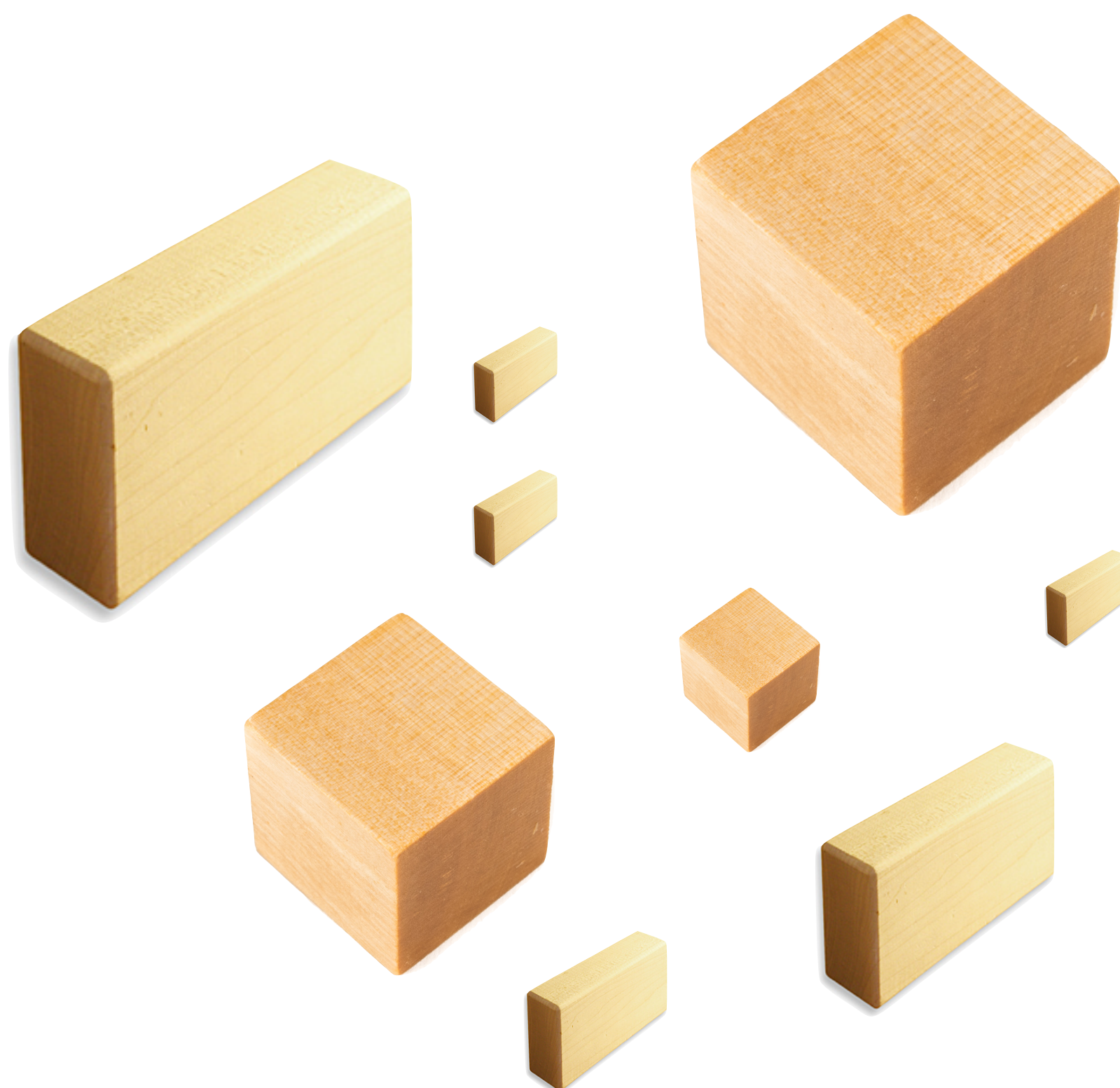


LG 5800

feb 15/17 2022

shelat

Knapsack



Sack has Capacity W

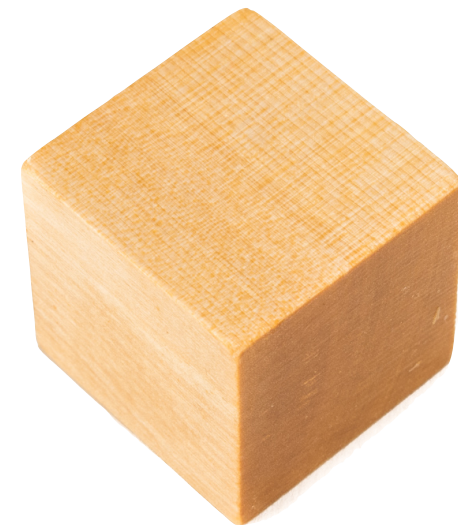


W



$w_1 \ v_1$

Each item has a weight w_i and a value v_i



$w_2 \ v_2$

Goal is to select a set of items that “**fit**” into the Knapsack and have the **greatest** value. Can only use each item once (versus Logcutter)



$w_3 \ v_3$

Define a quantity that captures the optimal solution:

$\text{Best}(\{1, \dots, n\}, W)$:

Consider the very first item. Is it part of the max solution?



Define a quantity that captures the optimal solution:

$\text{Best}(\{1, \dots, n\}, W)$: max value obtainable from items $\{1 \dots n\}$ that fit in sack of size W

Consider the very first item. Is it part of the max solution?



Define a quantity that captures the optimal solution:

Best($\{1, \dots, n\}, W$) : max value obtainable from items $\{1 \dots n\}$ that fit in sack of size W

Consider the very first item. Is it part of the max solution?



$$B(1 \dots n, W) = \max \left\{ \begin{array}{ll} B(2 \dots n, W) & \text{if not included} \\ v_1 + B(2 \dots n - 1, W - w_1) & \text{if in} \end{array} \right\}$$

Recursive structure

Either the best solution doesn't include item i

$$B(\{i \dots n\}, W) = \max$$

Or, it includes **item i** and the best solution for the remaining space, $W - w_i$

Recursive structure

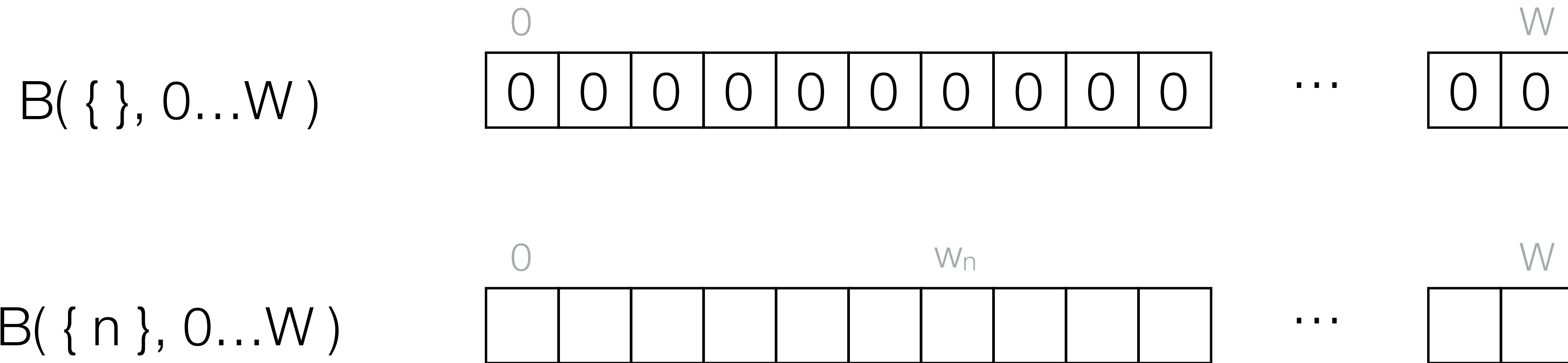
Either the best solution doesn't include item i

$$B(\{i \dots n\}, W) = \max \begin{cases} B(\{i+1 \dots n\}, W) \\ v_i + B(\{i+1 \dots n\}, W - w_i) \end{cases} \quad \text{If } W - w_i > 0$$

Or, it includes **item i** and the best solution for the remaining space, $W - w_i$

Pick an order

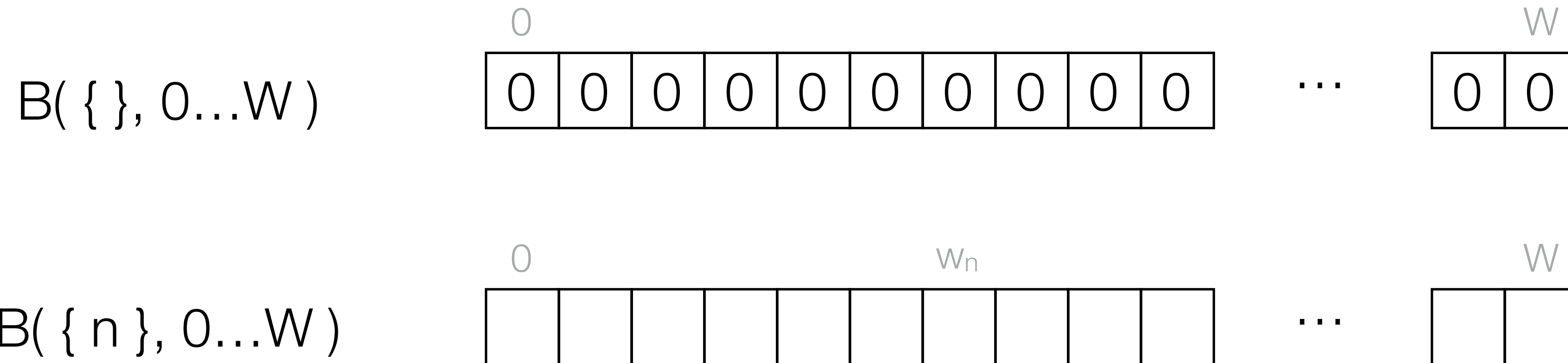
Start from the last item



$$\text{If } W - w_n > 0$$

Pick an order

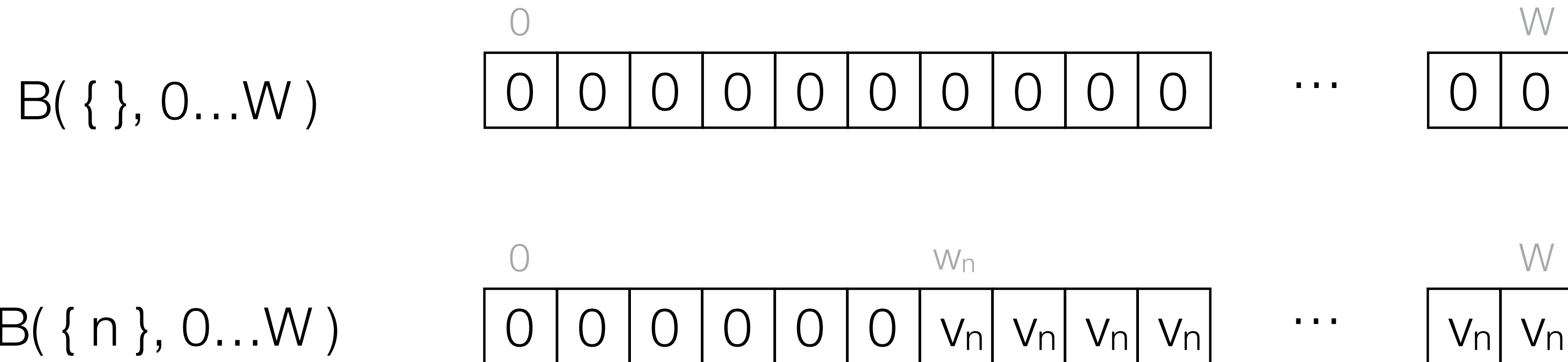
Start from the last item



$$B(\{n\}, W) = \max \begin{cases} B(\{\}, W) \\ v_n + B(\{\}, W - w_n) \end{cases} \quad \text{If } W - w_n > 0$$

Pick an order

Start from the last item

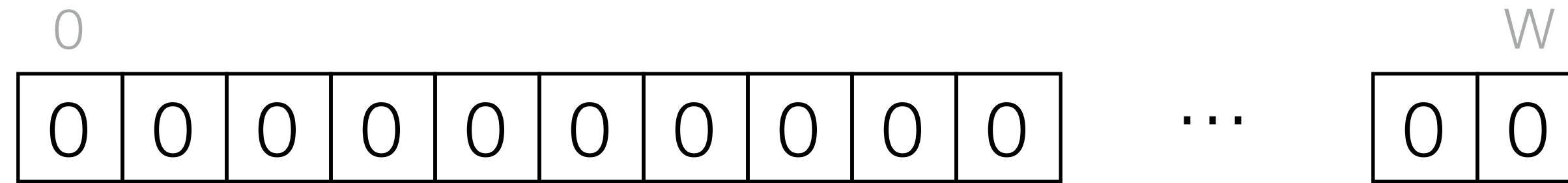


$$B(\{n\}, W) = \max \begin{cases} B(\{\}, W) \\ v_n + B(\{\}, W - w_n) \end{cases} \quad \text{If } W - w_n > 0$$

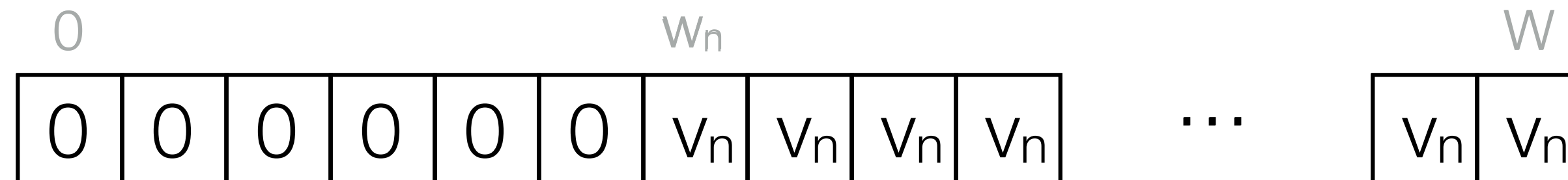
Pick an order

Start from the last item

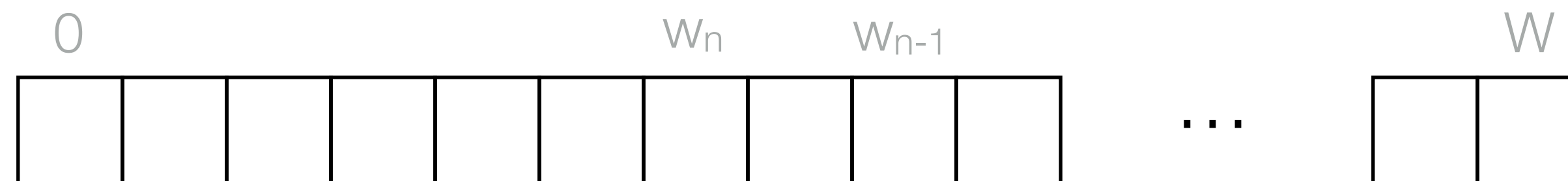
$B(\{\}, 0 \dots W)$



$B(\{n\}, 0 \dots W)$



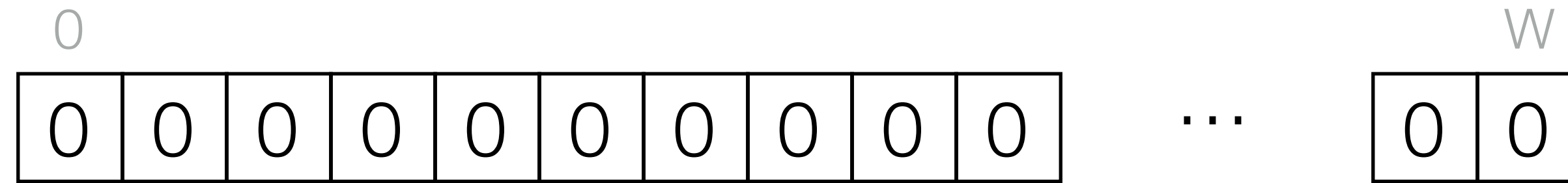
$B(\{n-1 \dots n\}, 0 \dots W)$



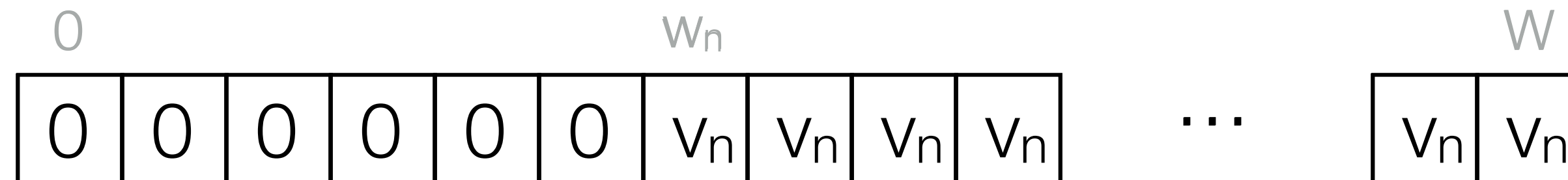
Pick an order

Start from the last item

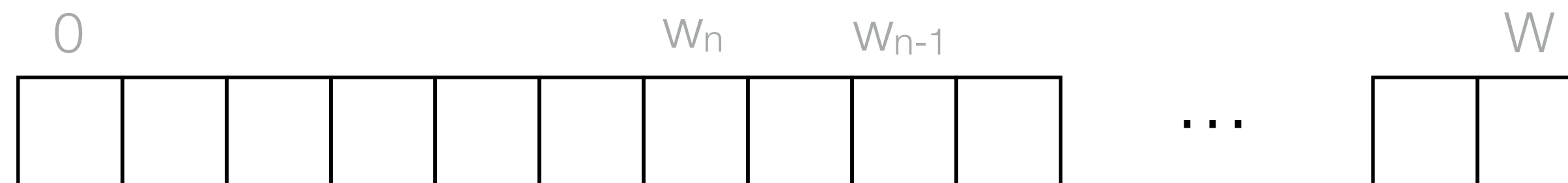
$B(\{\}, 0 \dots W)$



$B(\{n\}, 0 \dots W)$



$B(\{n-1 \dots n\}, 0 \dots W)$



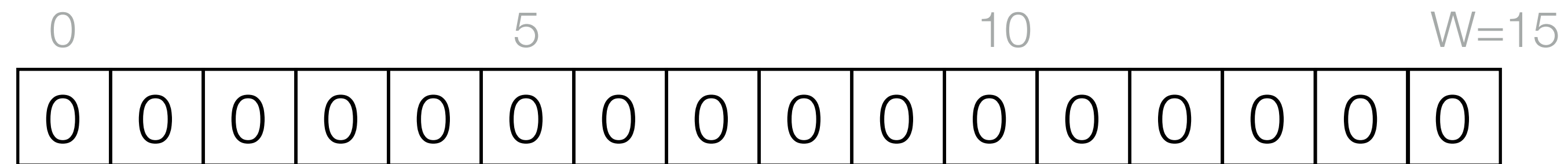
$$B(\{i \dots n\}, W) = \max \begin{cases} B(\{i+1 \dots n\}, W) \\ v_i + B(\{i+1 \dots n\}, W - w_i) \end{cases}$$

Example

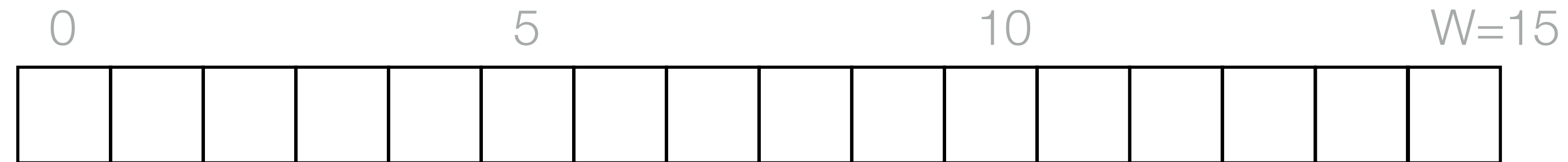
	1	2	3	4	5	6
v_i	4	5	9	1	10	3
w_i	1	3	2	4	7	2

$$C = 15$$

$B(\{\}, \dots)$



$B(\{6\}, \dots)$



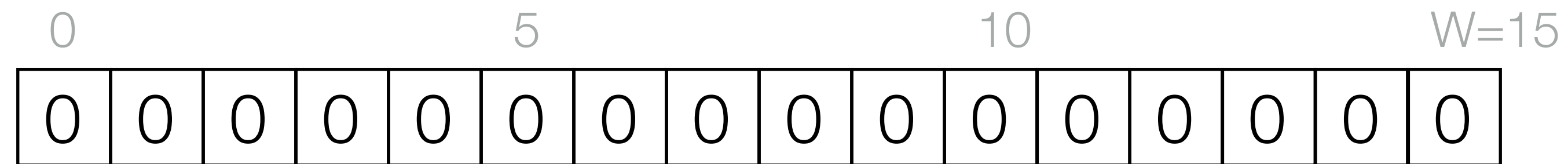
$$B(\{i \dots n\}, W) = \max \begin{cases} B(\{i+1 \dots n\}, W) \\ v_i + B(\{i+1 \dots n\}, W - w_i) \end{cases} \quad \text{If } W - w_i > 0$$

Example

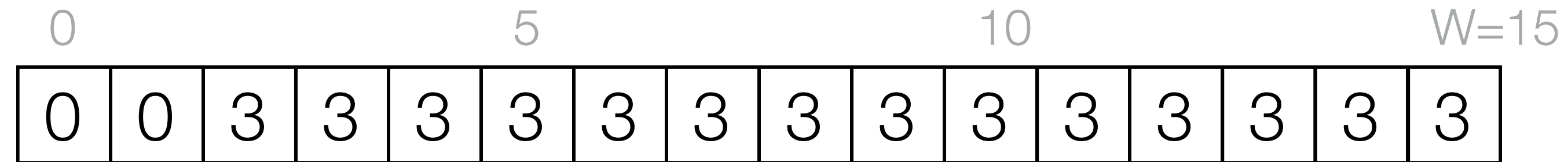
	1	2	3	4	5	6
v_i	4	5	9	1	10	3
w_i	1	3	2	4	7	2

$$C = 15$$

$B(\{\}, \dots)$



$B(\{6\}, \dots)$

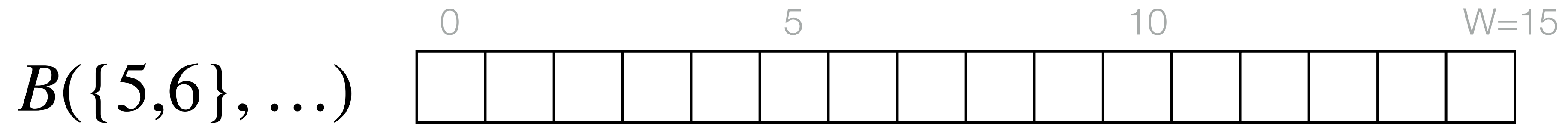
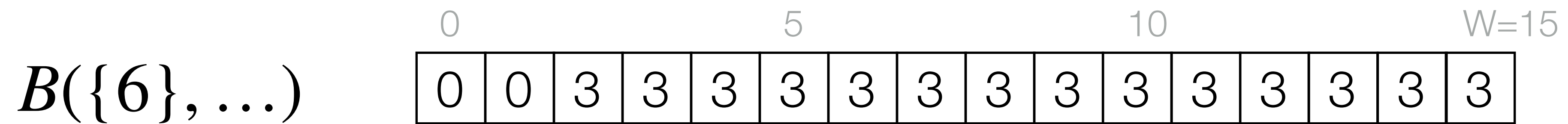


$$B(\{i \dots n\}, W) = \max \begin{cases} B(\{i+1 \dots n\}, W) \\ v_i + B(\{i+1 \dots n\}, W - w_i) \end{cases} \quad \text{If } W - w_i > 0$$

Example

	1	2	3	4	5	6
v_i	4	5	9	1	10	3
w_i	1	3	2	4	7	2

$$C = 15$$



$$B(\{i\dots n\}, W) = \max \begin{cases} B(\{i+1\dots n\}, W) \\ v_i + B(\{i+1\dots n\}, W - w_i) \end{cases} \quad \text{If } W - w_i > 0$$

Example

	1	2	3	4	5	6
v_i	4	5	9	1	10	3
w_i	1	3	2	4	7	2

$$C = 15$$

$B(\{6\}, \dots)$

	0		5		10		W=15
	0	0	3	3	3	3	3

$B(\{5,6\}, \dots)$

	0		5		10		W=15
	0	0	3	3	3	3	10
							10
							13
							13
							13
							13
							13
							13

$$B(\{i\dots n\}, W) = \max \begin{cases} B(\{i+1\dots n\}, W) \\ v_i + B(\{i+1\dots n\}, W - w_i) \end{cases} \quad \text{If } W - w_i > 0$$

Example

	1	2	3	4	5	6
v_i	4	5	9	1	10	3
w_i	1	3	2	4	7	2

$$C = 15$$

$B(\{5,6\}, \dots)$

	0		5		10		W=15								
	0	0	3	3	3	3	3	10	10	13	13	13	13	13	13

$B(\{4,5,6\}, \dots)$

	0		5		10		W=15								

$$B(\{i\dots n\}, W) = \max \begin{cases} B(\{i+1\dots n\}, W) \\ v_i + B(\{i+1\dots n\}, W - w_i) \end{cases} \quad \text{If } W - w_i > 0$$

Knapsack($\{w_i, v_i\}_n, W$)

Initialize $B(\{n-1\}, 0 \dots W) = 0$

for i from n to 1

for j from 0 to W

$B(i, j) = \max$

$$\left\{ \begin{array}{l} B(i+1, j) \\ v_i + B(i+1, j - w_i) \end{array} \right.$$

as long as $j > w_i$
because otherwise,
this term is negative

Return $B(1, W)$

Knapsack($\{w_i, v_i\}_n, W$)

Initialize $B(\{n-1\}, 0 \dots W) = 0$

for i from n to 1

 for j from 0 to W

$B(i, j) = B(i+1, j)$

 if $j > w_i$ and $B(i+1, j-w_i) + v_i > S(i, j)$

$B(i, j) = B(i+1, j-w_i) + v_i$

Return $B(1, W)$

How can we determine WHICH items are selected?

Knapsack($\{w_i, v_i\}_n, W$)

Initialize $B(\{n-1\}, 0 \dots W) = 0$

for i from n to 1

 for j from 0 to W

$B(i, j) = B(i+1, j)$

 pick(i, j) = false

 if $j > w_i$ and $B(i+1, j-w_i) + v_i > B(i, j)$

$B(i, j) = B(i+1, j-w_i) + v_i$

 pick(i, j) = true

//Backtrack to find solution

cap = W, sol = {}

for i from 1 to n

 if picked(i, cap) = true { sol = sol + {i}; cap = cap - w_i; }

Gerrymander

Congressional District 5



nationalatlas.gov



5

Congressional District

Nelson

County

0

50

100 Miles

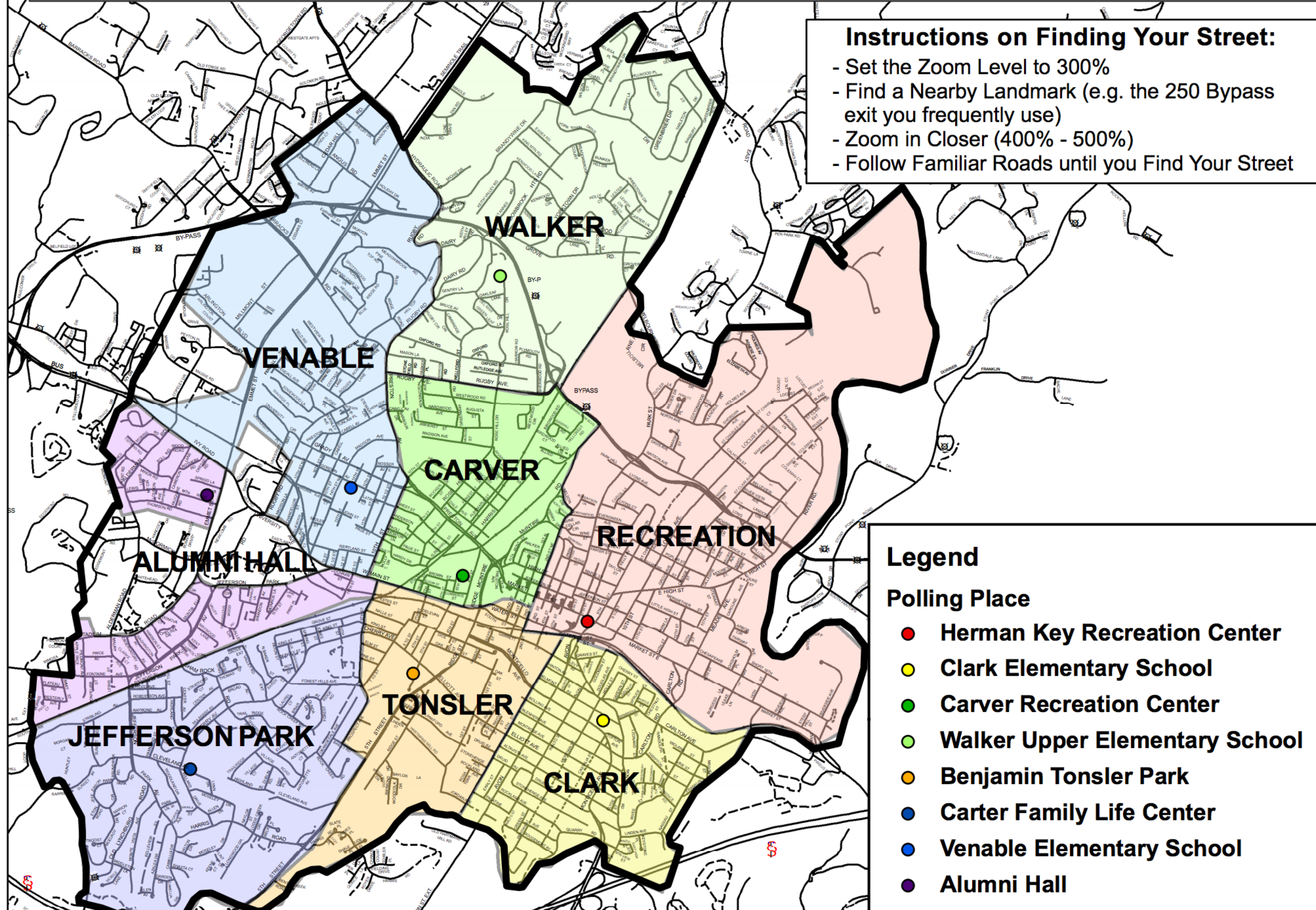


Virginia (11 Districts)

Map of Charlottesville Precincts and Polling Places

Instructions on Finding Your Street:

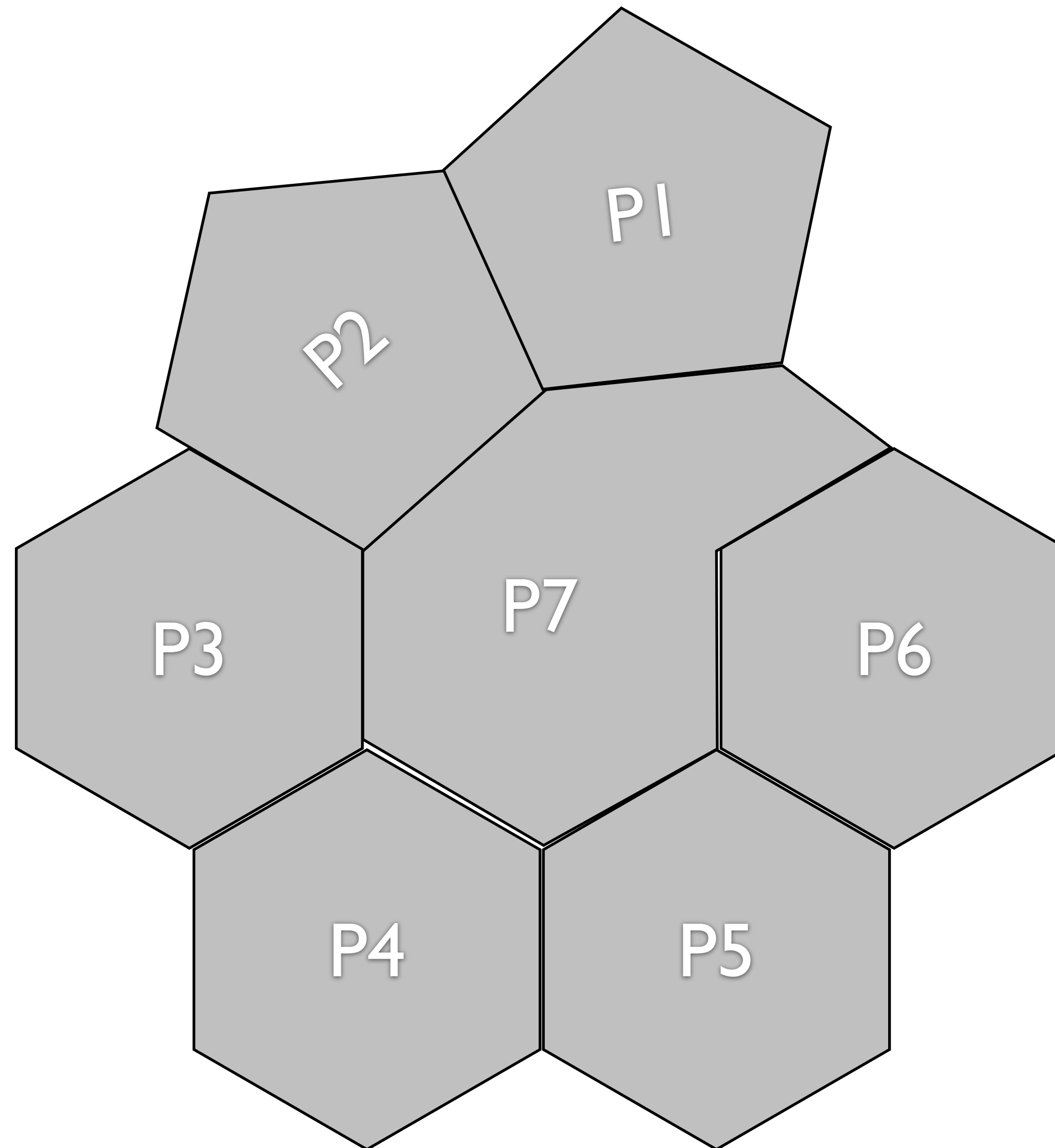
- Set the Zoom Level to 300%
- Find a Nearby Landmark (e.g. the 250 Bypass exit you frequently use)
- Zoom in Closer (400% - 500%)
- Follow Familiar Roads until you Find Your Street

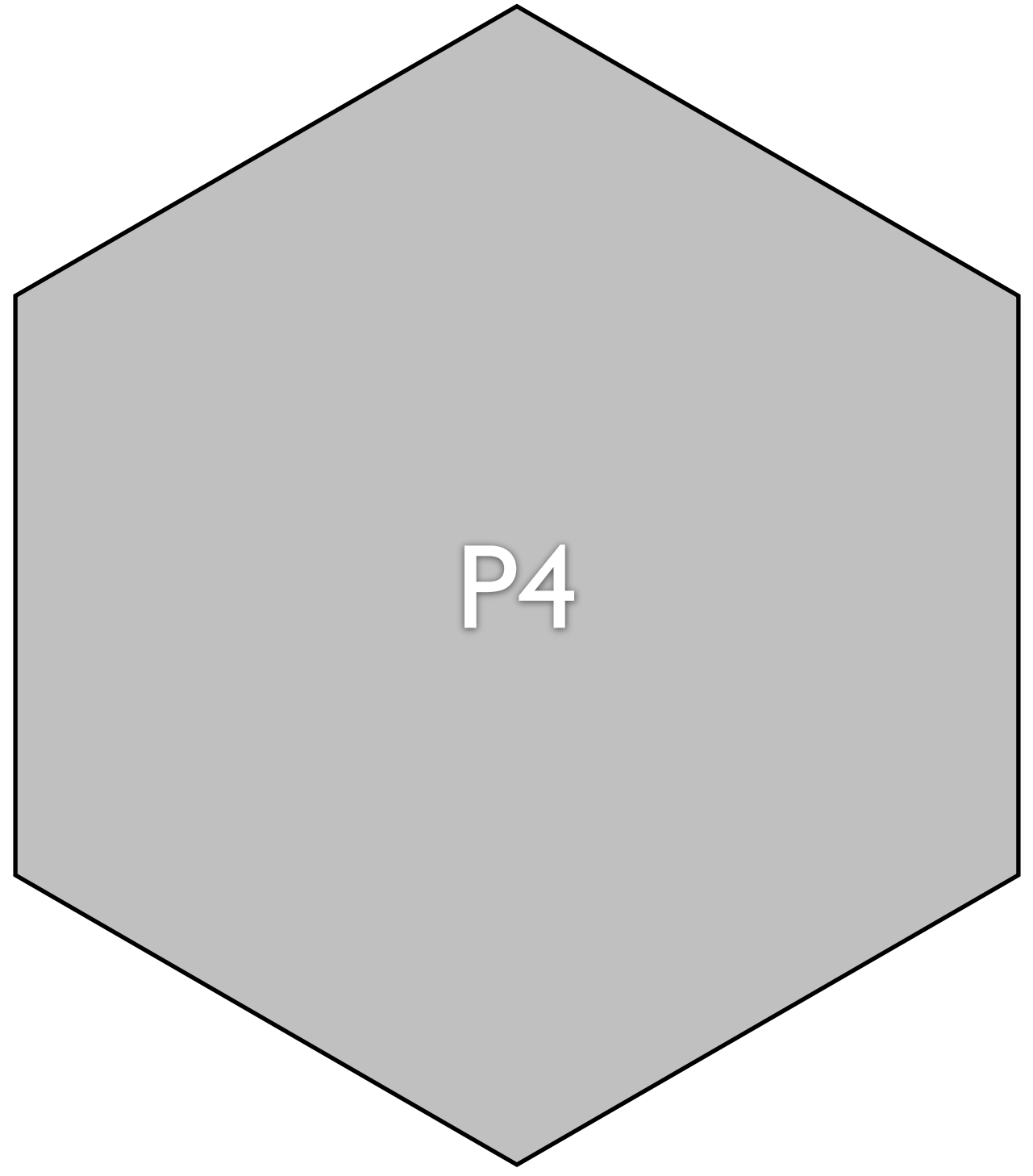


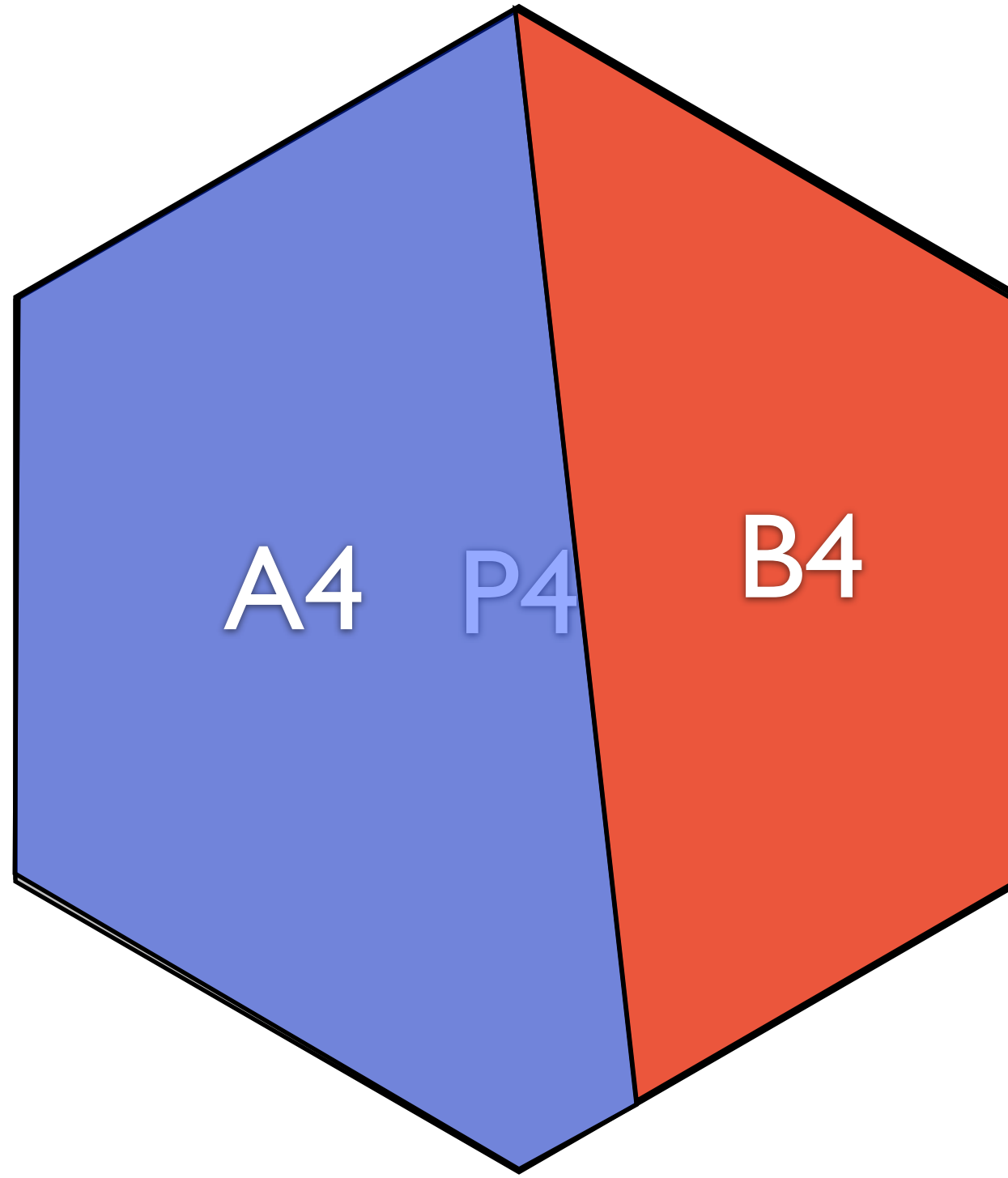
Legend

Polling Place

- Herman Key Recreation Center
- Clark Elementary School
- Carver Recreation Center
- Walker Upper Elementary School
- Benjamin Tonsler Park
- Carter Family Life Center
- Venable Elementary School
- Alumni Hall







Each precinct P_i has A_i voters for party A and B_i voters for party B.

gerrymander problem

given:

output:

gerrymander problem

given: m A_1, A_2, \dots, A_n n is even

Total voters

Voters for party A in each precinct

output: D_1, D_2

such that $|D_1| = |D_2|$

$$A(D_1) > \frac{mn}{4}$$

$$A(D_2) > \frac{mn}{4}$$

or “failure” if no such solution is possible

Example

Imagine 4
precincts
divided into
2 districts.

A1=65	A3=45
A2=57	A4=47

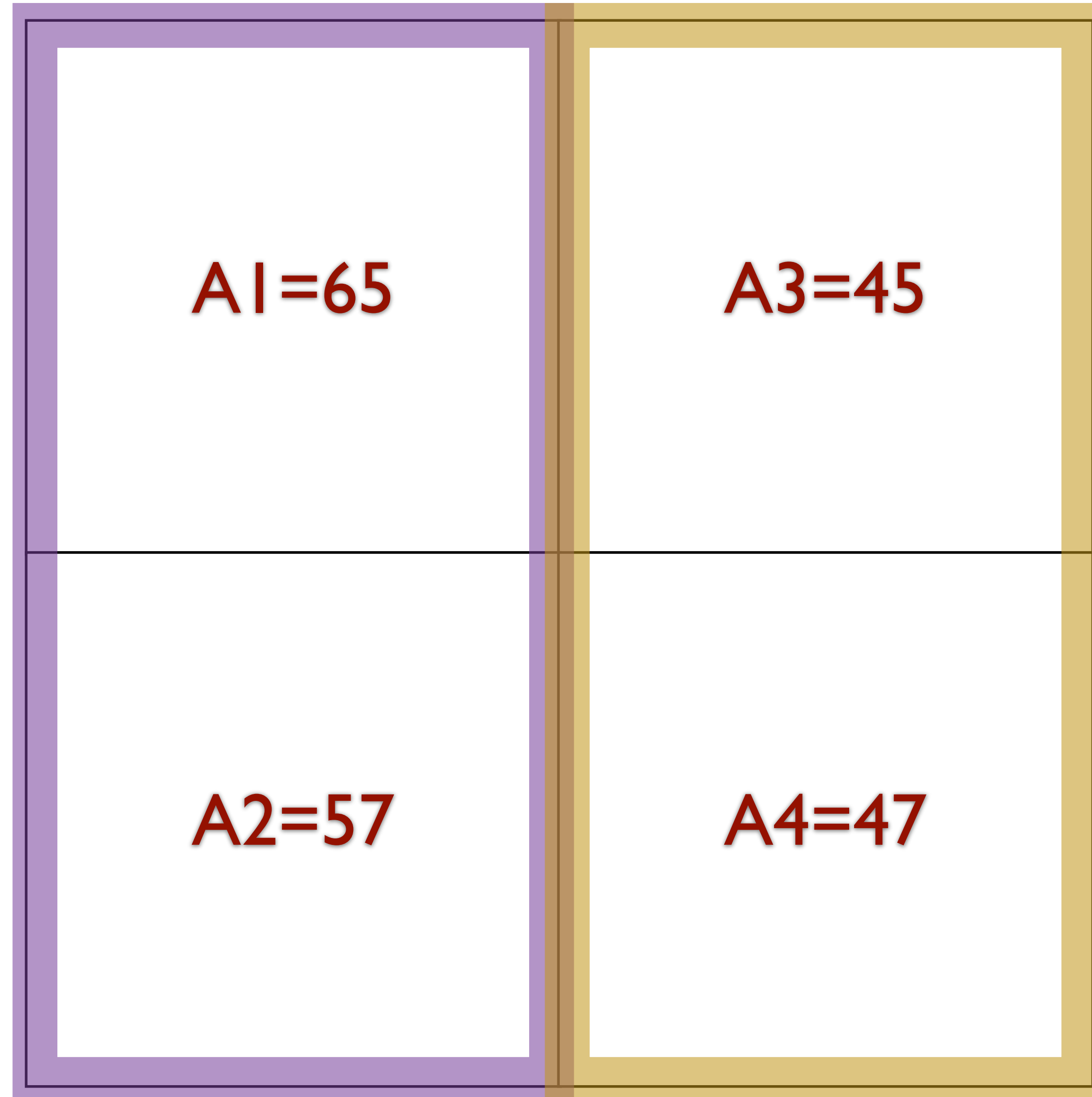
M=100

D1

D2

Example

Imagine 4
precincts
divided into
2 districts.



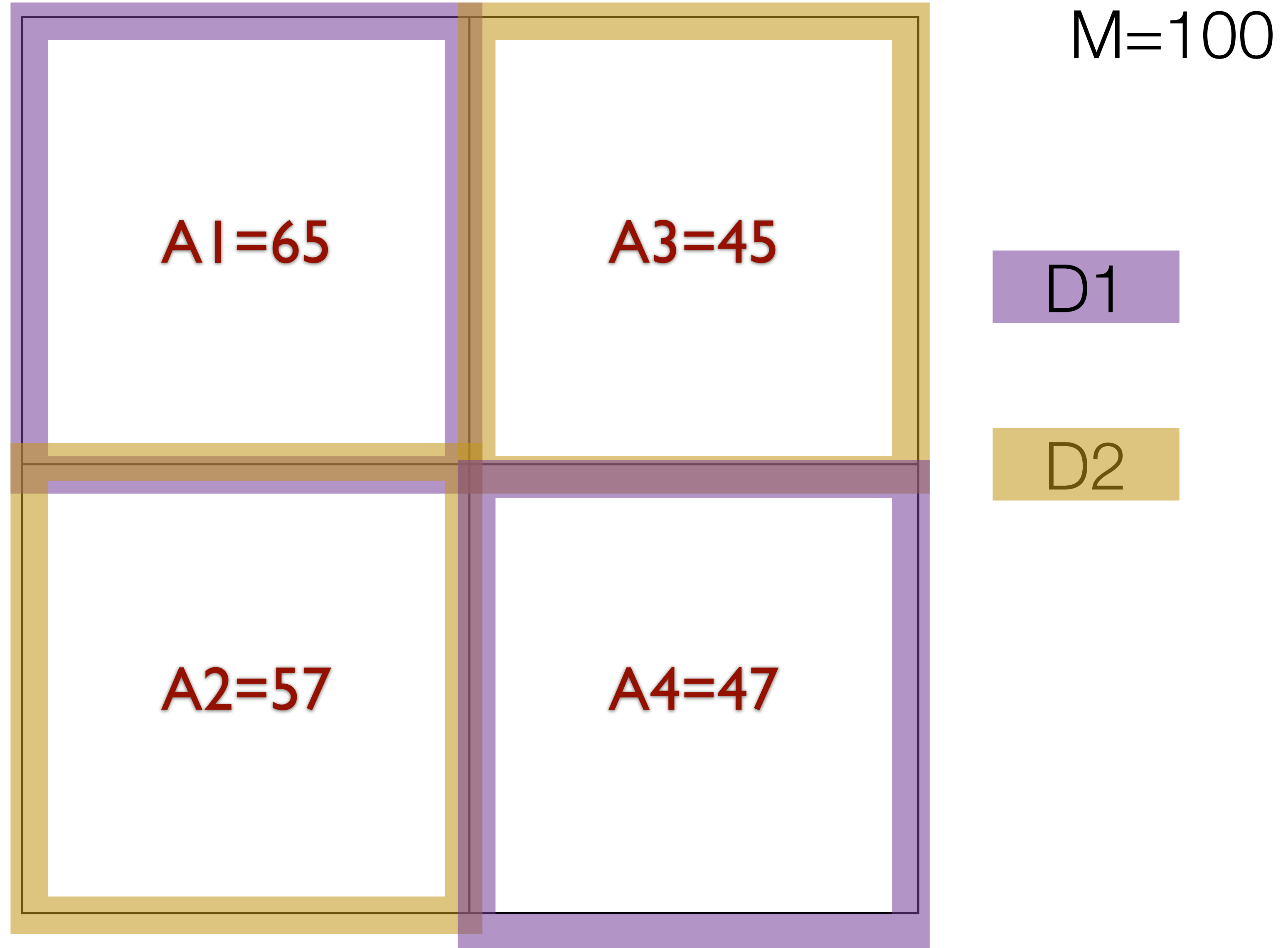
M=100

D1

D2

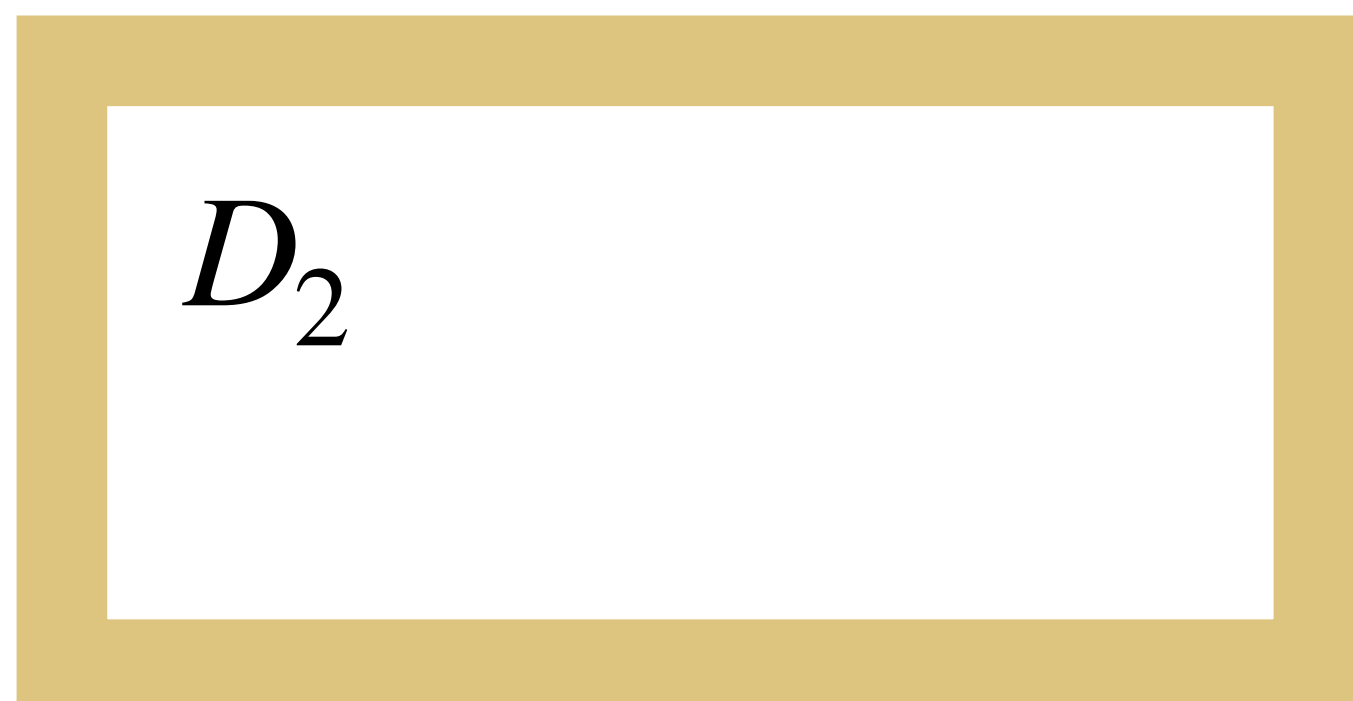
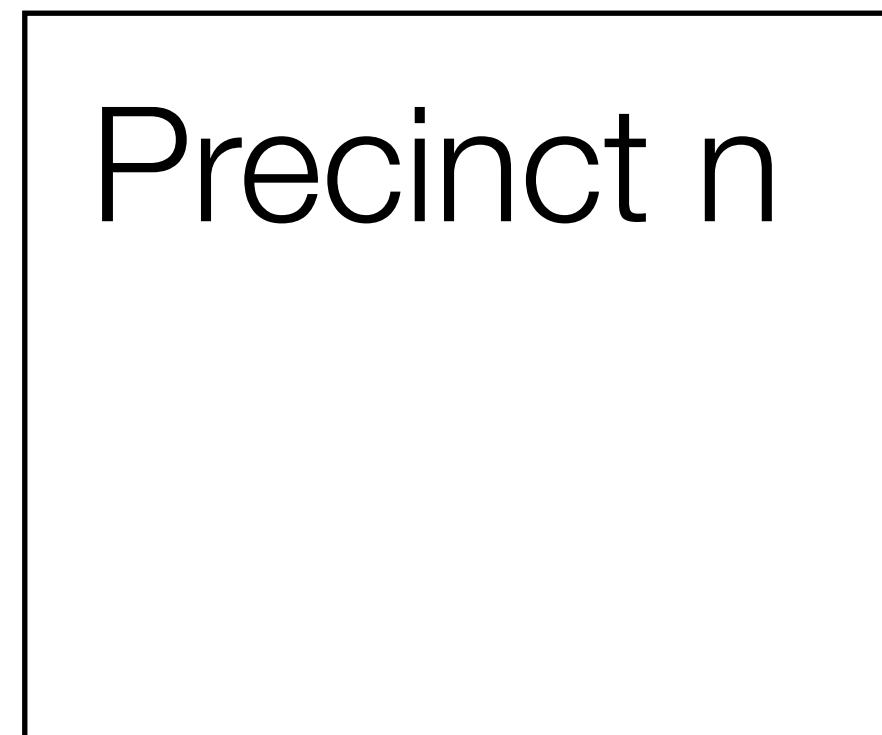
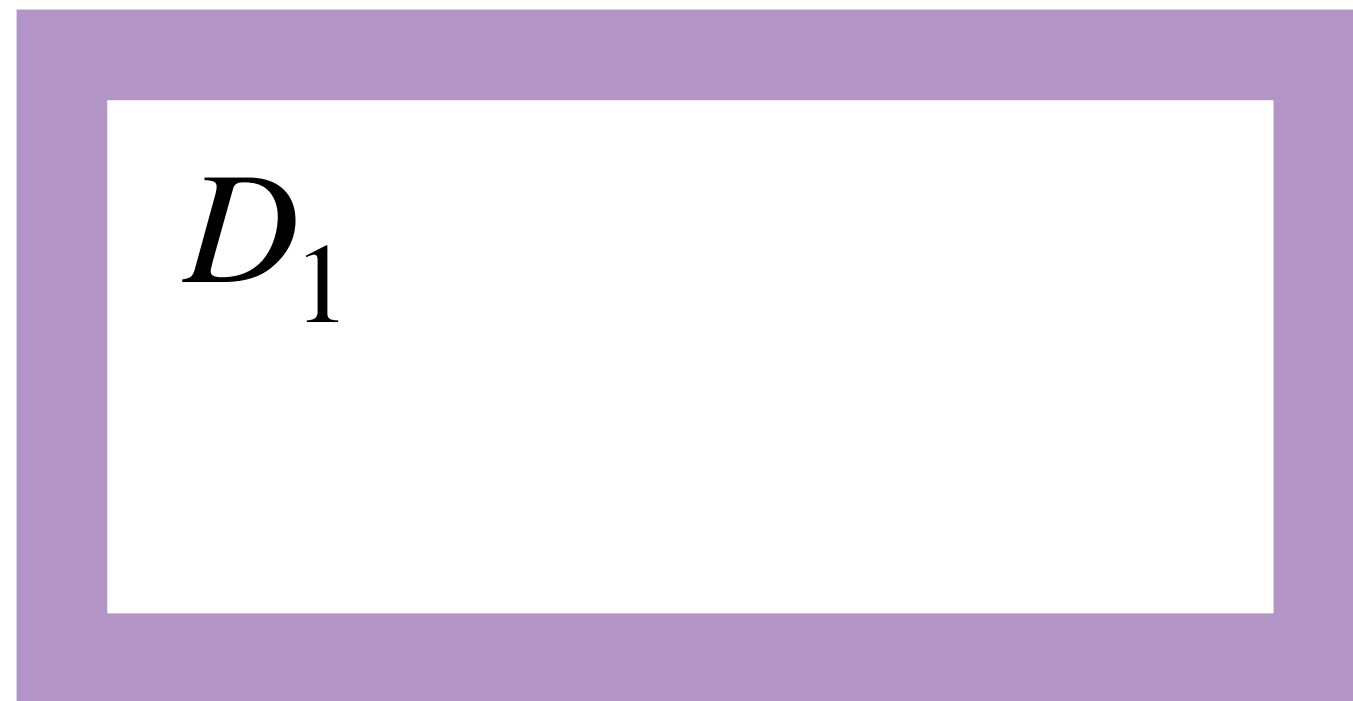
Example

Imagine 4 precincts divided into 2 districts.



Gerrymander

imagine very last precinct and how it is assigned:



Which district should we assign it to?

Gerrymander

imagine very last precinct and how it is assigned:

D_1

k precincts

x votes for A

Precinct n

D_2

$n - k - 1$ precincts

y votes for A

Which district should
we assign it to?

Gerrymander

imagine very last precinct and how it is assigned:

D_1
 k precincts
 x votes for A

Precinct n

D_2
 $n - k - 1$ precincts
 y votes for A

D_1

D_2

Which district should we assign it to?

Gerrymander

imagine very last precinct and how it is assigned:

D_1
 k precincts
 x votes for A

Precinct n

D_1
 $k + 1$ precincts,
 $x + A_n$ votes

D_2
 $n - k - 1$
precincts,
 y votes

D_2
 $n - k - 1$ precincts
 y votes for A

Which district should
we assign it to?

k precincts, x

$n - k$
precincts,
 $y + A_n$

Gerrymander

$$S_{j,k,x,y} =$$

Gerrymander

$S_{j,k,x,y} =$ TRUE if there exists an assignment of the first j precincts such that
 $|D_1| = k, A(D_1) = x, A(D_2) = y$

Gerrymander

$S_{j,k,x,y}$ = there is a split of first j precincts
in which $|D_1| = k$ and
 x people in D_1 vote A
 y people in D_2 vote A

How can we express this value in an equation:

$$S_{j,k,x,y} =$$

$$S_{j,k,x,y} = S_{j-1,k-1,x-A_j,y} \vee S_{j-1,k,x,y-A_j}$$

Gerrymander(P,A,m)

initialize array S[o,o,o,o]

$$S_{j,k,x,y} = S_{j-1,k-1,x-A_j,y} \vee S_{j-1,k,x,y-A_j}$$

Gerrymander(P,A,m)

```
initialize array S[0,0,0,0]
```

```
for j=1,...,n
```

```
  for k=1,...,j
```

```
    for x=0,...,jm
```

```
      for y=0,...,jm
```

```
        fill table according to equation
```

```
search for true entry at S[n, n/2, >(mn/4)...mn, >(mn/4)...mn]
```

PROBLEM: REDUCE IMAGE WIDTH



scaling: distortion
deleting column: distortion
delete the most invisible [seam](#)

<http://www.youtube.com/watch?v=qadw0BRKeMk>



Shai Avidan
Mitsubishi Electric Research Lab
Ariel Shamir
The interdisciplinary Center & MERL

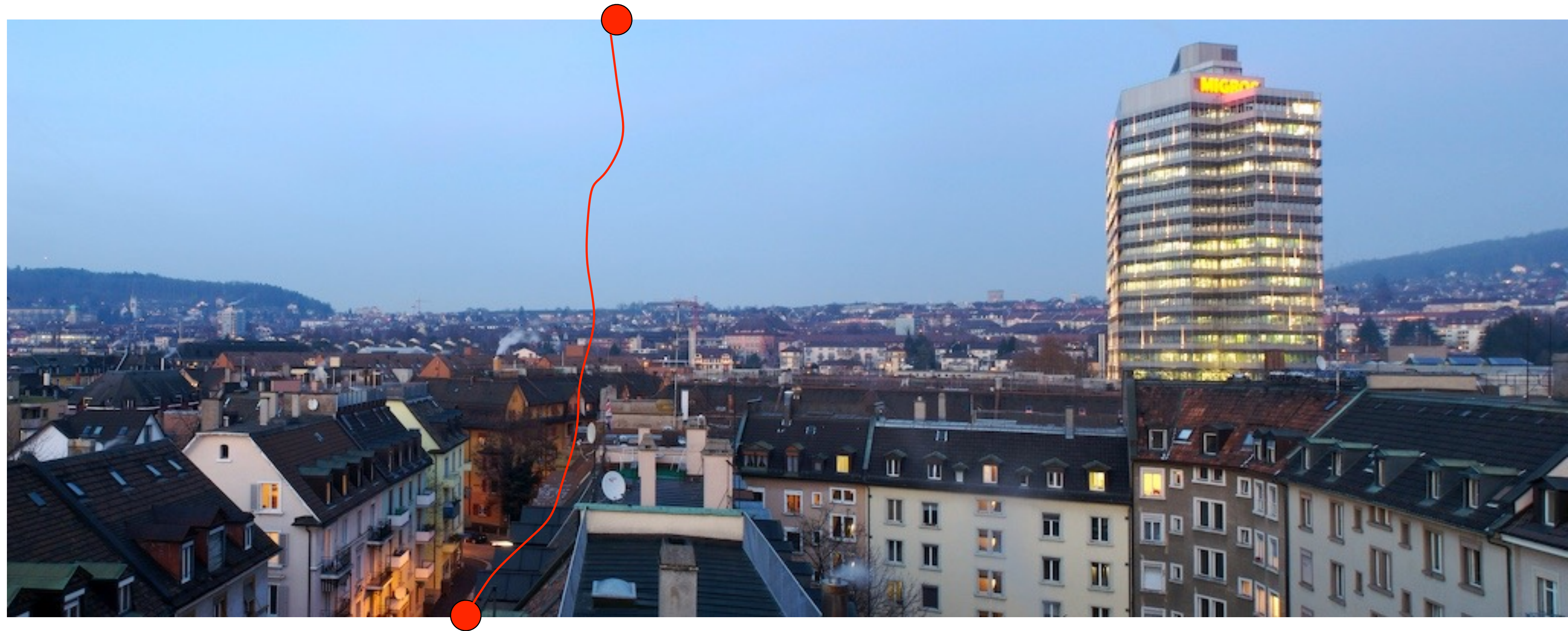
<http://www.youtube.com/watch?v=qadw0BRKeMk>

DEMO?

Demo



WHICH SEAM TO DELETE?



ENERGY OF AN IMAGE

$$e(\mathbf{I}) = \left| \frac{\partial}{\partial x} \mathbf{I} \right| + \left| \frac{\partial}{\partial y} \mathbf{I} \right|$$

“magnitude of gradient at a pixel”

$$\frac{\partial}{\partial x} I_{x,y} = I_{x-1,y} - I_{x+1,y}$$

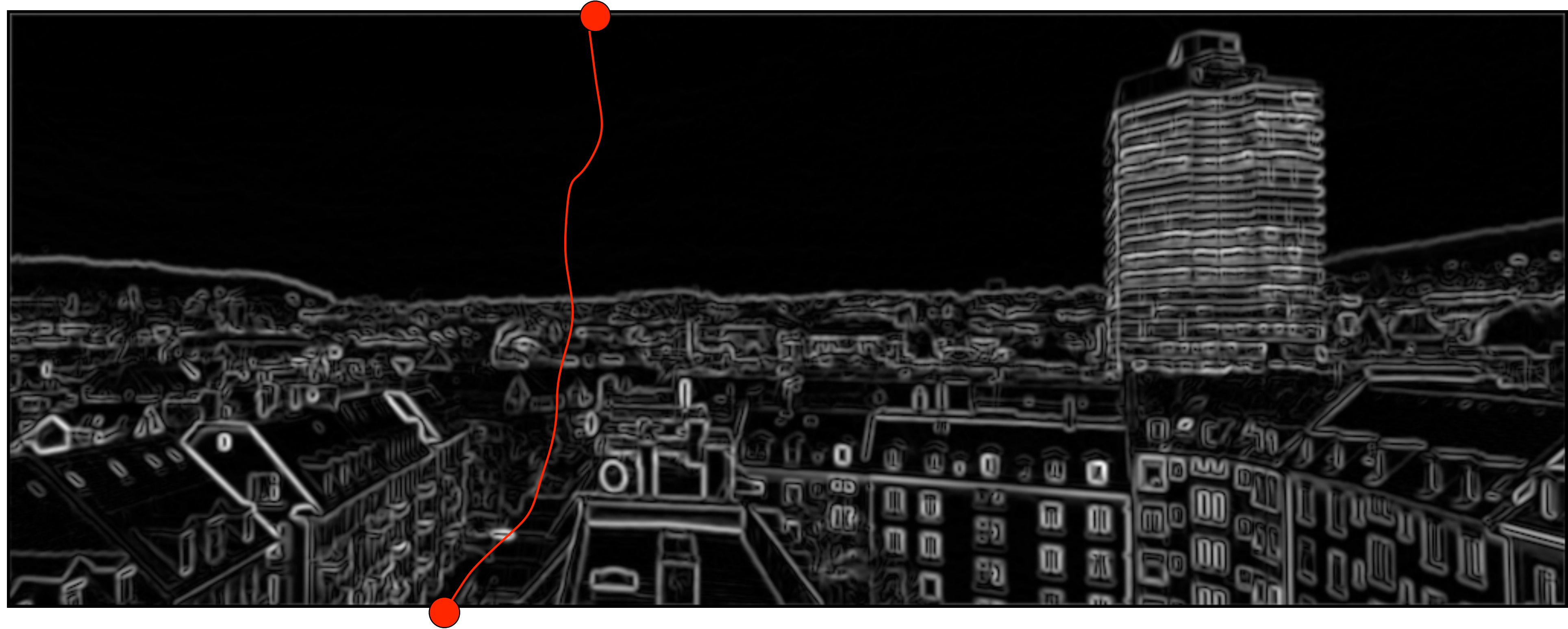


energy of sample image

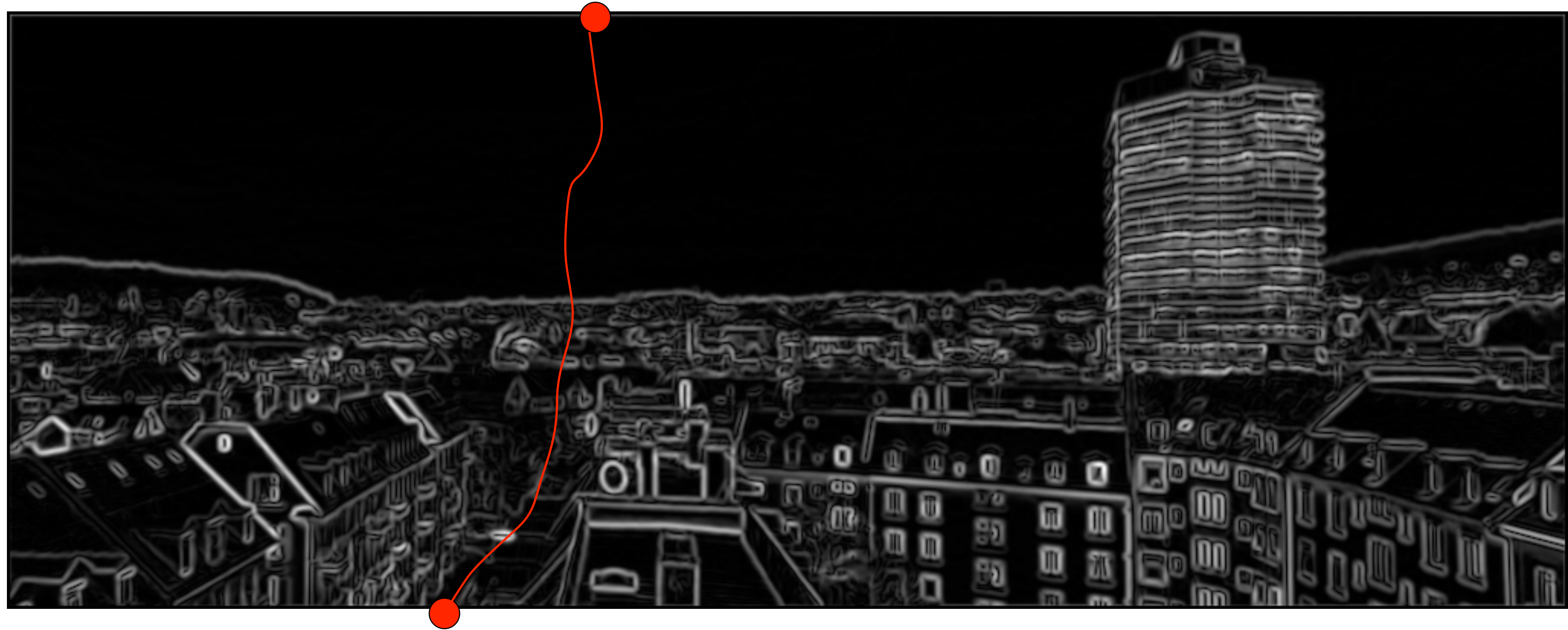
thanks to [Jason Lawrence](#) for gradient software



BEST SEAM HAS LOWEST ENERGY



FINDING LOWEST ENERGY SEAM?



DEFINE A VARIABLE:

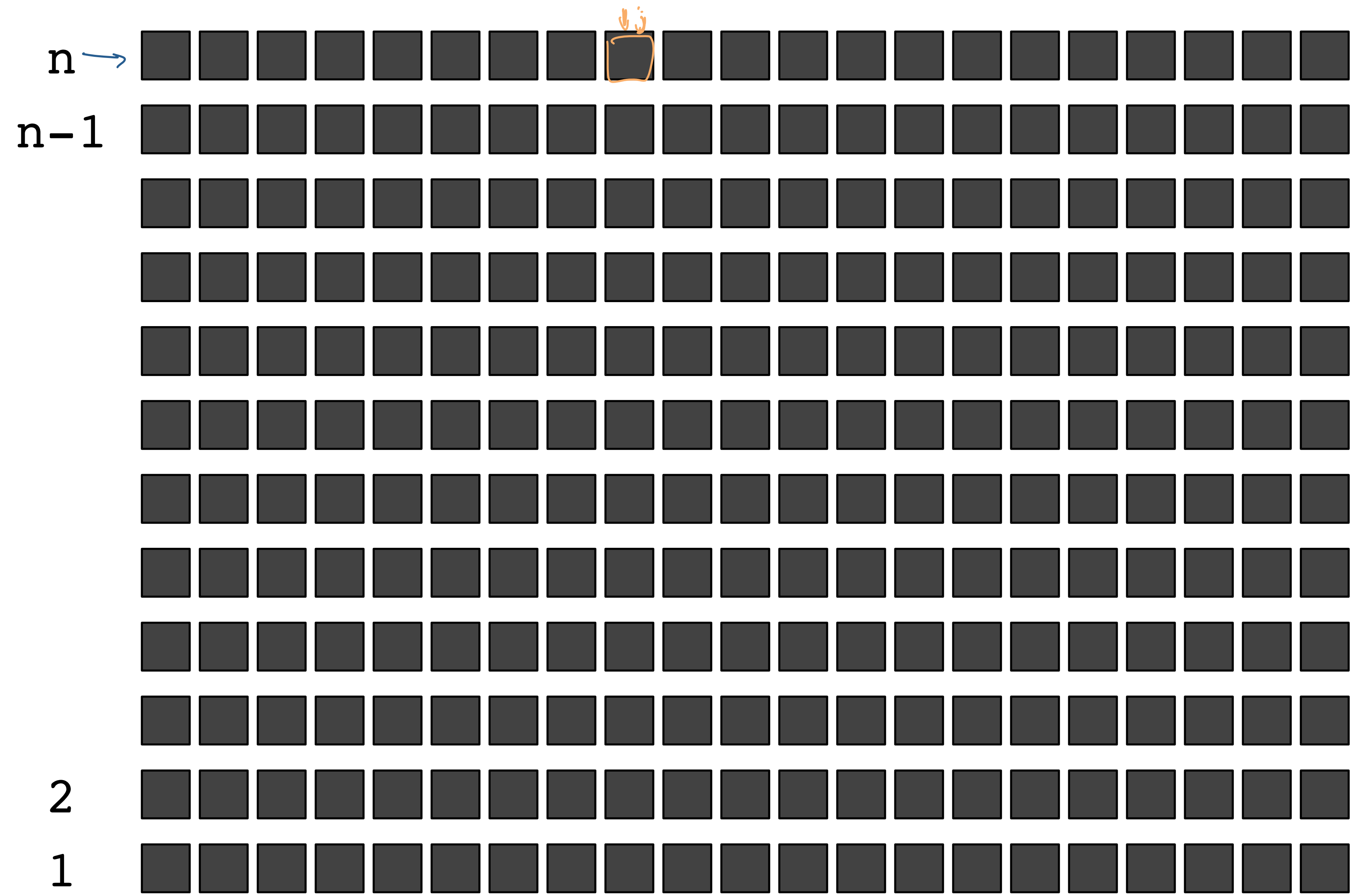
$$S_i(j)$$

DEFINE A VARIABLE:

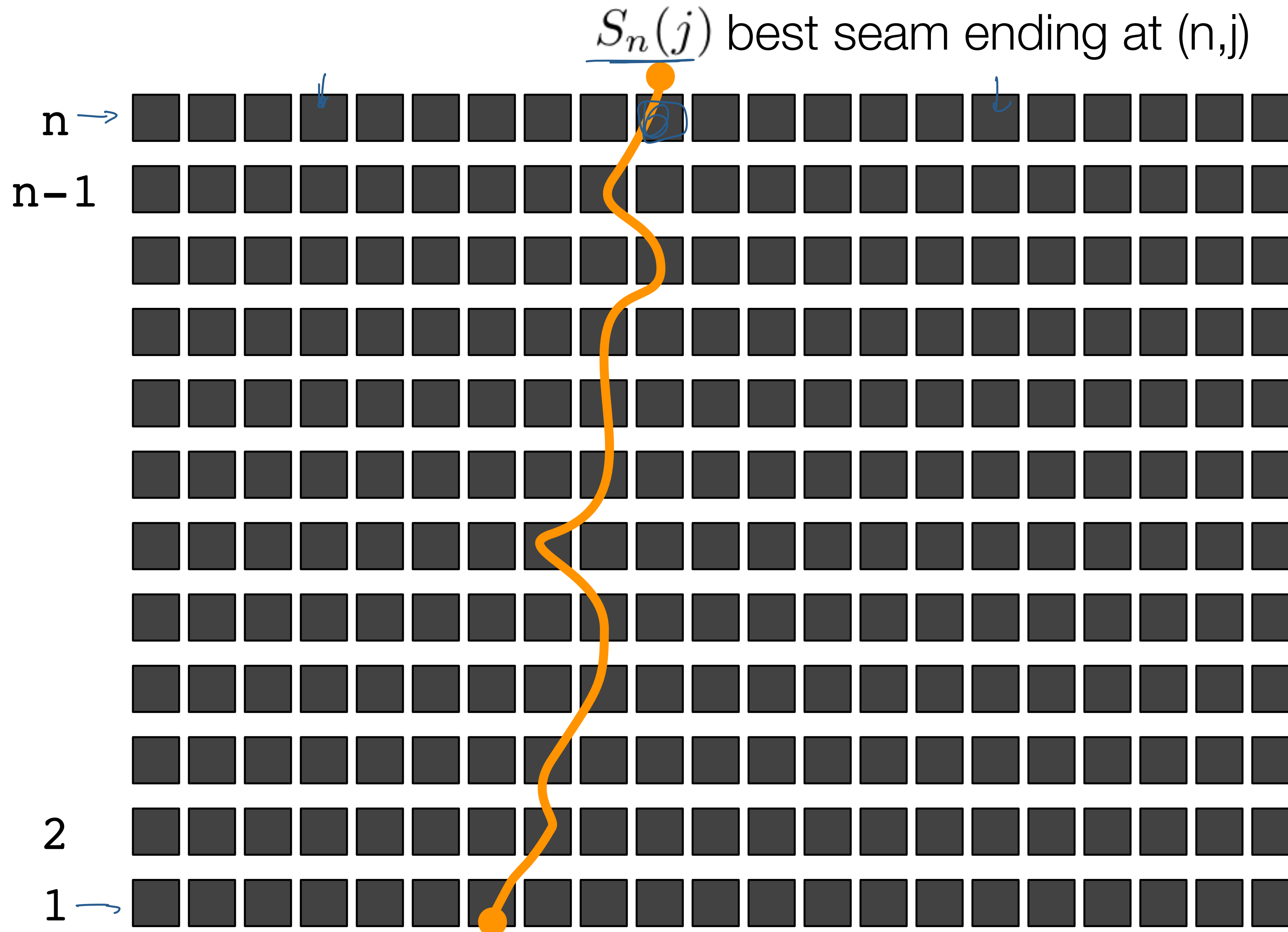
 $S_i(j)$

Total energy of the lowest energy seam that ends at row (l,j)

definition: $S_n(j)$ Value of lowest energy seam that ends at (n,j)



definition:

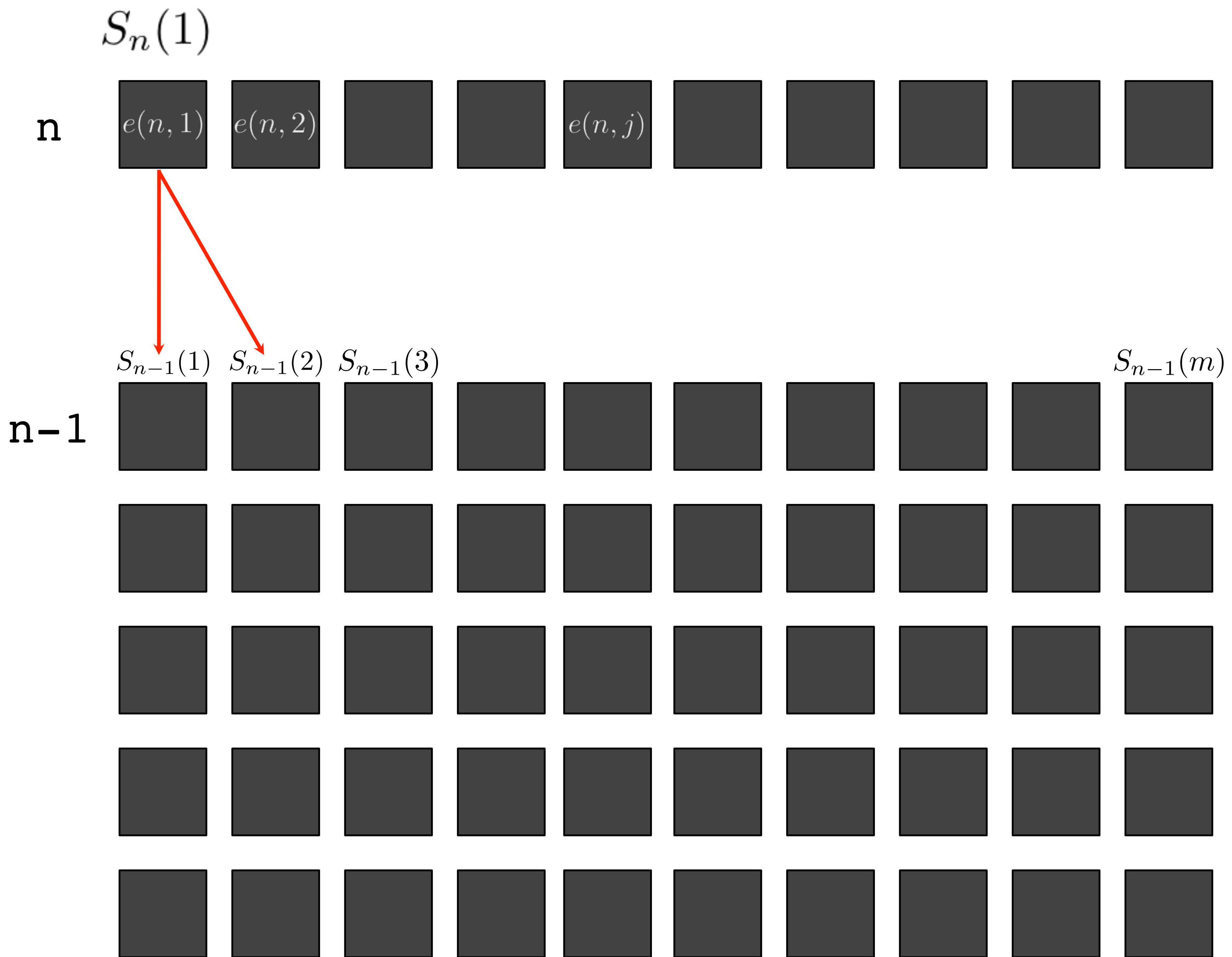


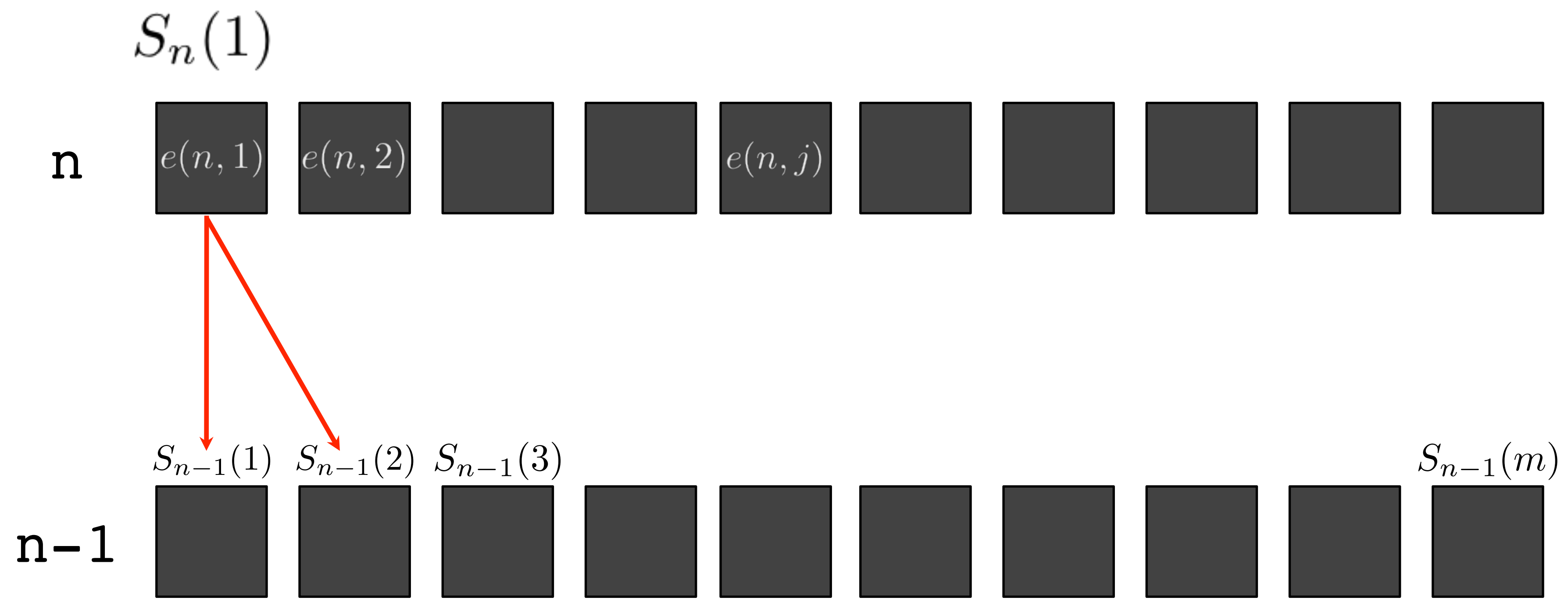
BEST SEAM TO DELETE HAS TO
BE THE BEST AMONG

$S_n(1), \underline{S_n(2)}, \dots, S_n(m)$

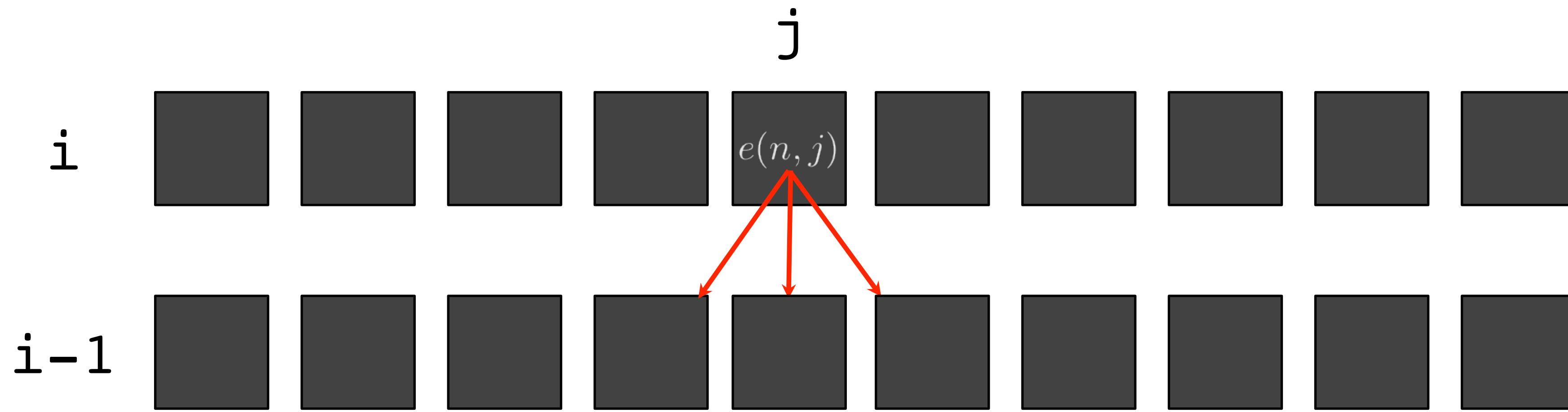
IMAGINE YOU HAVE THE
SOLUTION TO THE
FIRST $N-1$ ROWS

What happens on the very last row?

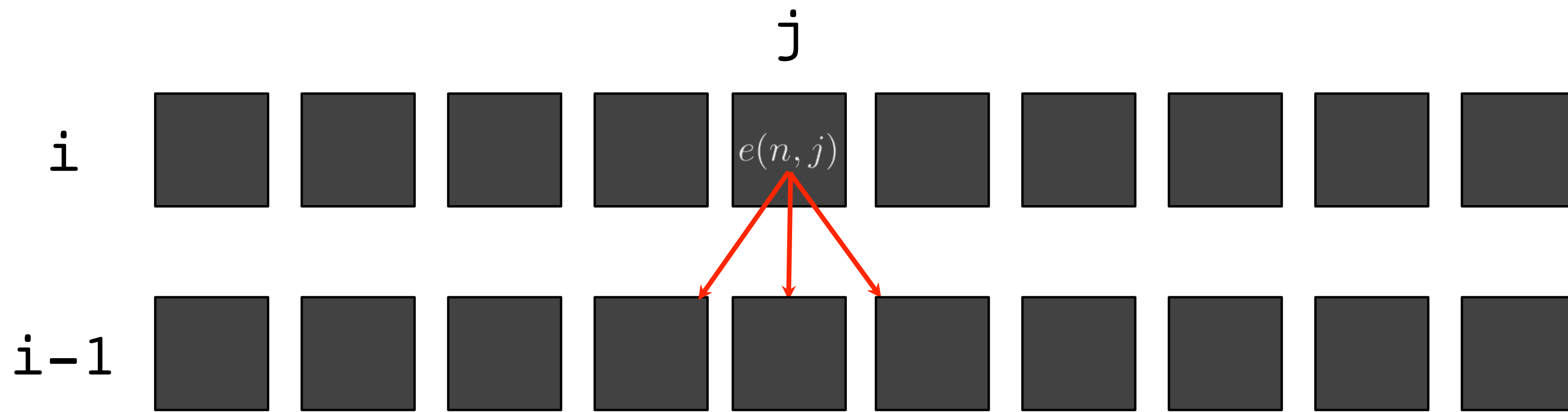




$$S_n(1) = e(n, 1) + \min\{S_{n-1}(1), S_{n-1}(2)\}$$



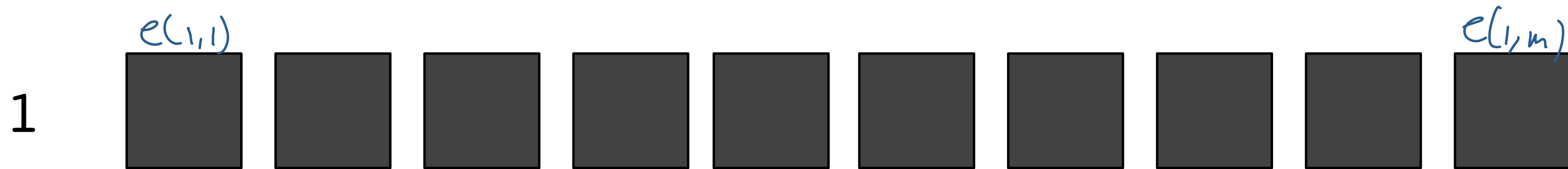
$$S_i(j) =$$



$$S_i(j) = e(i, j) + \min \begin{cases} S_{i-1}(j-1) \\ S_{i-1}(j) \\ S_{i-1}(j+1) \end{cases}$$

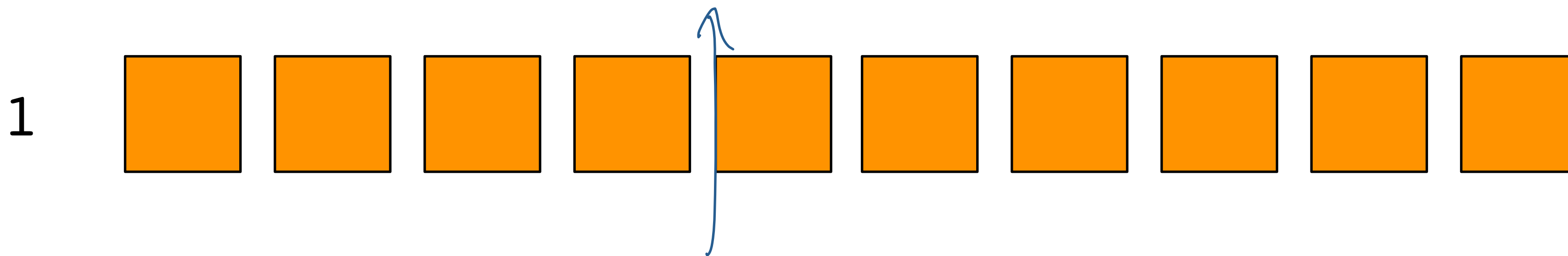
ALGORITHM

start at bottom of picture



ALGORITHM

start at bottom of picture. initialize $S_1(i) = e(1, i)$

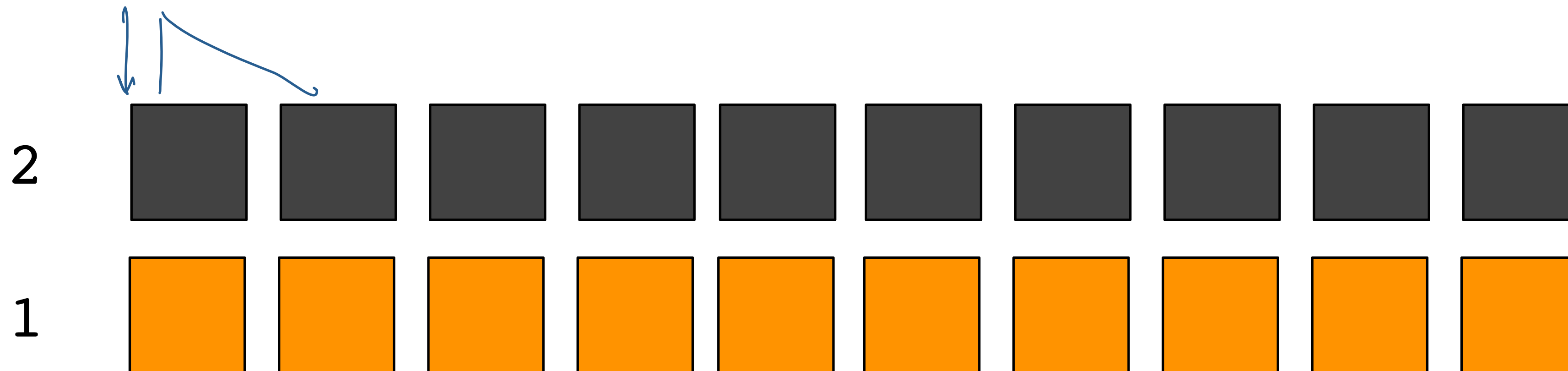


ALGORITHM

start at bottom of picture. initialize $S_1(i) = e(1, i)$

for $i=2$ to n use formula to compute $S_{i+1}(\cdot)$

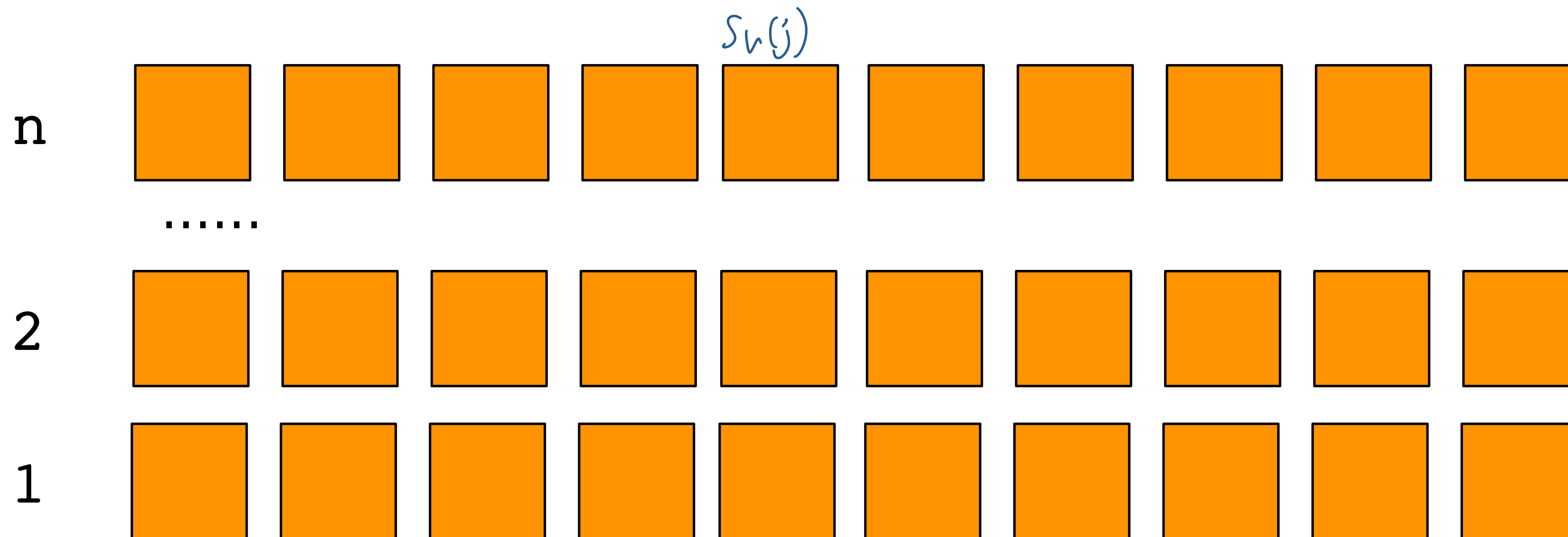
$$S_i(j) = e(i, j) + \min \begin{cases} S_{i-1}(j-1) \\ S_{i-1}(j) \\ S_{i-1}(j+1) \end{cases}$$



ALGORITHM

start at bottom of picture. initialize $S_1(i) = e(1, i)$

for $i=2, n$ use formula to compute $S_{i+1}(\cdot)$

$$S_i(j) = e(i, j) + \min \begin{cases} S_{i-1}(j-1) \\ S_{i-1}(j) \\ S_{i-1}(j+1) \end{cases}$$


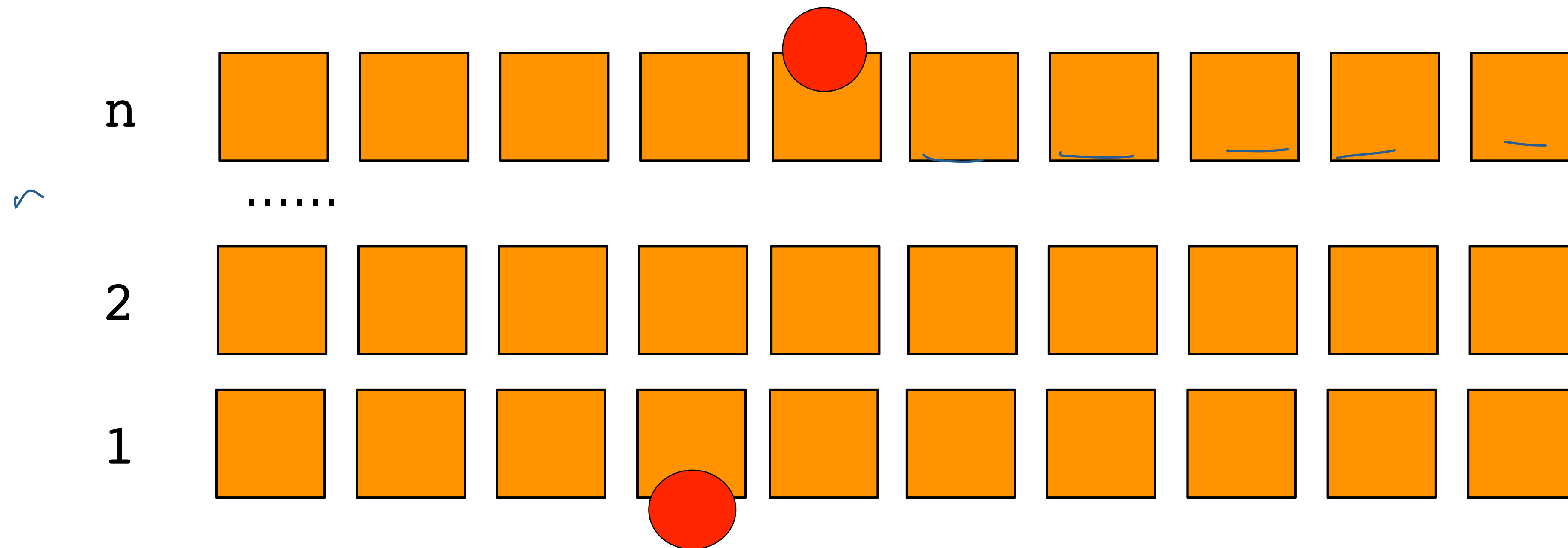
ALGORITHM

start at bottom of picture. initialize $S_1(i) = e(1, i)$

for $i=2, n$ use formula to compute $S_{i+1}(\cdot)$

$$S_i(j) = e(i, j) + \min \begin{cases} S_{i-1}(j-1) \\ S_{i-1}(j) \\ S_{i-1}(j+1) \end{cases}$$

pick best among top row, backtrack.



RUNNING TIME

start at bottom of picture. initialize $S_1(i) = e(1, i)$

for $i=2, n$ use formula to compute $S_{i+1}(\cdot)$

$$S_i(j) = e(i, j) + \min \begin{cases} S_{i-1}(j-1) \\ S_{i-1}(j) \\ S_{i-1}(j+1) \end{cases}$$

pick best among top row, backtrack.