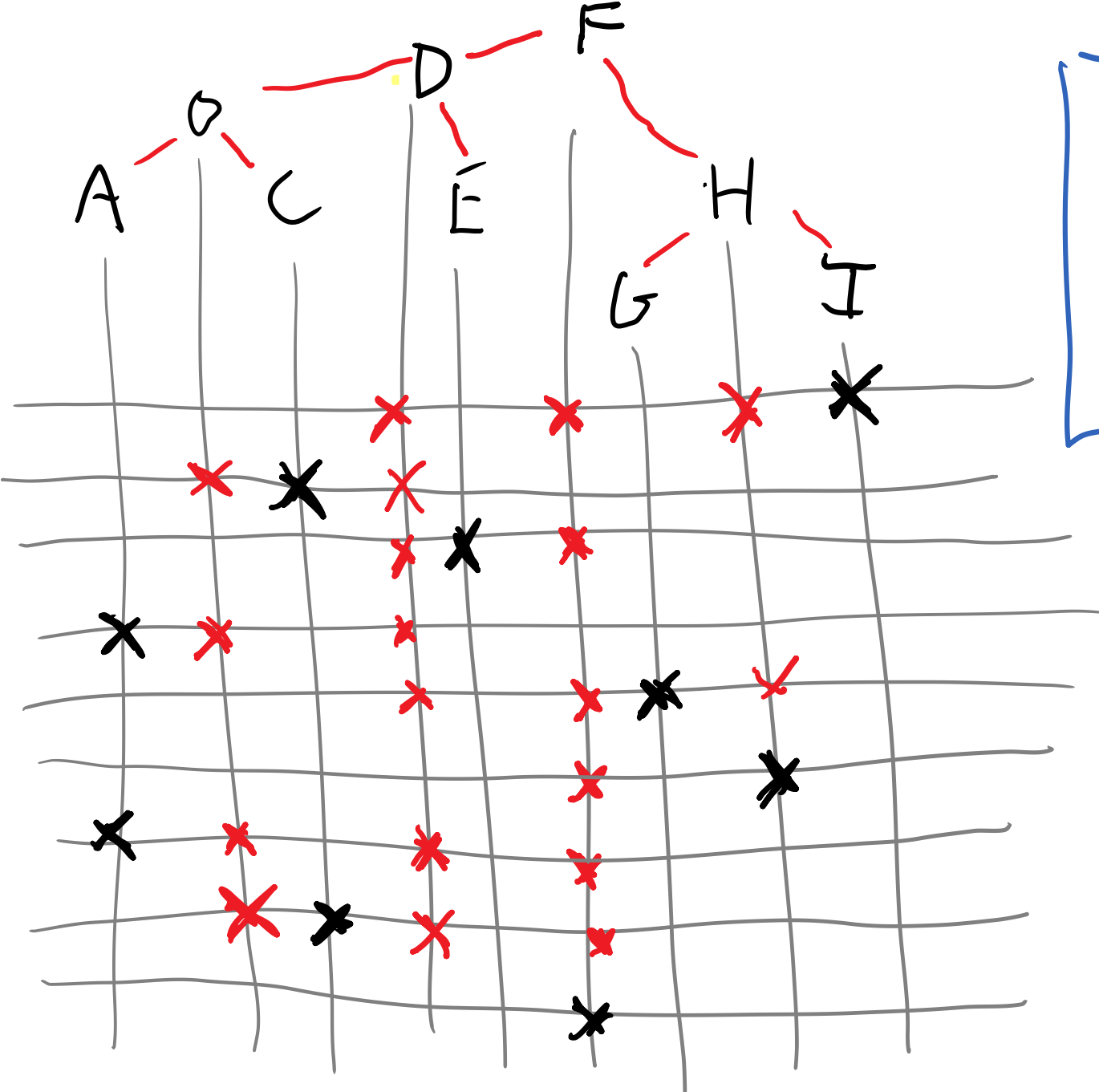
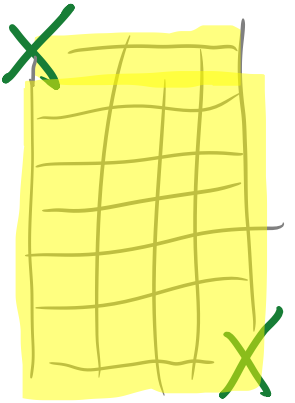
Cost to search in tree

=
Number of ~~XX~~ in this picture



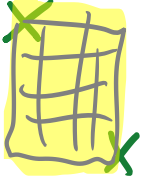
Stare
AND
Think

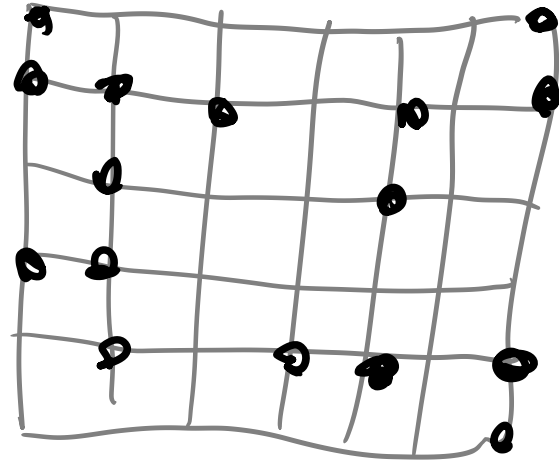
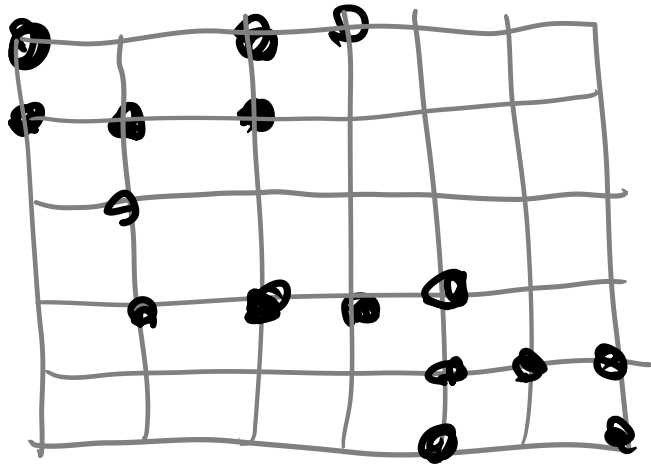
Can you Find



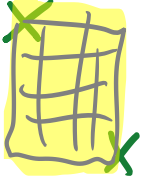
Stare
AND
Think

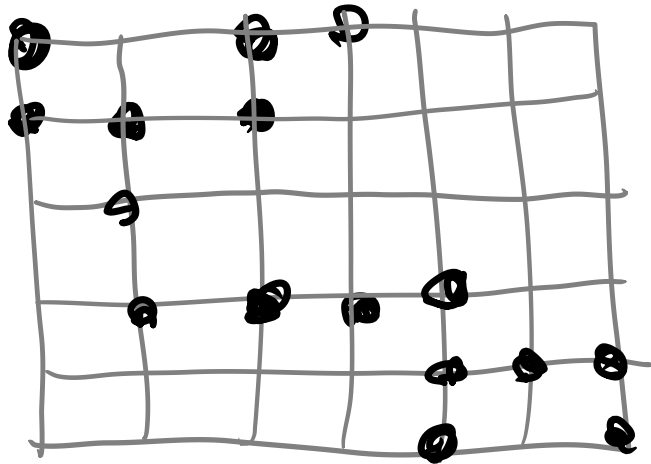
Definition:

No  \rightarrow "Arbitrarily Satisfied Set"

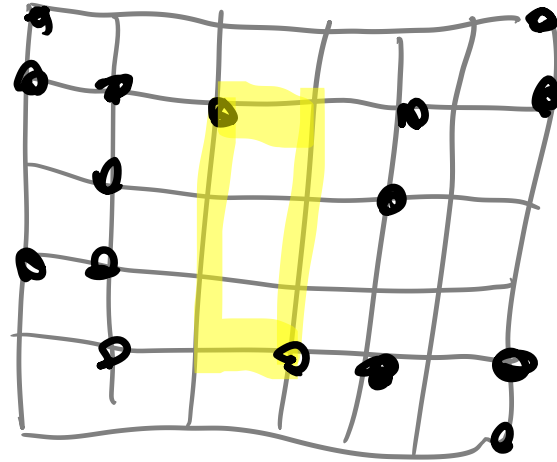


Definition:

No  \rightarrow "Arbitrarily Satisfied Set"

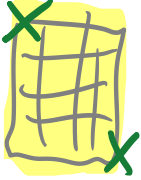


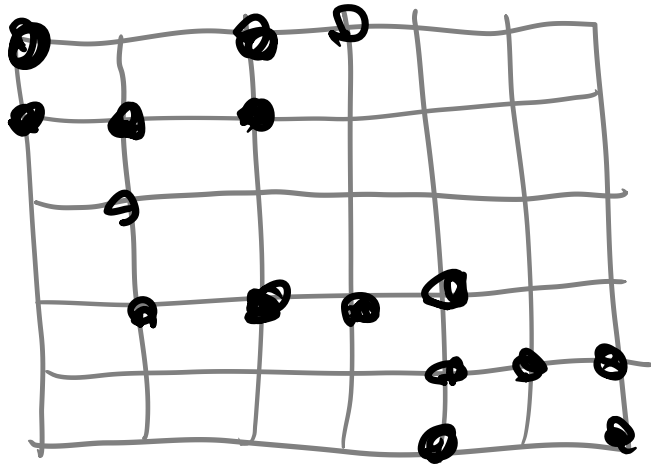
ASS



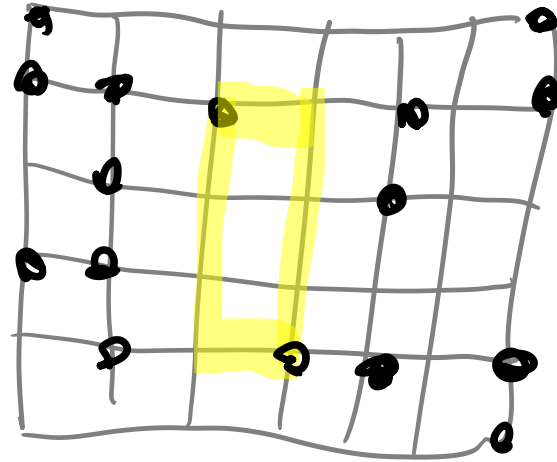
Not ASS

Definition:

No  \rightarrow "Arbitrarily Satisfied Set"



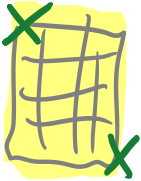
ASS

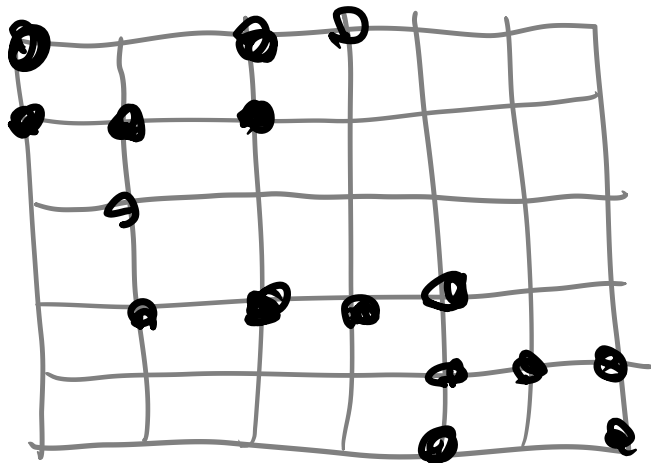


Not ASS

Theorem: Plotting any way to search for stuff
 \rightarrow ASS Points

Definition:

NO  → "Arbitrarily Satisfied Set"



ASS

What about the reverse way?

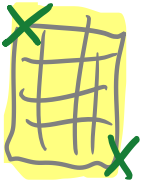
Given an ASS point set like

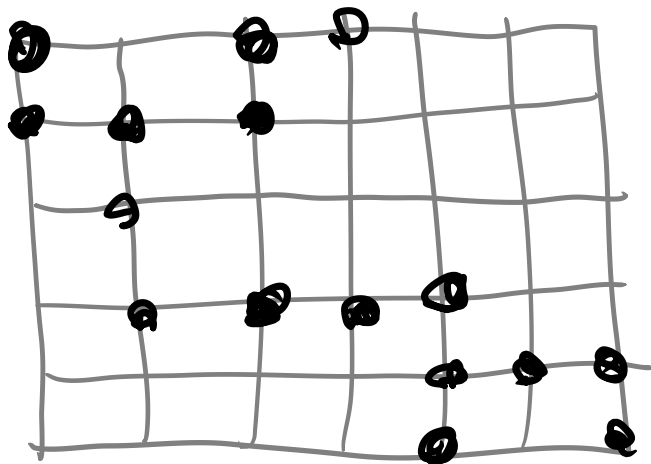


Can you find a way to find stuff so that this is the plot?

Theorem: Plotting any way to search for stuff
→ ASS Points

Definition:

No  → "Arbitrarily Satisfied Set"



ASS

What about the reverse way?

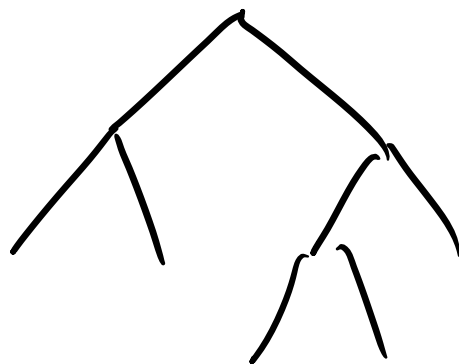
Given an ASS point set like



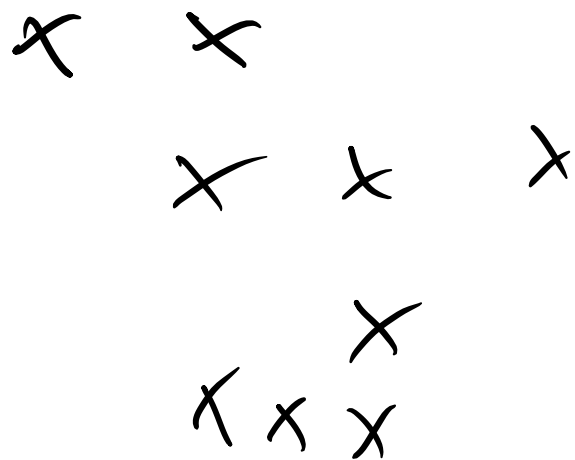
Can you find a way to find stuff so that this is the plot? **YES!**

Theorem: Plotting any way to search for stuff
→ ASS Points

So we can forget about



And work with



The best way to find stuff

Looking for C, A, F, D, B, E

	A	B	C	D	E	F
C						
A						
F						
B						
D						
E						

The best way to find stuff

Looking for C, A, F, D, B, E

	A	B	C	D	E	F
C			X			
A	X					
F						X
B		X				
D				X		
E					X	

The best way to find stuff

Looking for C, A, F, D, B, E

	A	B	C	D	E	F
C			X			
A	X					
F						X
B		X				
D				X		
E					X	

What is the minimum number of X's to add to make this AS?

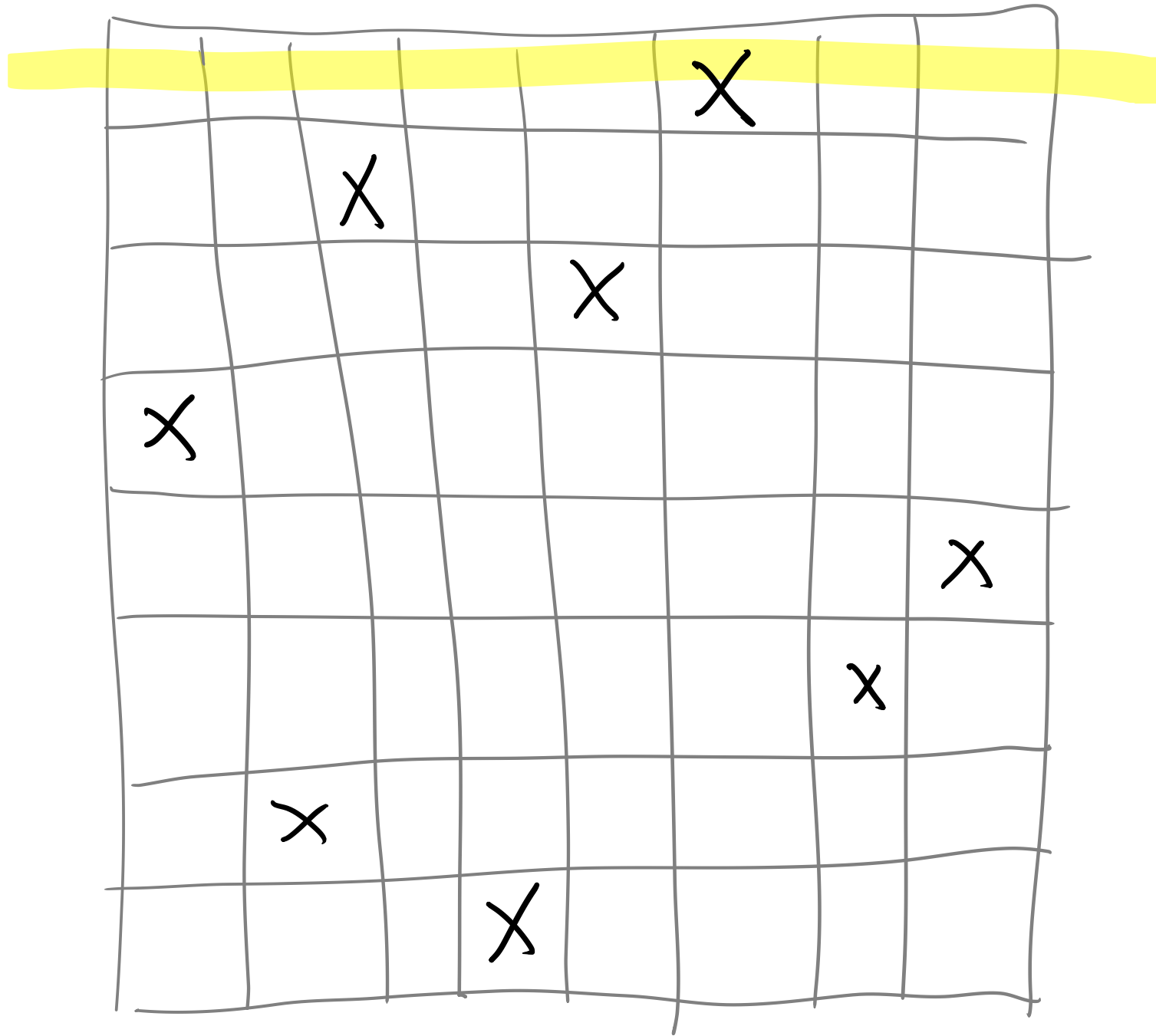
The best way to find stuff

Looking for C, A, F, D, B, E

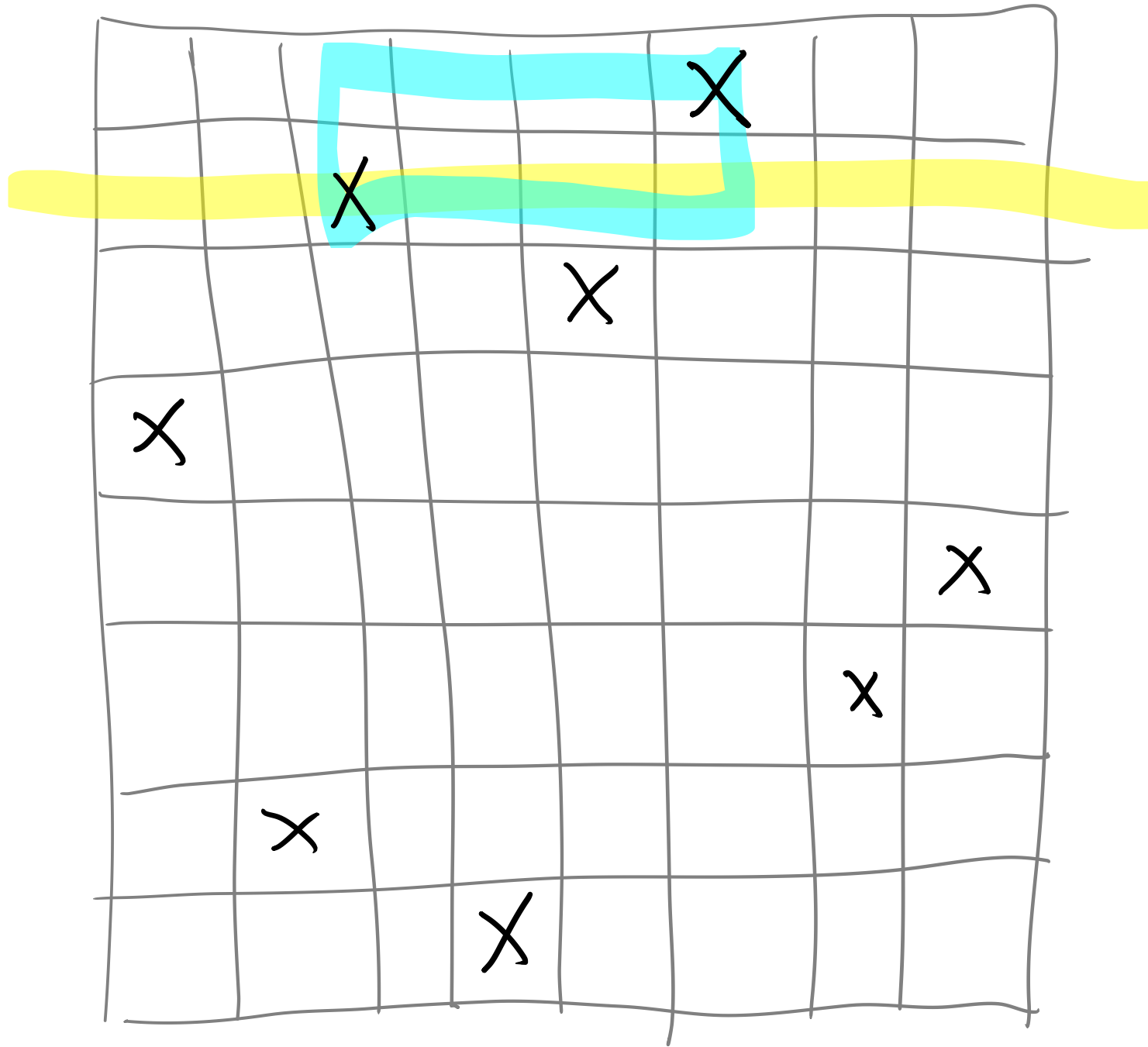
	A	B	C	D	E	F
C			X			
A	X		X			
F			X	X		X
B	X	X	X	X		
D				X	X	X
E					X	

What is the minimum number of X's to add to make this AS?

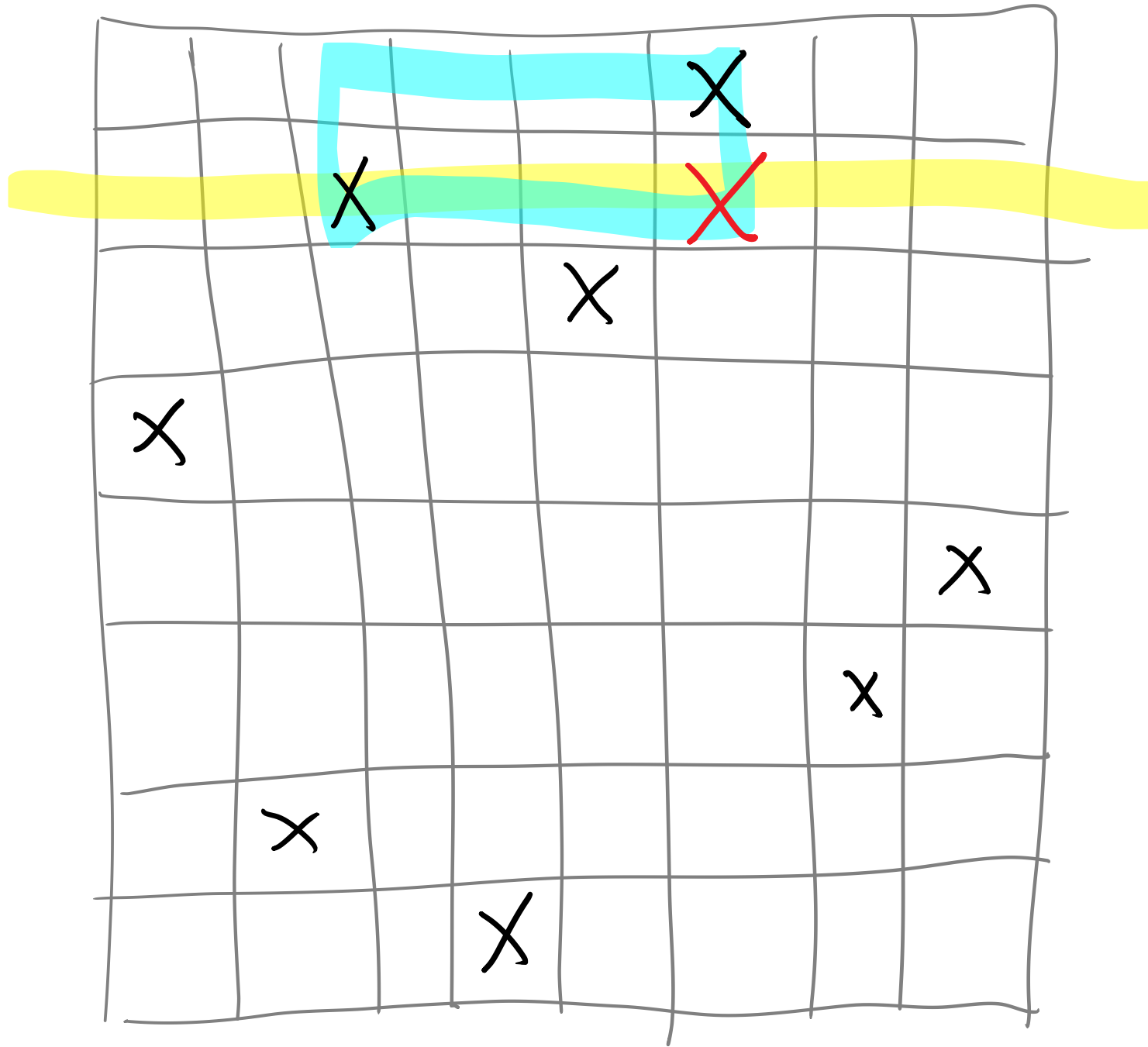
8 I think



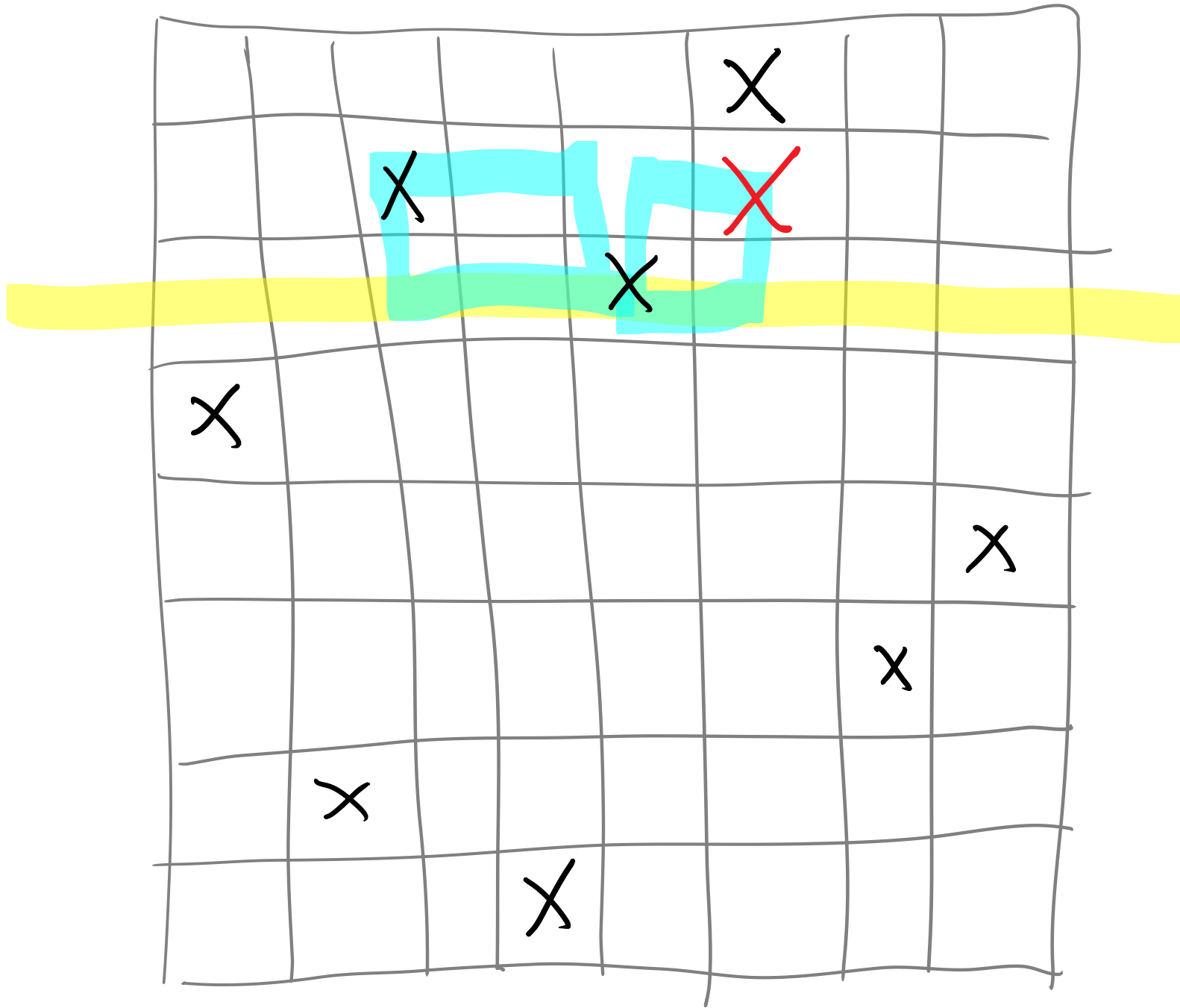
What is
the most
obvious way
to add
points to
make this
AS3
?
.



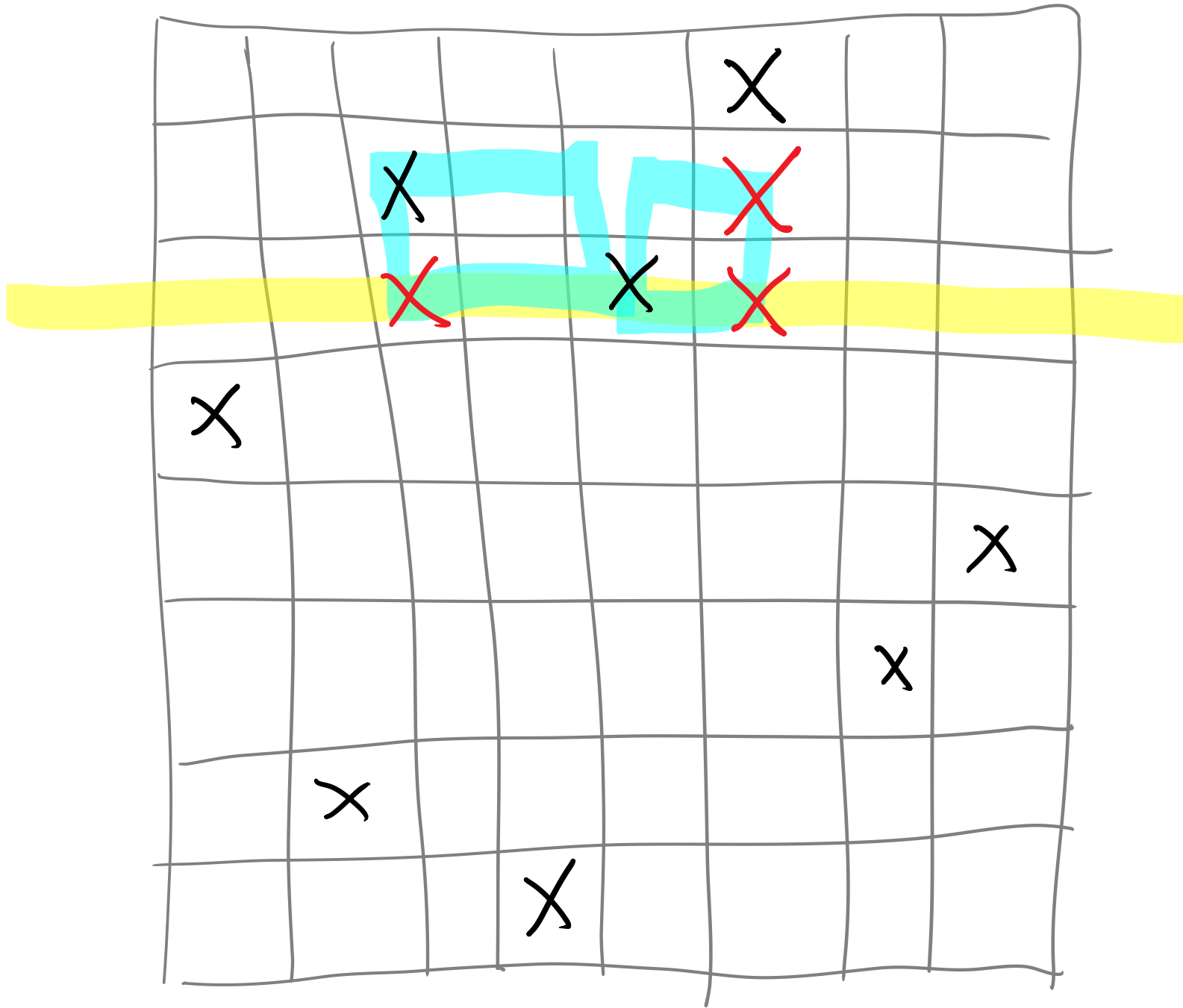
What is
the most
obvious way
to add
points to
make this
ASS
?
.



What is
 the most
 obvious way
 to add
 points to
 make this
 ASS
 ?
 .



What is
 the most
 obvious way
 to add
 points to
 make this
 ASS
 ?
 .



What is
the most
obvious way
to add
points to
make this
ASS
?
.

					X		
		X			X		
		X		X	X		
X		X					
							X
						X	
	X						
			X				

What is
the most
obvious way
to add
points to
make this
ASS
?
.

					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
						X	
	X						
			X				

What is
the most
obvious way
to add
points to
make this
ASS
?
.

					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
	X						
			X				

What is
the most
obvious way
to add
points to
make this
AS3
?
.

					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
		X			X		
X	X	X			X		
			X				

What is
the most
obvious way
to add
points to
make this
AS3
?
.

					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
X	X	X			X		
		X	X	X	X		

What is
the most
obvious way
to add
points to
make this
ASS
?
.

					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
X	X	X			X		
		X	X	X	X		

What is
the most
obvious way
to add
points to
make this
ASS
?
.

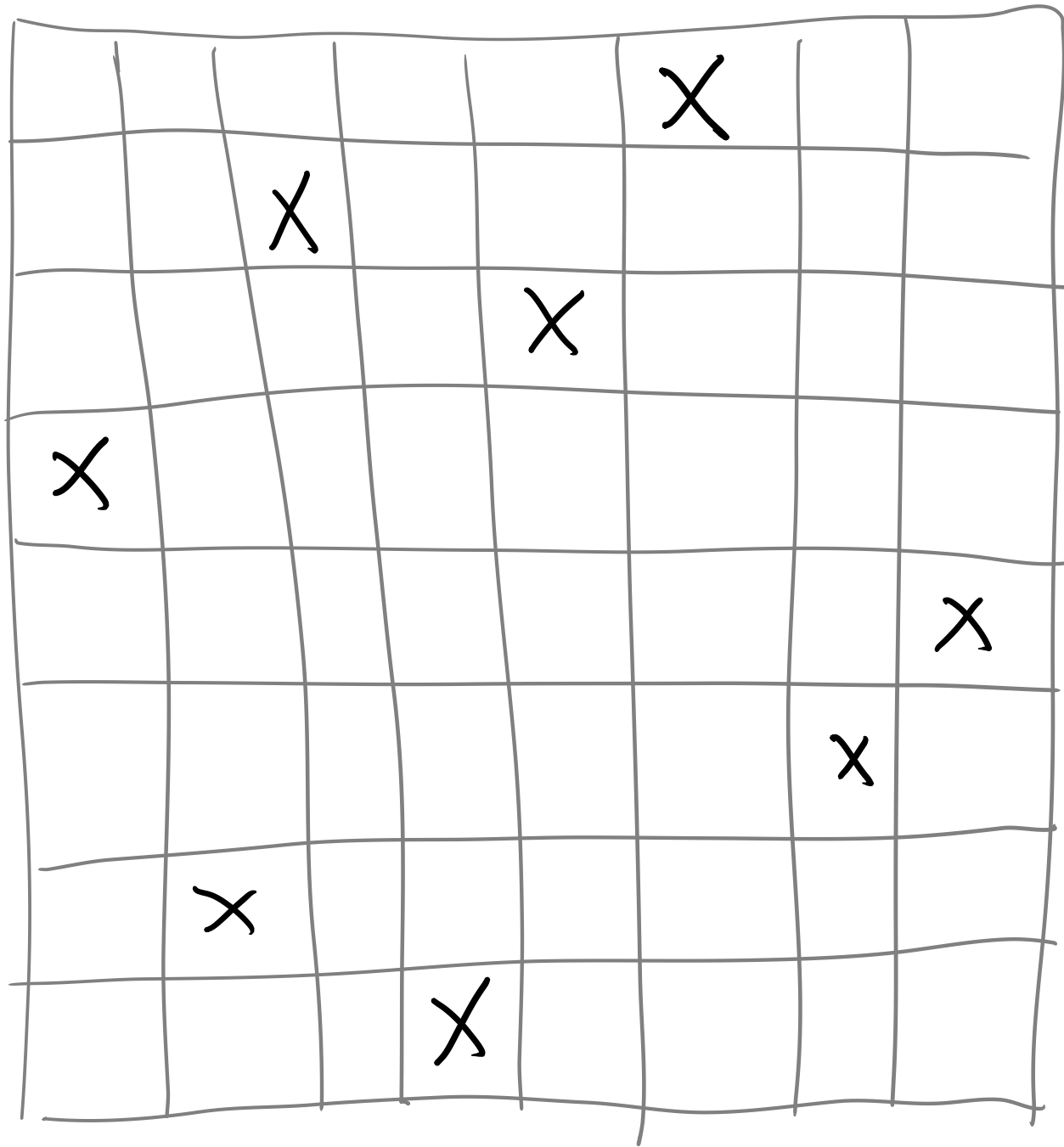
					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
X	X	X			X		
		X	X	X	X		

Is this
the minimum
of X's?

					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
X	X	X			X		
		X	X	X	X		

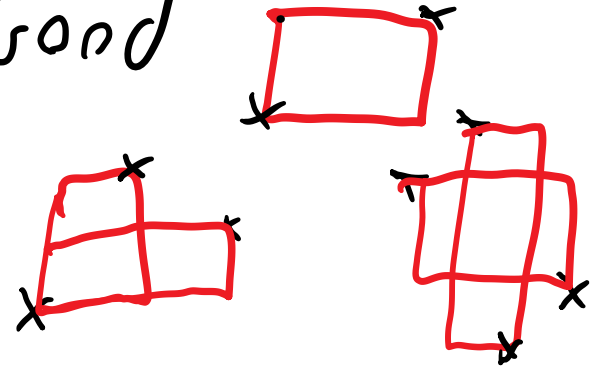
Is this
the minimum
of X's?

No, but it
appears to be
at most
double the
minimum

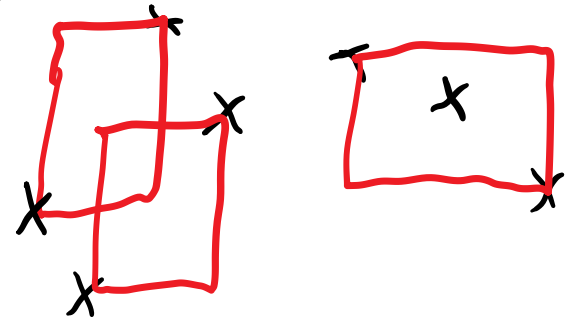


Independent Rectangles

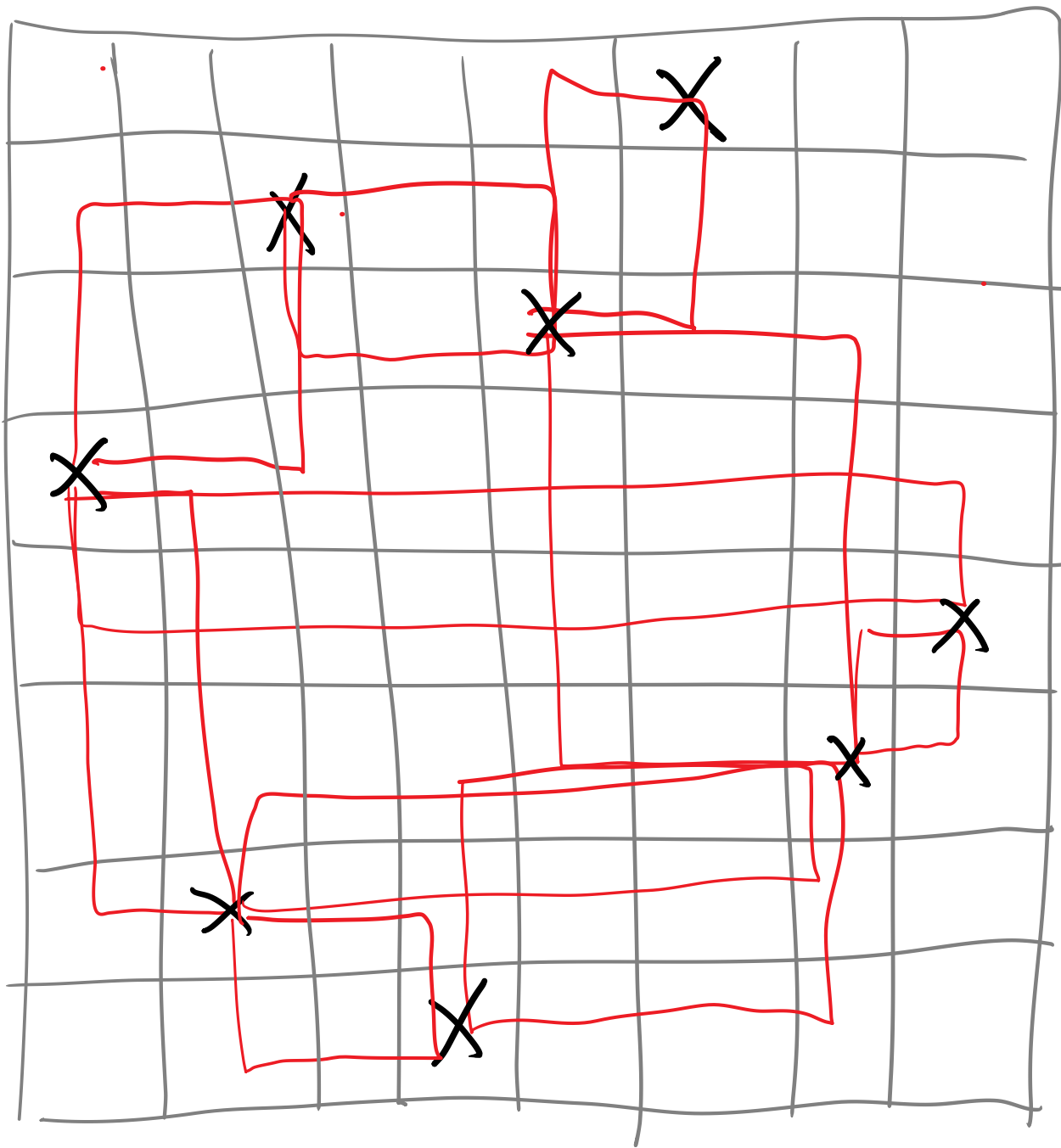
Good



Bad

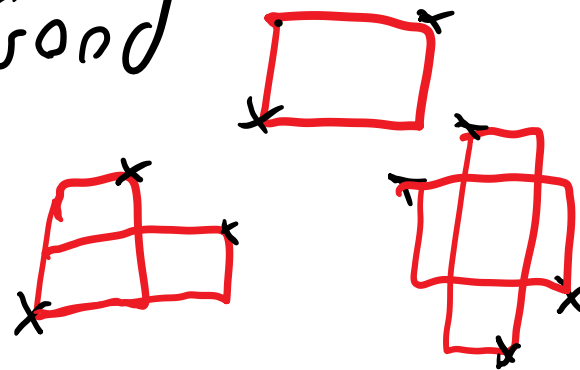


10
IND
Rects

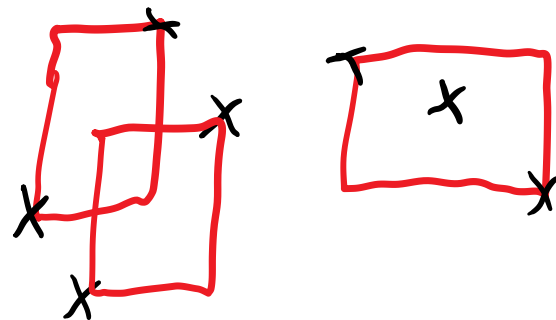


Independent Rectangles

Good



Bad



Independent Rectangles = Lower Bound

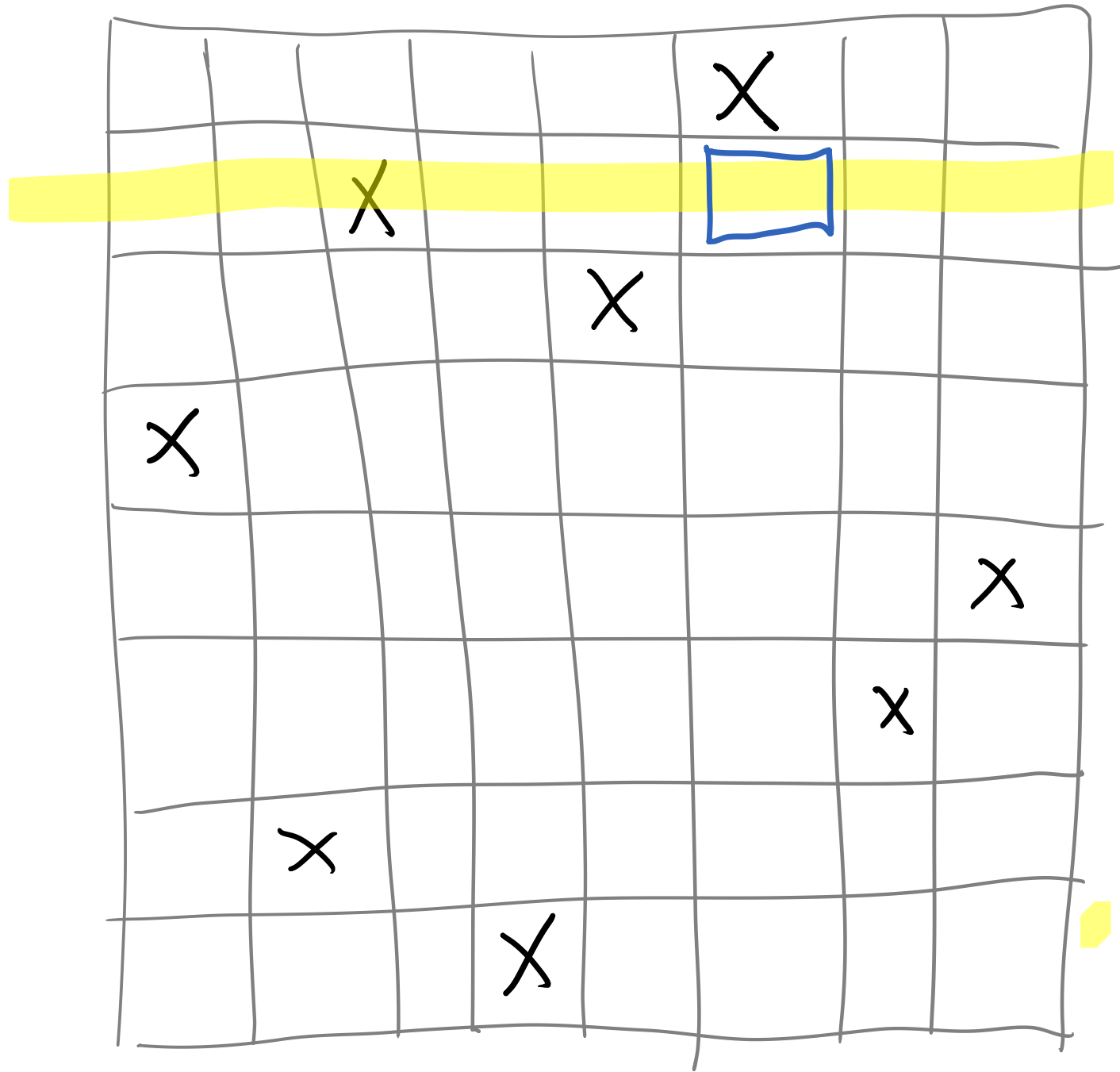
of ind Rects \leq OPT(X)
in geometric
view of X

Independent Rectangles = Lower Bound

MAX # of ind Rects \leq OPT(X)
in geometric
view of X

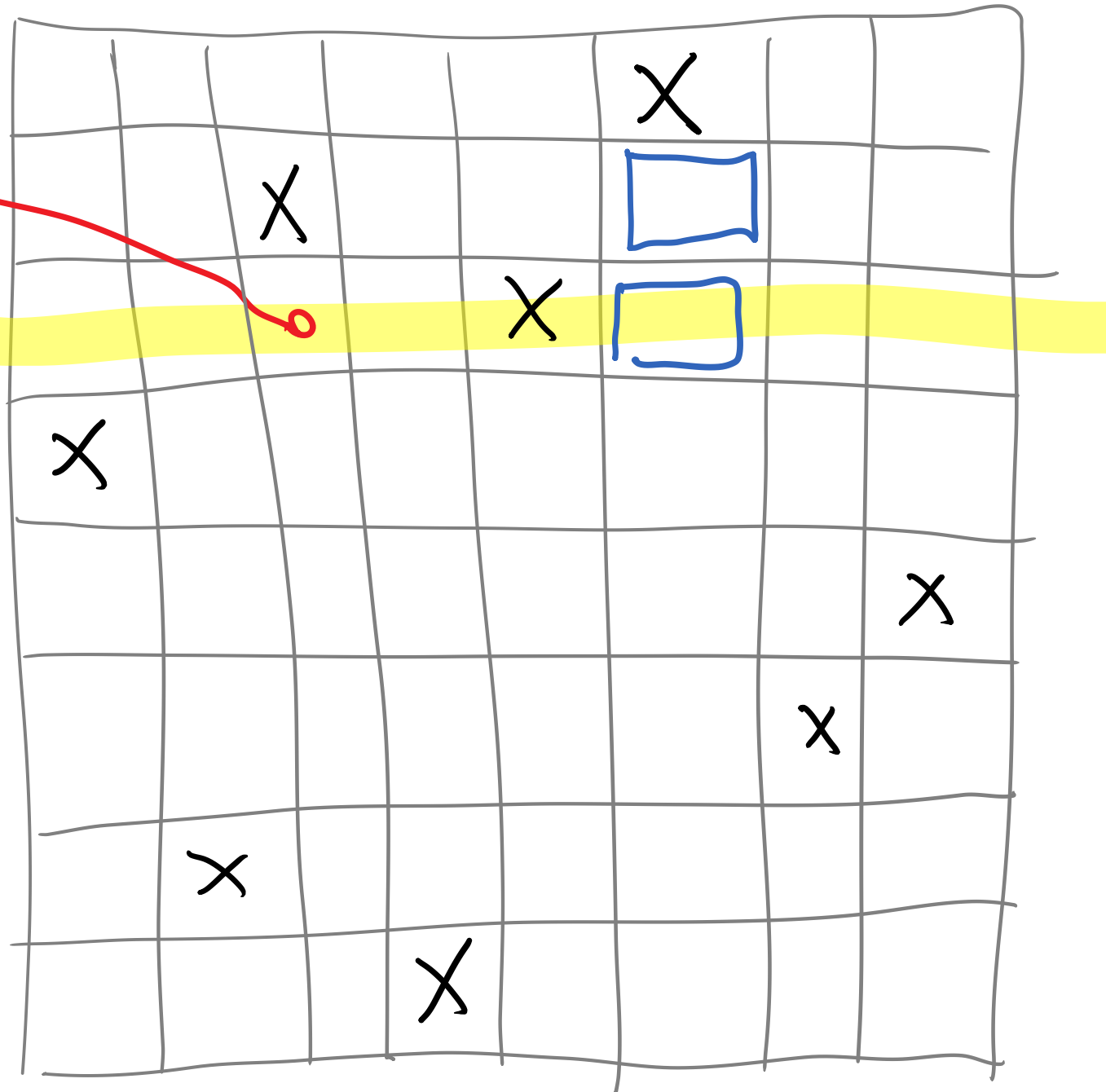
					X		
		X					
				X			
X							
							X
						X	
	X						
			X				

Right only

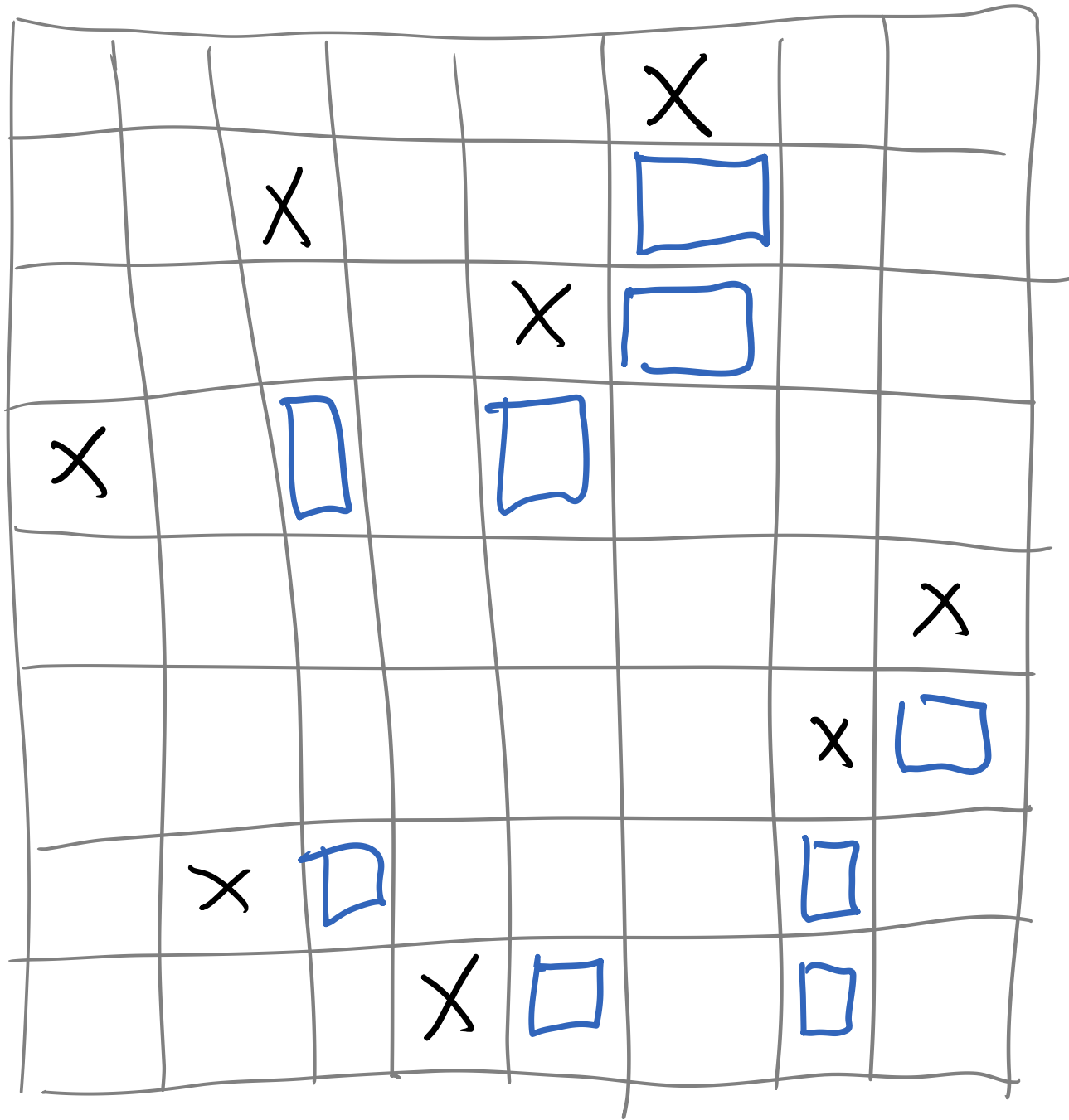


Right only

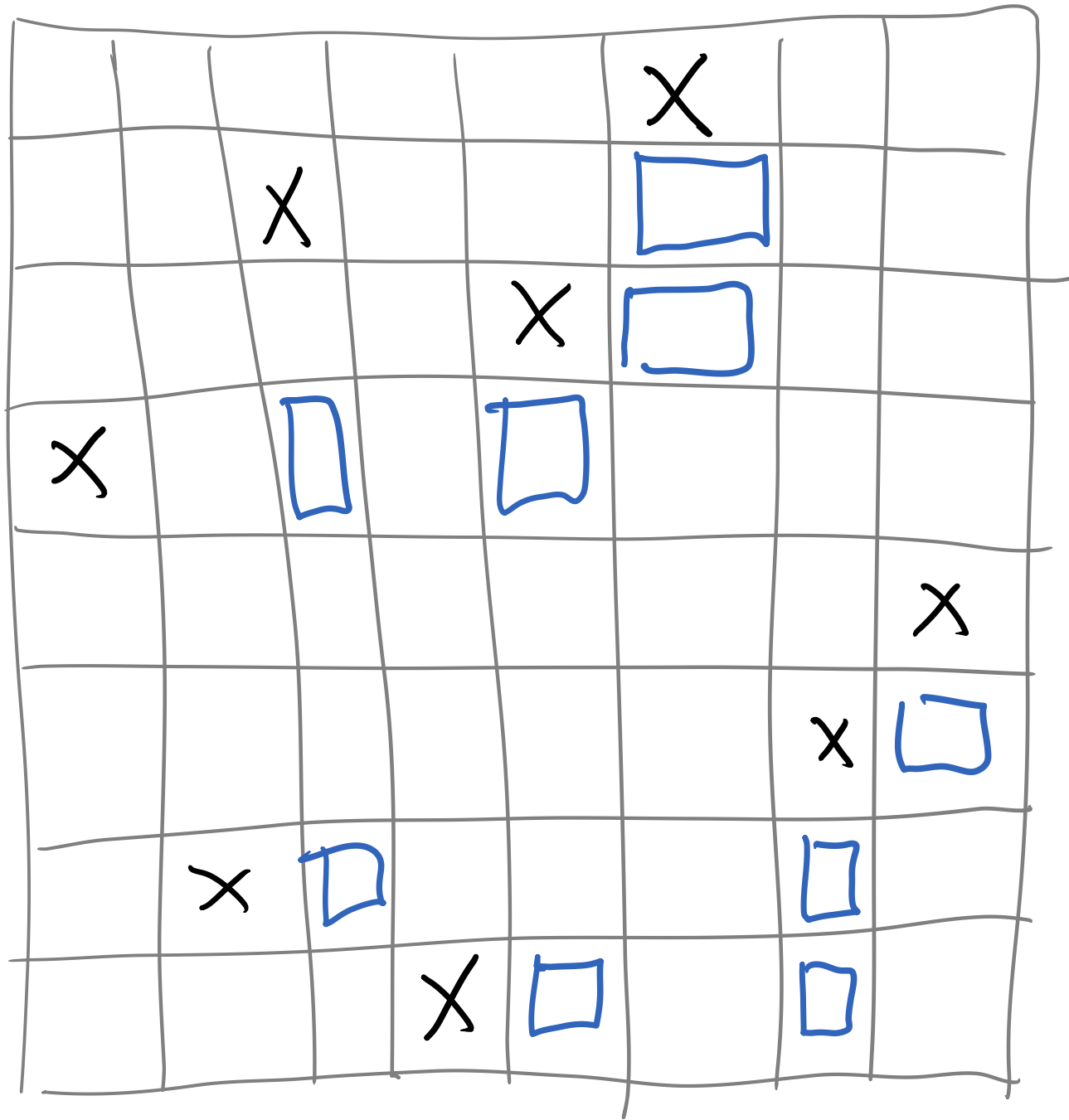
Don't add this



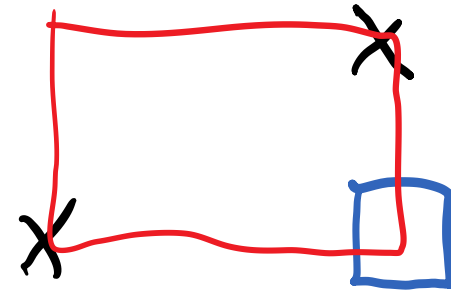
Right only

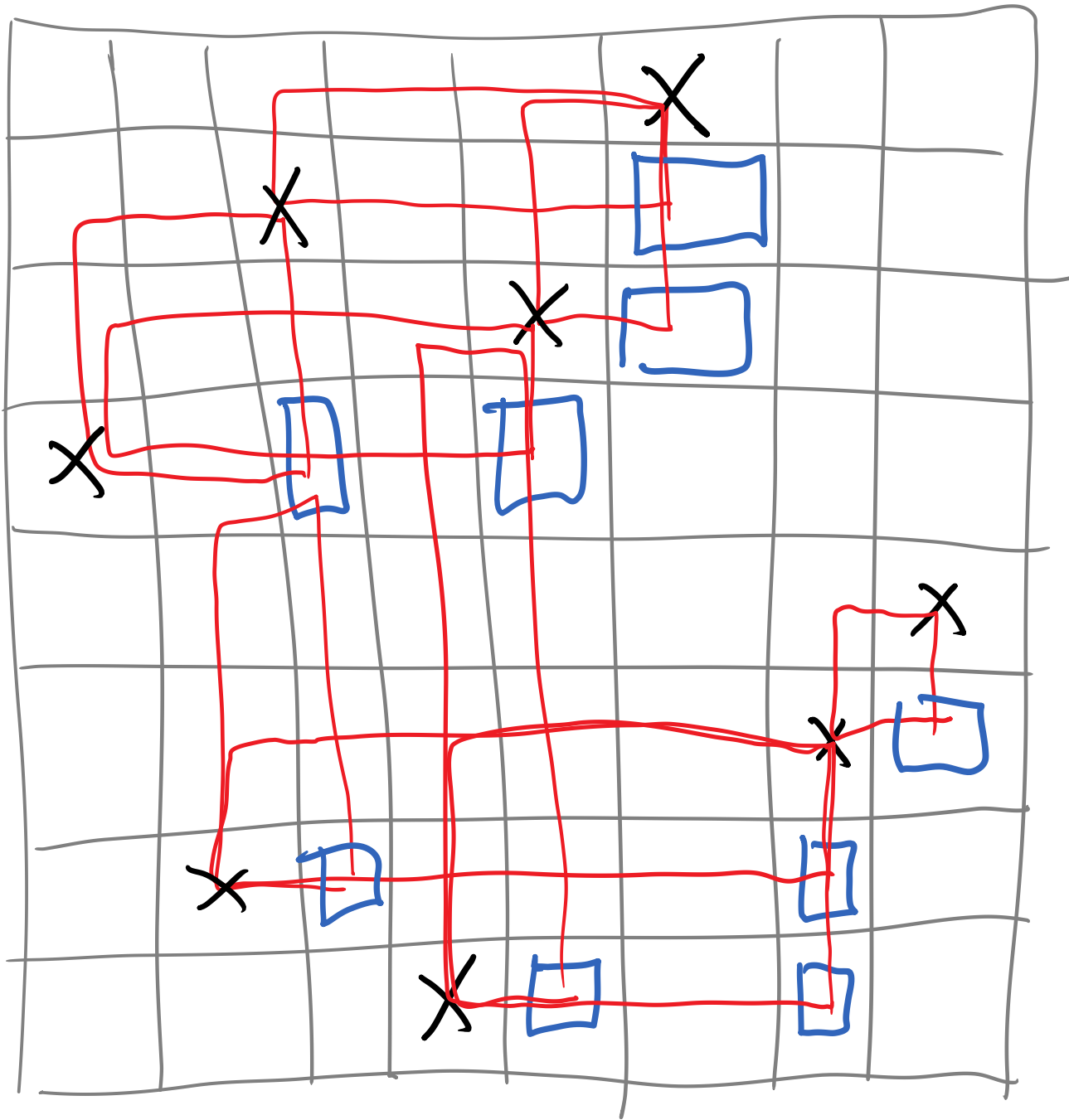


Right only

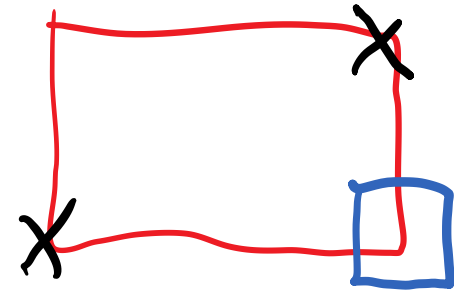


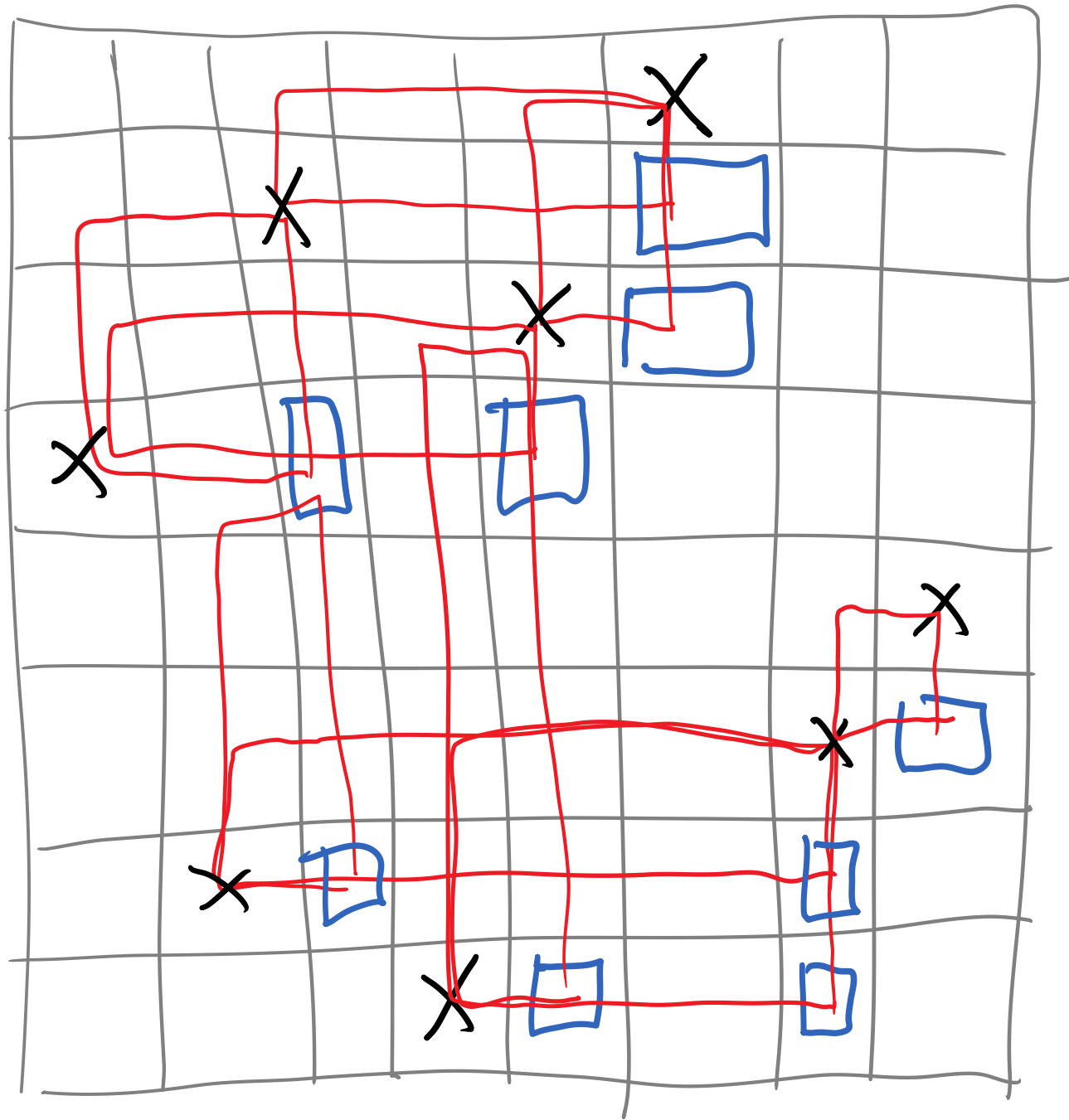
Draw Rectangles



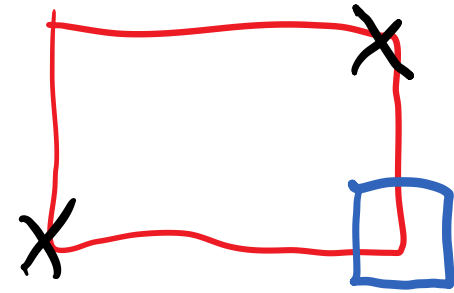


Draw Rectangles

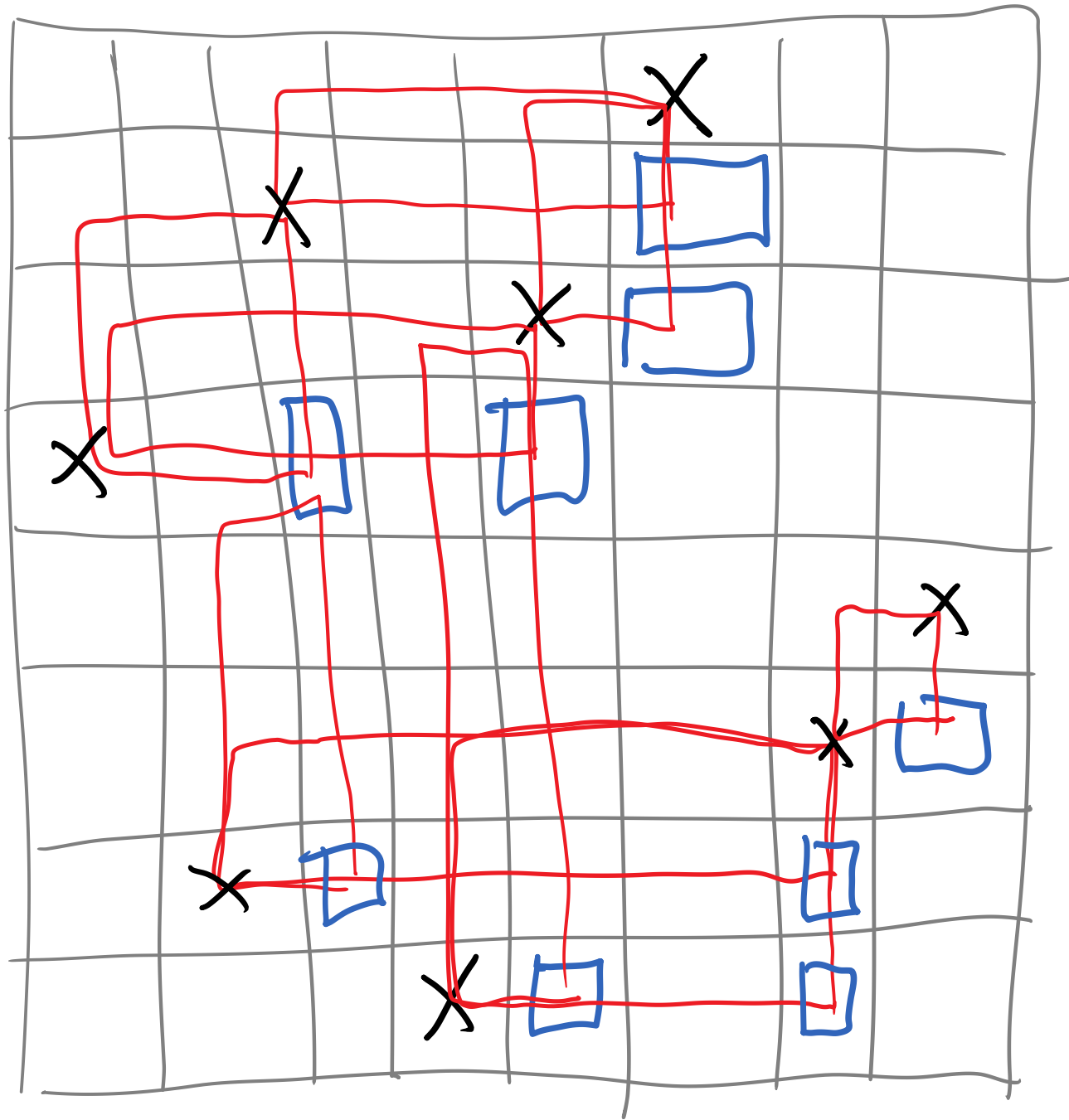




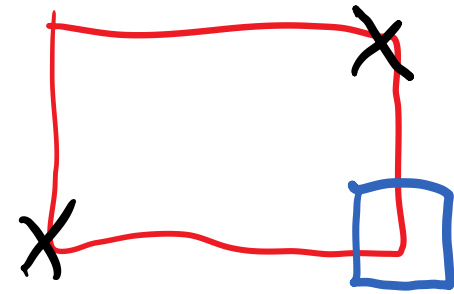
Draw Rectangles



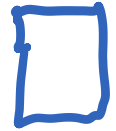
They are Independent!



Draw Rectangles



They are Independent!

Thus #  is a lower bound to make this ASS!

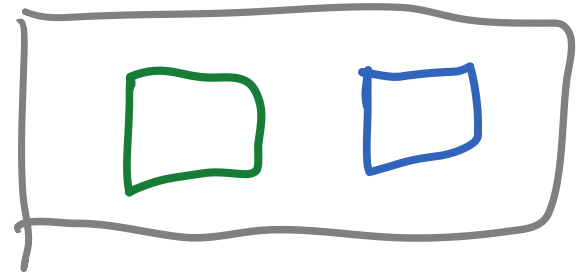
					X		
		X			□		
		□		X	□		
X		□		□			
□				□	□		X
					□	X	□
□	X	□				□	
	□	□	X	□		□	

Left only
Right only

Number of □□
is less than
the minimum
X needed
to make it ASS

					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
X	X	X					
		X	X	X	X		

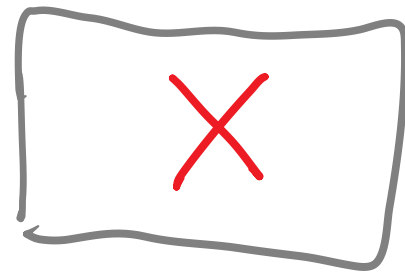
					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
X	X	X					
		X	X	X	X		



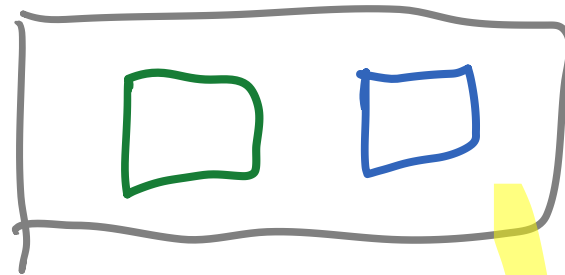
is less than

Minimum X
to make it ASS

is less than



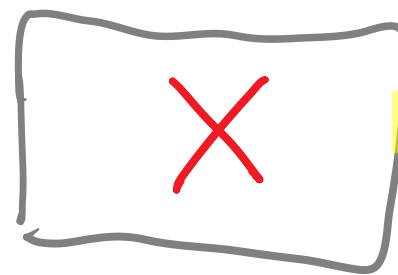
					X		
		X			X		
		X		X	X		
X		X					
		X			X		X
					X	X	X
X	X	X					
		X	X	X	X		



is less than

Minimum X
to make it ASS

is less than



related?

				X		
	X					
			X			
X						
						X
					X	
	X					
		X				

Questions

Find minimal
ASS superset: Per NPL

				X		
	X					
			X			
X						
						X
					X	
	X					
		X				

Questions

Find minimal
ASS superset: Per N/C

Approximate minimal
ASS superset.

$O(\log \log n)$ -approx known
but nothing better

				X		
	X					
			X			
X						
						X
					X	
	X					
		X				

Questions

Find minimal
ASS superset: Per N/C

Approximate minimal
ASS superset.

$O(\log \log n)$ -approx known
but nothing better

problem is "secondary
effects"

				x	X		
x		X		x			
x				X	x		
X		x					
						X	X
		x	x			x	
	x	x	x				
			X				

Questions

Find minimal
ASS superset: Per N/C

Approximate minimal
ASS superset.

$O(\log \log n)$ -approx known
but nothing better

problem is "secondary
effects"

				x	X		
x		X		x			
x				X	x		
X		x					
						x	X
		x	x				x
	x	x	x				
			X				

Questions

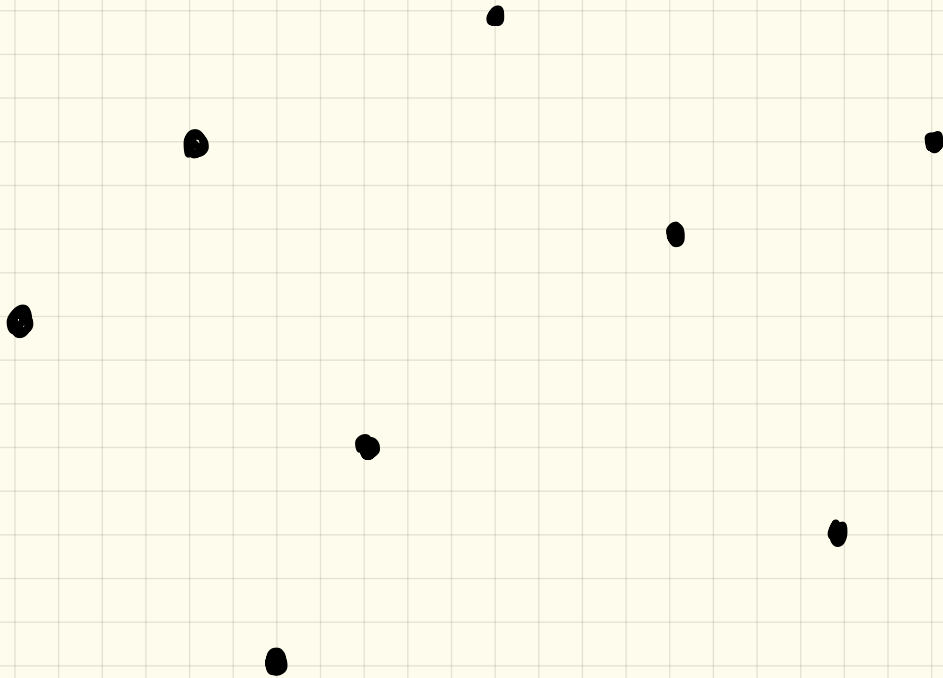
Find minimal
ASS superset: Per NPL

Approximate minimal
ASS superset.

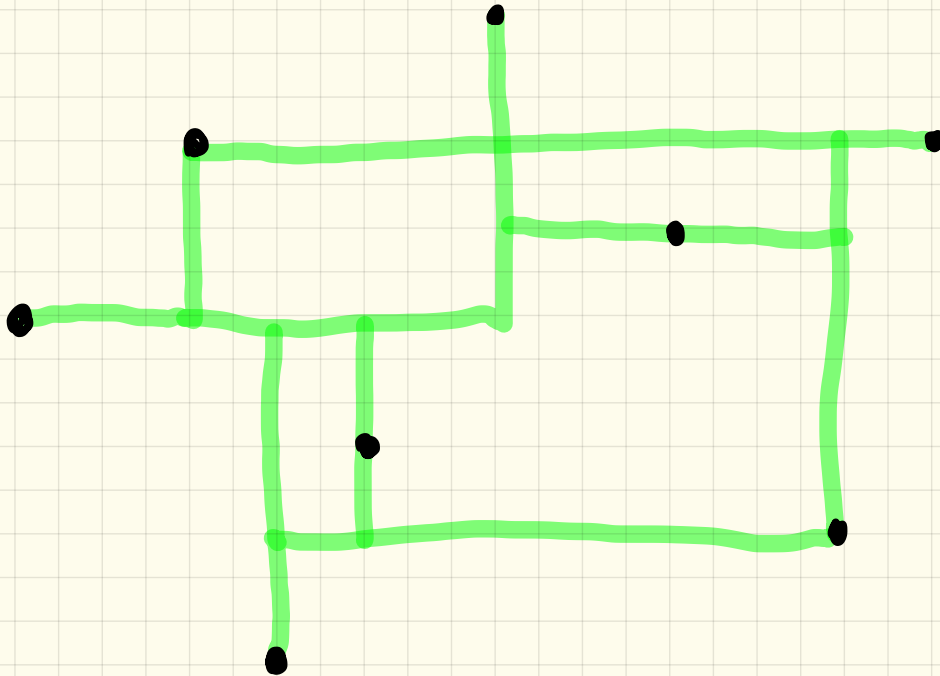
$O(\log^2 n)$ -approx known
but nothing better

problem is "secondary
effects"

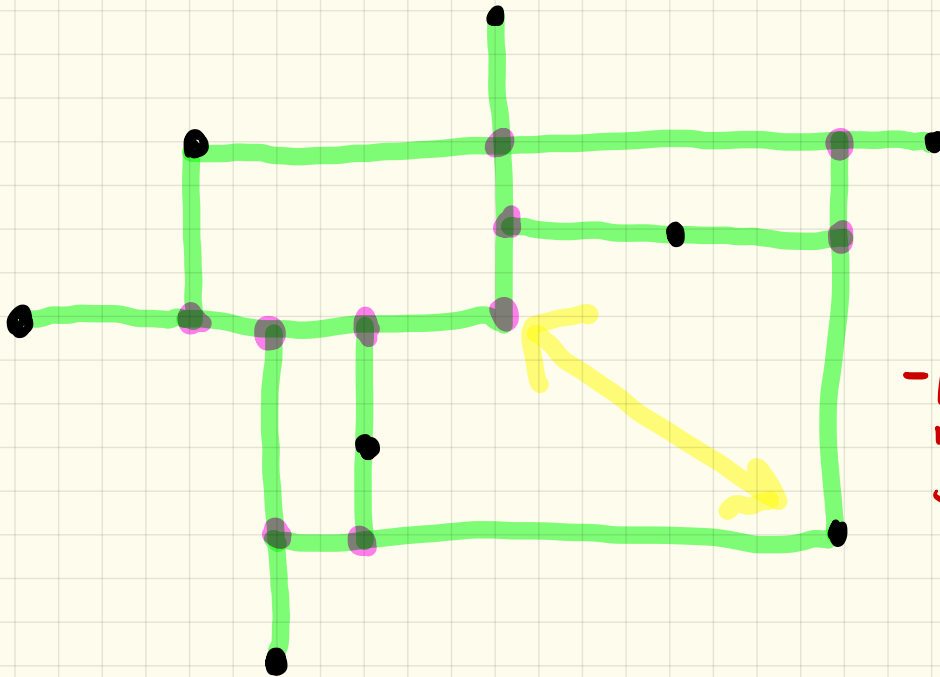
Seems Similar To Minimum
Manhattan Network



Seems Similar To Minimum
Manhattan Network



Seems Similar To Minimum Manhattan Network



- Measure
of interest
is # of
added junctions

- But network
must treat
junctions as
points

PART. = .

Cache Oblivious

+

Persistence

PART. = .

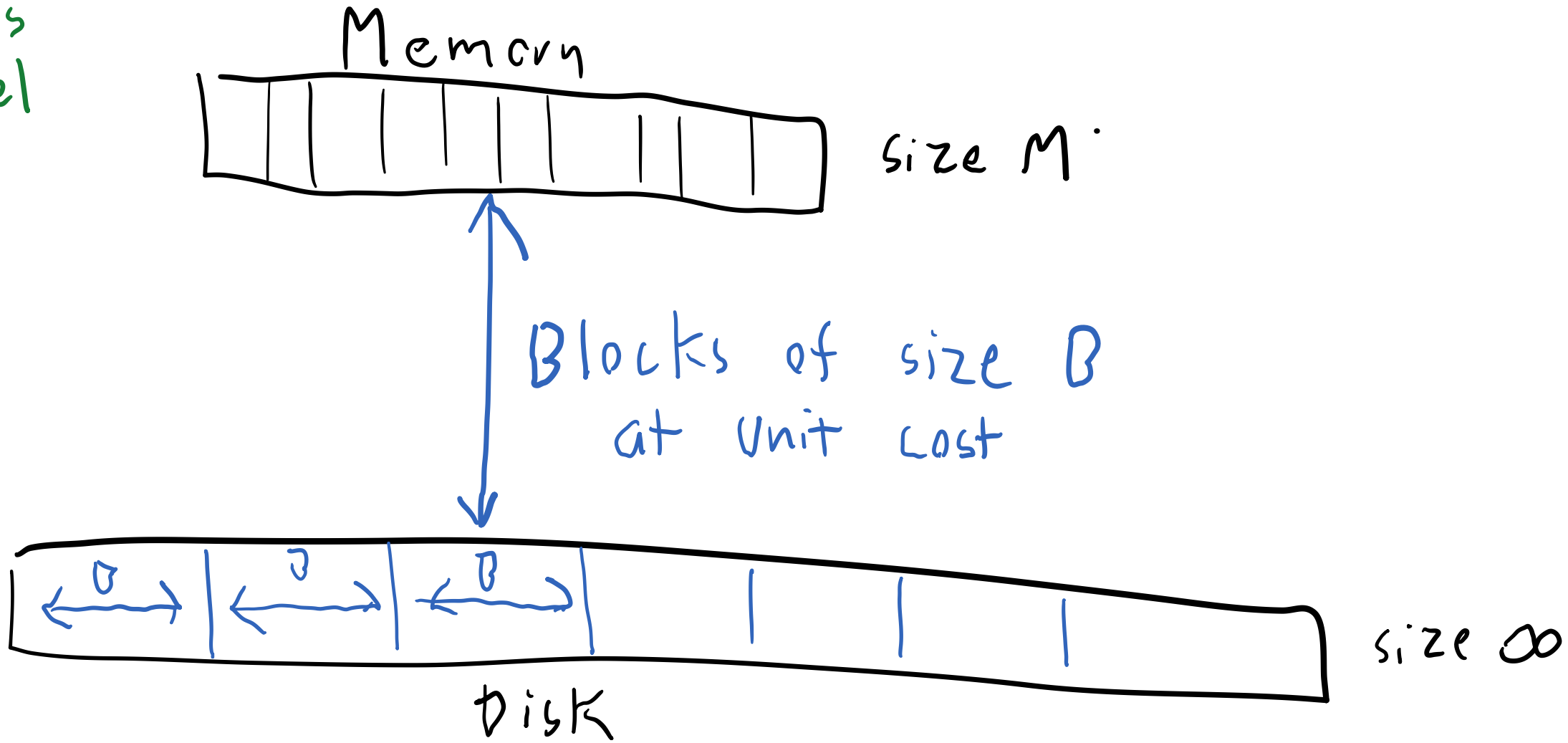
Cache Oblivious

+

Persistence

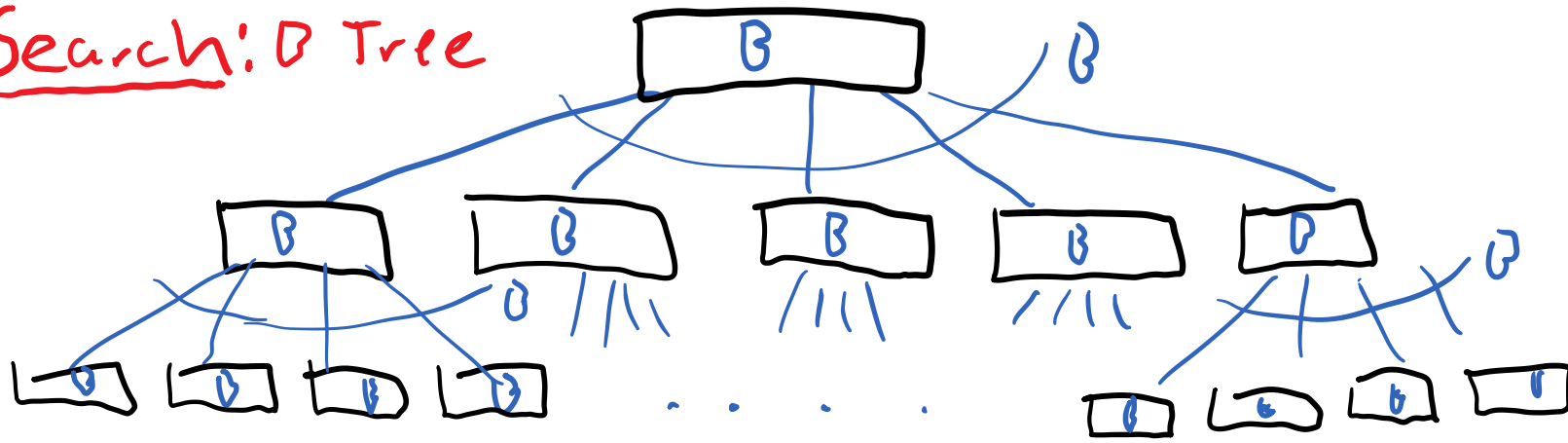
with P. Davoodi, O. Ozkan, J. Fineman

Disk
Access
Model



Two Examples

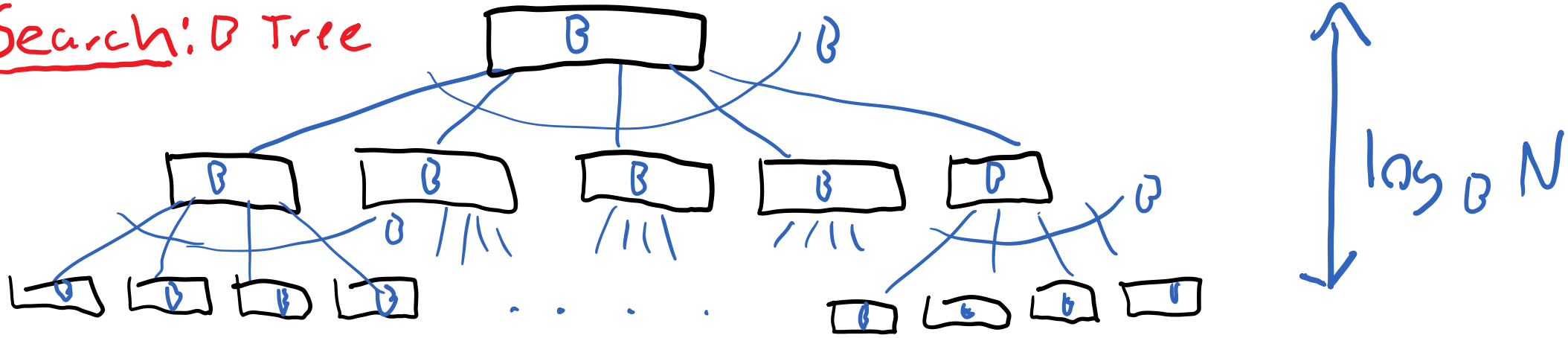
Search: B Tree



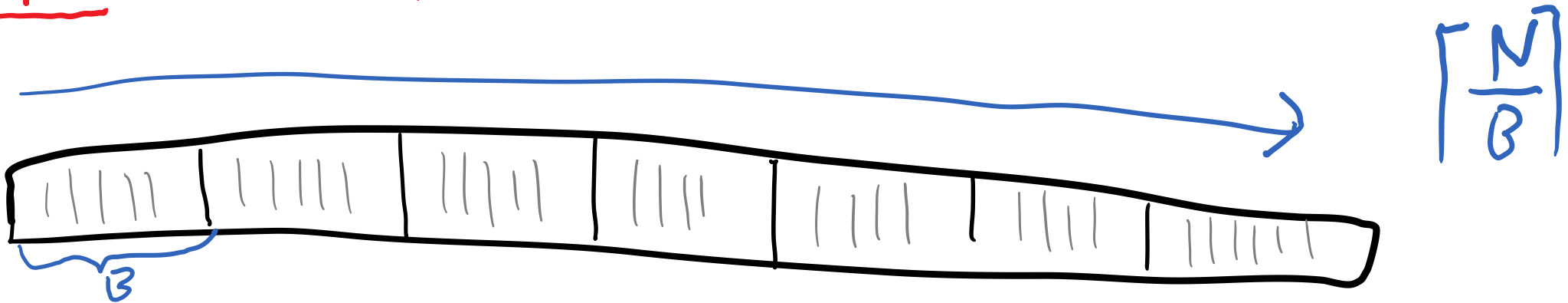
$\updownarrow \log_B N$

Two Examples

Search: B Tree

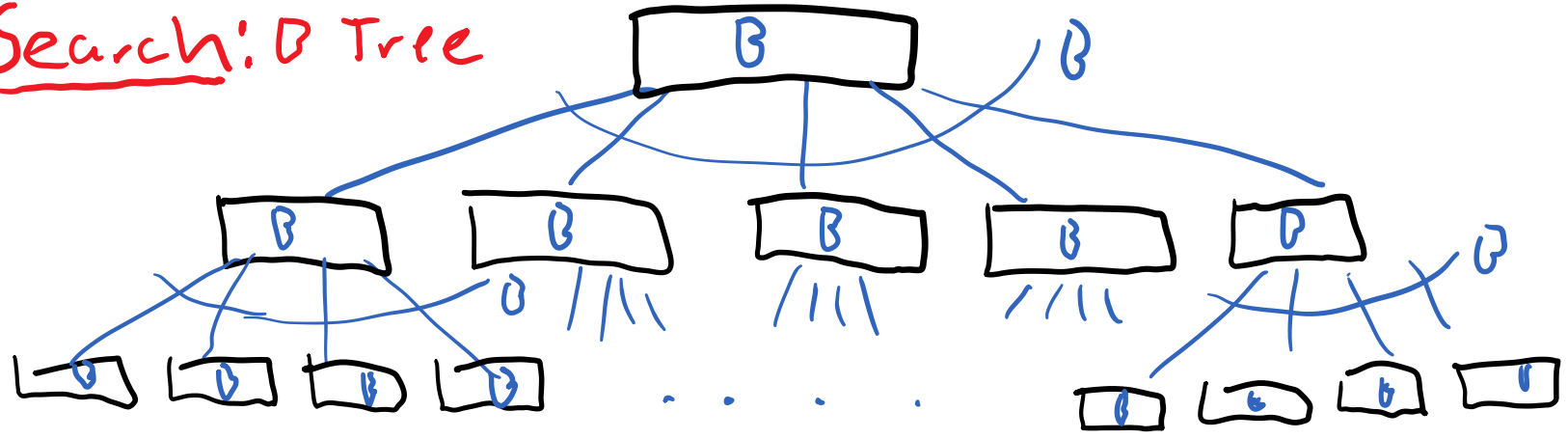


Mini: For loop



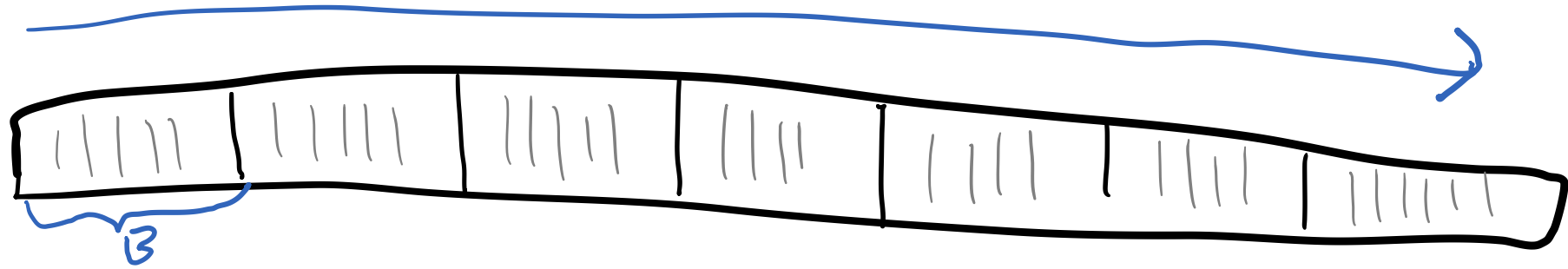
Two Examples

Search: B Tree

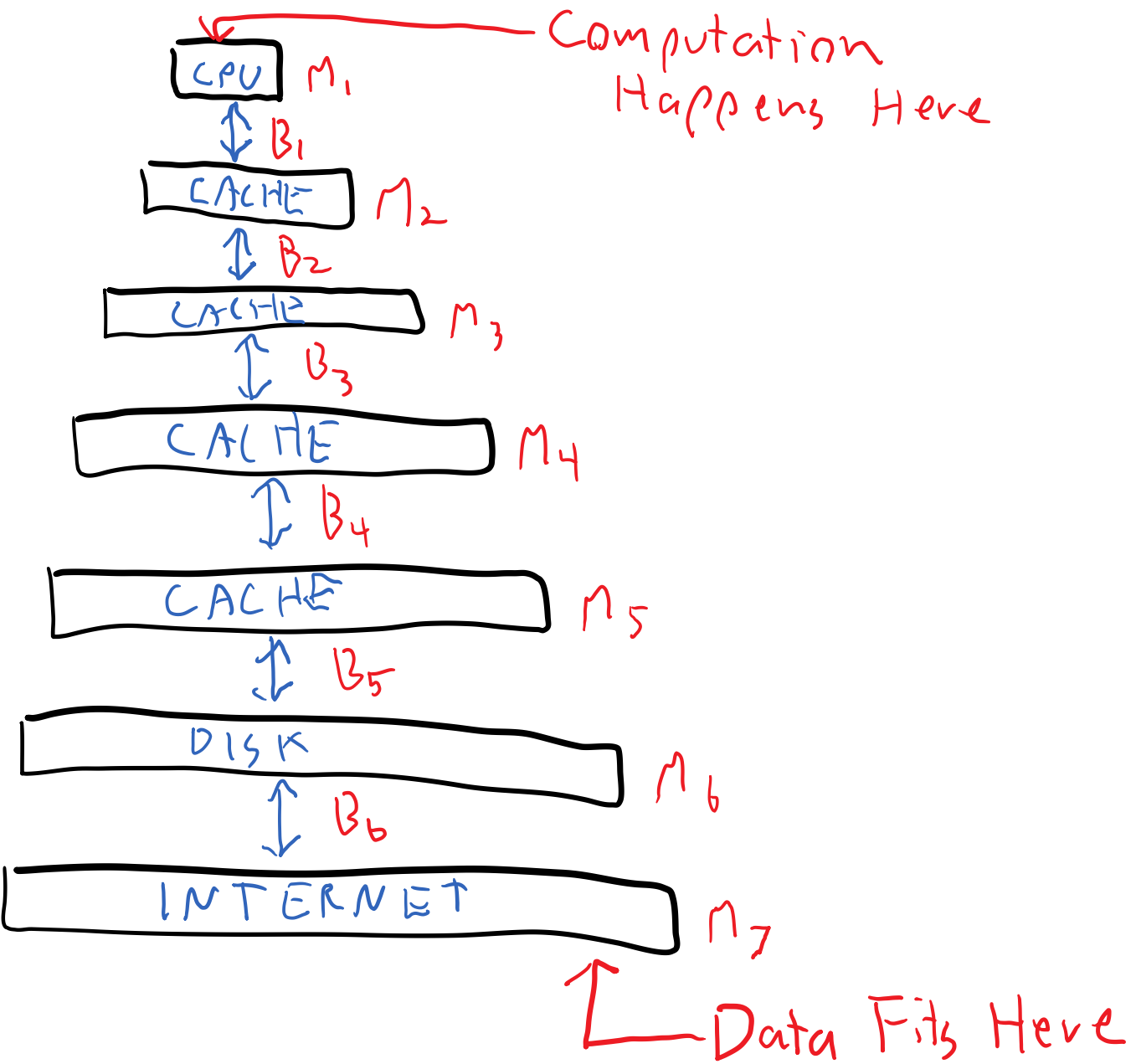


$\log_B N$ Needs to know B

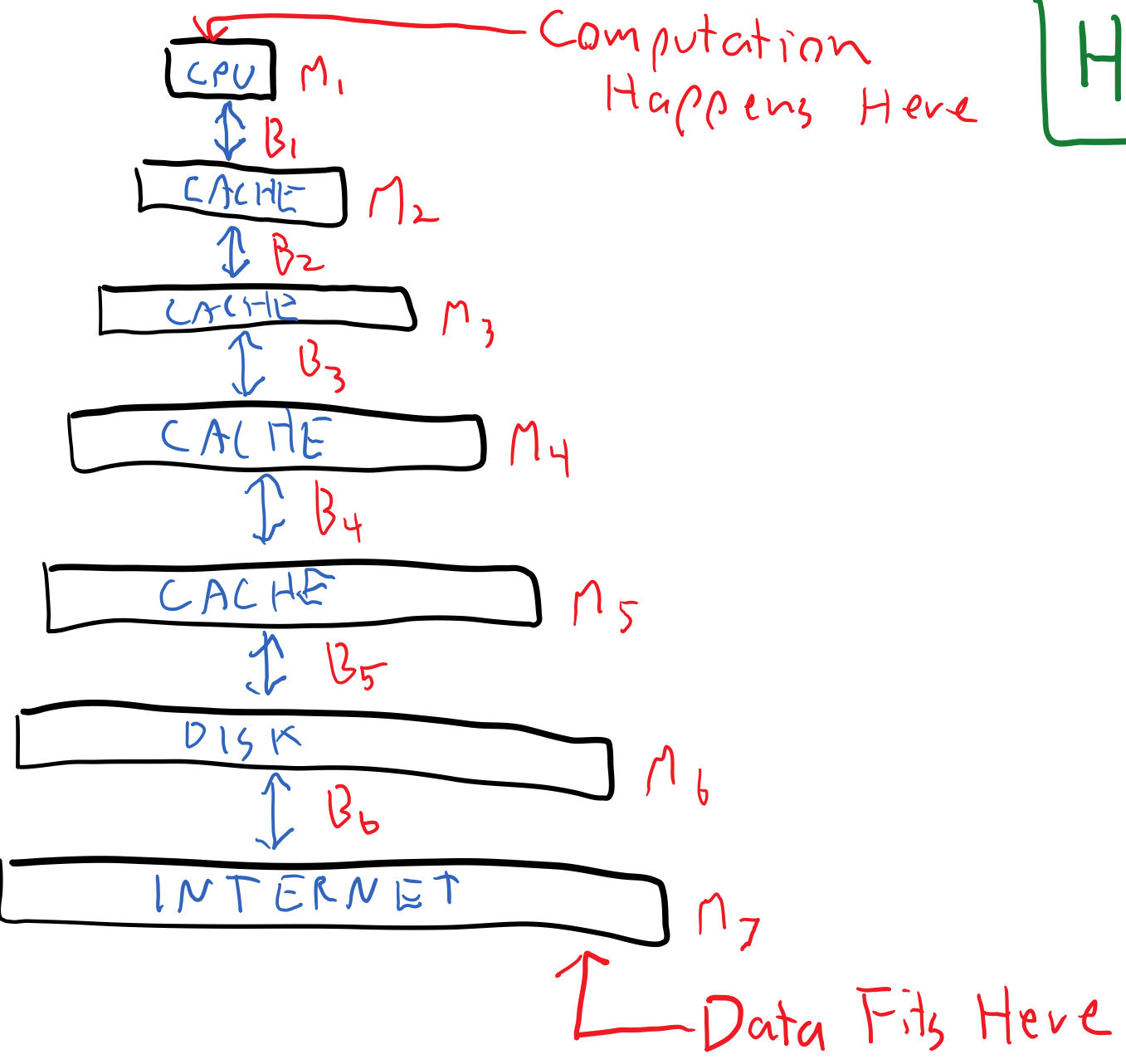
Mini: For loop



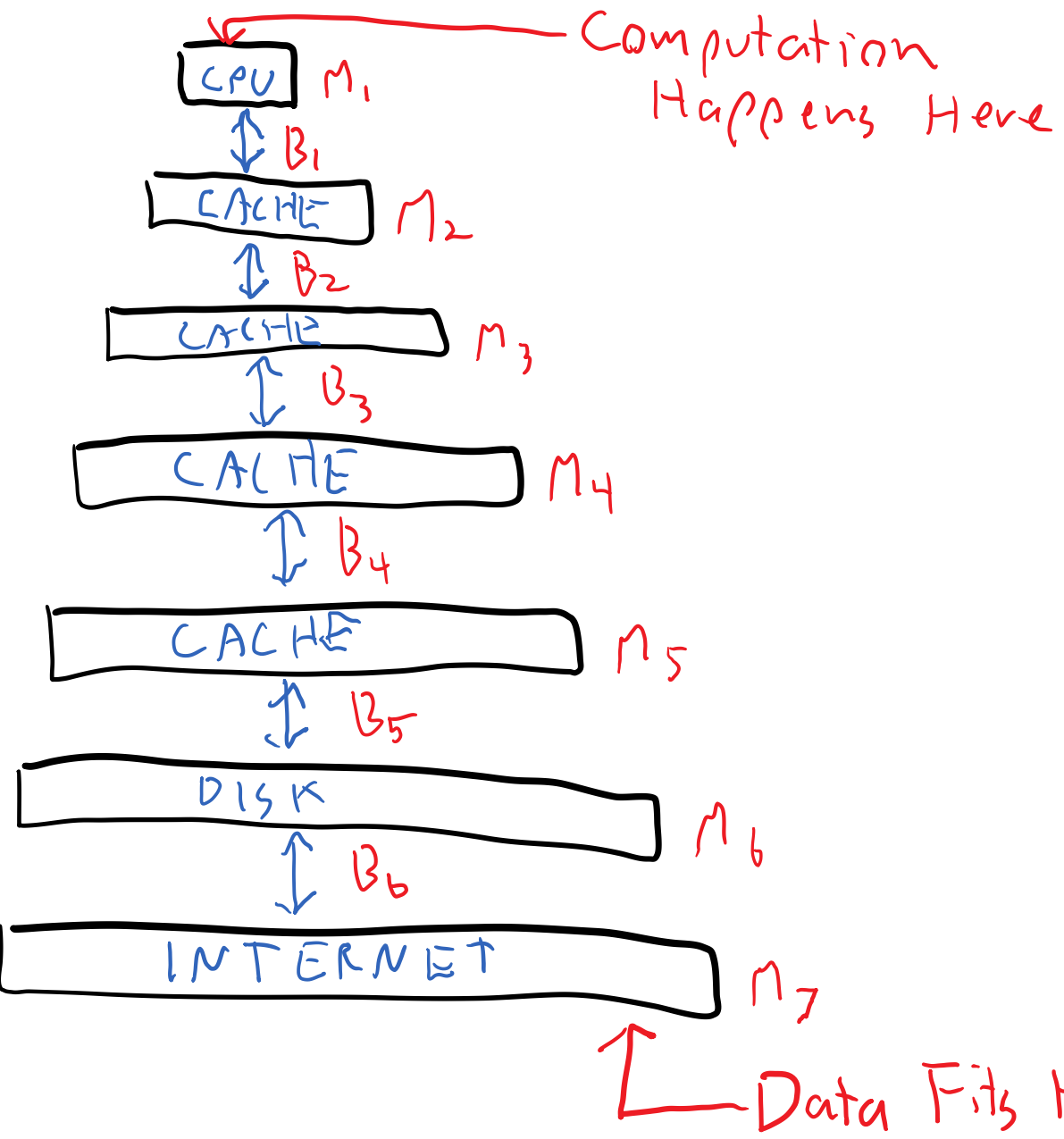
$\lceil \frac{N}{B} \rceil$ Does not need to know B



How do we deal with this?

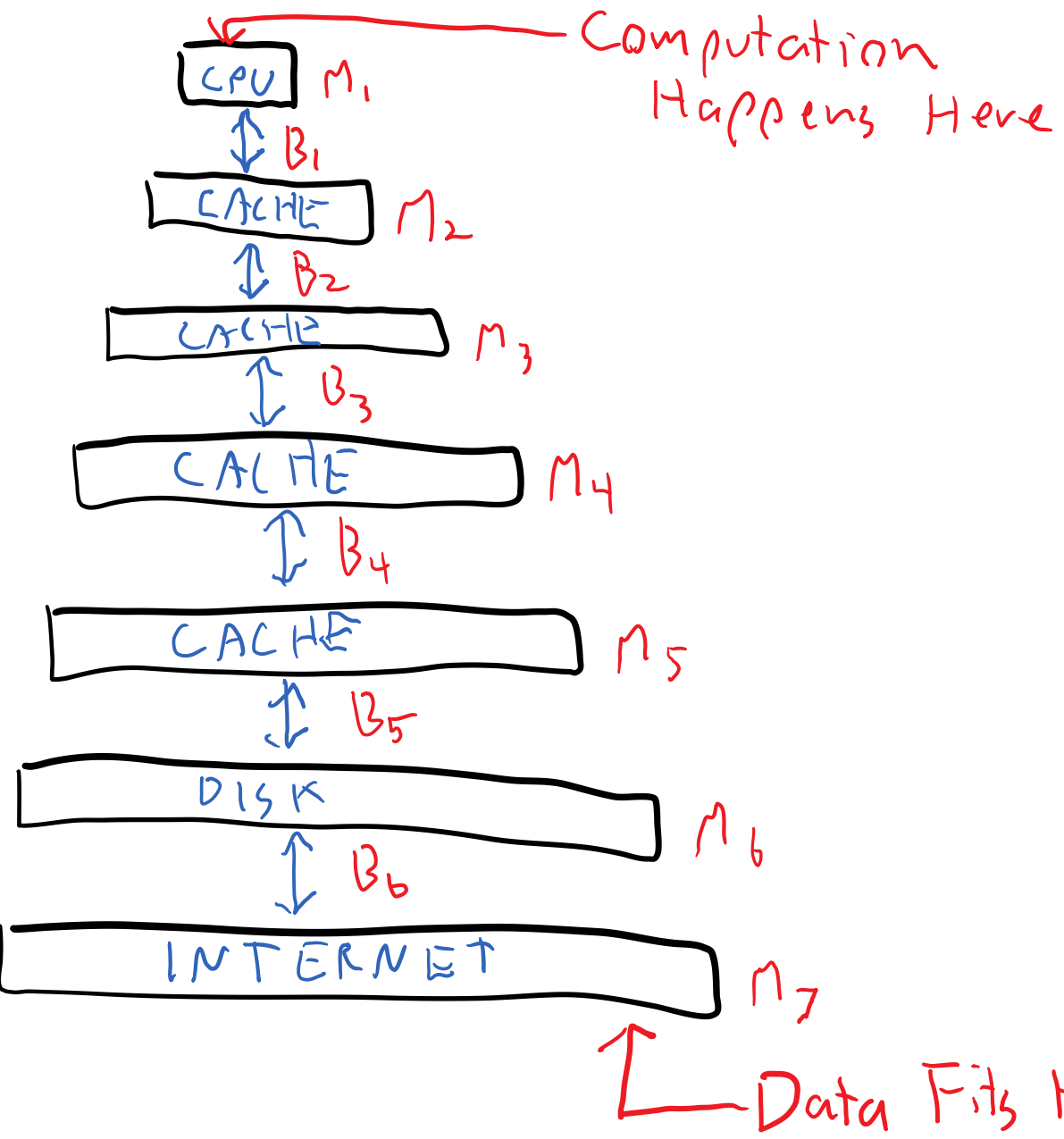


How do we deal with this?



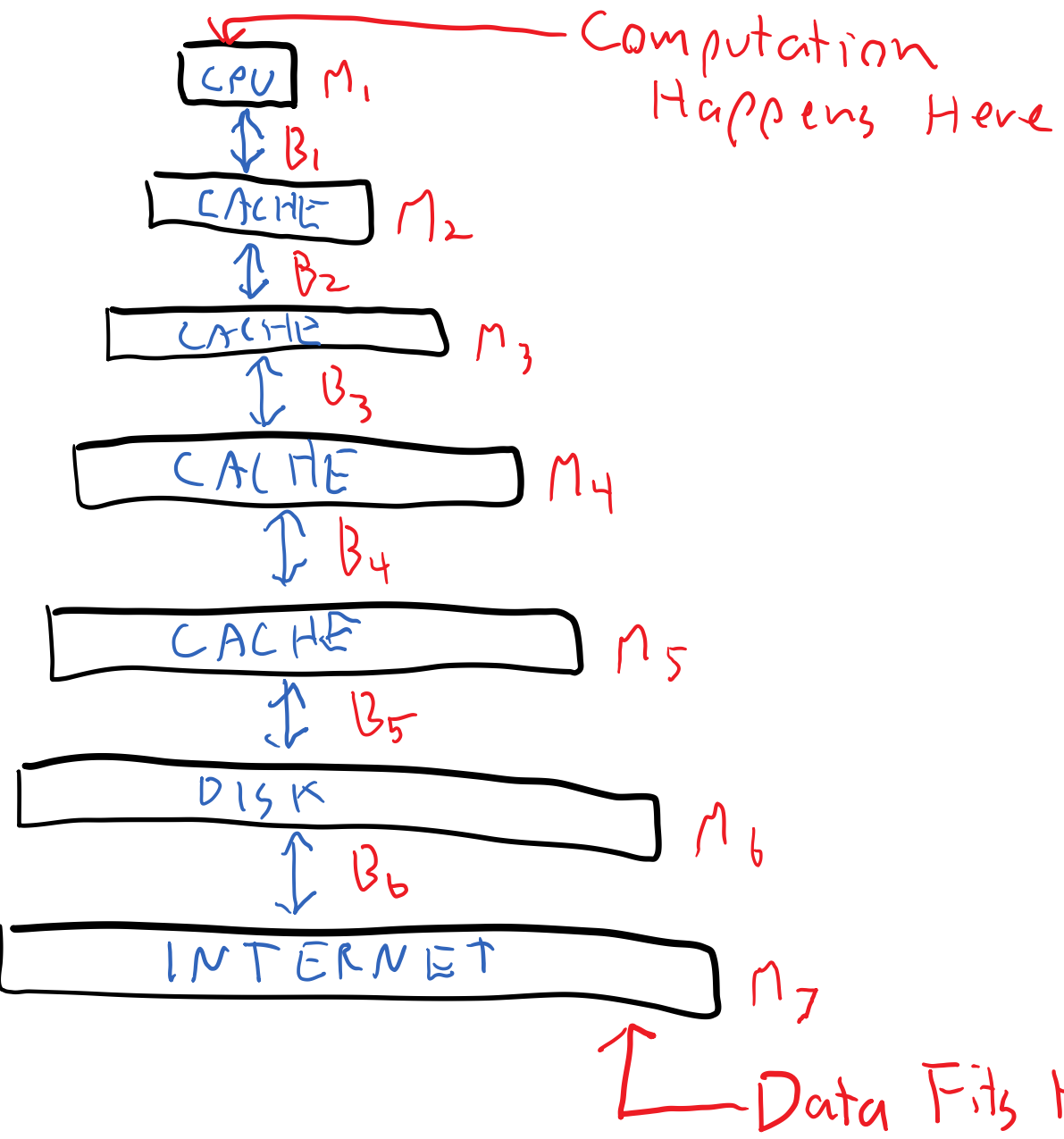
① Make alg that uses $M_1, M_2 \dots M_7; B_1, B_2 \dots B_7$
YUCK

How do we deal with this?



- ① Make alg that uses $M_1, M_2 \dots M_7; B_1, B_2 \dots B_7$
YUCK
- ② Use 2-level (DAM) alg that does not know M, B
Cache Oblivious

How do we deal with this?



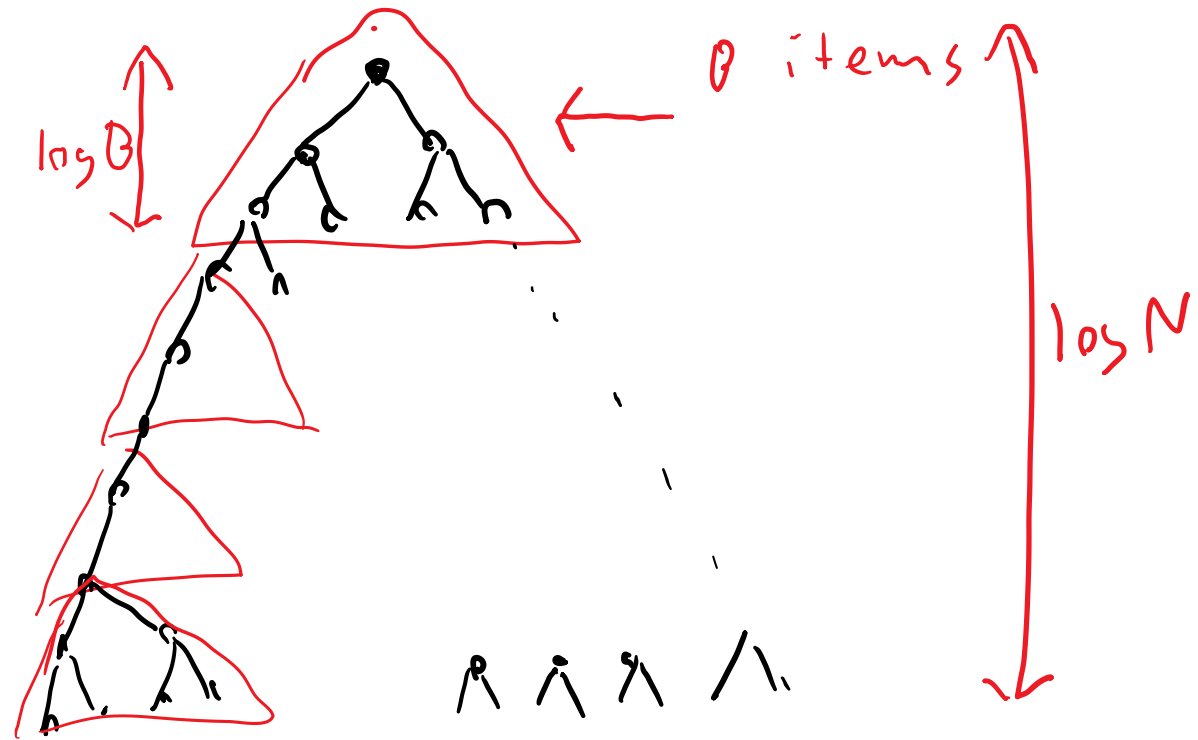
① Make alg that uses $M_1, M_2 \dots M_7; B_1, B_2 \dots B_7$
YUCK

② Use 2-level (DAM) alg that does not know M, B
Cache Oblivious

E.g. Scan works well

How Do We Make a \mathcal{O} tree with no \mathcal{B} ?]

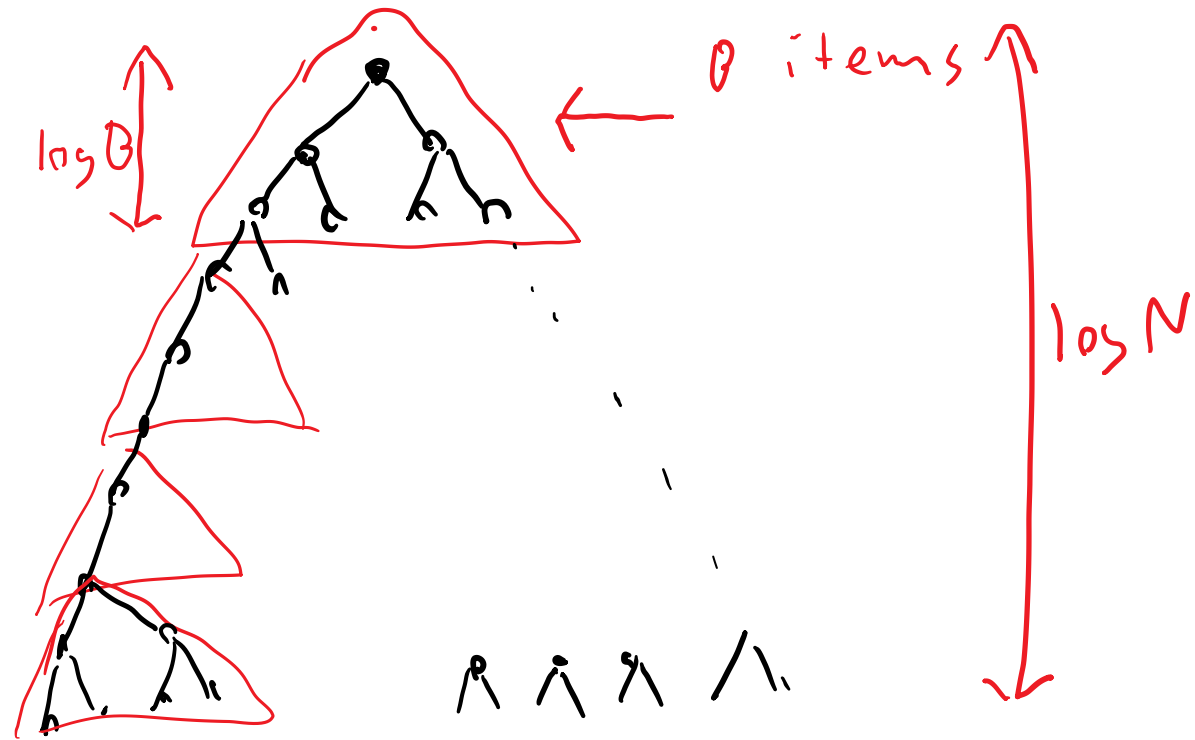
How Do We Make a B tree with no B?



Search goes through

$$\frac{\log N}{\log B} \text{ red trees}$$

How Do We Make a B tree with no B?

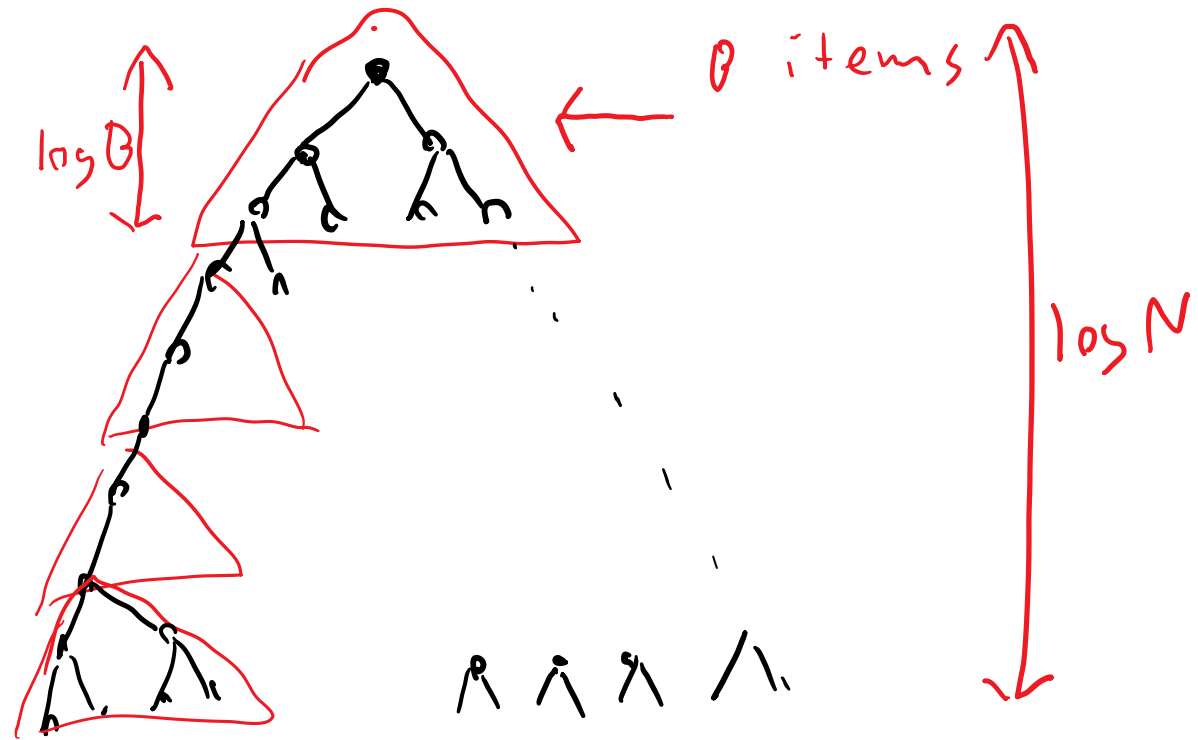


How are these blocks stored?

Search goes through

$$\frac{\log N}{\log B} \text{ red trees}$$

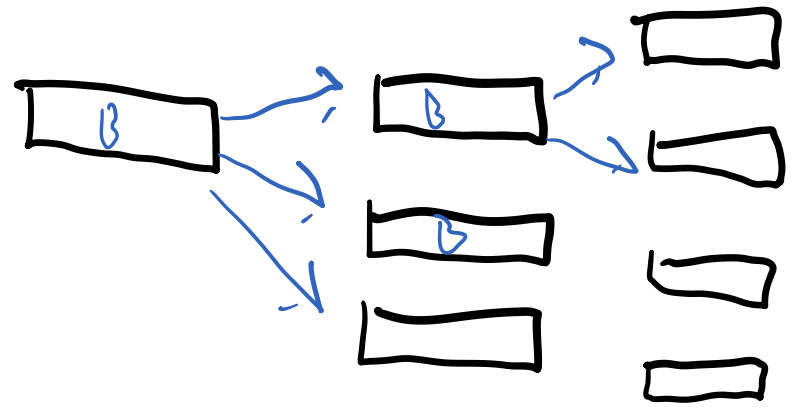
How Do We Make a B tree with no B?



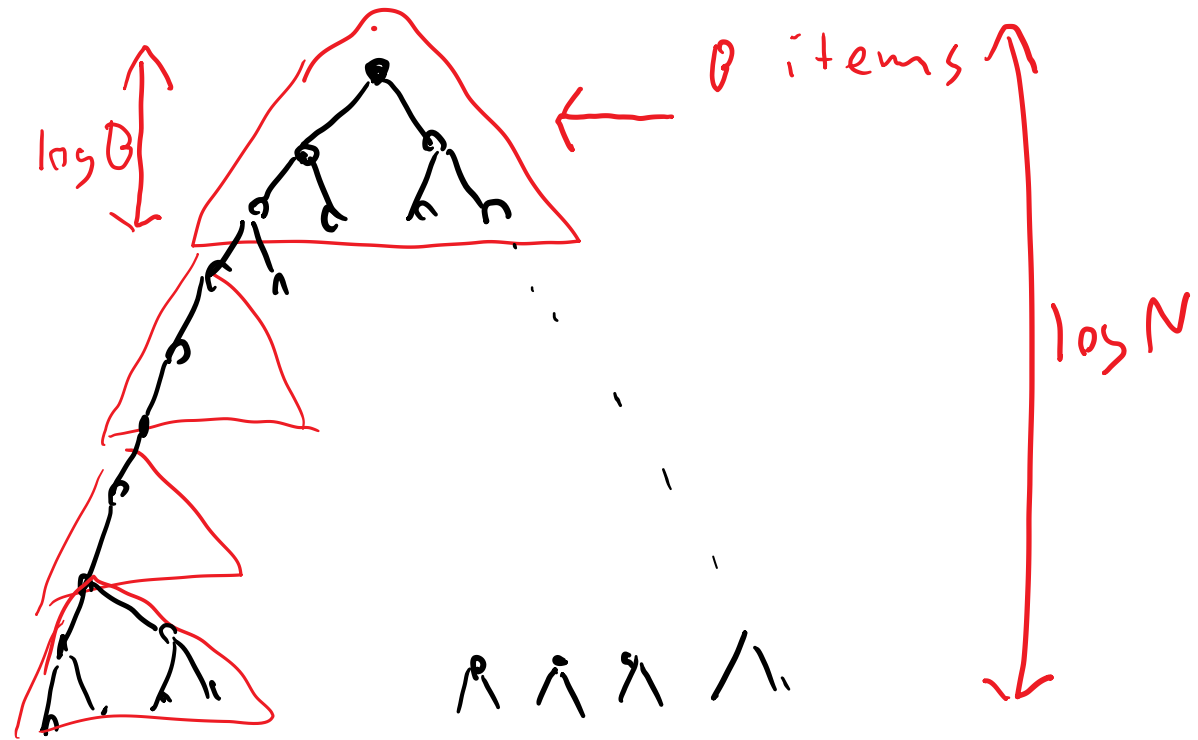
Search goes through

$$\frac{\log N}{\log B} \text{ red trees}$$

How are these blocks stored?



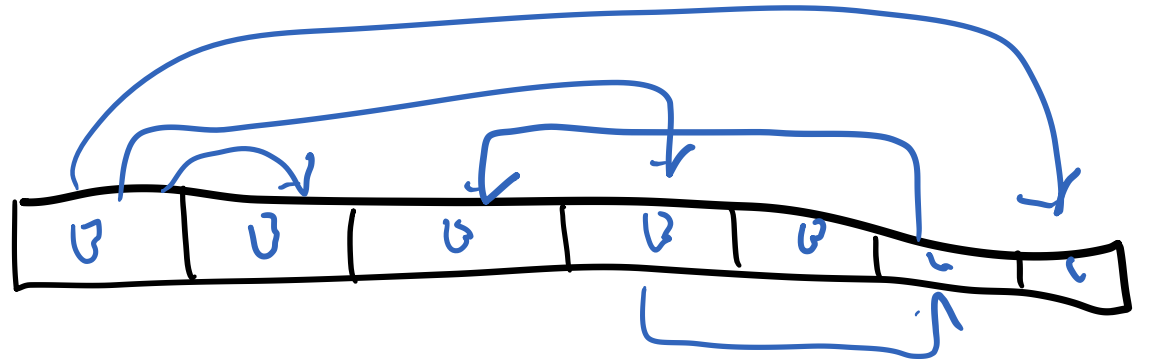
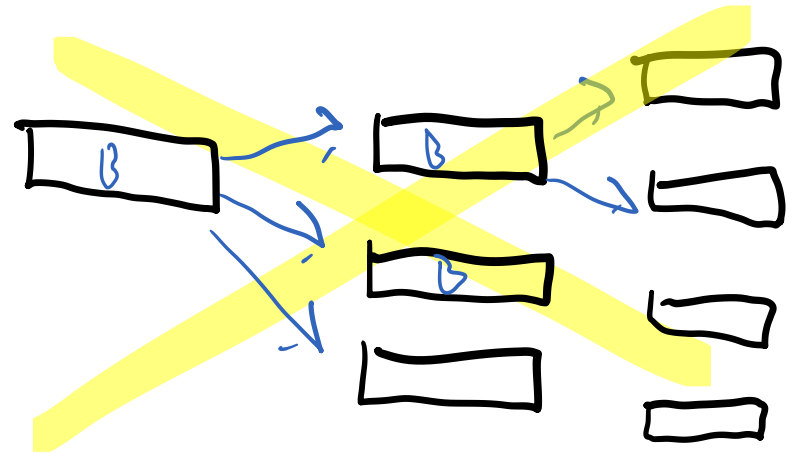
How Do We Make a B tree with no B?



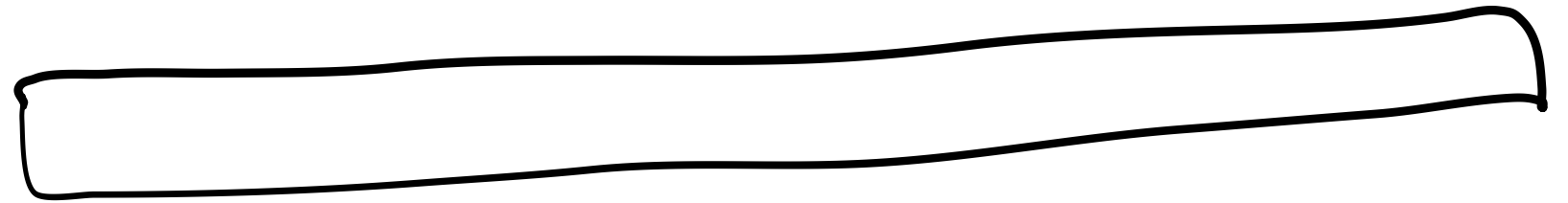
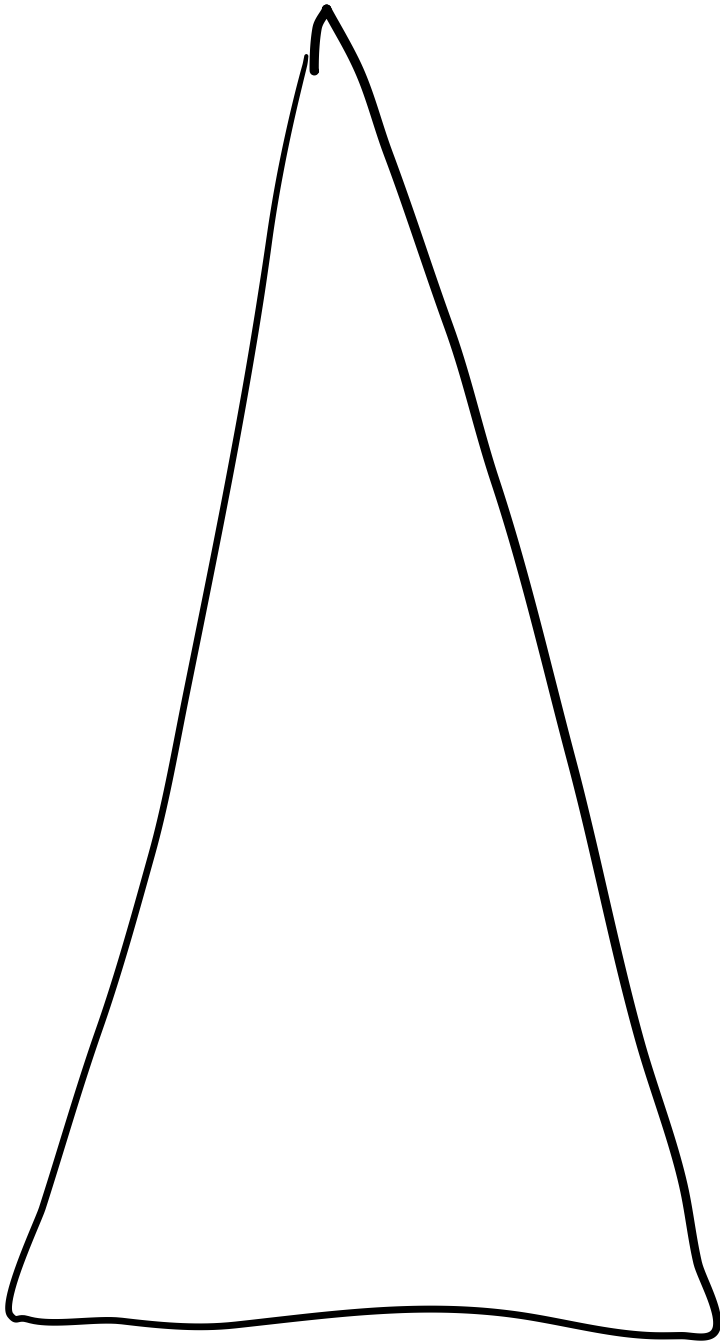
Search goes through

$$\frac{\log N}{\log B} \text{ red trees}$$

How are these blocks stored?

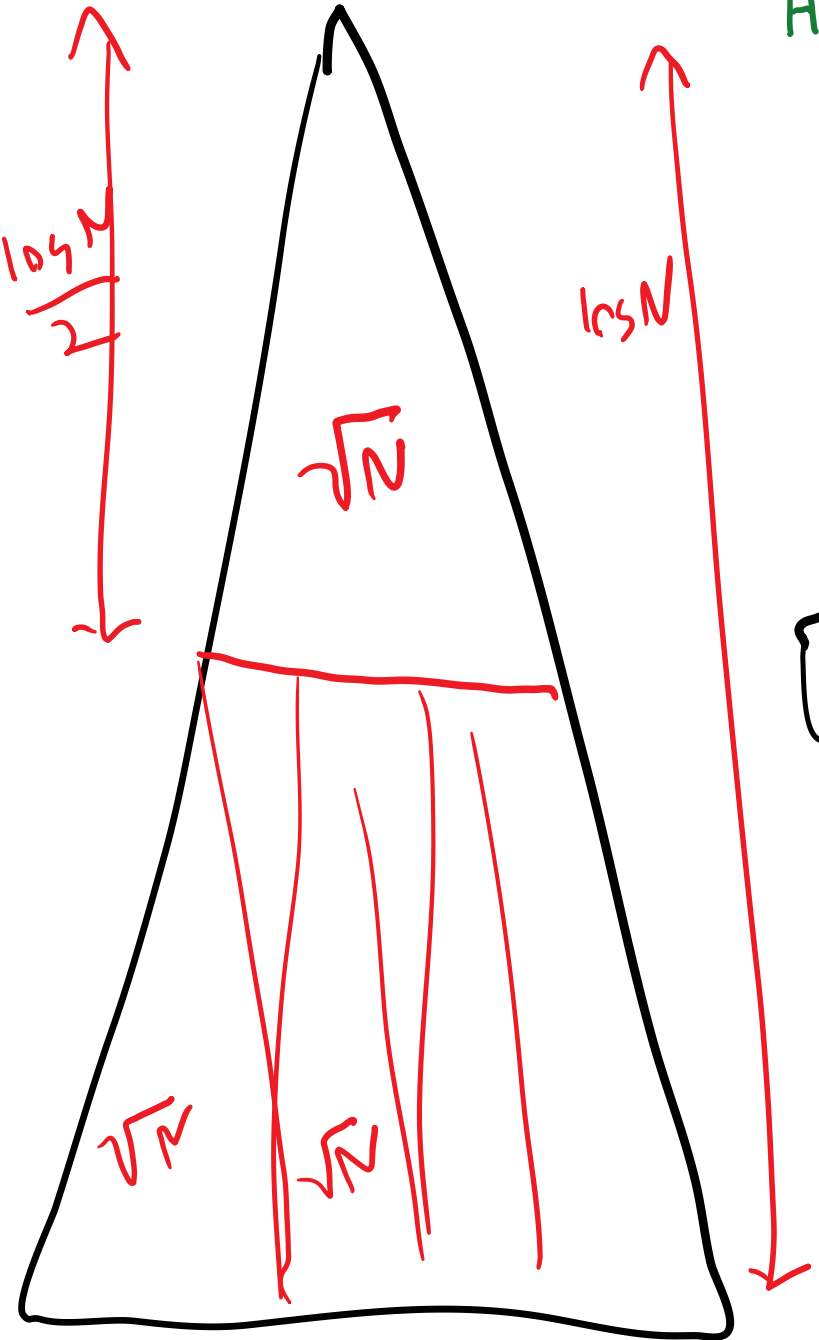


How do you put a tree into memory?

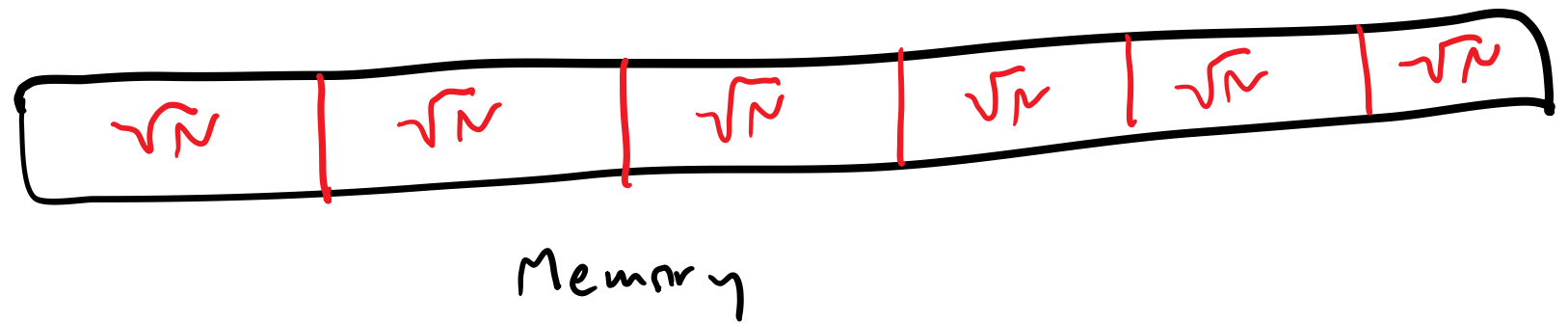


Memory

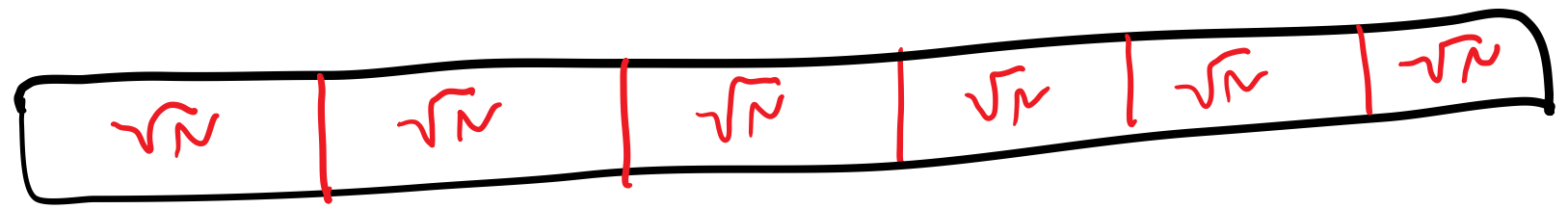
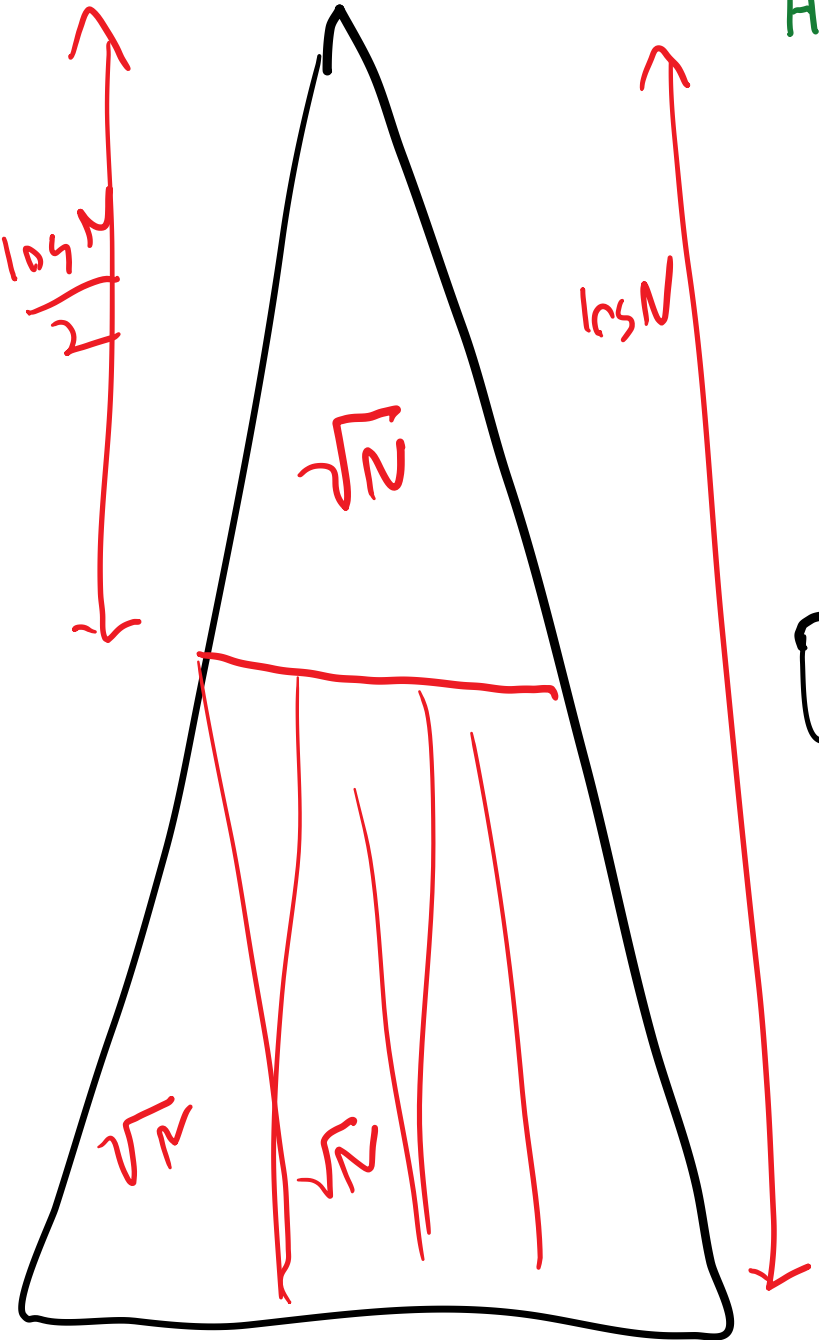
How do you put a tree into memory?



How do you put a tree into memory?



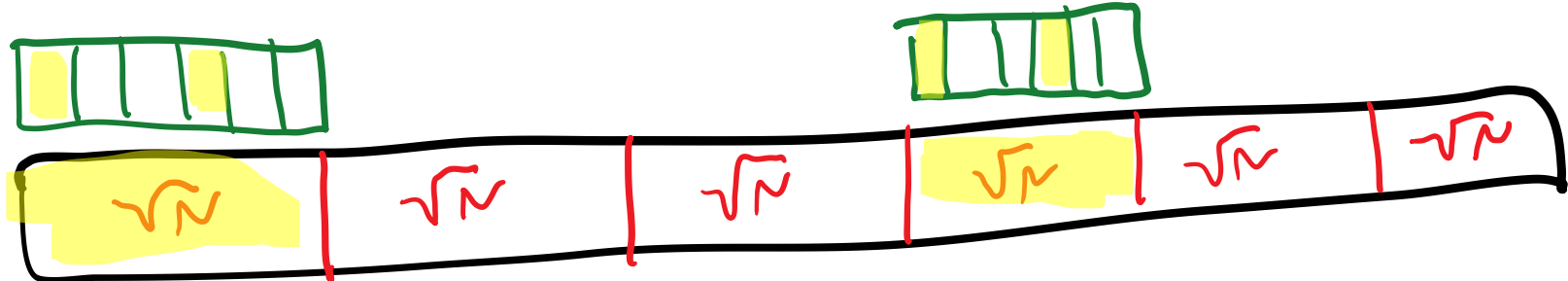
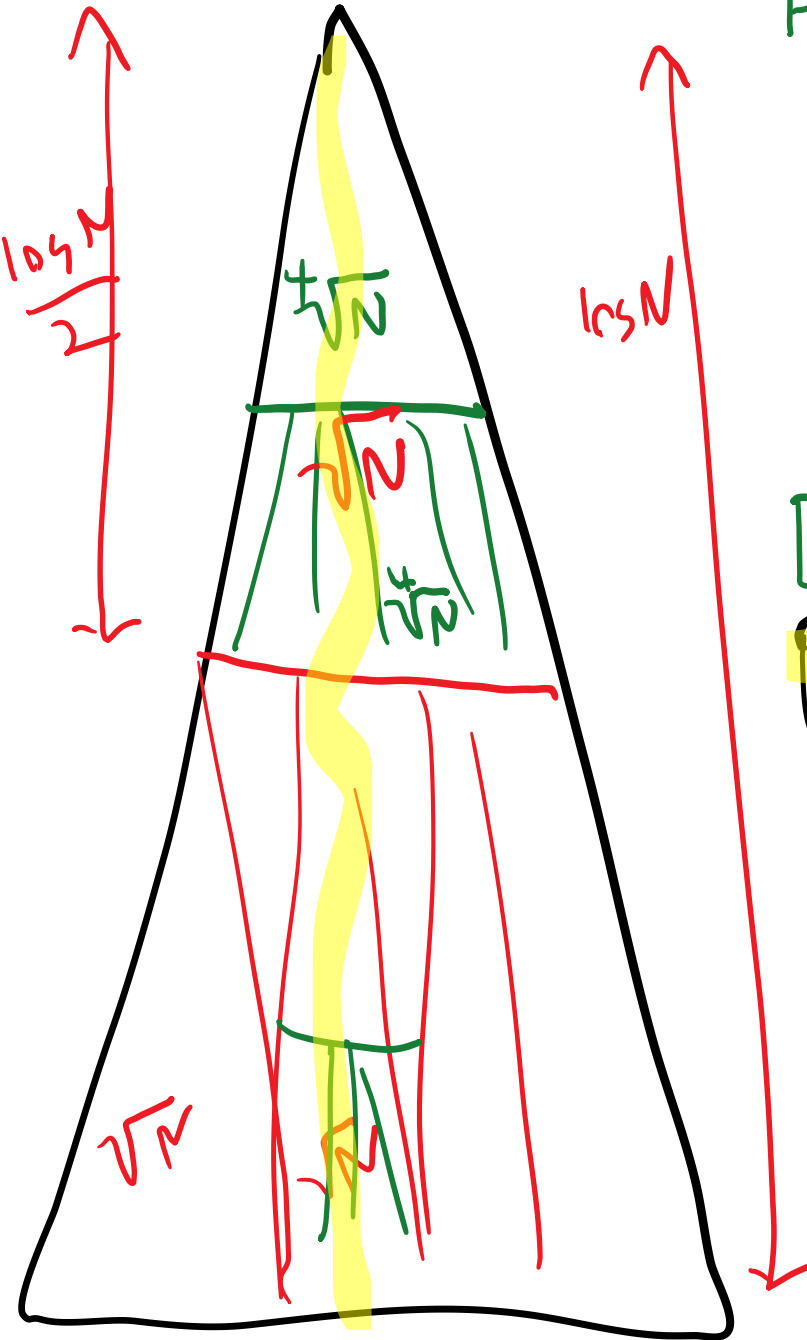
How do you put a tree into memory?



Memory

RECURSE

How do you put a tree into memory?

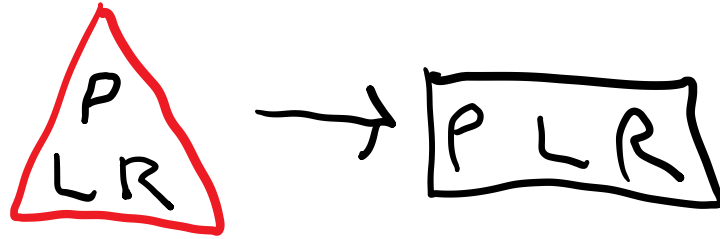
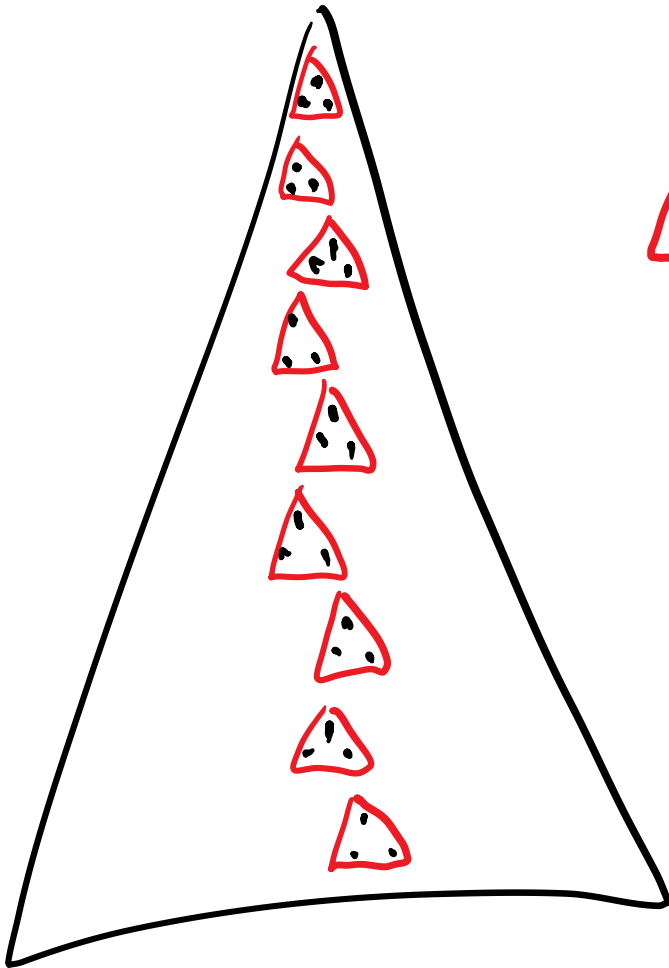


Memory

RECURSE

2	Blocks	\sqrt{N}
4	Blocks	$4\sqrt{N}$
⋮		
$\log_B N$	Blocks	B

ULTIMATE LOCALITY



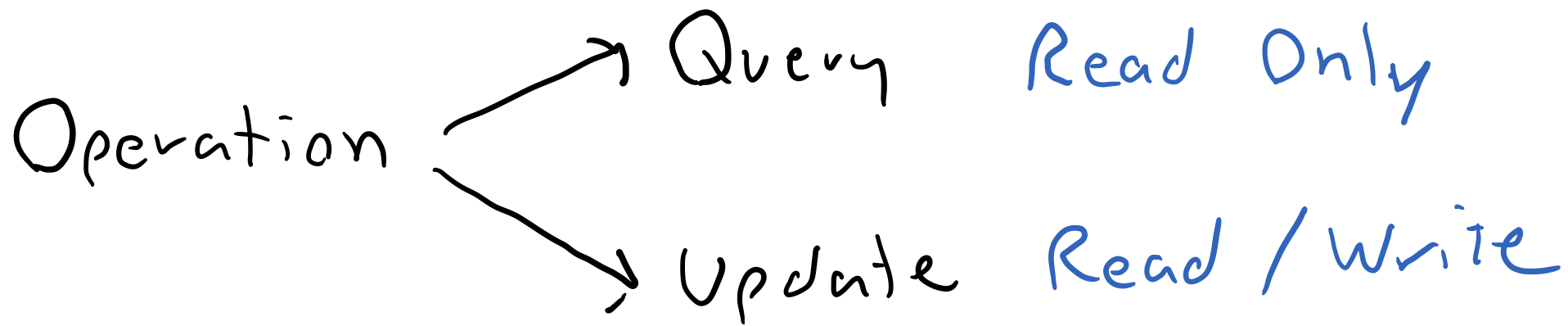
Lots of results in
Cache - Oblivious Model

Persistence

Persistence
See the past

Persistence

See the past



Types of Persistence

Partial

Full

Confluent

Retroactive

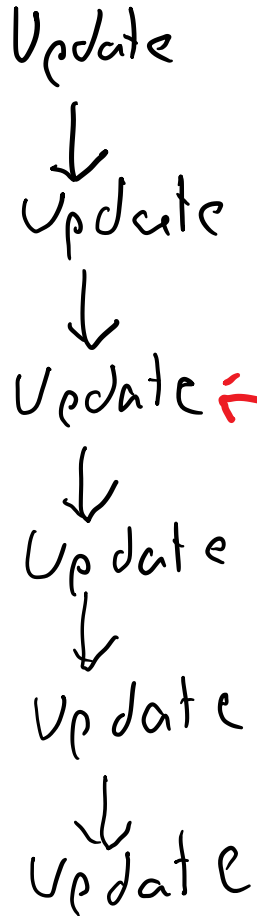
Types of Persistence

Partial

Full

Confluent

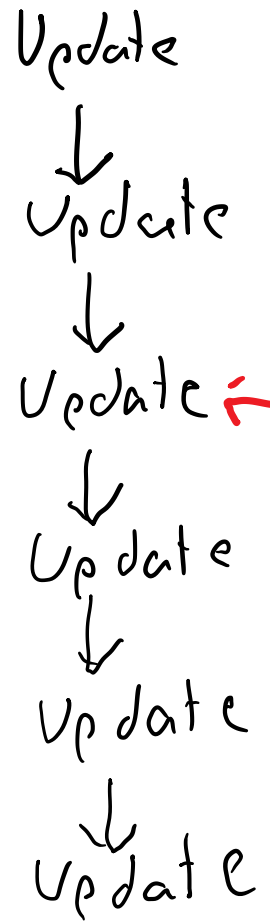
Retroactive



- Can Update Most recent version
- Query at any point in the past
- Time is linear

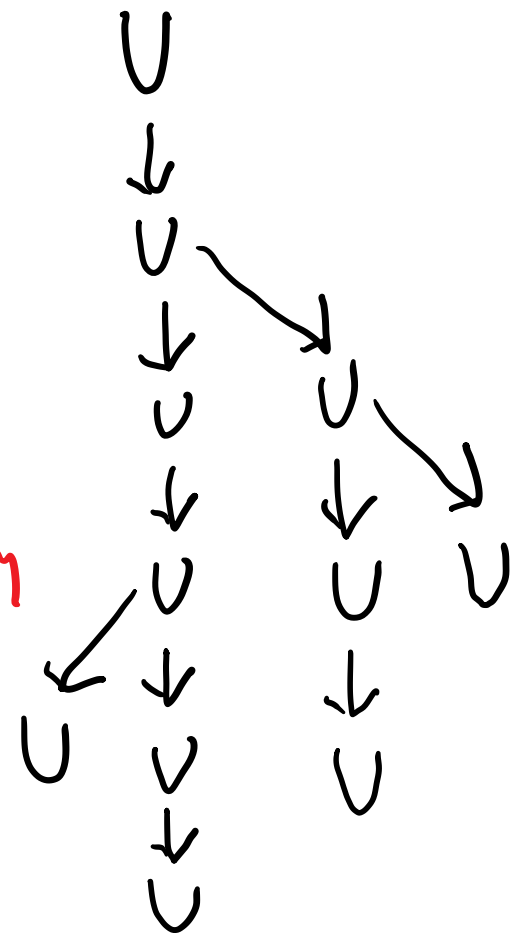
Types of Persistence

Partial

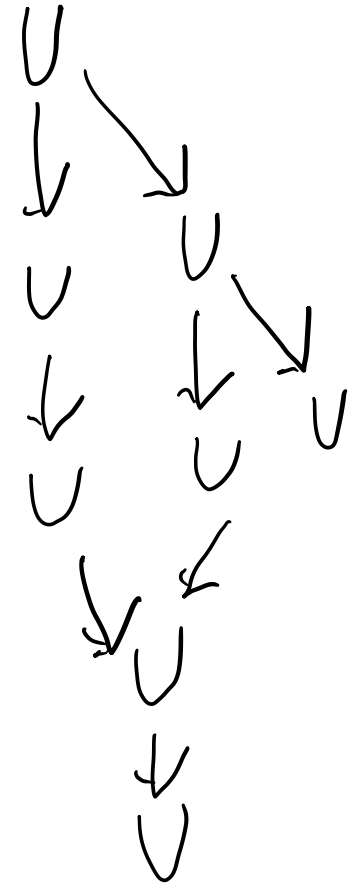


Query

Full



Confluent



Retroactive

Persistence — Results

For pointer-based structures of constant indegree

- ~ Partial, Full persistence is free
- ~ Confluent persistence is complicated
- ~ Retroactive is impossible

Persistence — Results

For pointer-based structures of constant indegree

- ~ Partial, Full persistence is free
- ~ Confluent persistence is complicated
- ~ Retroactive is impossible

But we care about the cache-oblivious model

C-O = locality

Pointer = anti-locality

So, again, what is the C-O model?

So, again, what is the C-O model?

From point of view of an alg:

- Memory is an Array

- Read

- Write

So, again, what is the C-O model?

From point. of view of an alg:

- Memory is an Array

- Read

- Write

So we need a persistent array
that maintains locality

Geometric View

↑ time

$$A[8] = 4$$

$$A[2] = 7$$

$$A[2] = 5$$

$$A[15] = 0$$

$$A[8] = 5$$

$$A[1] = 6$$

$$A[2] = 4$$

$A[i]$	8	5	2	3	7	0	0	4	6	5	9	8	6	1	1	4	
i	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16

Geometric View

↑ time

$$A[8] = 4$$

$$A[2] = 7$$

$$A[2] = 5$$

$$A[15] = 0$$

$$A[8] = 5$$

$$A[1] = 6$$

$$A[2] = 4$$

$$A[i]$$

i	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
	8	5	2	3	7	0	0	0	4	6	5	9	8	6	1	1	4

4

7
5

0

5

6

4

Geometric View

↑ time

$$A[8] = 4$$

$$A[2] = 7$$

$$A[2] = 5$$

$$A[15] = 0$$

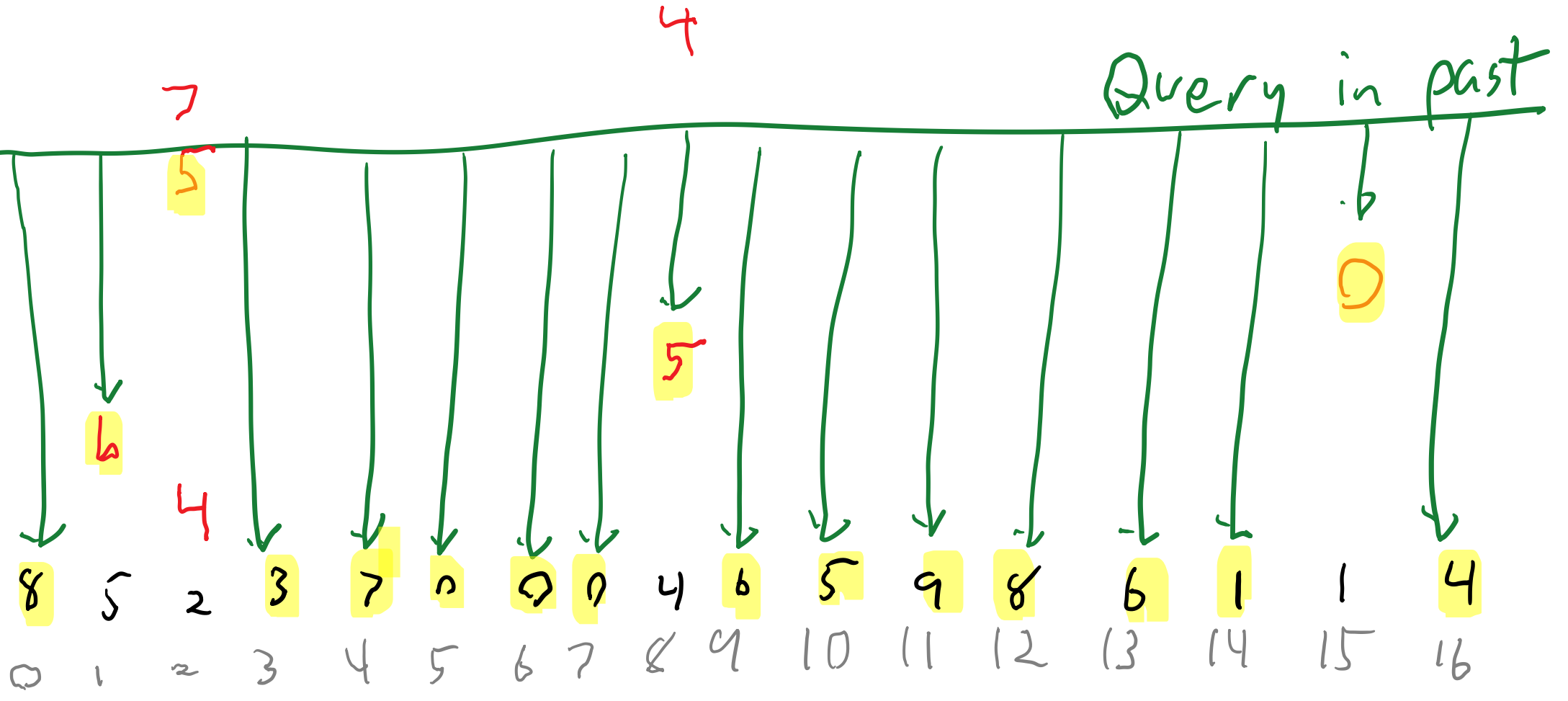
$$A[8] = 5$$

$$A[1] = 6$$

$$A[2] = 4$$

$$A[i]$$

i



Geometric View

Store in Obvious way: No Locality

Copy memory at every time; Horrible
but has locality

↑ time

$$A[8] = 4$$

$$A[2] = 7$$

$$A[2] = 5$$

$$A[15] = 0$$

$$A[8] = 5$$

$$A[1] = 6$$

$$A[2] = 4$$

$$A[i]$$

i

8	5	2	3	7	0	0	0	4	6	5	9	8	6	1	1	4
0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16

7

5

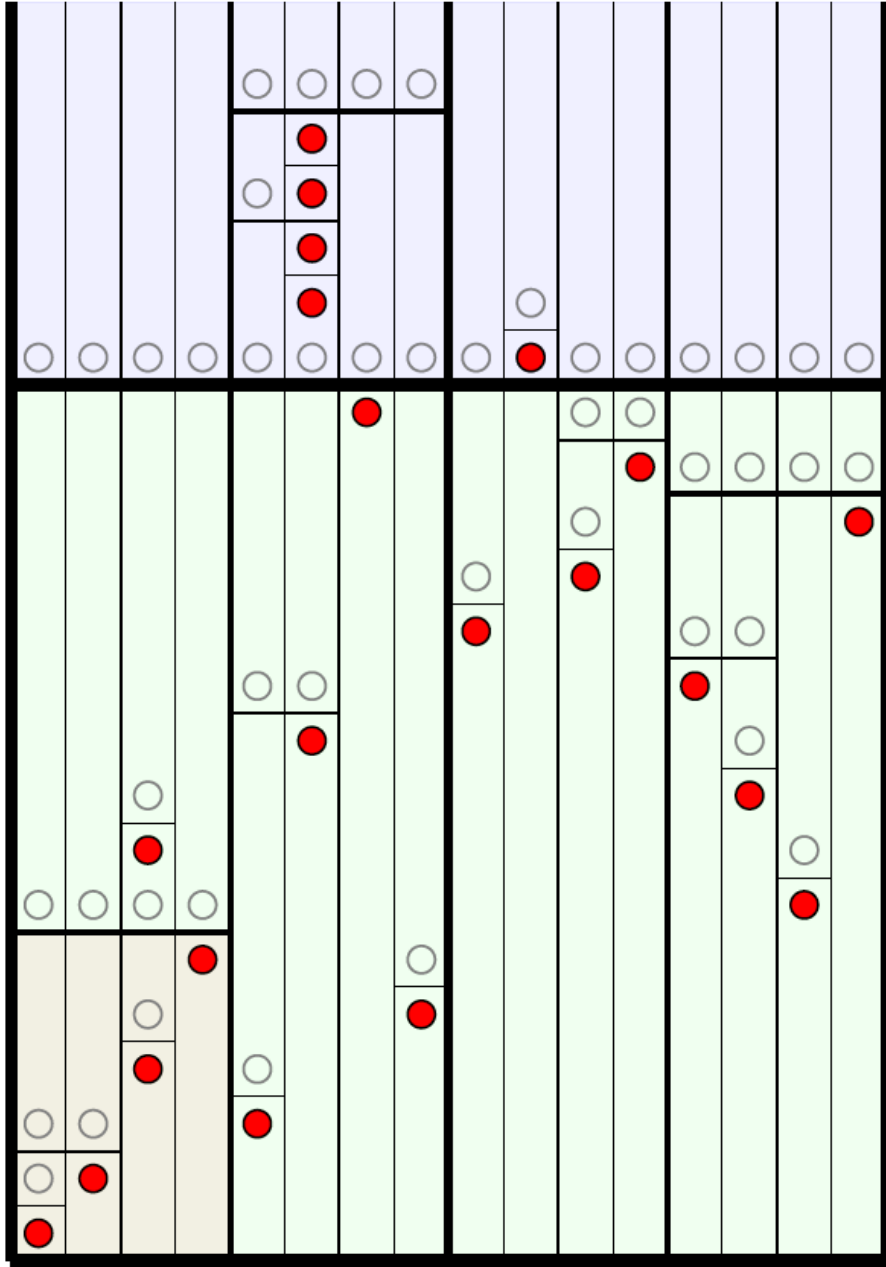
4

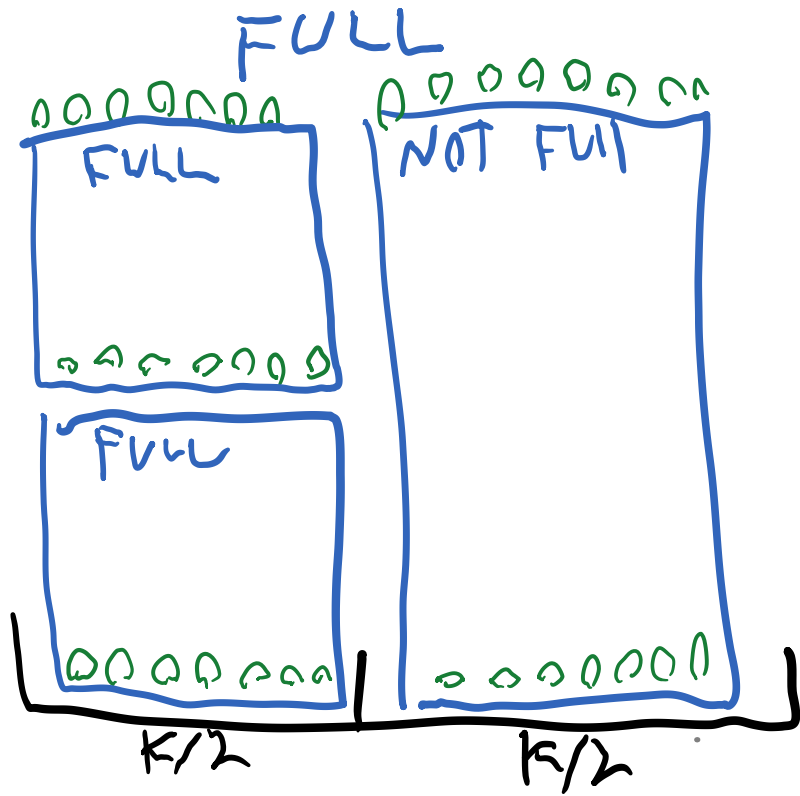
4

Query in past

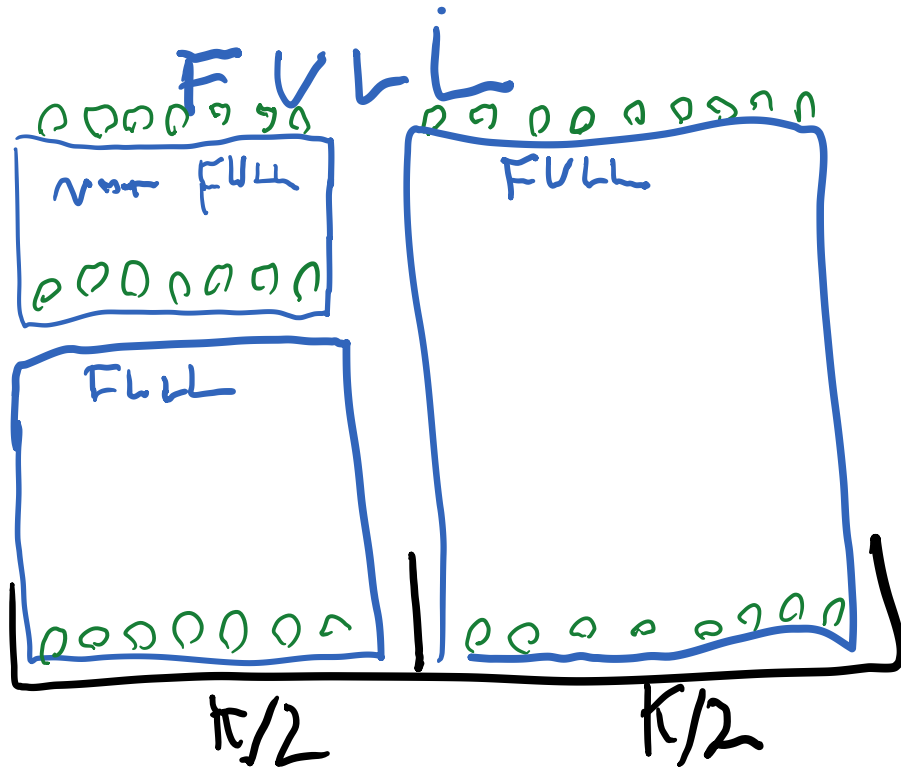
0

5

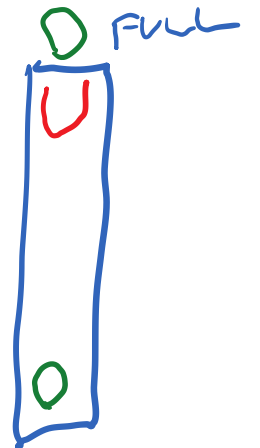




k -Block

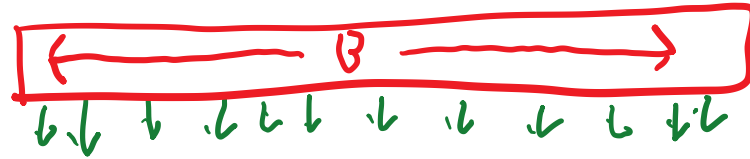


k -Block

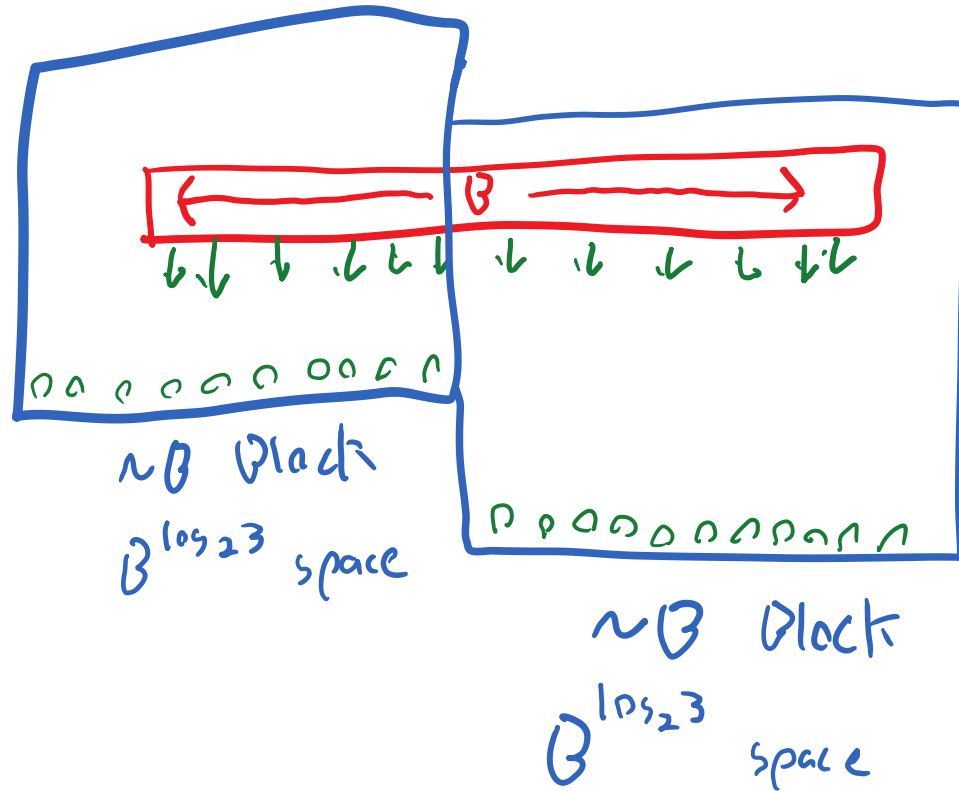


1 -Block

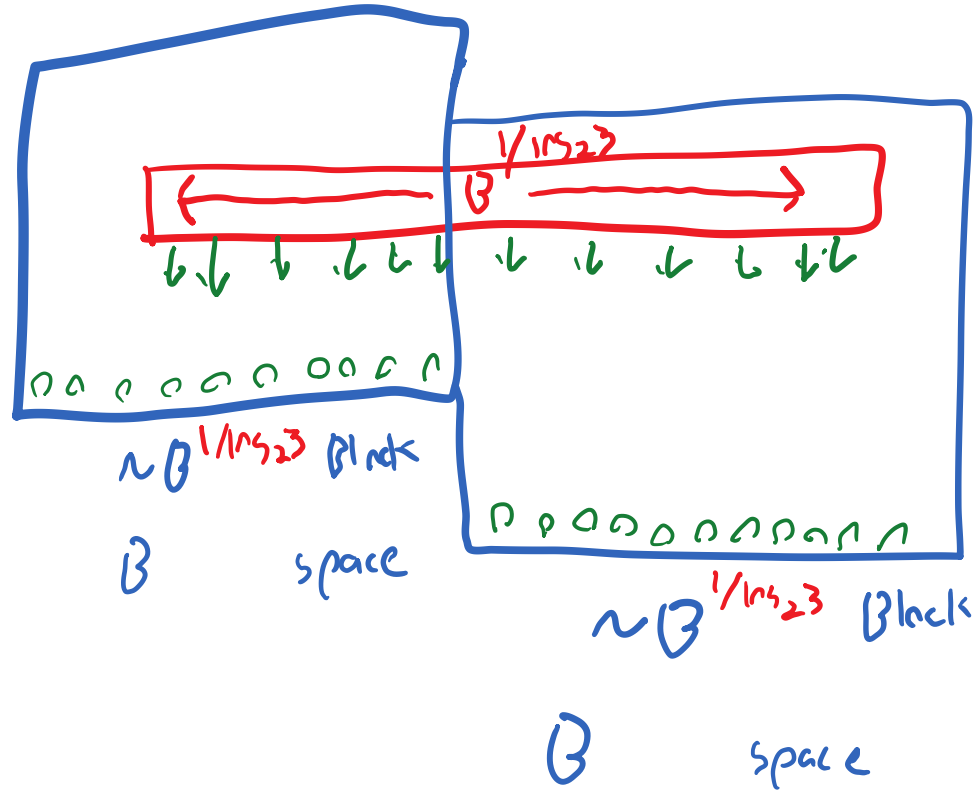
Suppose I wanted to look at 1 block of
size B in memory at same time



Suppose I wanted to look at 1 block of size B in memory at same time



Suppose I wanted to look at 1 block of size $B^{1/\log_2 3}$ in memory at some time



A block of size $B^{1/\log_2 3} \approx B^{0.63}$

In the past can be found in 2 ranges of size B in memory

Suppose I wanted to look at 1 block of size $B^{1/\log_2 3}$ in memory at same time

$T(B)$ = Runtime of Alg A in C-O model with block size B

THM: Persistent queries take time $O(T(B^{1/\log_2 3}))$

A block of size $B^{1/\log_2 3} \approx B^{0.63}$
In the past can be found in 2 ranges of size B in memory

Suppose I wanted to look at 1 block of size $B^{1/\log_2 3}$ in memory at same time

$T(B)$ = Runtime of Alg A in C-O model with block size B

THM: Persistent queries take time $O(T(B^{(1-\epsilon)/\log_2 3}) \log_B S)$

space
↓

A block of size $B^{1/\log_2 3} \approx B^{0.63}$
In the past can be found in 2 ranges of size B in memory

Suppose I wanted to look at 1 block of size $B^{1/\log_2 3}$ in memory at same time

$T(B)$ = Runtime of Alg A in C-O model with block size B

THM: Persistent queries take time $O(T(B^{(1-\epsilon)/\log_2 3}) \log_B S)$

space
↓

A block of size $B^{1/\log_2 3} \approx B^{0.63}$
In the past can be found in 2 ranges of size B in memory

$$O(\log_B N) \rightarrow O(\log_B^2 N)$$

[worse than BCR 02]

$$O(N/B) \rightarrow O(N \log_B N / B^{0.63})$$

Notes

- I've ignored M
- Log S space blowup
- Full persistence probably possible

.

Thoughts

The C-Q model is a torturous way to
get algs with great locality.

Better way?

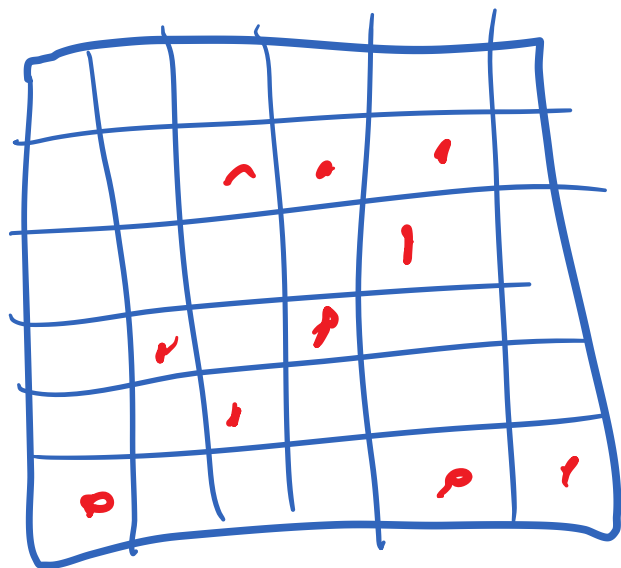
^{Arxiv}
[IKV19]

Geometry?

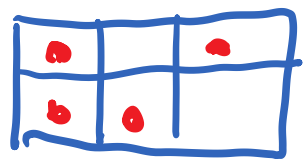
Part \equiv : Forbidden Matrices

Idea: Use Results on extremal
functions of Q -1 Matricies
with forbidden submatricies

Idea: Use Results on extremal functions of $0-1$ Matrices with forbidden submatrices



with
NO



has $O(n \log n)$ dots

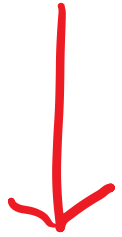
[G. Tardos 05]

Method

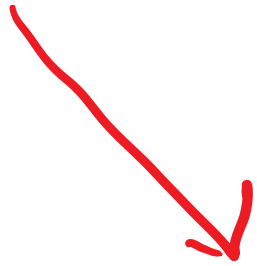
Data Structure

Method

Data Structure



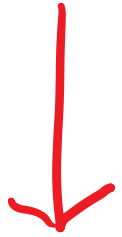
Geometric View



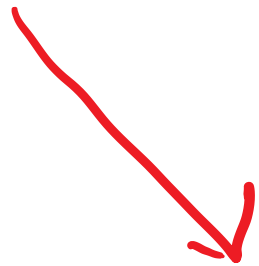
Find Forbidden Submatrices

Method

Data Structure



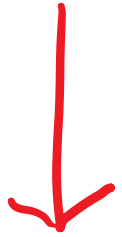
Geometric View



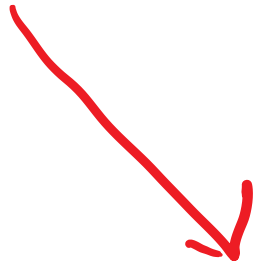
Find Forbidden Submatrices

Method

Data Structure



Geometric View



Find Forbidden Submatrices

Compute / look up
extremal Function

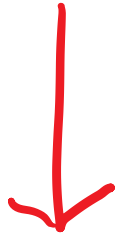


Method

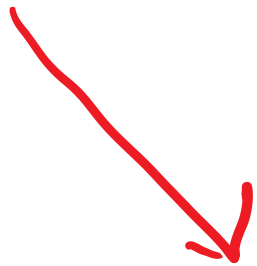
[Peattie 2010]

Runtime Bound!

Data Structure



Geometric View



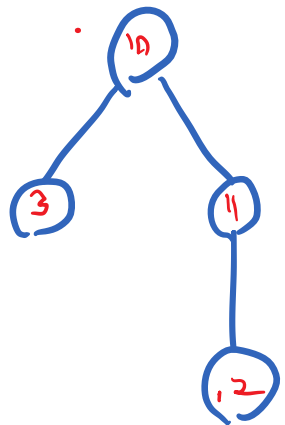
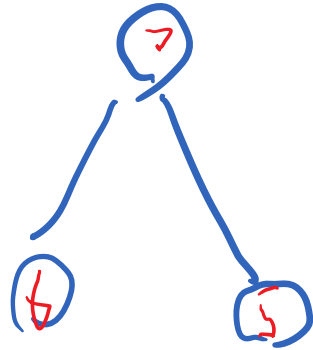
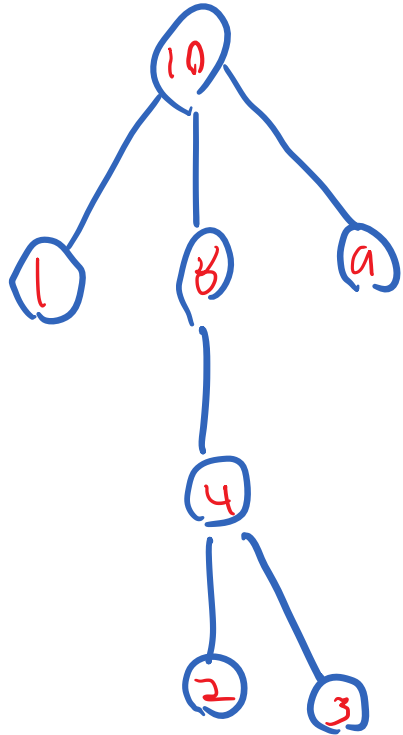
Find Forbidden Submatrices

Compute / look up
extremal Function



Example: Union-Find w Path Compression.

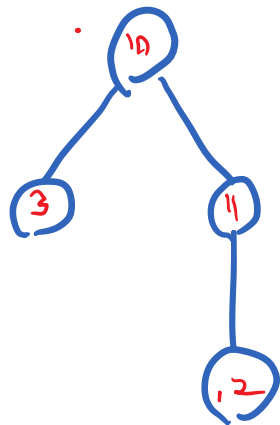
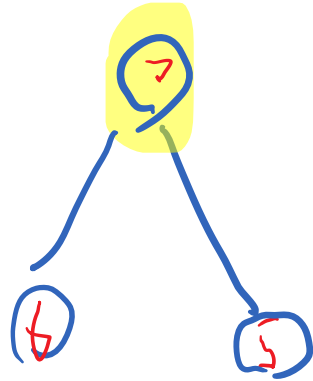
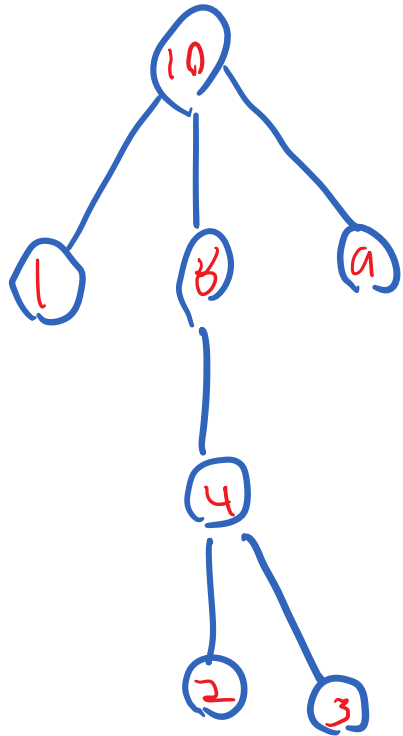
[GF 64, HU 73, T 75]



— Who is my root

— Union

Example: Union-Find w Path Compression.

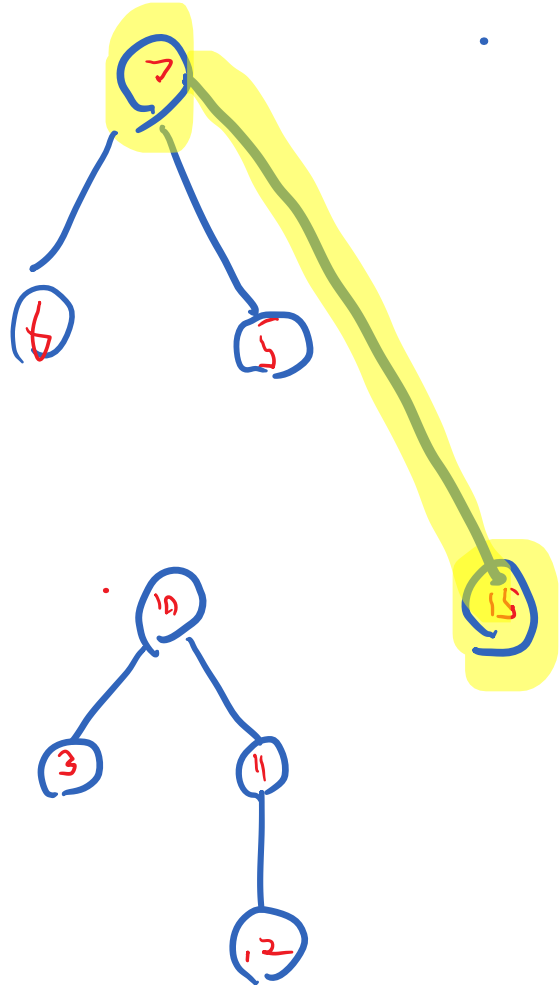
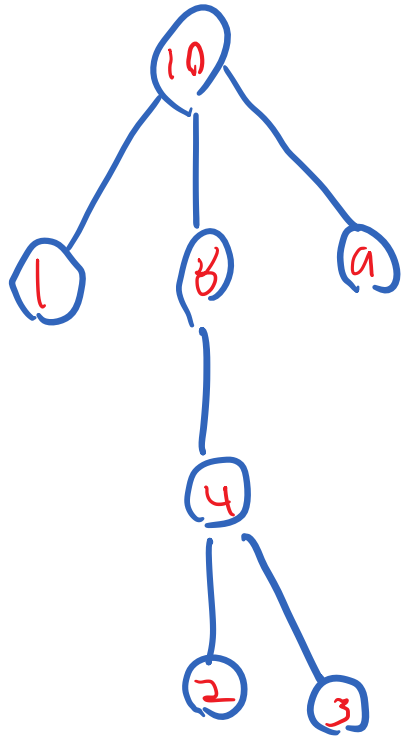


— Who is my root

— Combine

Union

Example: Union-Find w Path Compression.

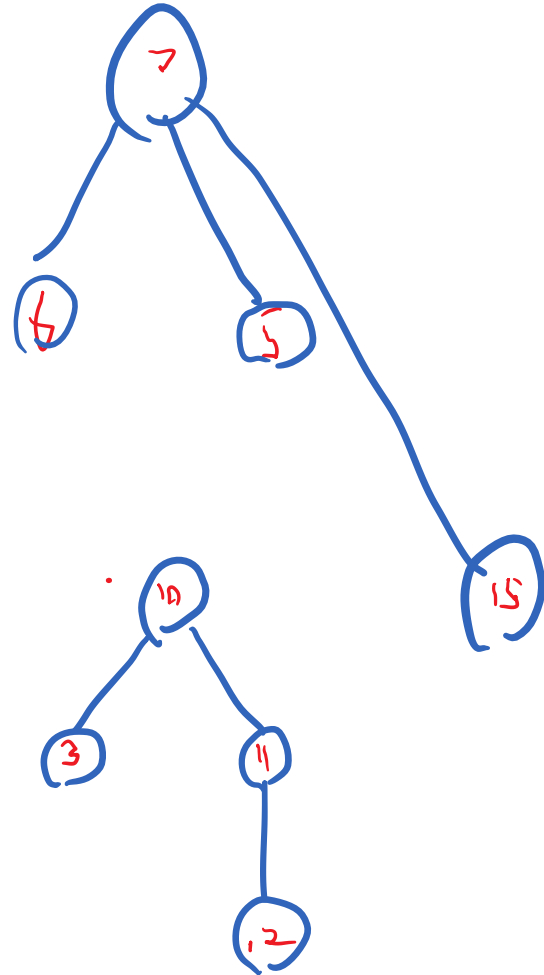
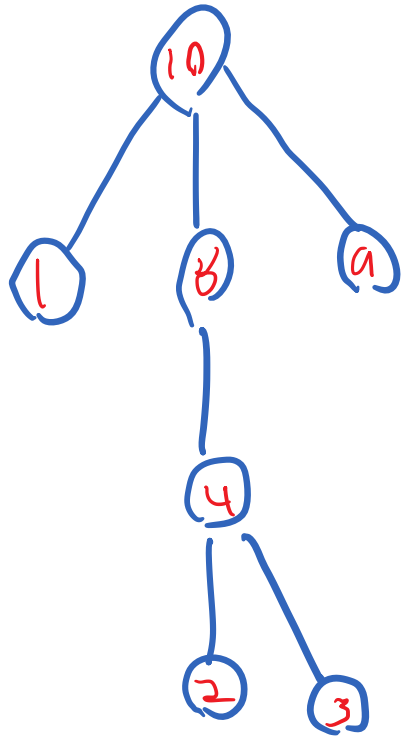


— Who is my root

— Combine

Union

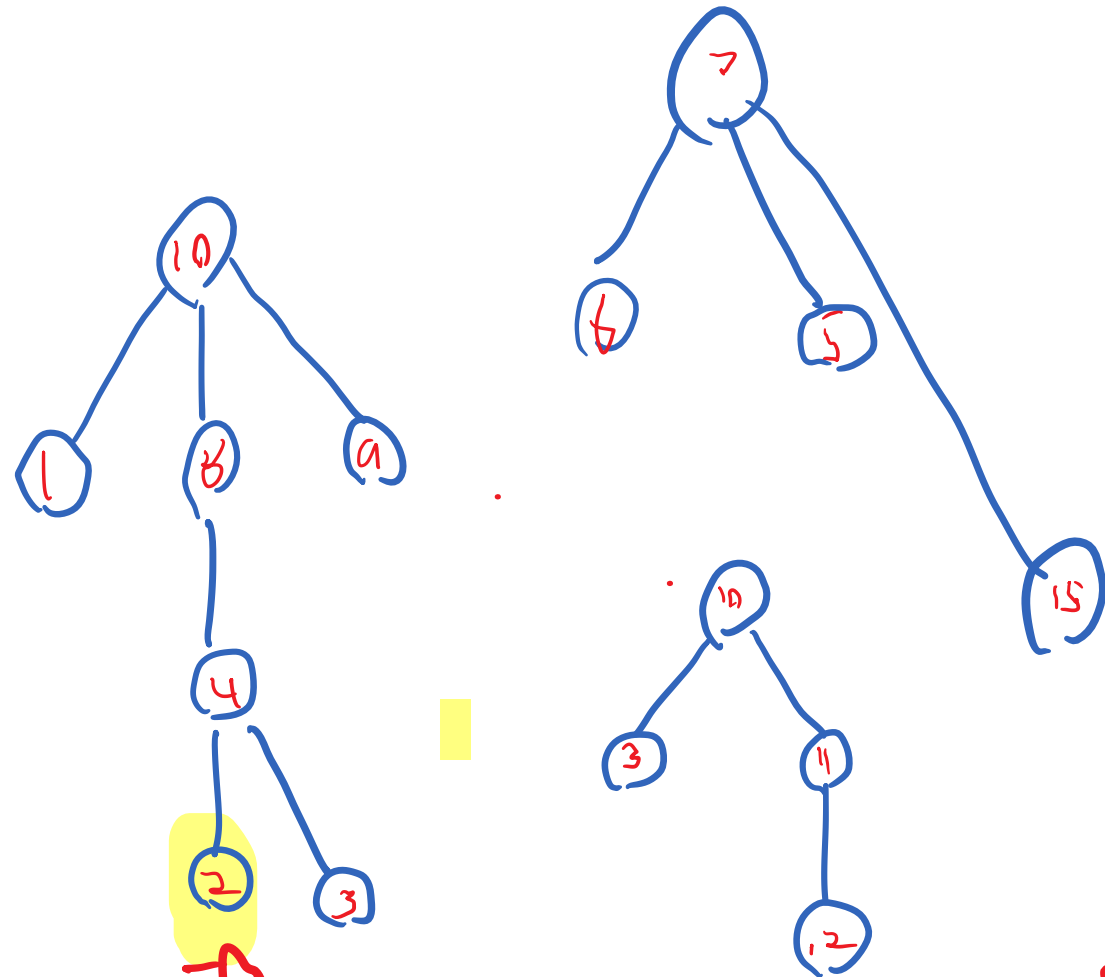
Example: Union-Find w Path Compression.



— Who is my root

— Combine

Example: Union-Find w Path Compression.

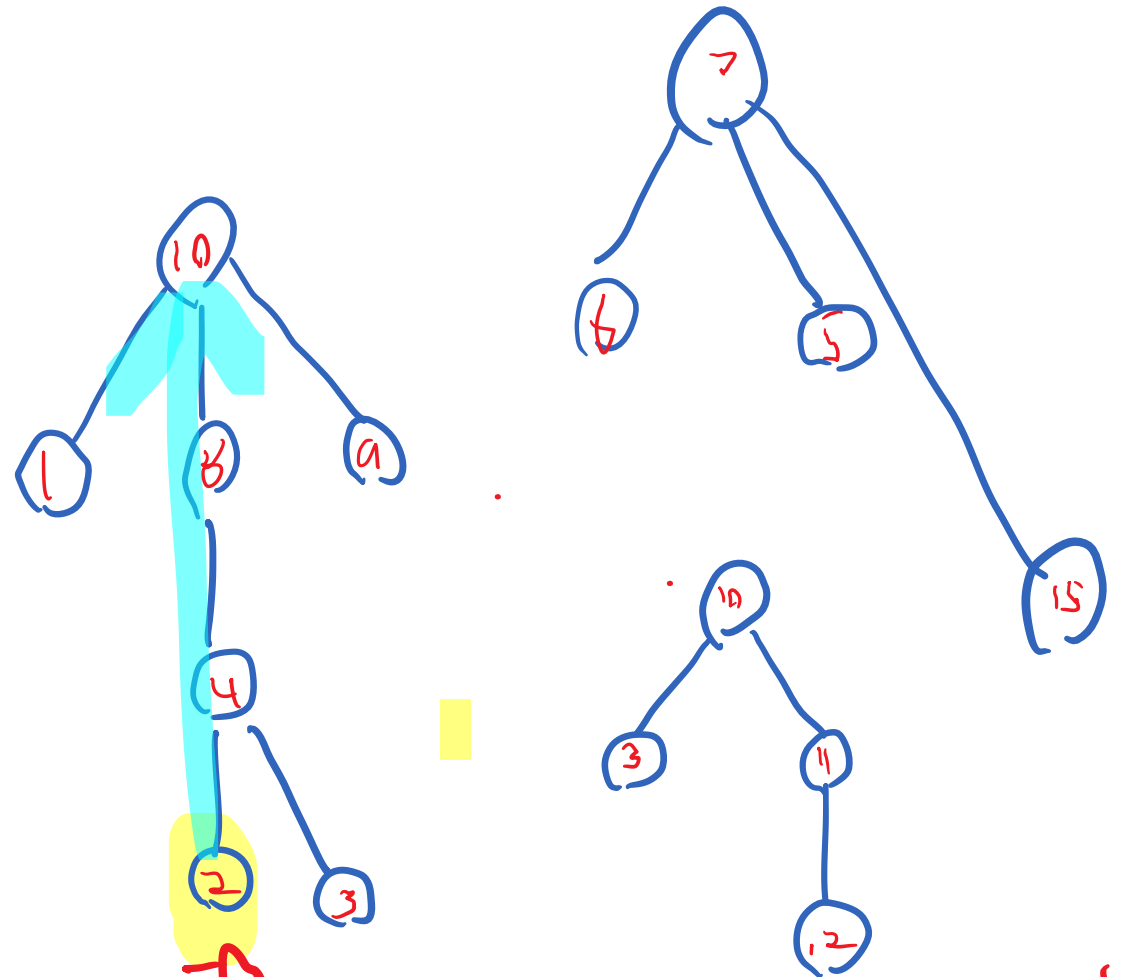


↑ who is my root

— Who is my root

— Combine

Example: Union-Find w Path Compression.

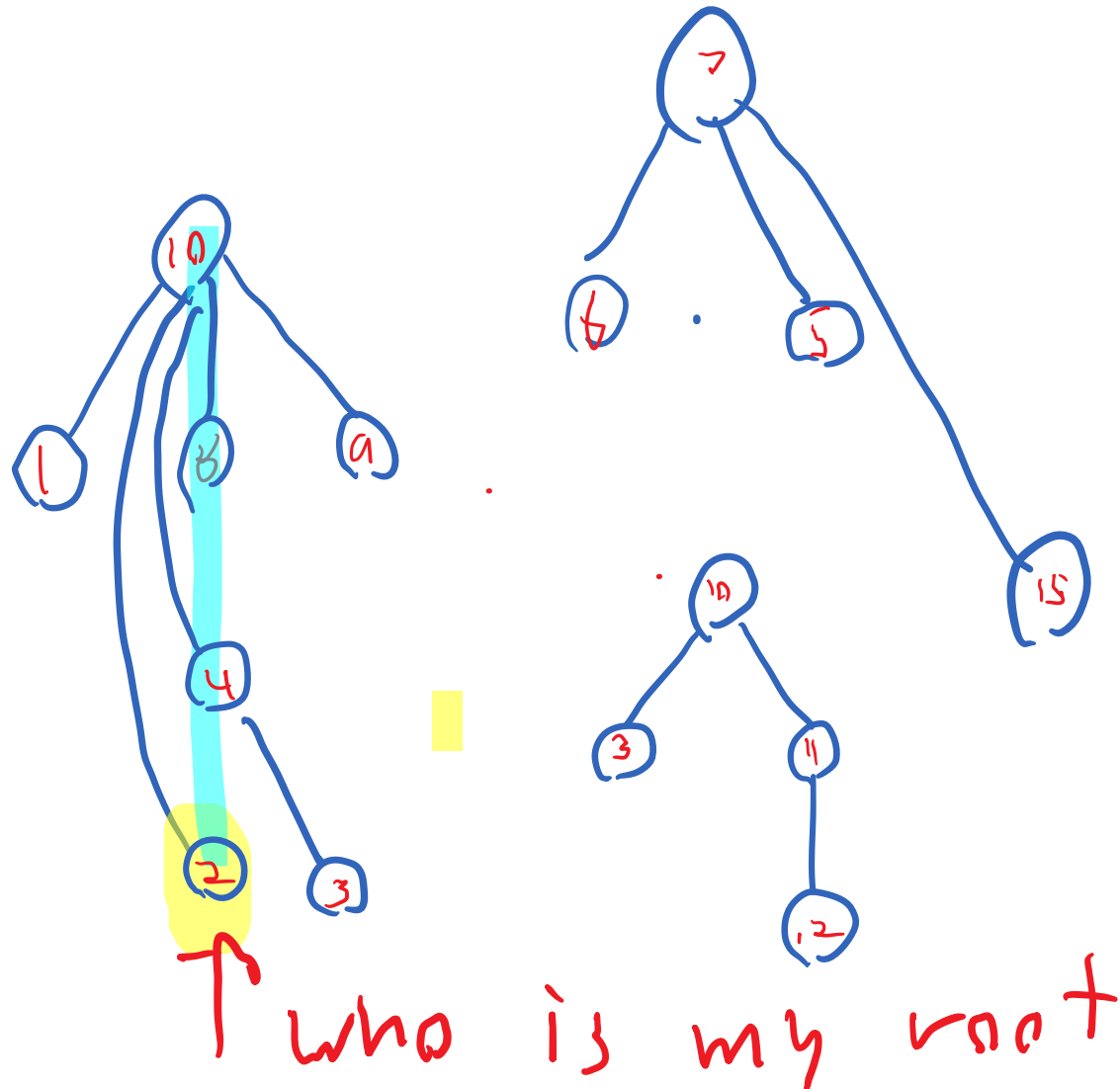


— Who is my root

— Combine

↑ who is my root

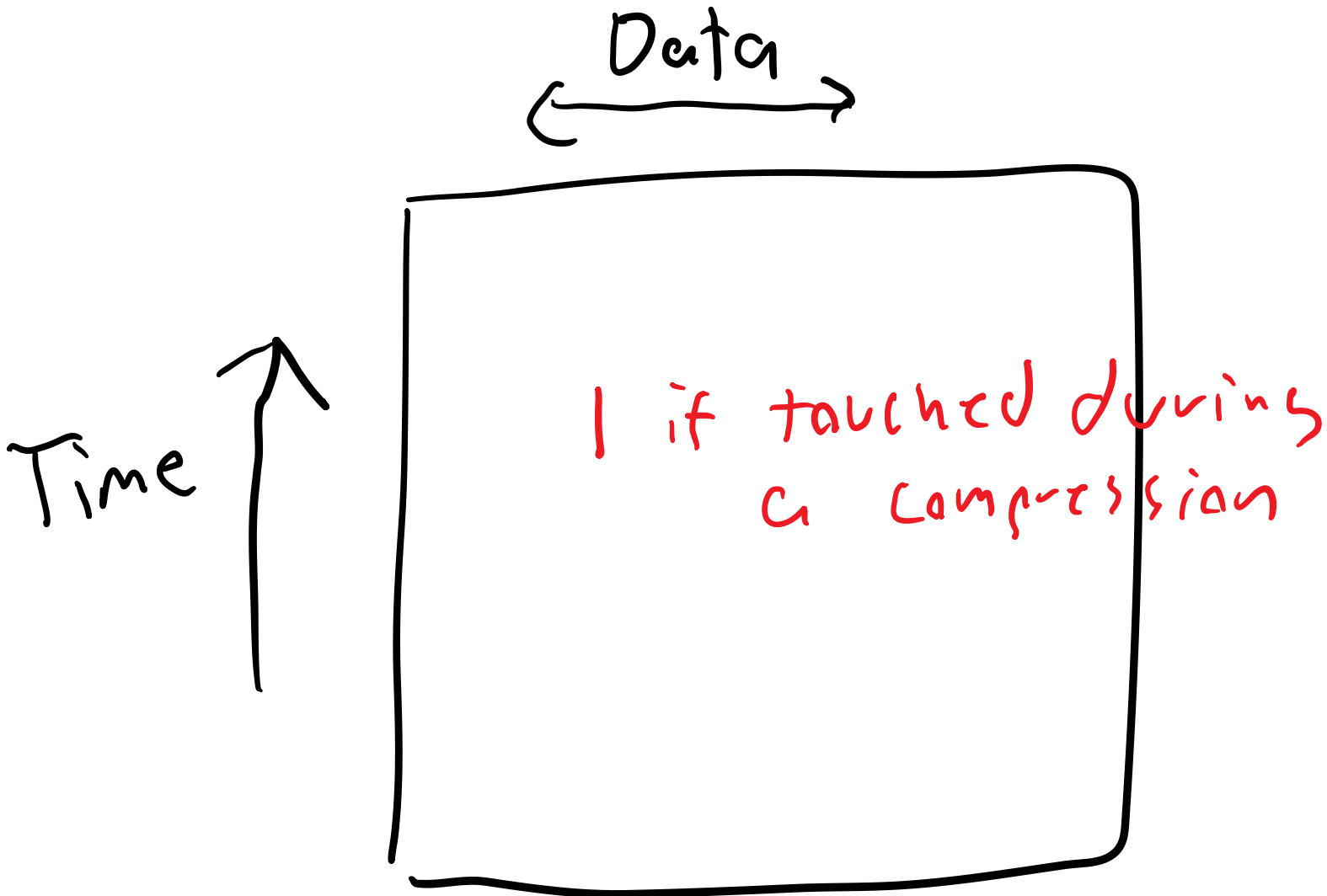
Example: Union-Find w Path Compression.



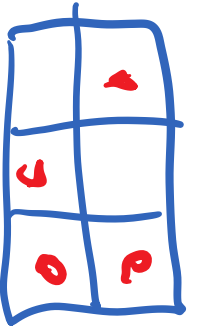
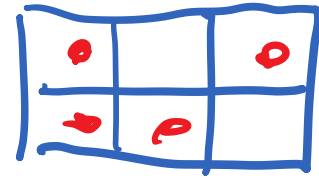
- Who is my root
- Combine

COMPRESS!

Plot Geometric View



Observe



Forbidden

Thus
 $O(n \log n)$

Technique seems powerfull

Technique seems powerfull

Yet most results are simplifications

Another Example

Aronov
Bose
Demaine
Guðmundsson
Langerman
Smid
OO

[Petrie 10]

Incremental
Restricted
Voronoi



A problem
Having to
do with
Binary search
Trees

Flarb/Dilbags



Geometric
View



Forbidden
Matrix



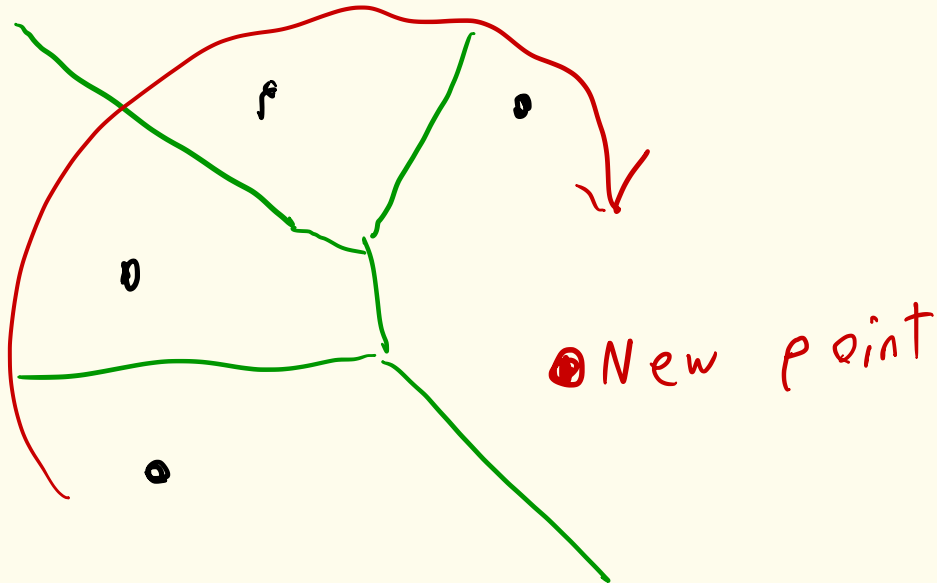
Bound!



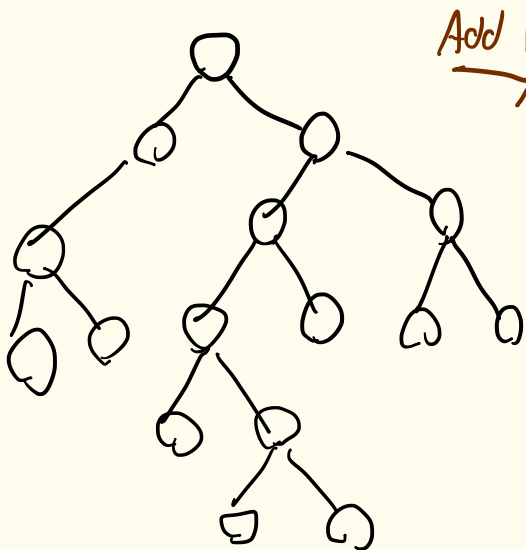
Voronoi Diagrams

- Incremental

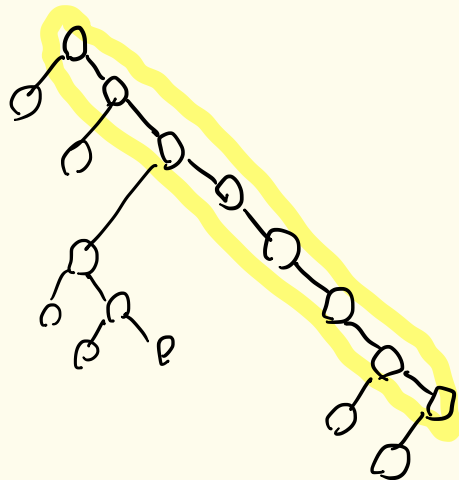
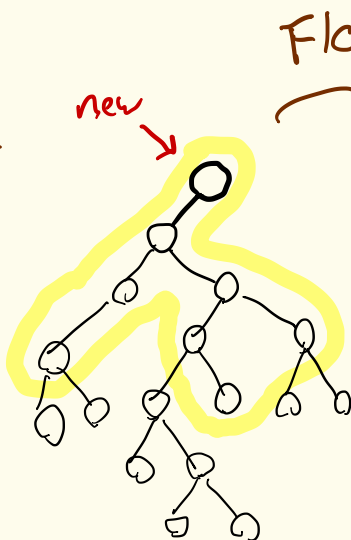
- Add hull points in clockwise order



Flarb / Oil bag

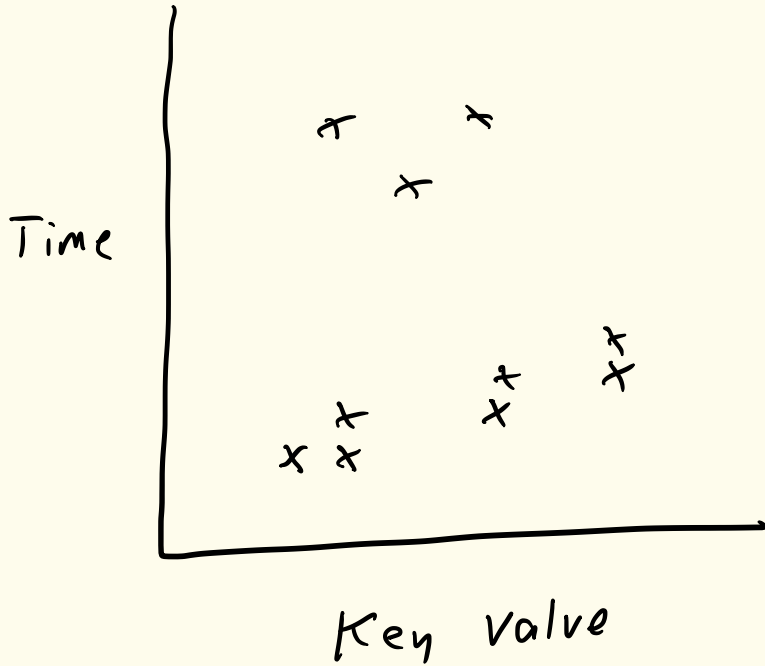


Add Root
→



Cost is # of children
who have had their
parent change

Geometric View



x = parent changed

Pettie's Observation

No

	x	x
		x
x		

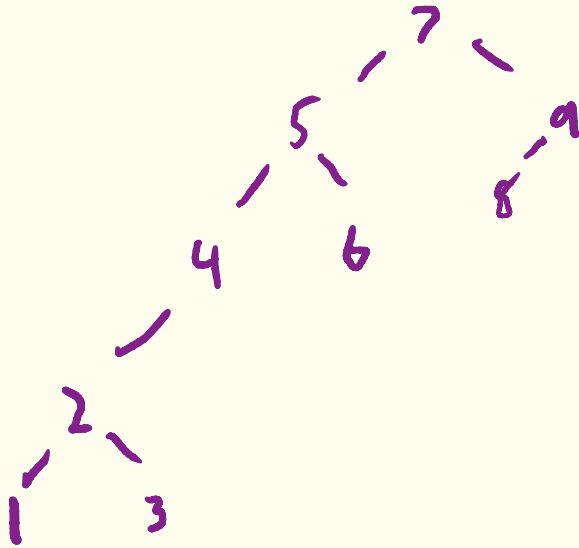
as a submatrix

→ #X's = $O(N \log N)$

Pattern Avoidance in BSTs

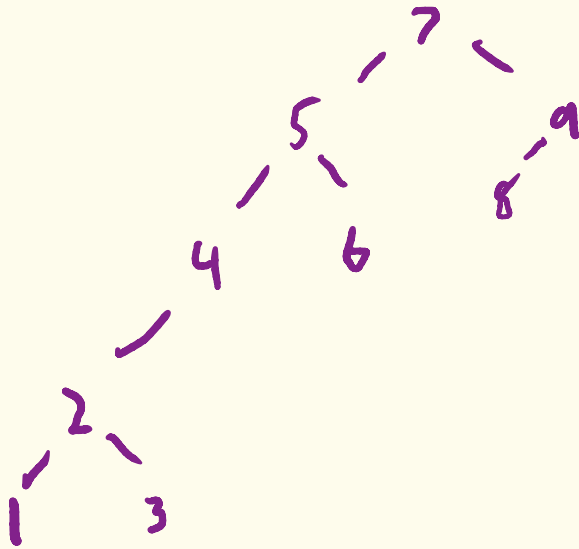
Forbidden Pattern
in the search
set \rightarrow Bound on algorithm
to make a
satisfied set

Preorder Conjecture



1	2	3	4	5	6	7	8	9

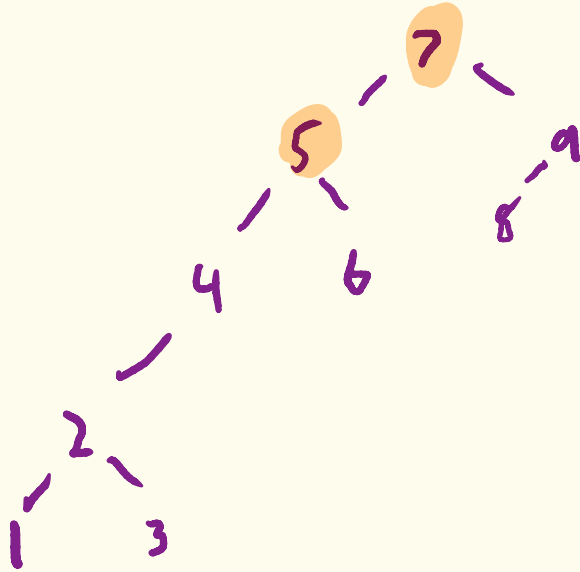
Preorder Conjecture



1	2	3	4	5	6	7	8	9

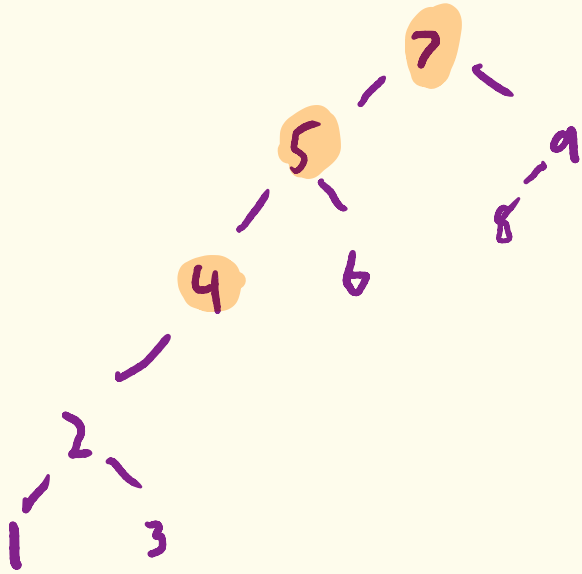
An empty 4x9 grid with a black 'X' mark in the bottom-right cell (row 4, column 7). The columns are labeled 1 through 9 at the bottom.

Preorder Conjecture



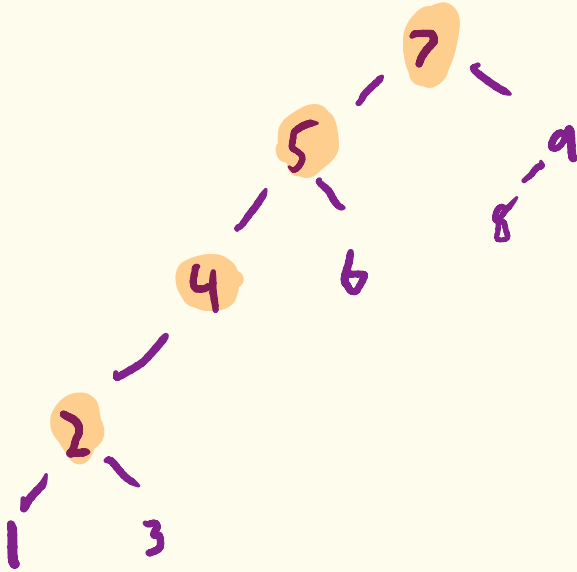
1	2	3	4	5	6	7	8	9

Preorder Conjecture



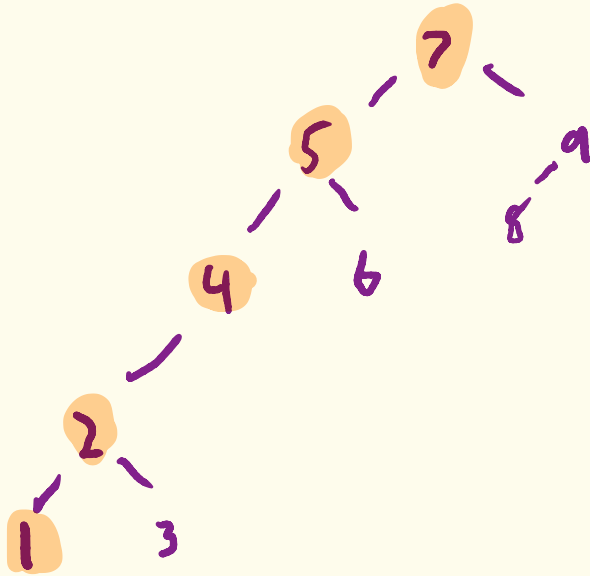
1	2	3	4	5	6	7	8	9

Preorder Conjecture



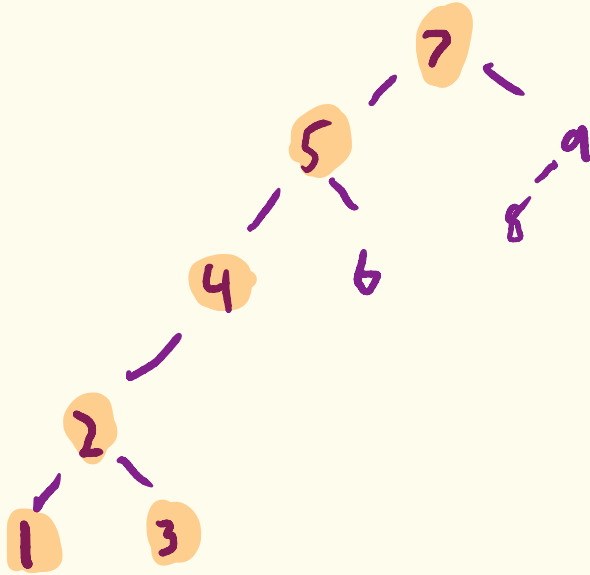
	X							
			X					
				X				
						X		
1	2	3	4	5	6	7	8	9

Preorder Conjecture



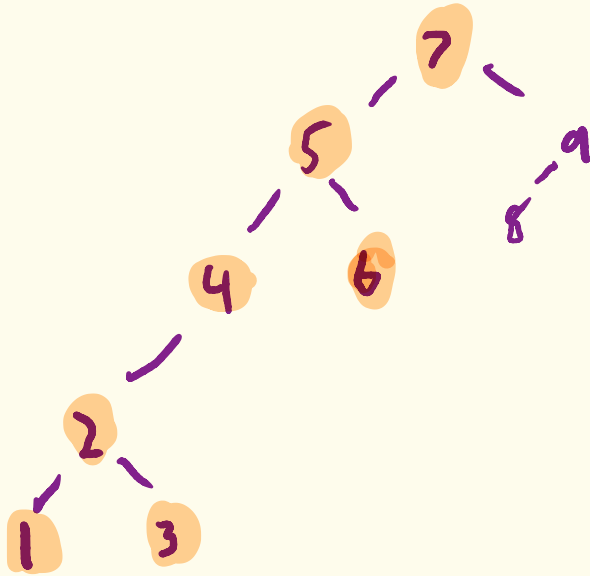
X								
	X							
			X					
				X				
						X		
1	2	3	4	5	6	7	8	9

Preorder Conjecture



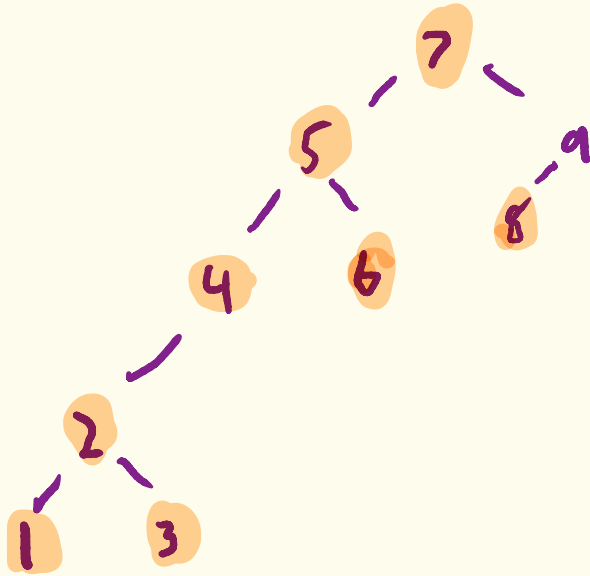
X		X						
	X							
			X					
				X				
						X		
1	2	3	4	5	6	7	8	9

Preorder Conjecture



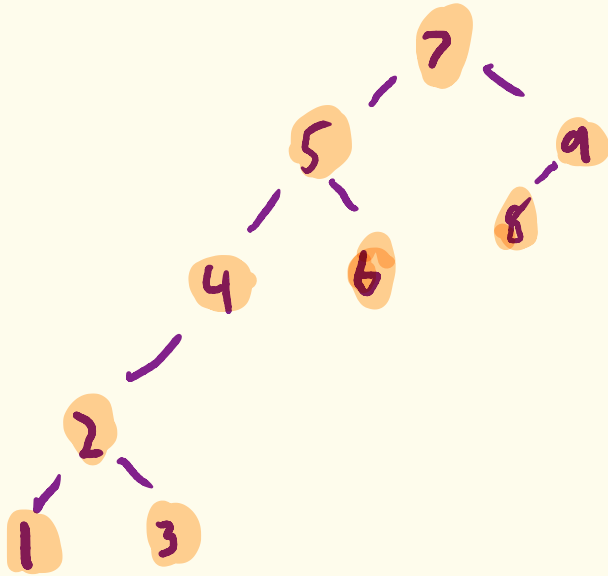
						X		
X		X						
	X							
			X					
				X				
						X		
1	2	3	4	5	6	7	8	9

Preorder Conjecture



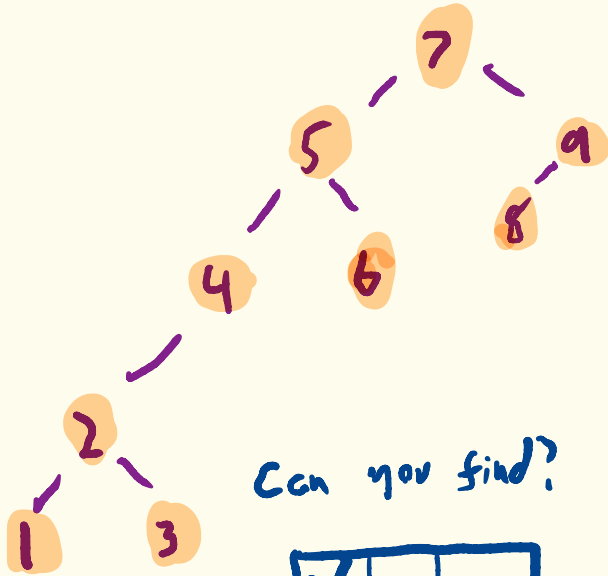
									X
						X			
X		X							
	X								
			X						
				X					
							X		
1	2	3	4	5	6	7	8	9	

Preorder Conjecture

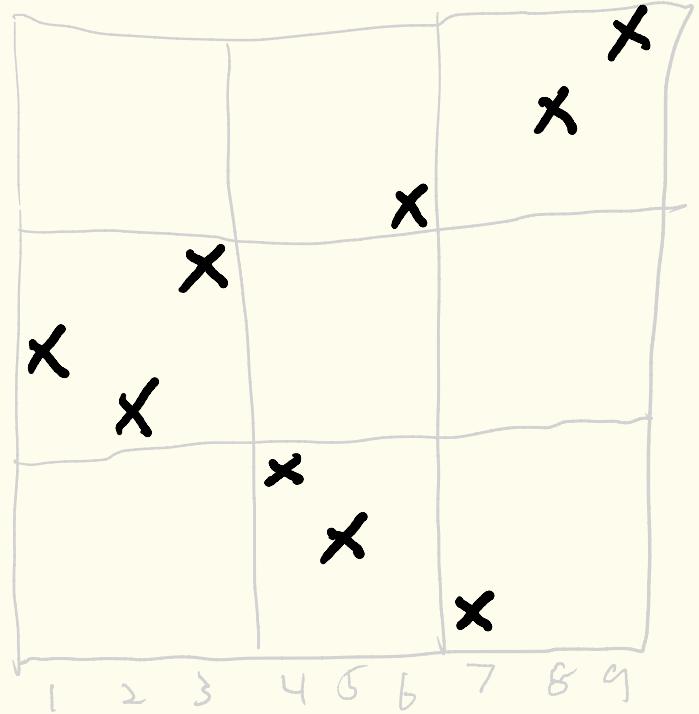
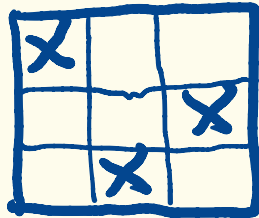


							X	X
						X		
X		X						
	X							
			X					
				X				
						X		
1	2	3	4	5	6	7	8	9

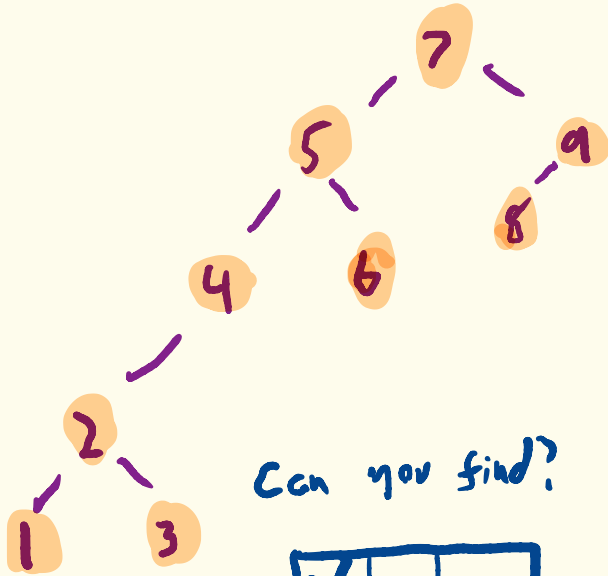
Preorder Conjecture



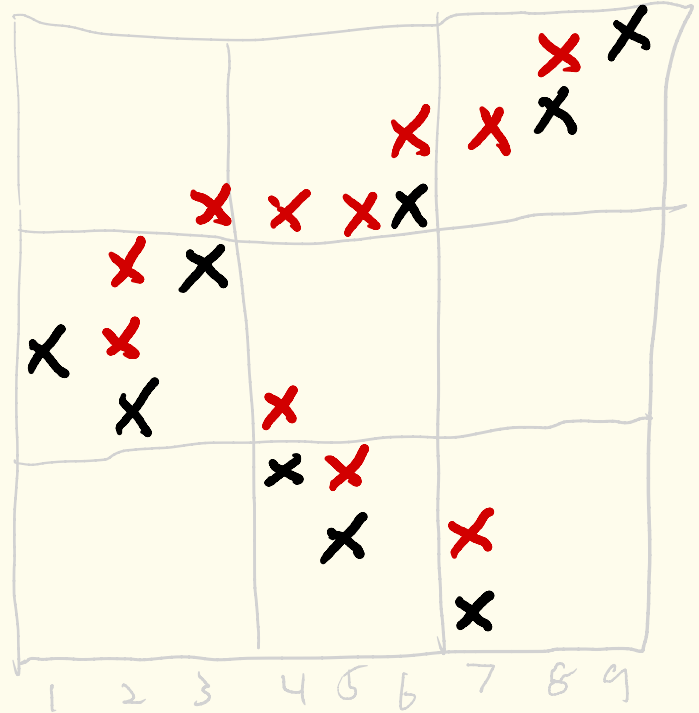
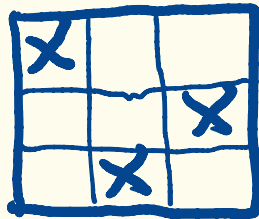
Can you find?



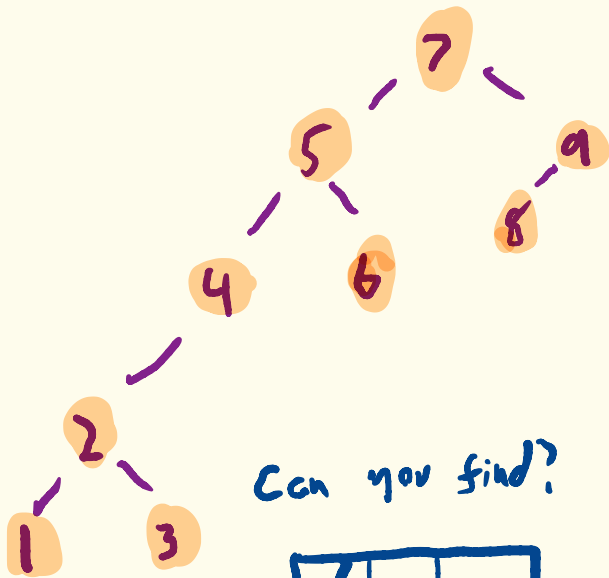
Preorder Conjecture



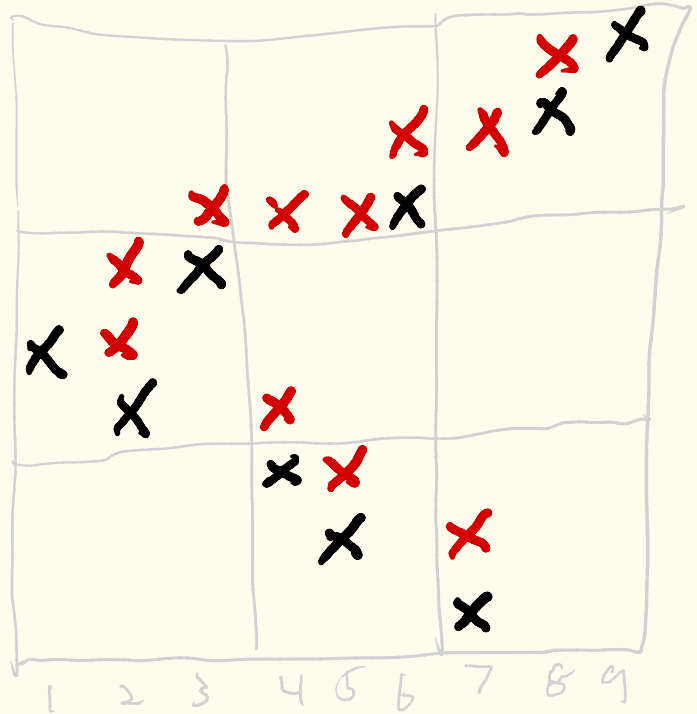
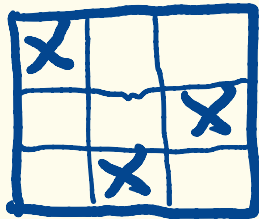
Can you find?



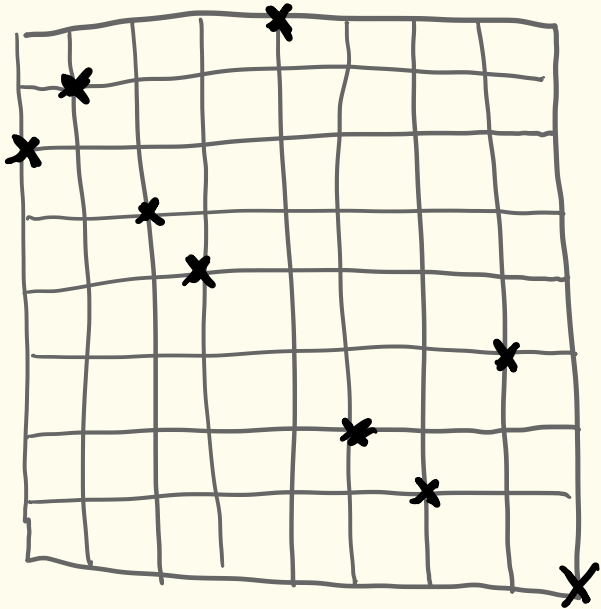
Dynamic Opt \rightarrow Preorder takes $O(N)$ time



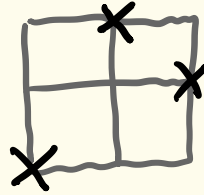
Can you find?



Pattern Avoidance in BST



No submatrix



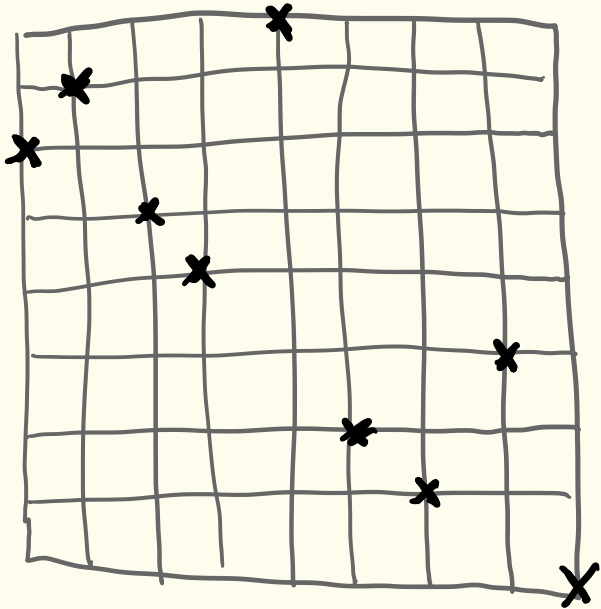
→ Greedy's Runtime is

$$\leq n \cdot 2^{\alpha(n)} \cdot O(1)$$

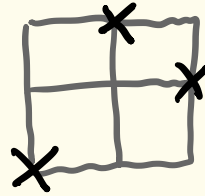
Chalermsook
Goswami
Kozma
Melhorn
Saranurak
2015

Pattern Avoidance in BST

Generalize!



No submatrix

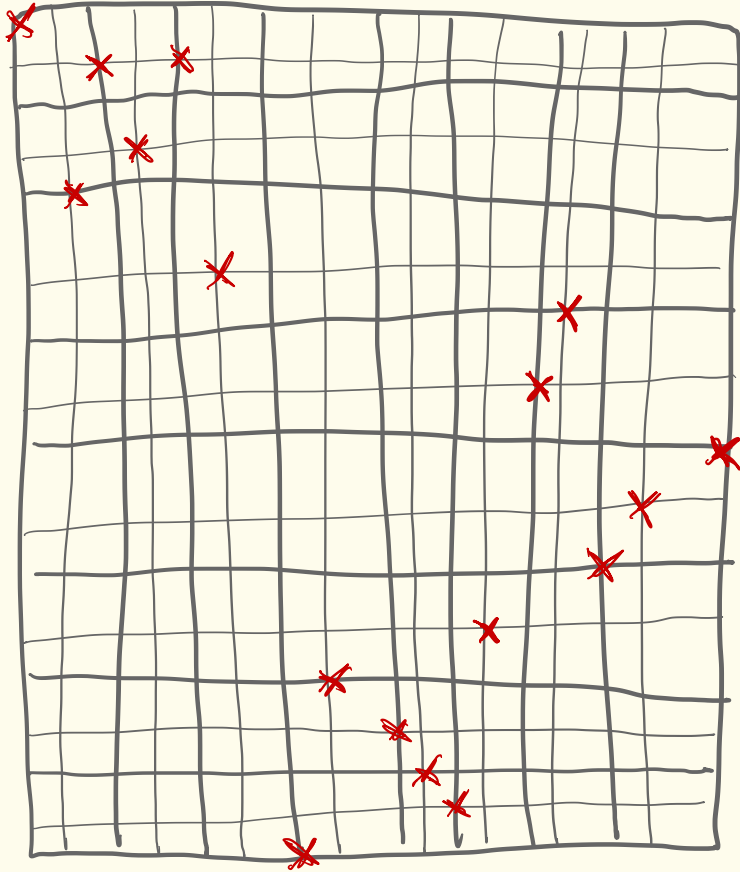


} any $k \times k$ permutation

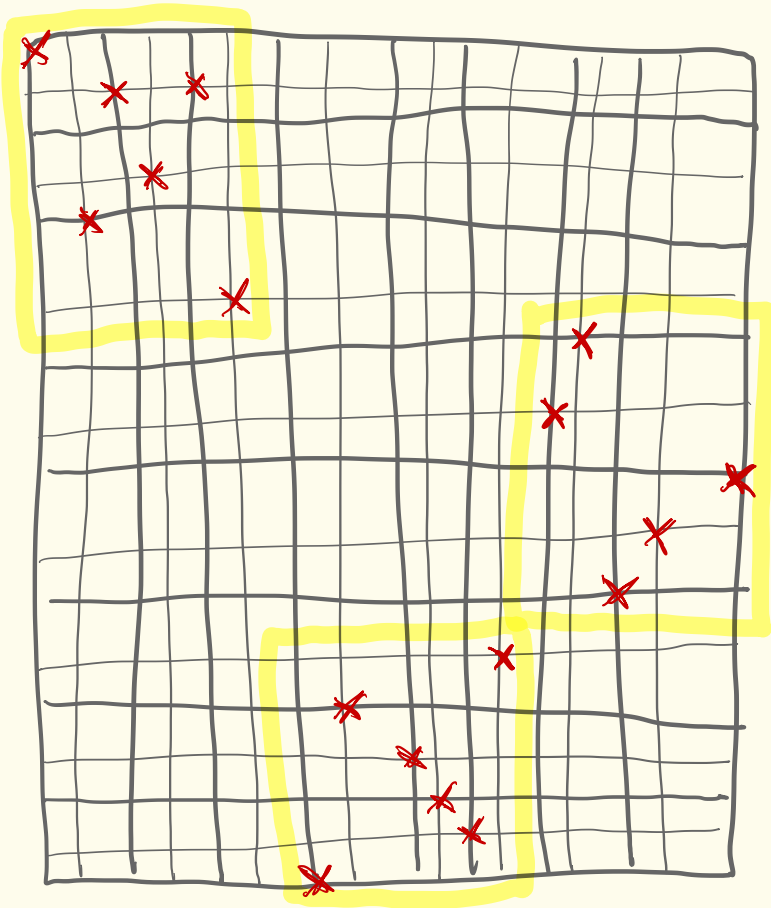
→ Greedy's runtime is

$$n \geq \alpha(n) \quad \text{or} \quad O(k)$$

Recursive Decompositions

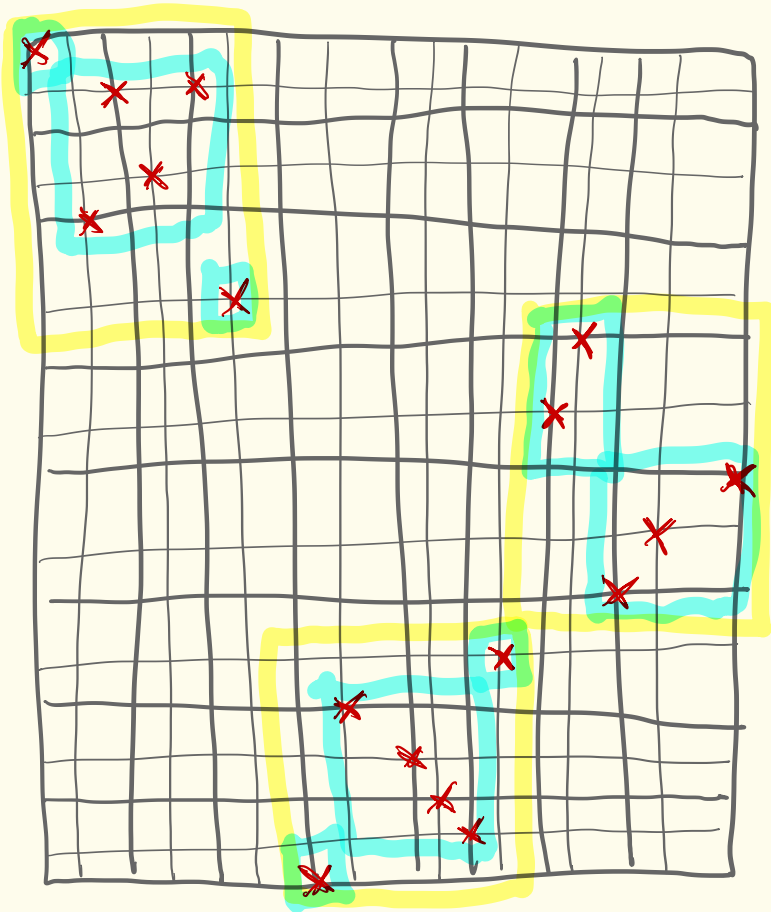


Recursive Decompositions



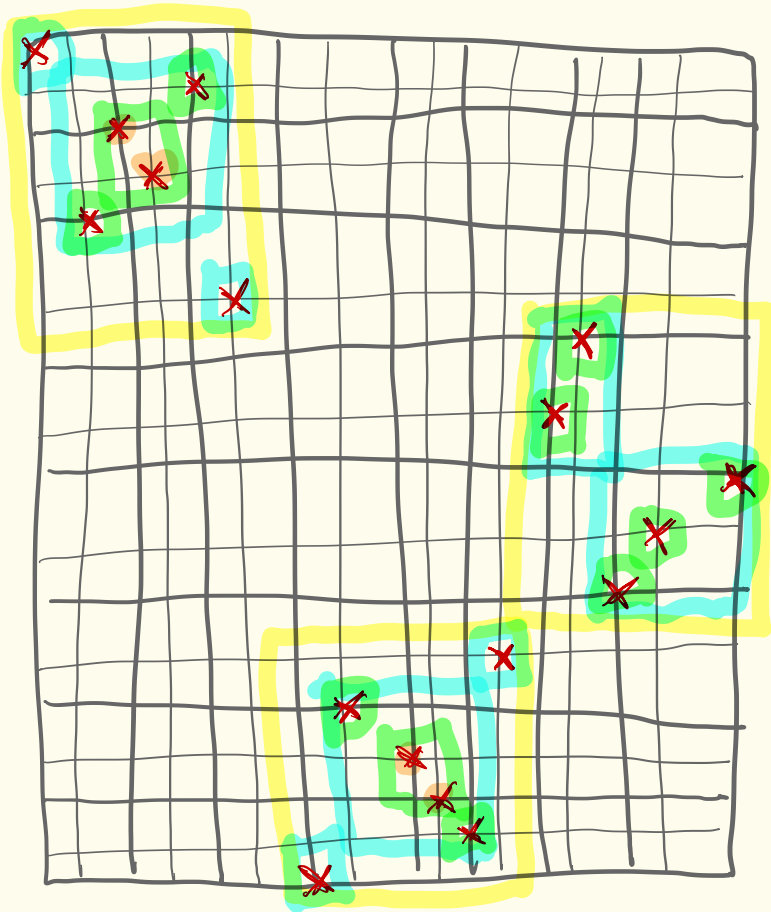
3 - decomposable

Recursive Decompositions



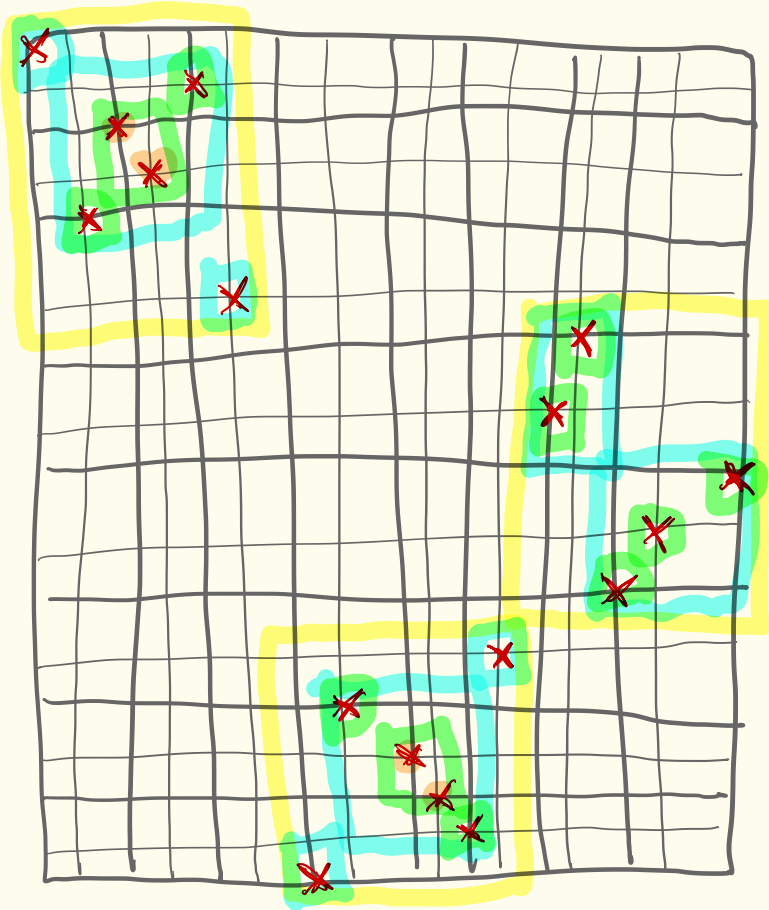
3 - decomposable

Recursive Decompositions



recursively
3 - decomposable

Recursive Decompositions



recursively
3 - decomposable

Recursively k -decomposable

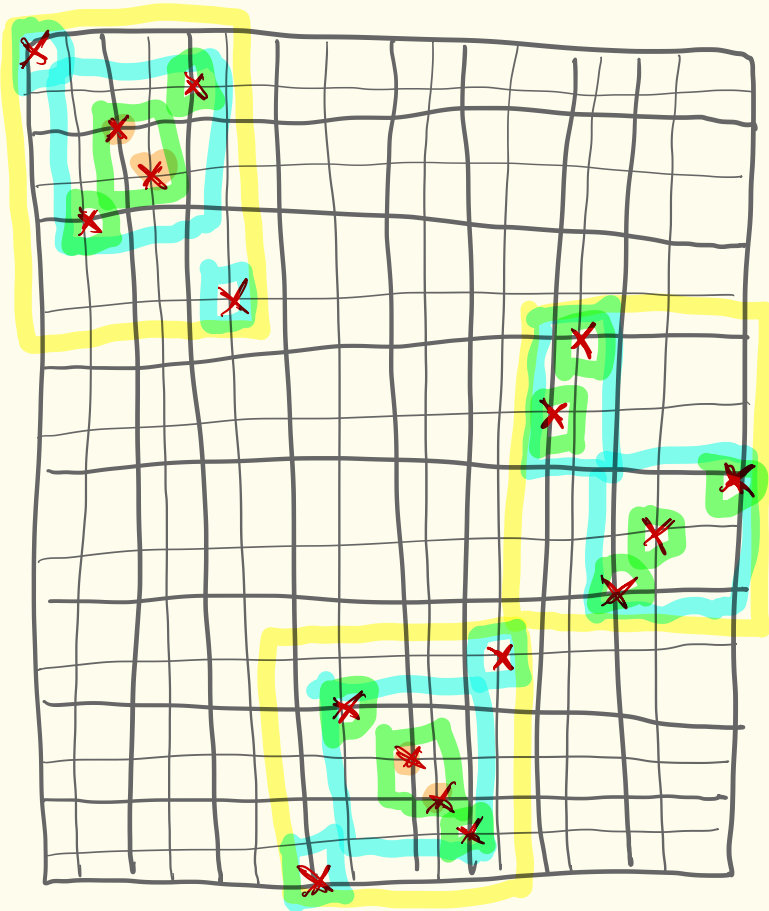
→ Greedy* adds:

$$n \geq O(k^2)$$

Chaitin, G. J.,
Goswami,
Kozma,
Melhorn,
Saranurak

2015

Recursive Decompositions



recursively
3 - decomposable

Recursively k -decomposable

→ Greedy* adds:

~~$n \leq O(k^2)$~~

$O(n \log k)$

[Chaitin, Goshwami,
Kozma,
Melhorn,
Saranurak
2015]

← same 2017
using

[Jacobson, Langerman]
SODA 2017]

More Applications?

Possible Future Directions

- Geometry of other fundamental DS's, E.G. Heaps
- Modeling other models Geometrically?
- Other forbidden matrix applications
e.g. compact encoding of
geometric objects.

The End

ULD Algorithms Group Has Multiple Postdocs!

Gwen Jarek ↘



Jean Cardinal ↗



Elena Khramtsova ↗

John Izano ↗

Avélien Ooms ↗

Till Miltzow ↖

Stefan Langerman ↗



Sam Fiorini ↘

