

L10 4

Feb 23 2016

abhi shelat

Dynamic programming: matrix chains, seam carve

1

0

2

LUNCH

2 pages

Diagrams

February 2016

Su	Mo	Tu	We	Th	Fr	Sa
	1	2	3	4	5	6
7	8	9	10	11	12	13
14	15	16	17	18	19	20
21	22	<u>23</u>	24 ^{H3}	25	26	27
28	29	1	2 _{<u>H4</u>}	3	<u>4</u> <u>midterm</u>	

February 2016

Su Mo Tu We Th Fr Sa

1 2 3 4 5 6

7 8 9 10 11 12 13

14 15 16 17 18 19 20

21 22 23 24 25 26 27

28 29 1 2 3 4 5

6 7 8 ~~9~~ 10 11 12

13 14 15 16 17 18

HW3

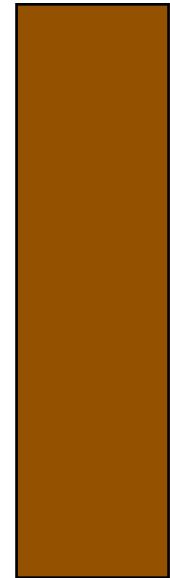
HW7

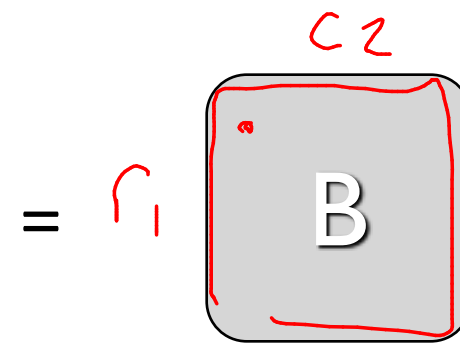
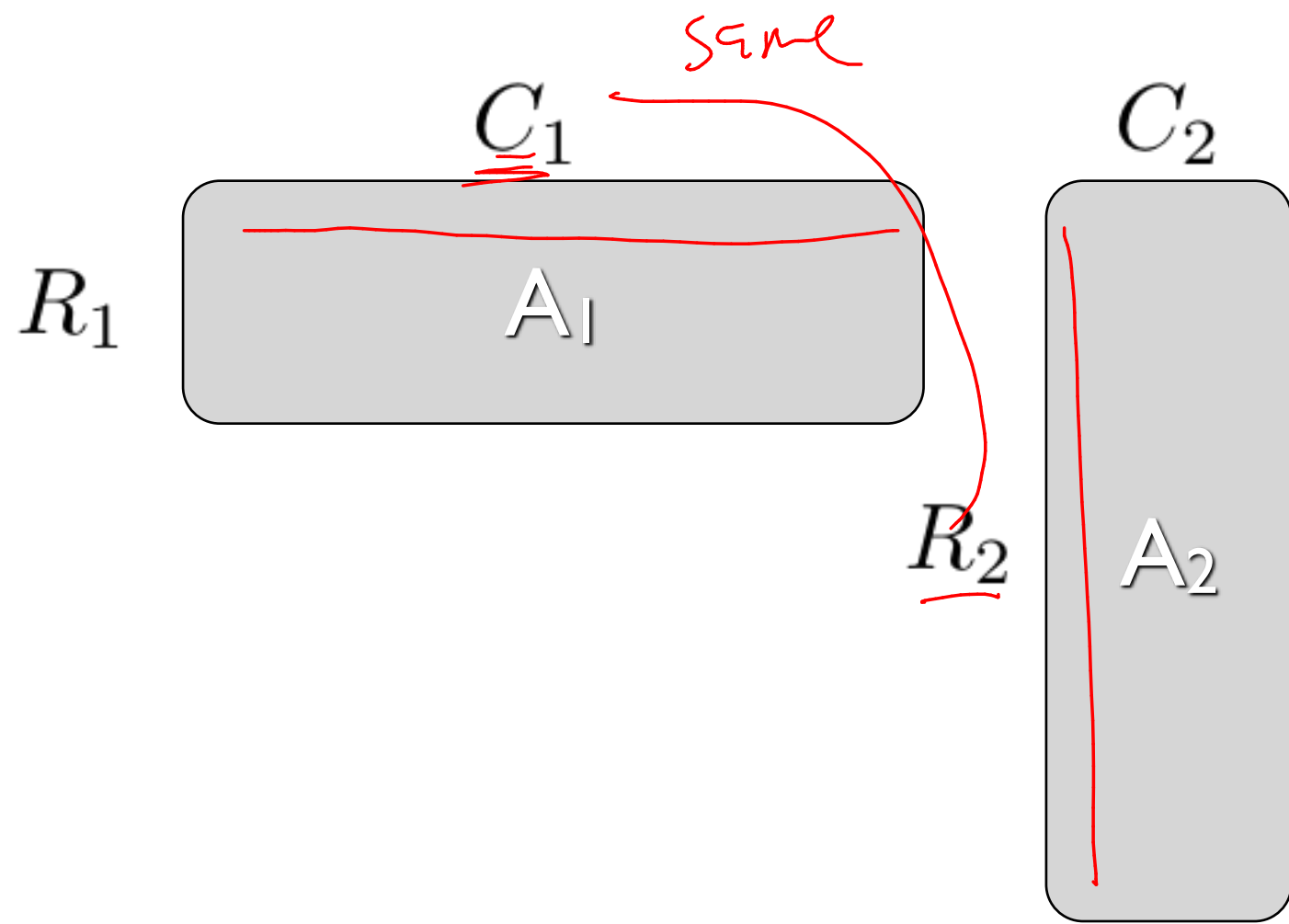
Spring break!

Midterm due



MATRIX





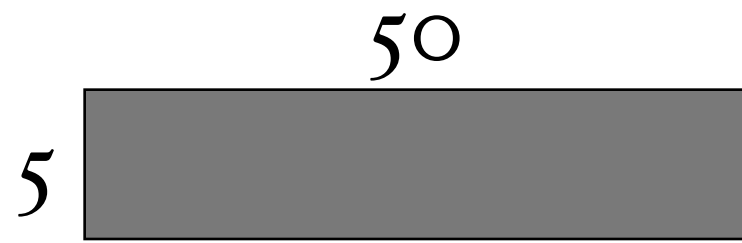
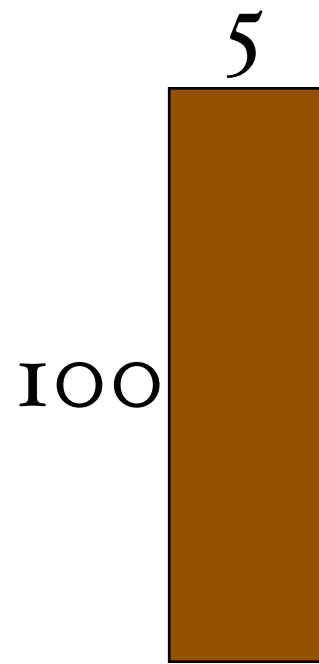
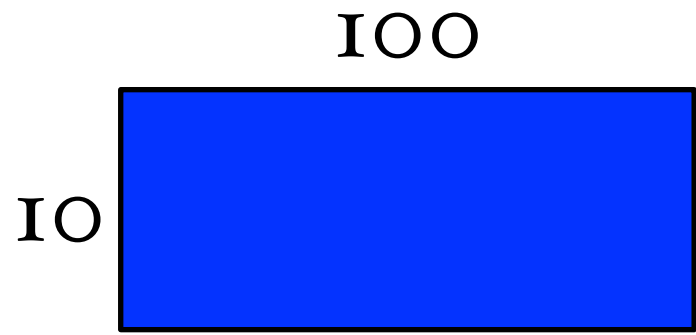
$$\#_{\text{ops}} = R_1 \cdot C_1 \cdot C_2$$

$$\underline{A_1} \cdot \underline{A_2} \cdot \underline{A_3}$$

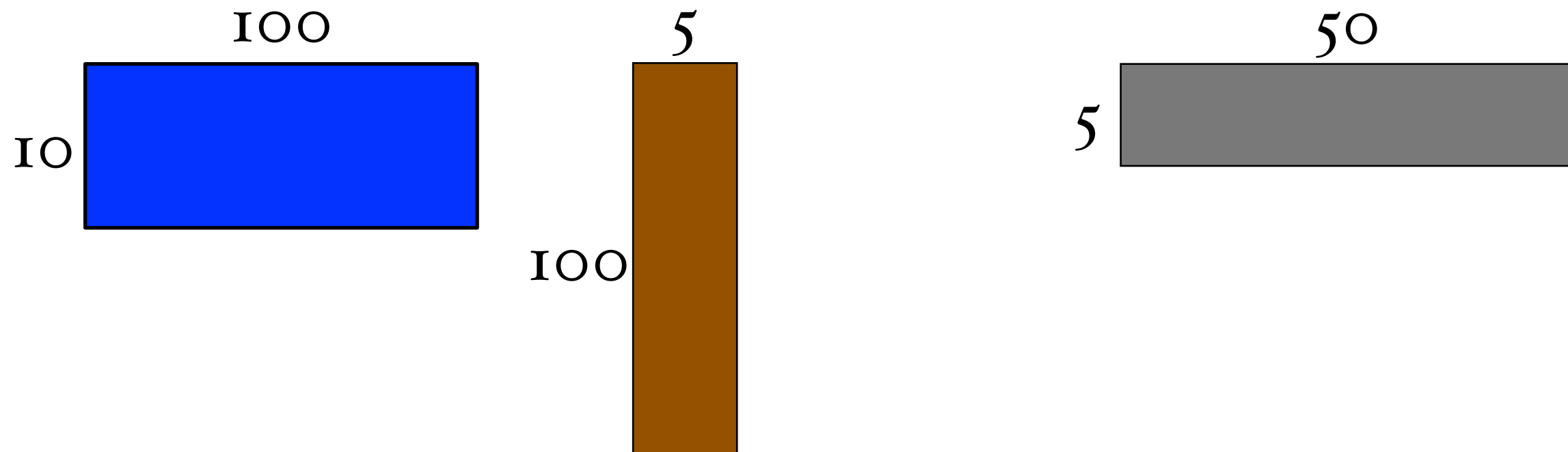
$$\underline{(A_1 \cdot A_2)} \cdot \underline{A_3}$$

$$\underline{A_1} \cdot \underline{(A_2 \cdot A_3)}$$

$$\underline{(A_1 \cdot A_2)} \cdot A_3$$



$$(A_1 \cdot A_2) \cdot A_3$$

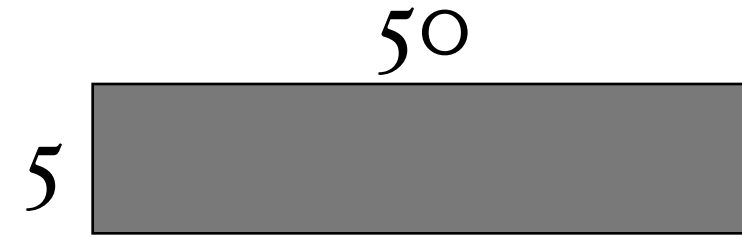
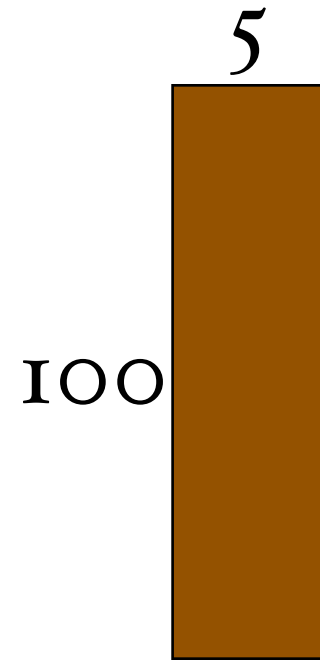
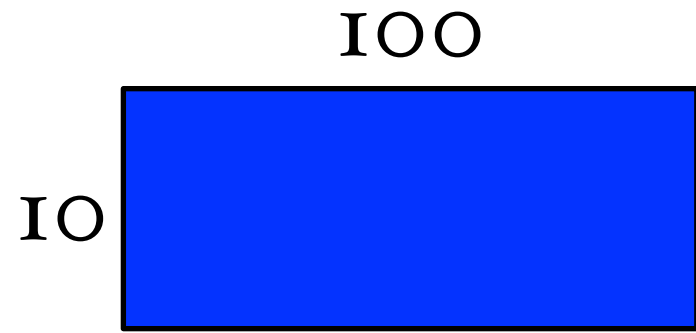


$$10 \cdot 100 \cdot 5 + 10 \cdot 5 \cdot 50$$

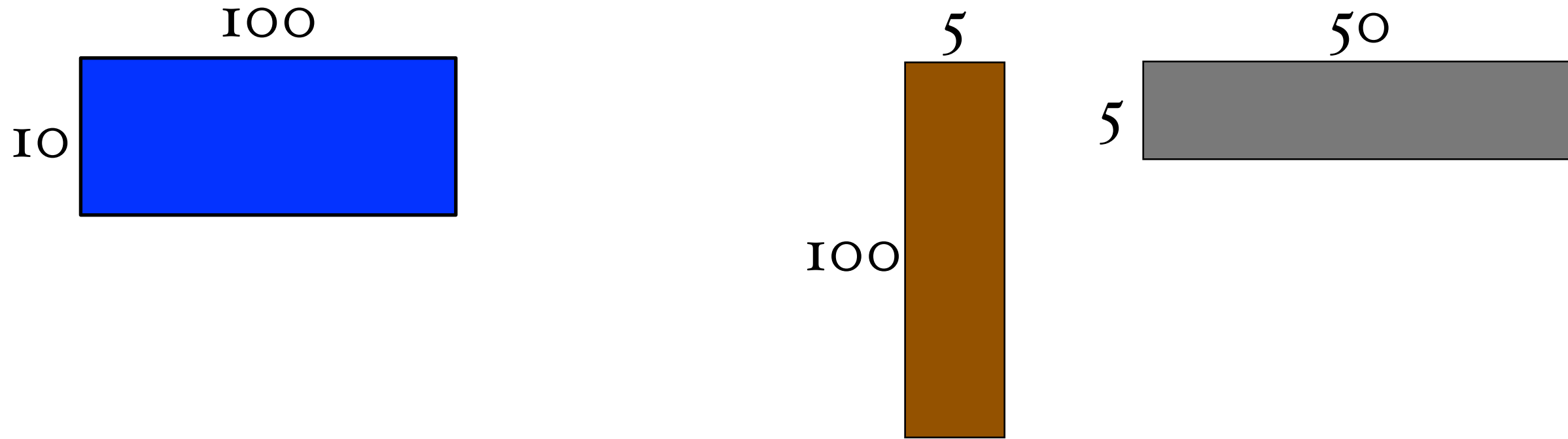
operations

7500

$$A_1 \cdot (A_2 \cdot A_3)$$



$$A_1 \cdot A_2 \cdot A_3$$



$$100 \cdot 5 \cdot 50 + 10 \cdot 100 \cdot 50$$

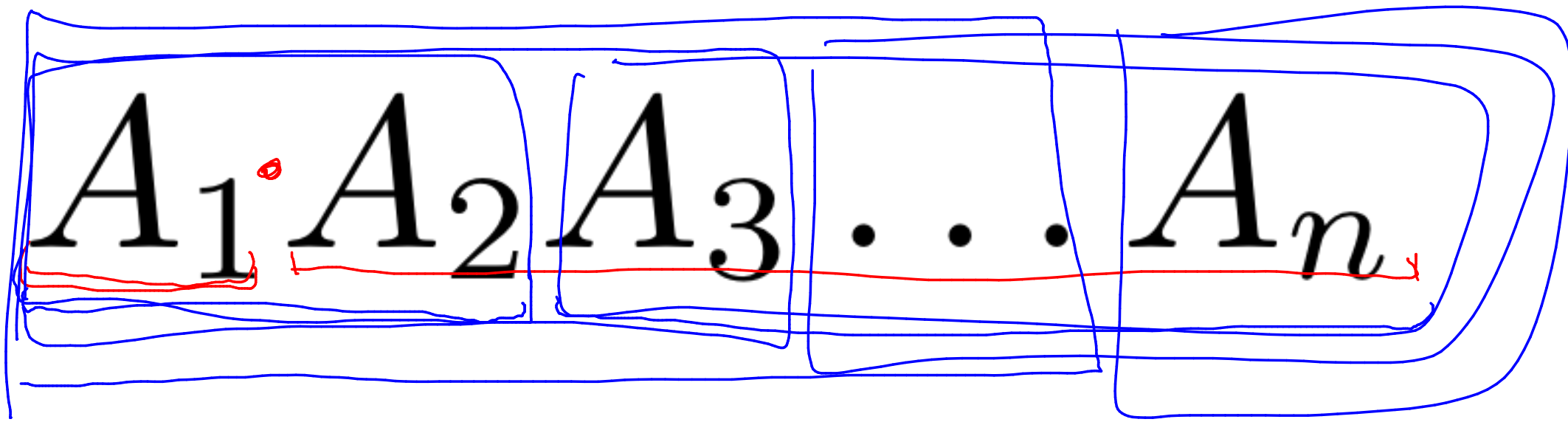
operations

75,000

ORDER MATTERS

(for efficiency)

HOW MANY WAYS TO



$P(n)$: # of ways to multiply the n matrices.

$$\underline{P(n)} = P(1) \cdot P(n-1) + P(2) \cdot P(n-2) + P(3) \cdot P(n-3) + \dots + P(n-1) \cdot P(1)$$

$$= \sum_{i=1}^{n-1} P(i) P(n-i) \approx \underline{4^n}$$

HOW MANY WAYS TO

$$A_1 A_2 A_3 \dots A_n$$

$$A_1 A_2 A_3 \dots A_n$$

HOW MANY WAYS TO

$$A_1 A_2 A_3 \dots A_n$$

$$A_1 A_2 A_3 \dots A_n$$

$$A_1 A_2 A_3 \dots A_n$$

HOW MANY WAYS TO

A_1 $A_2 A_3 \dots A_n$

$A_1 A_2$ $A_3 \dots A_n$

$A_1 A_2 A_3$ $\dots A_n$

OPTIMAL WAY TO COMPUTE

$l \rightarrow$ optimal last step

$${}^{r_1} A_1 {}^{c_1} {}^{r_2} A_2 {}^{c_2} A_3 \dots {}^{r_l} A_l {}^{c_l} A_{l+1} \dots A_n$$

$B[l, n]$ = smallest # of operations needed to multiply $A_{l+1} \dots A_n$.

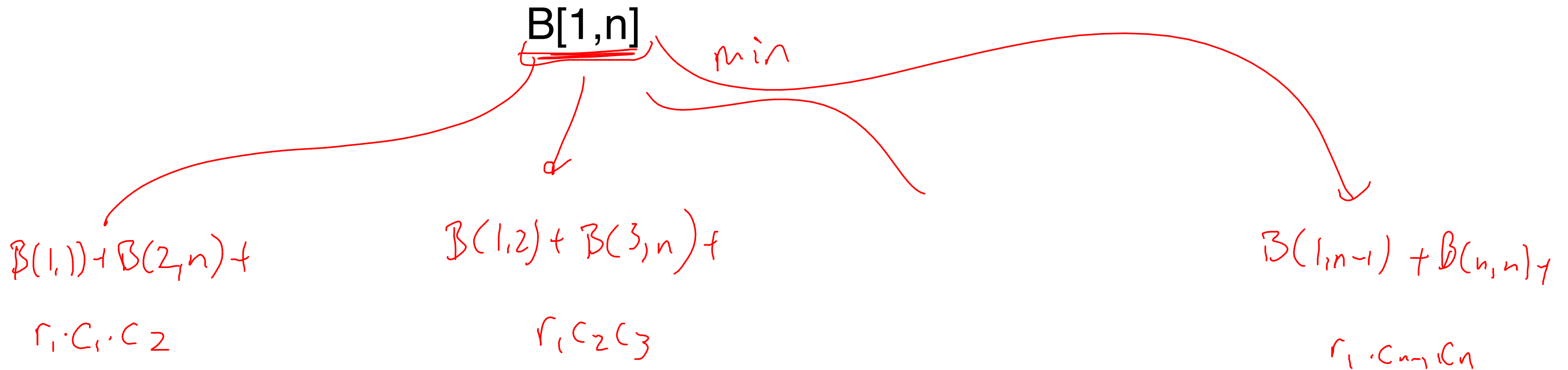
$$\underline{B[l, n] = B[l, l] + B[l+1, n] + r_l \cdot c_l \cdot c_{l+1}} \quad \text{if } l \text{ is optimal}$$

how many choices are there
for l ??

$$l \in [1, n]$$

OPTIMAL WAY TO COMPUTE

$A_1 A_2 A_3 A_4 \dots A_n$



OPTIMAL WAY TO COMPUTE

$A_1 A_2 A_3 A_4 \dots A_n$

$B[1,n]$

$B[1,1]$

$B[2,n]$

$R_1 C_1 C_n$

OPTIMAL WAY TO COMPUTE

$$A_1 A_2 A_3 A_4 \dots A_n$$

Handwritten annotations: r_1 above A_1 , c_1 above A_1 and A_2 , r_2 above A_2 , c_2 above A_2 and A_3 , r_3 above A_3 .

B[1,n]

B[1,1]

B[1,2]

...

B[1,n-2]

B[1,n-1]

B[2,n]

B[3,n]

...

B[n-1,n]

B[n,n]

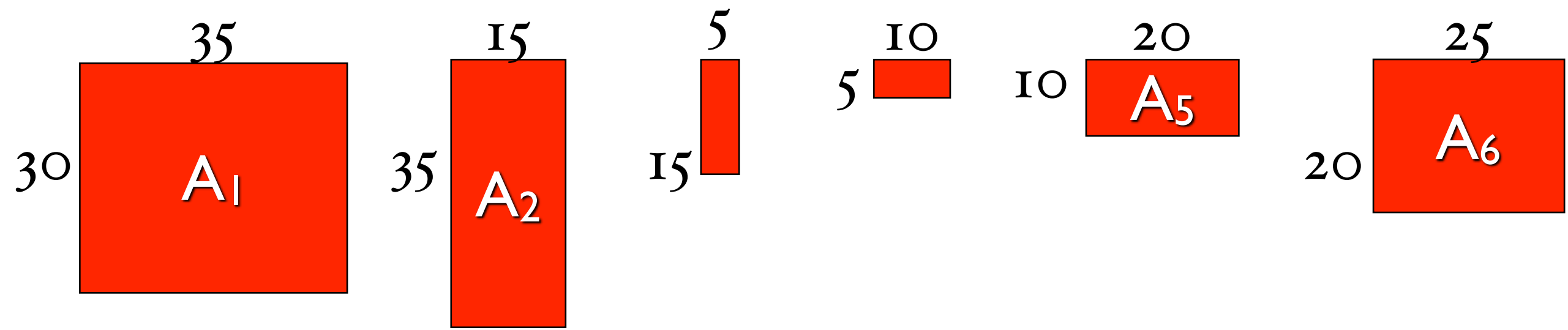
$R_1 C_1 C_n$

$R_1 C_{n-2} C_n$

$R_1 C_{n-1} C_n$

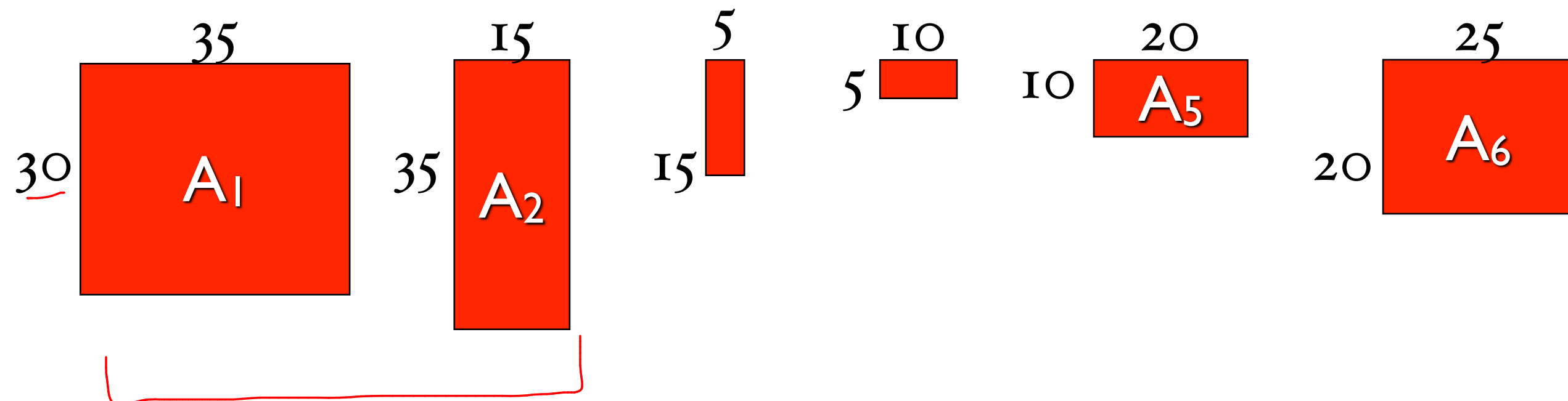
$$\left. \begin{aligned}
 \underline{B(i, i)} &= \underline{0} \\
 \underline{B(i, j)} &= \min_{k=i}^{j-1} \left\{ \begin{array}{l}
 \text{prefix} \quad \text{suffix} \\
 \underline{B(i, k)} + \underline{B(k+1, j)} + \underline{r_i c_k c_j}
 \end{array} \right.
 \end{aligned} \right\} \begin{array}{l}
 \text{\# of operations to} \\
 \text{multiply the prefix \&} \\
 \text{suffix}
 \end{array}$$

WHICH ORDER TO SOLVE?

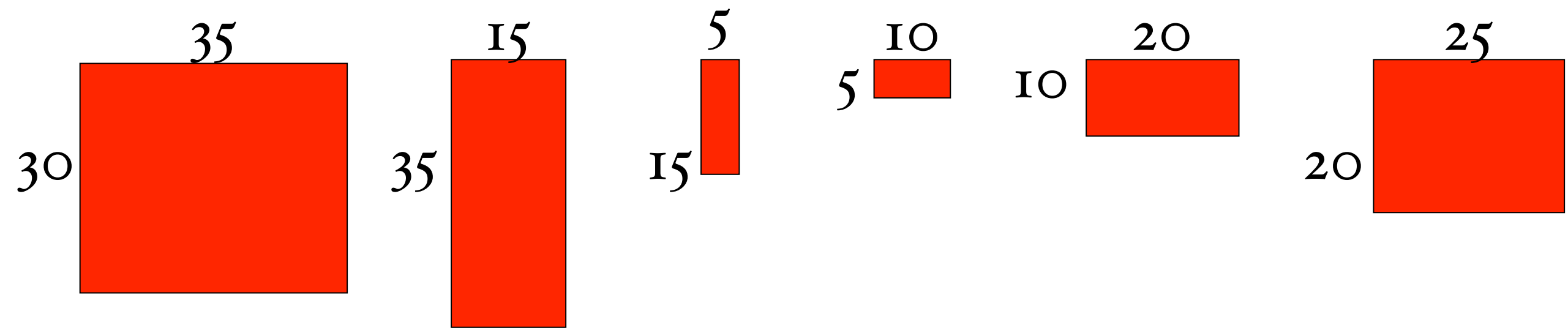


6						0
5					0	
4				0		
3			0			
2		0				
1	0					
	1	2	3	4	5	6

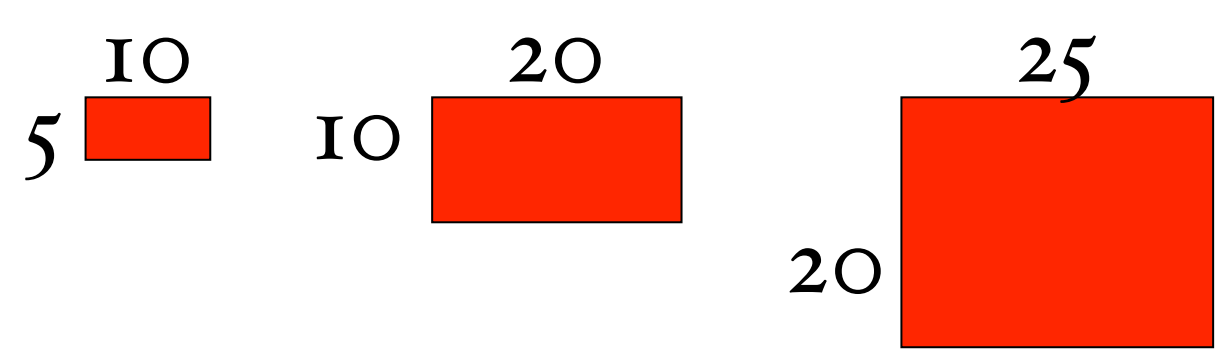
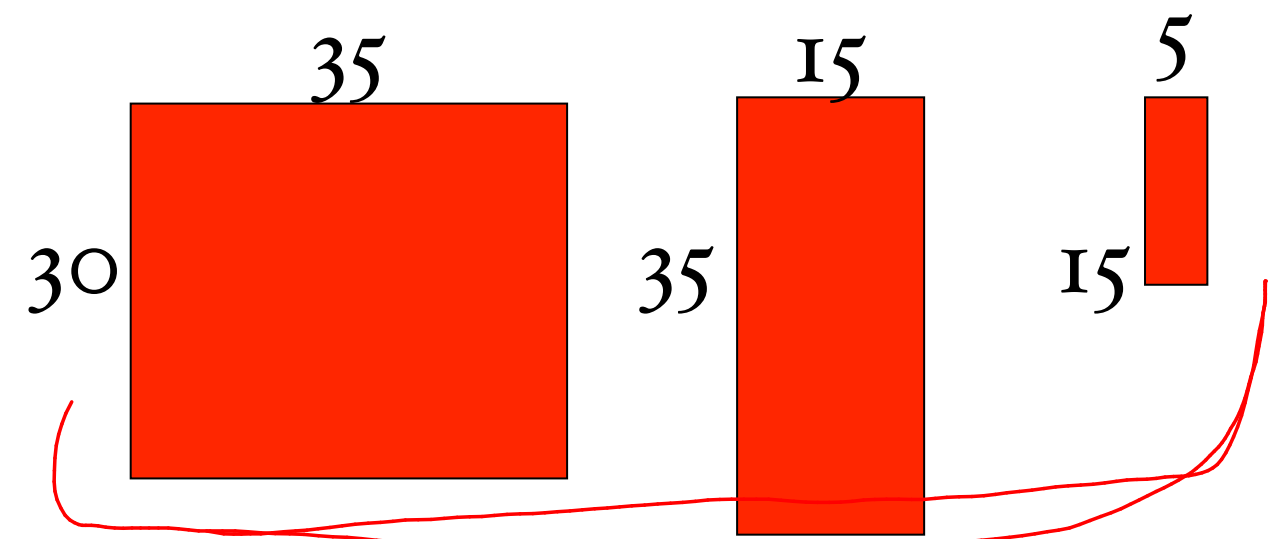
$B(i, i) = 0$
 $B(i, j) = \min_{k=i}^j \left\{ B(i, k) + B(k + 1, j) + r_i c_k c_j \right\}$



$$B(1, 2) = \text{Best}(1, 1) + B(2, 2) + 30 \cdot 35 \cdot 15 = \underline{15750}$$



6					$10 \cdot 20 \cdot 25 = 5000$	0
5				$5 \cdot 10 \cdot 20 = 1000$		0
4			$15 \cdot 5 \cdot 10 = 750$		0	
3		$35 \cdot 15 \cdot 5 = 2625$			0	
2	$30 \cdot 35 \cdot 15 = 15750$				0	
1						0
	I	2	3	4	5	6



$Best(1,3) = \text{min}$

15750

$$B(1,2) + B(3,3) + 30 \cdot 15 \cdot 5$$

$$B(1,1) + B(2,3) + 30 \cdot 35 \cdot 5$$

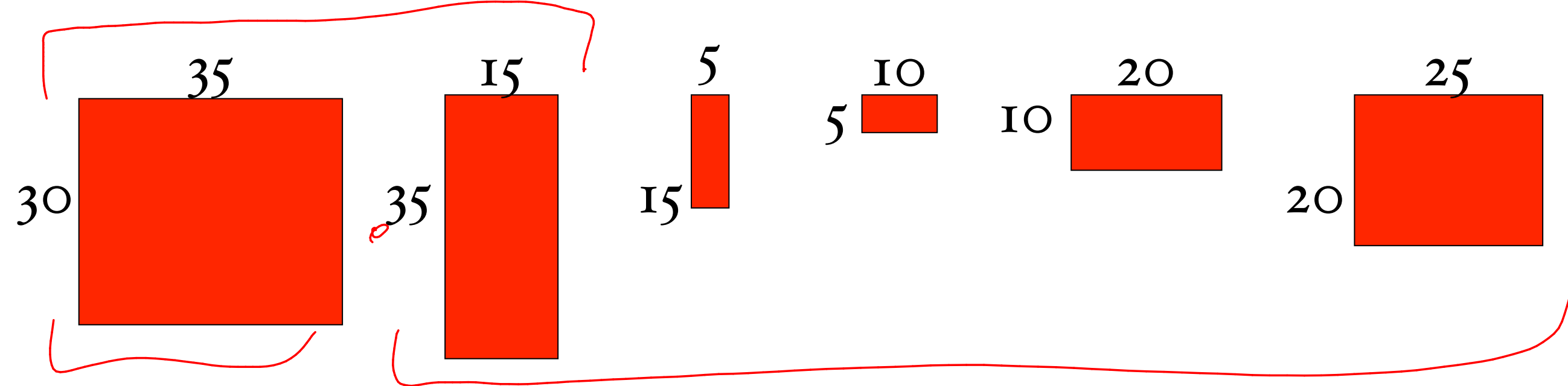
$$0 + 2625 + 5250 = 7875$$

3		$35 \cdot 15 \cdot 5 = 2625$	0
---	--	------------------------------	---

2	$30 \cdot 35 \cdot 15 = 15750$	0
---	--------------------------------	---

1	0
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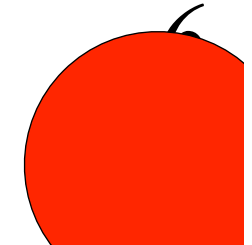
1 2 3 4 5 6

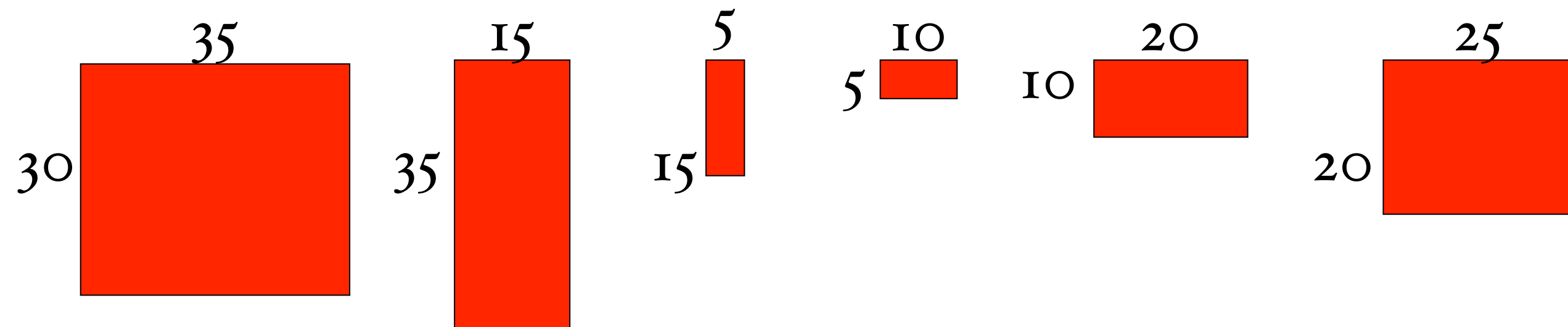



6		<u>10500</u>	<u>5375</u>	3500	$10*20*25 = 5000$	<u>0</u>
5	<u>11875</u>	7125	2500	$5*10*20 = 1000$	0	
4	9375	4375	$15*5*10 = 750$	0		
3	7875	$35*15*5 = 2625$	0			
2	$30*35*15 = \underline{15750}$	0				
1	0					

$B(i, j) =$

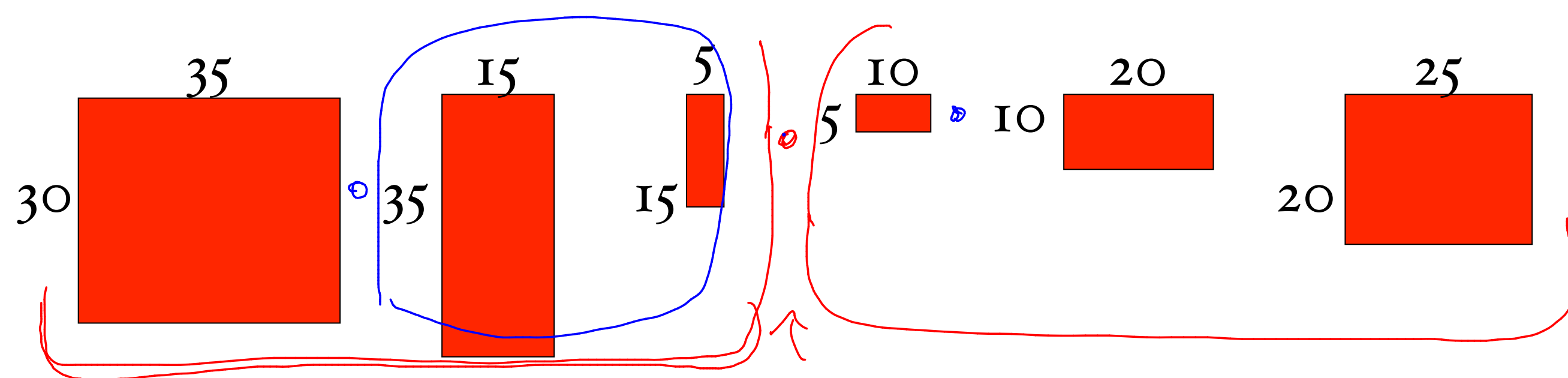
1 2 3 4 5 6





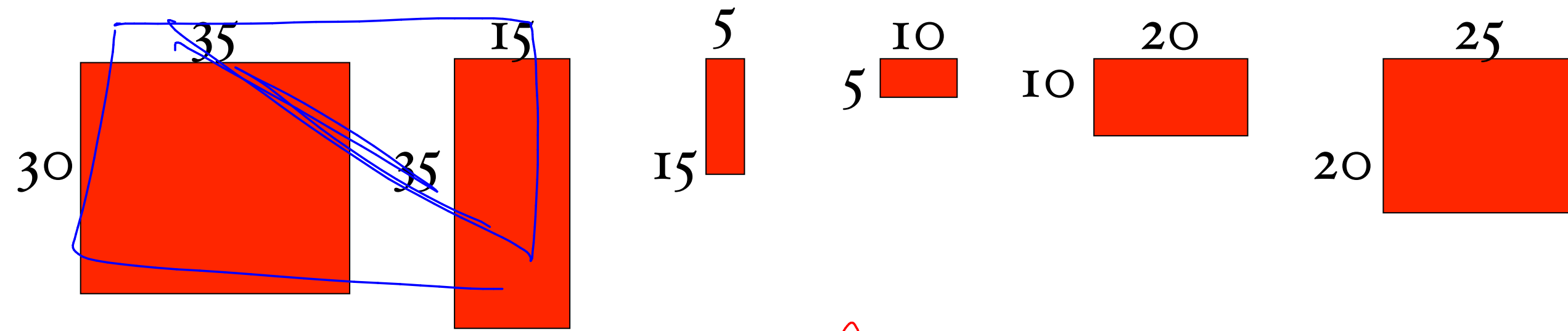
6 

$$B(1, 6) = \min \left\{ \begin{array}{l} k = 1 \quad \underline{B(1, 1)} + \underline{B(2, 6)} + r_1 c_1 c_6 \\ k = 2 \quad B(1, 2) + B(3, 6) + r_1 c_2 c_6 \\ k = 3 \quad \underline{B(1, 3)} + \underline{B(4, 6)} + r_1 c_3 c_6 \quad * \\ k = 4 \quad B(1, 4) + B(5, 6) + r_1 c_4 c_6 \\ k = 5 \quad \underline{B(1, 5)} + B(6, 6) + r_1 c_5 c_6 \end{array} \right.$$



of def
indef

6	15125 ³	10500	5375	3500 [*]	10*20*25 = 5000	0
5	11875	7125	2500	5*10*20 = 1000	0	
4	9375	4375	15*5*10 = 750	0		
3	7875 [*]	35*15*5 = 2625	0			
2	30*35*15 = 15750	0				
1	0					
	1	2	3	4	5	6



6	<u>15125</u> ₃	10500	5375	3500	10*20*25 = 5000	0
5	11875	7125	2500	5*10*20 = 1000	0	
4	9375	4375	15*5*10 = 750	0		
3	7875	35*15*5 = 2625	0			
2	30*35*15 = 15750	0				
1	0					
	1	2	3	4	5	6

MATRIX-CHAIN-MULT(P)

initialize array $m[x,y]$ to zero

RUNNING TIME?

initialize array B[x,y] to zero

starting at diagonal, working towards upper-left

compute B[i,j] according to

$$\left\{ \begin{array}{l} B(i, i) = 0 \\ B(i, j) = \min_{k=i}^{j-1} \left\{ B(i, k) + B(k+1, j) + r_i c_k c_j \right\} \end{array} \right.$$

how many elements
 $\Theta(n^2)$

each loop
takes
 $\Theta(n)$

$\Theta(n^3)$

\Rightarrow there is a better
way $\Theta(n \log n)$

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

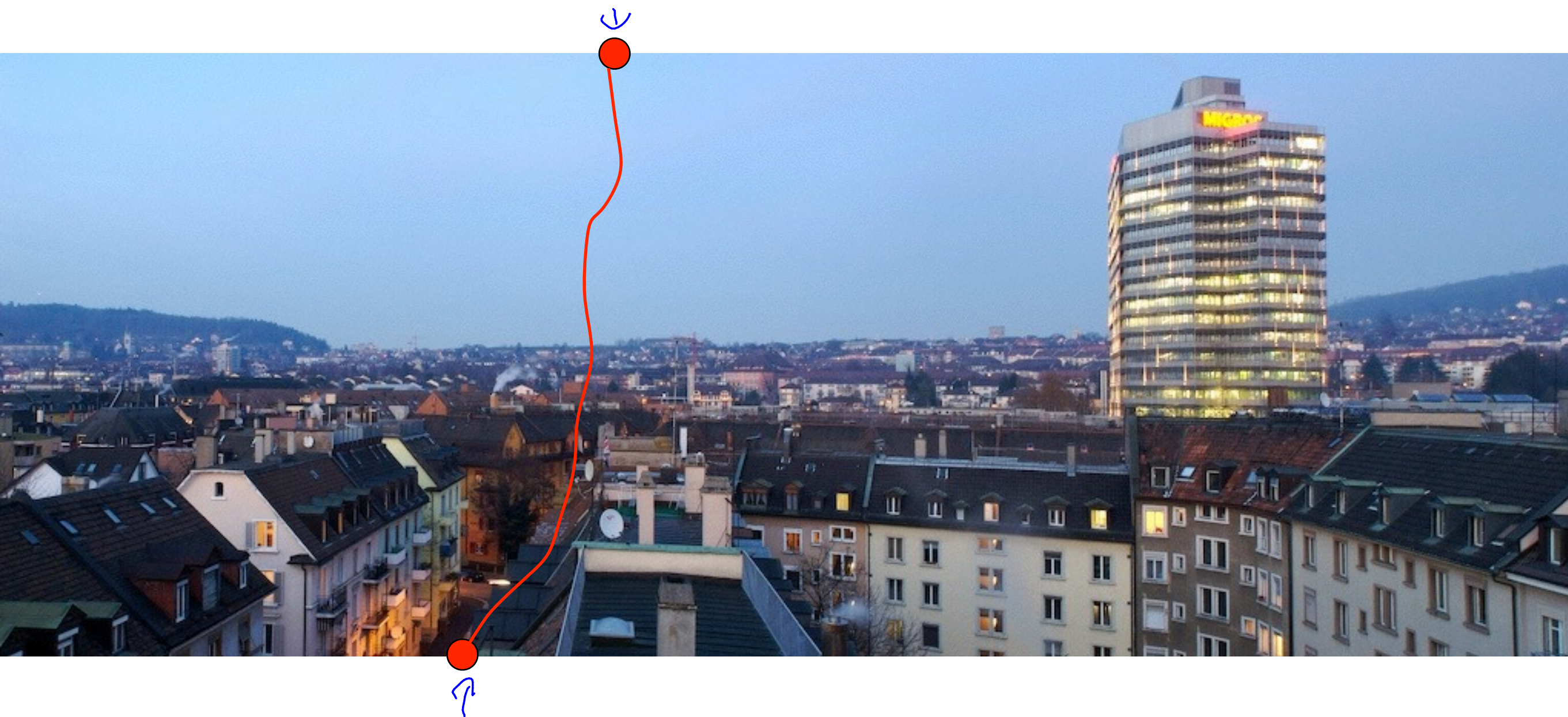
<http://www.youtube.com/watch?v=qadw0BRKeMk>

DEMO?

<http://rsizr.com/>



WHICH SEAM TO DELETE?

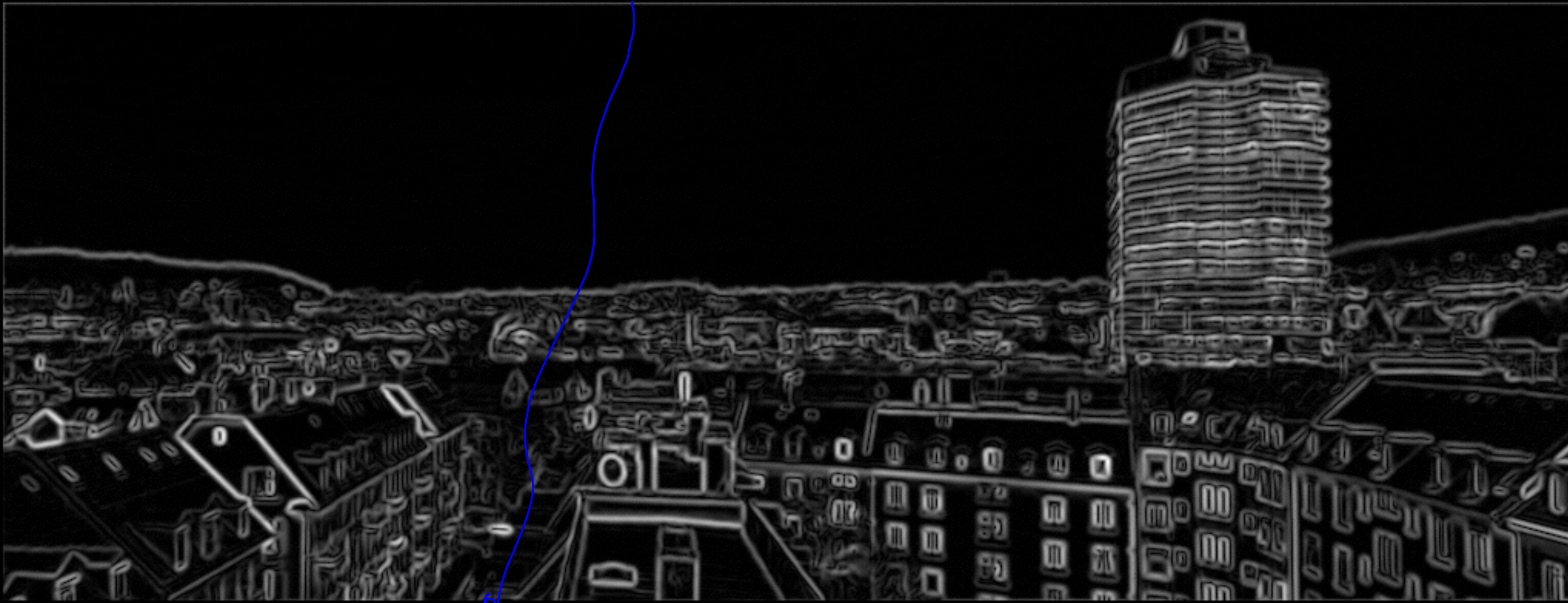


ENERGY OF AN IMAGE

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

“magnitude of gradient at a pixel”

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

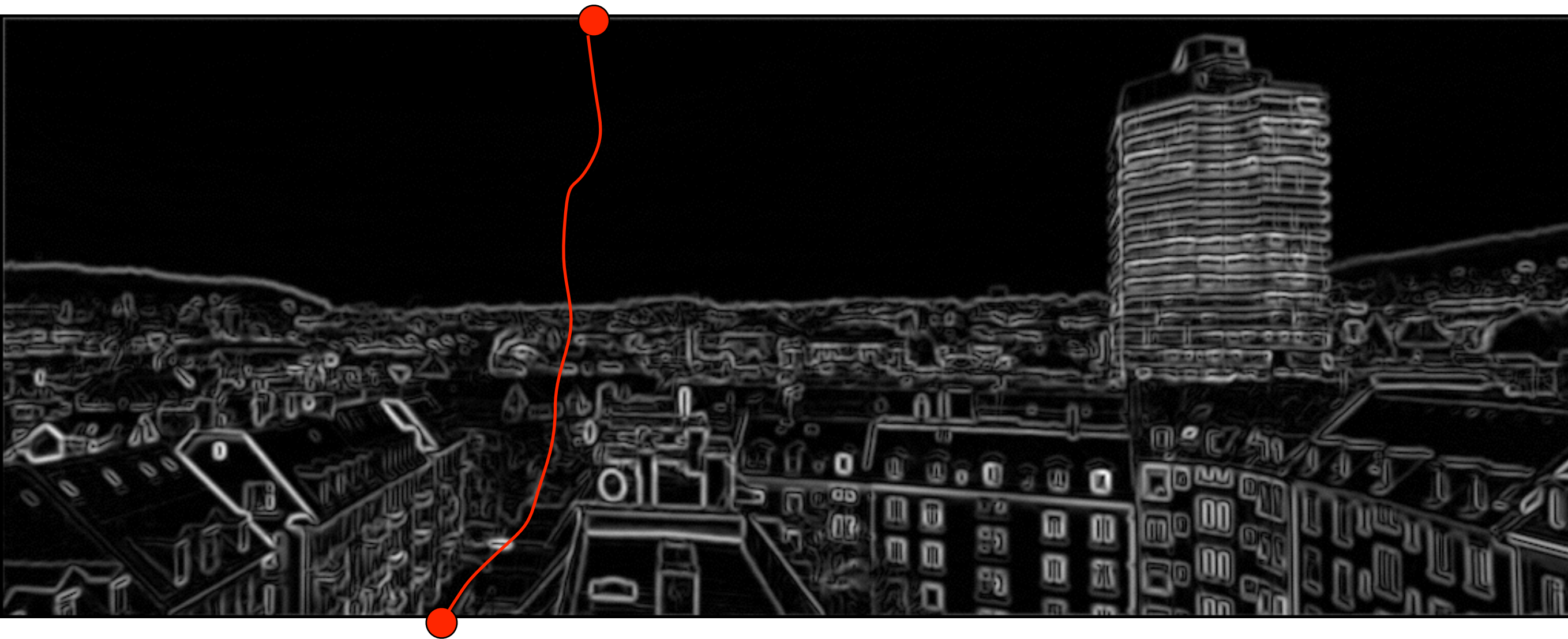


energy of sample image

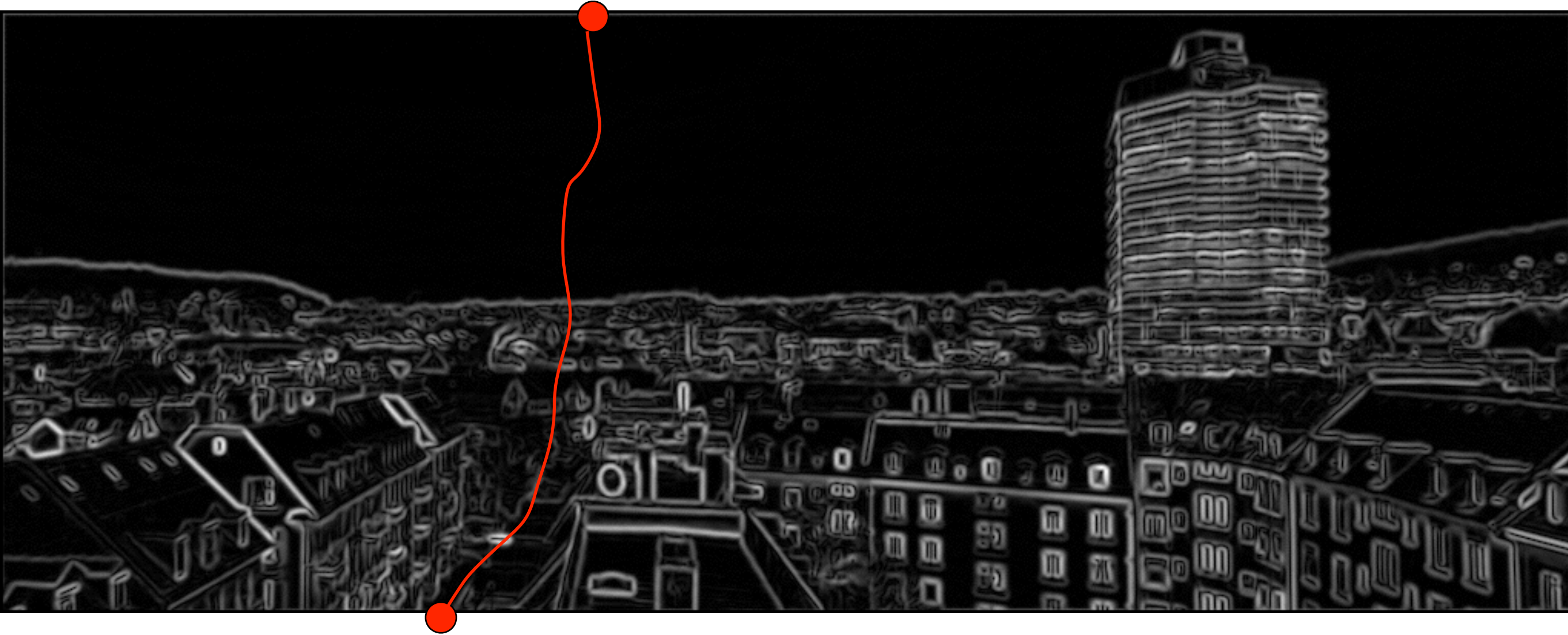
thanks to Jason Lawrence for gradient software



BEST SEAM HAS LOWEST ENERGY



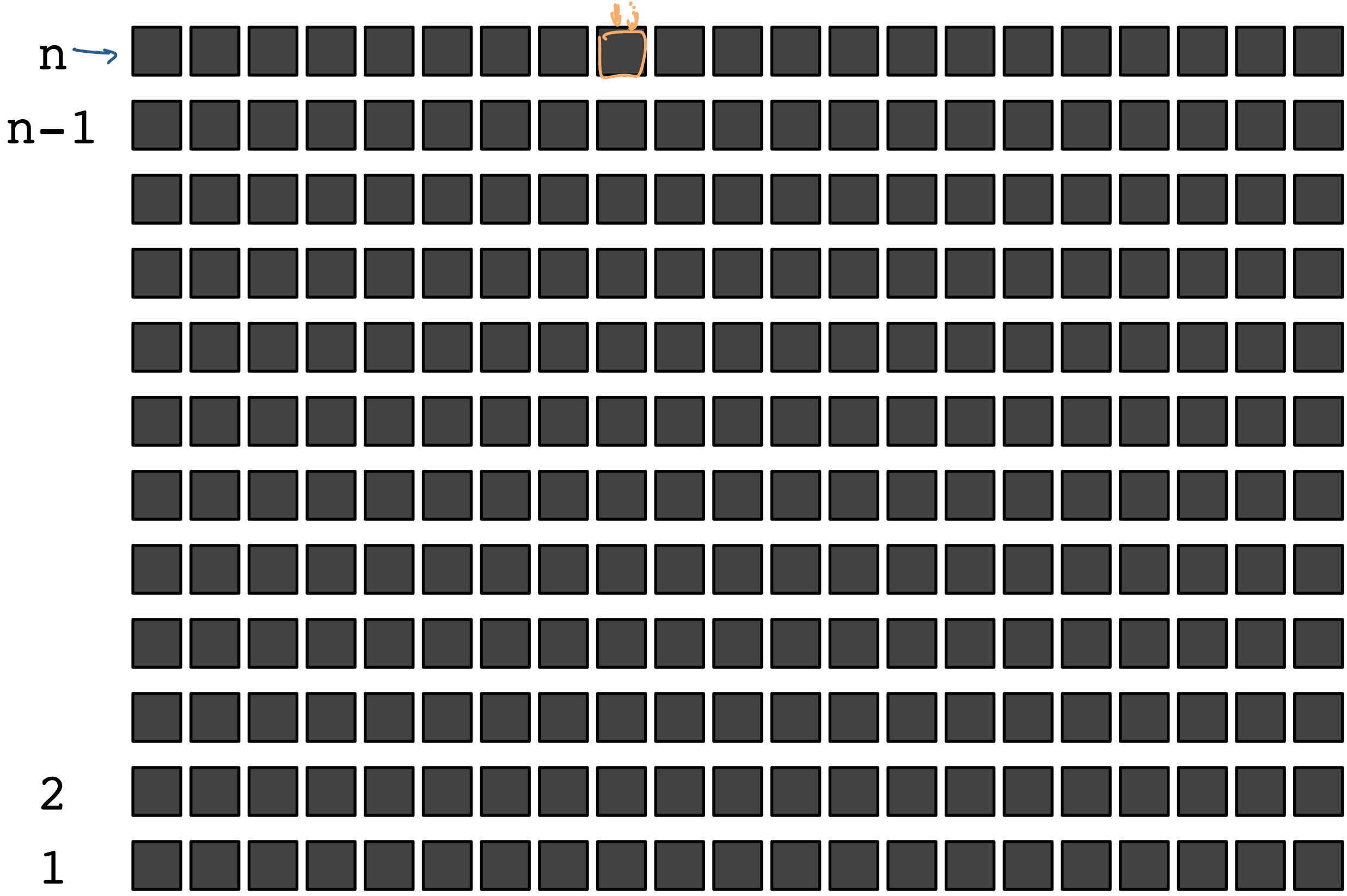
FINDING LOWEST ENERGY SEAM?



DEFINE A VARIABLE:

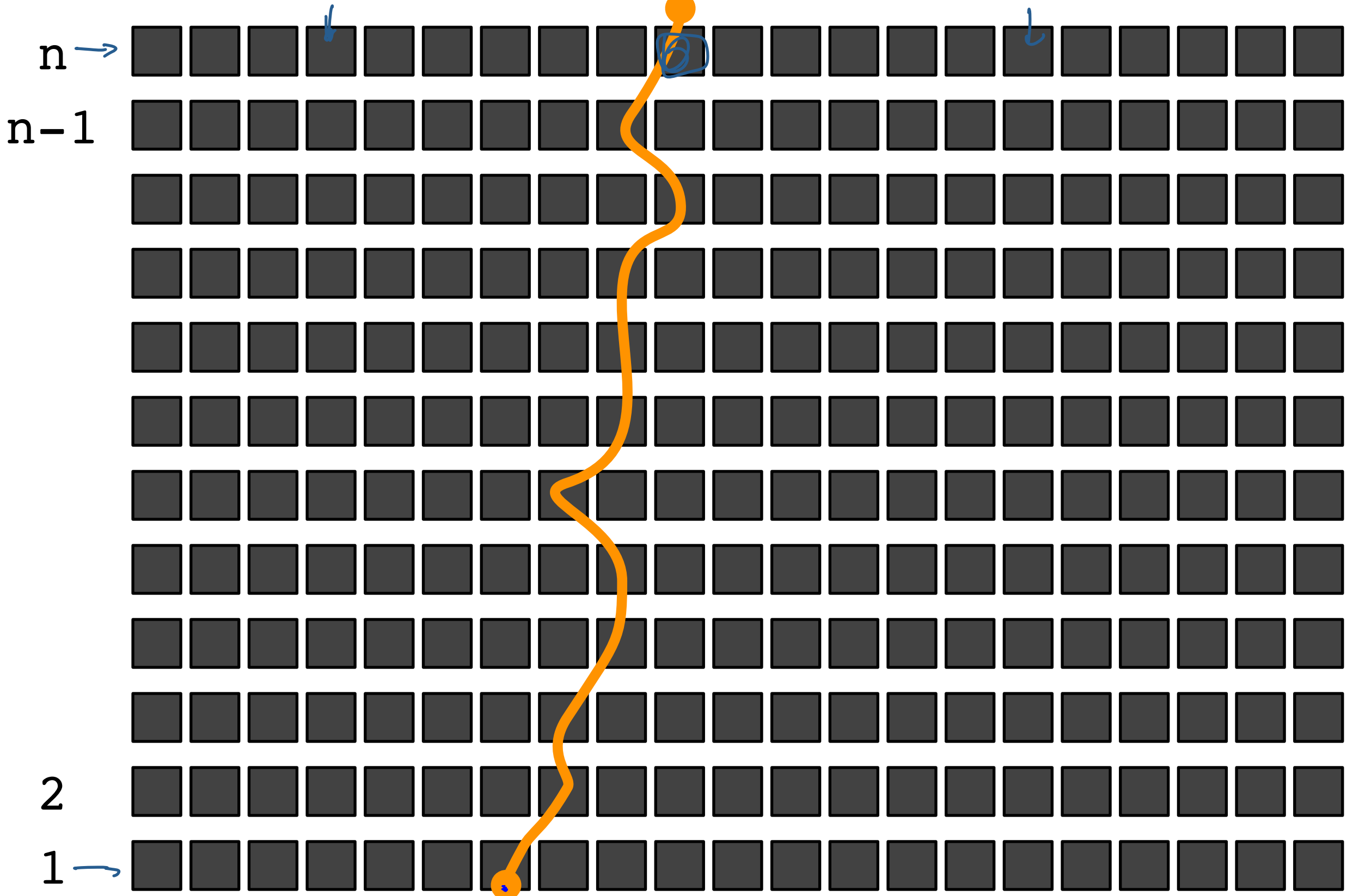
$S_i(j)$: least energy path from the bottom row to pixel (i, j)

definition: $S_n(j)$

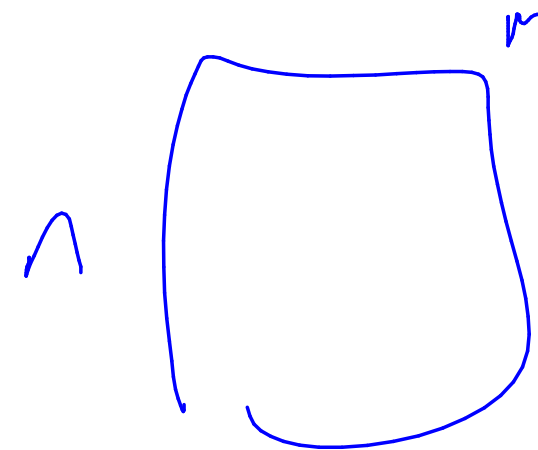


definition:

$S_n(j)$ best seam ending at (n,j)

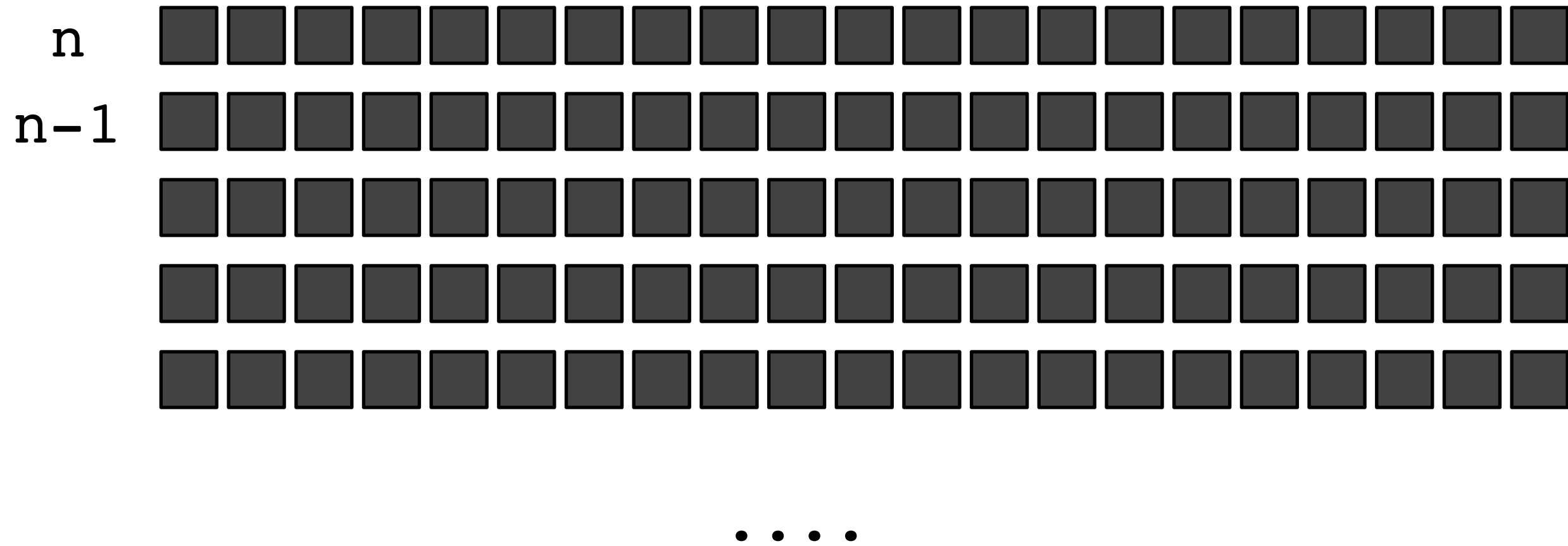


BEST SEAM TO DELETE HAS TO
BE THE BEST AMONG



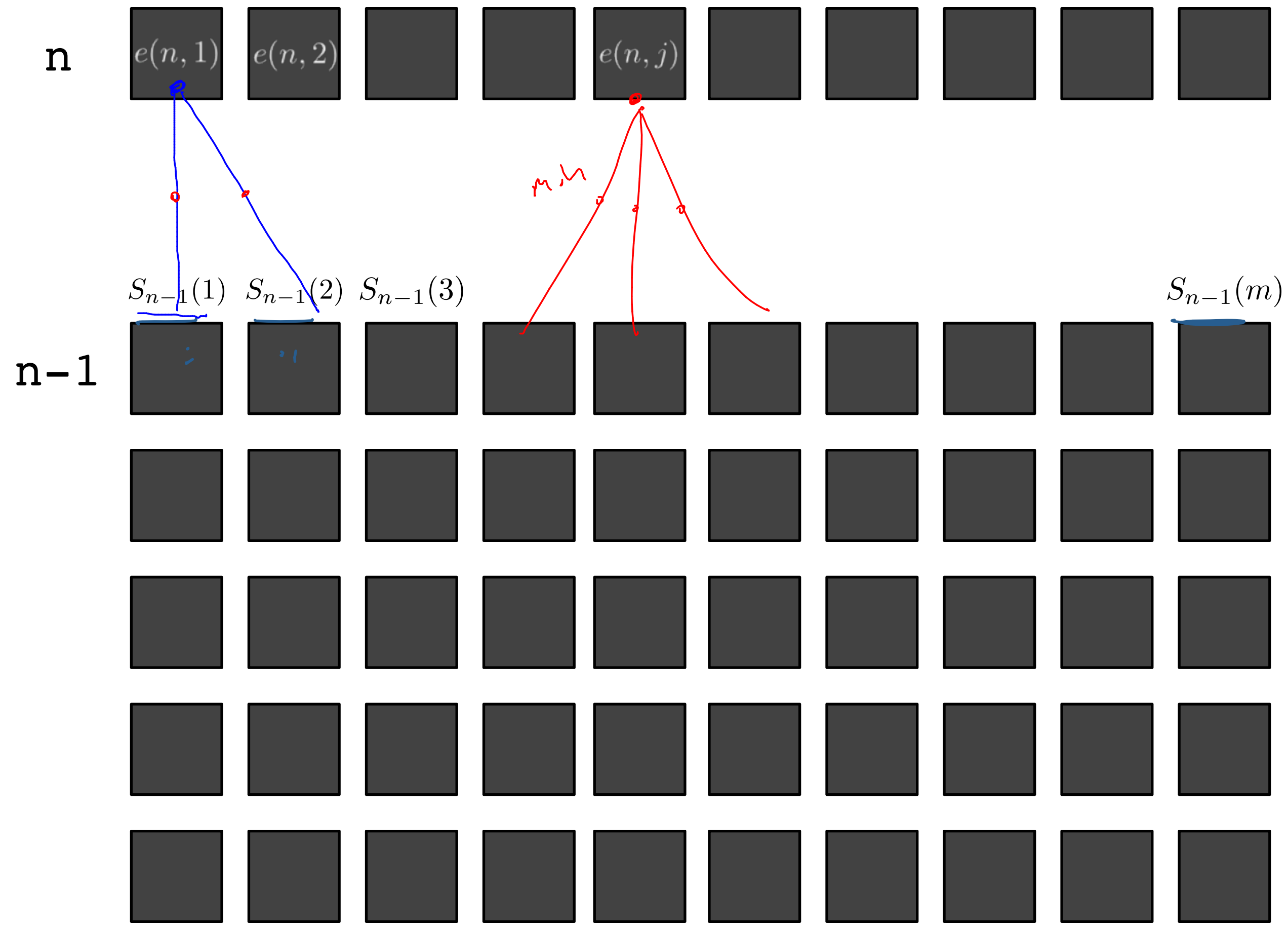
$S_n(1)$, $S_n(2)$, \dots , $S_n(m)$

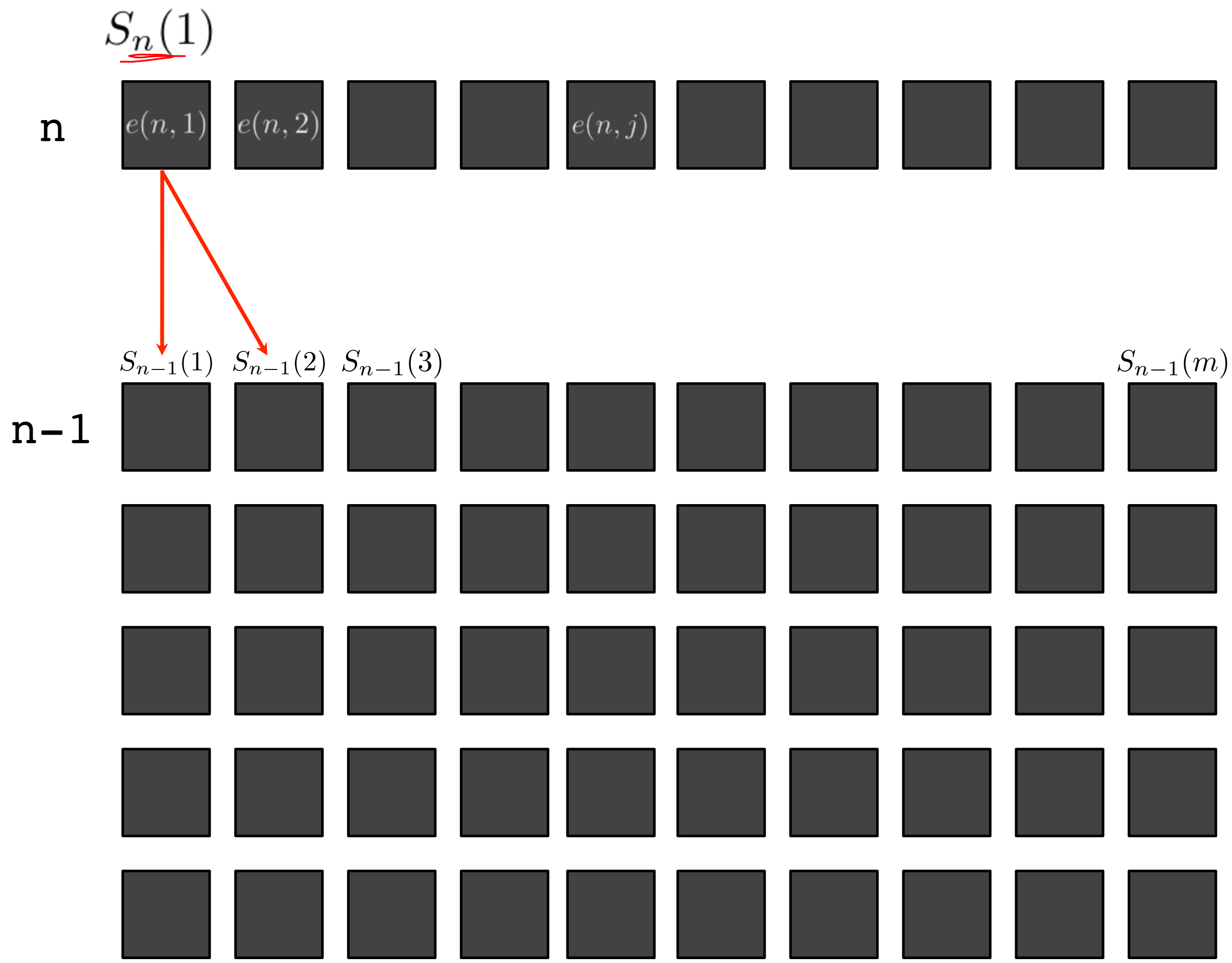
IDEA: COMPUTE + COMPARE

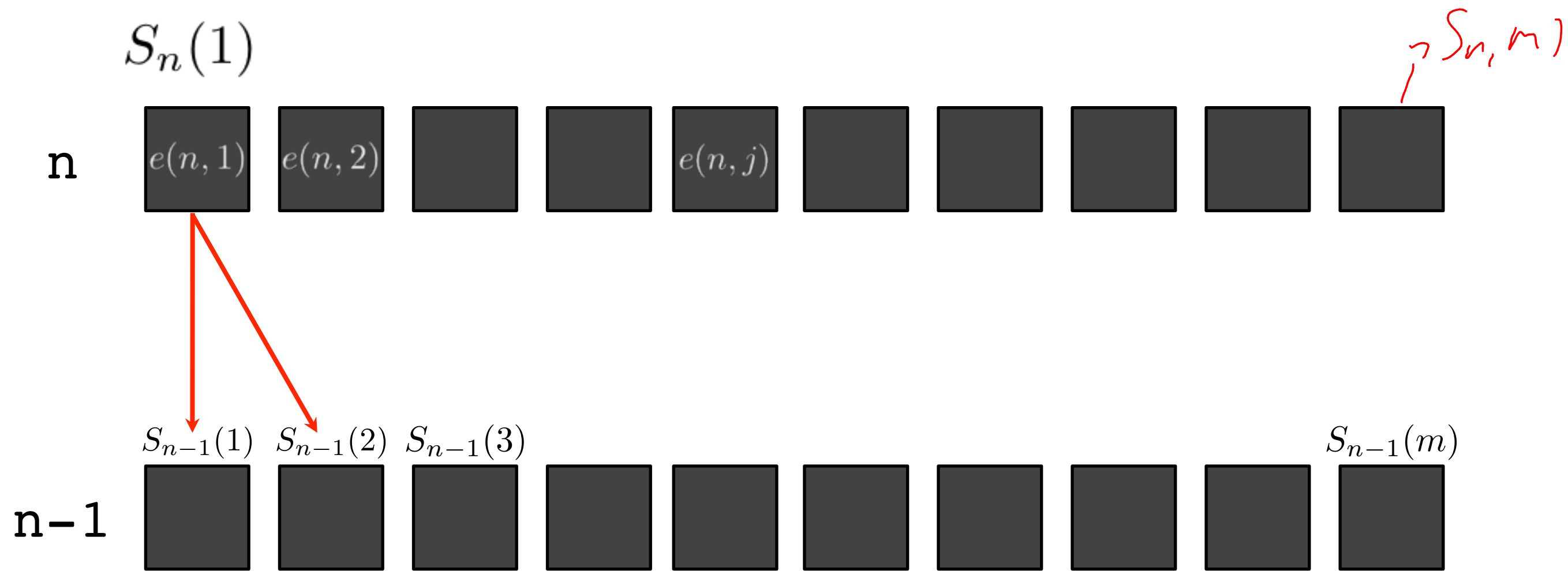


IMAGINE YOU HAVE THE
SOLUTION TO THE
FIRST $N-1$ ROWS

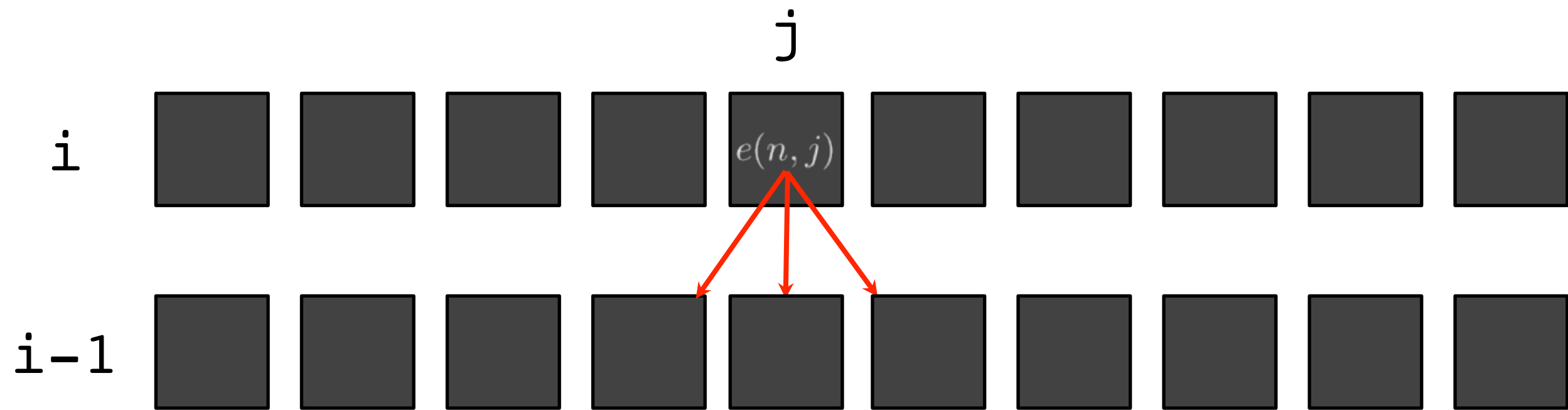
$$S_n(i) = \min \left\{ \begin{array}{l} S_{n-1}(i) + E_{n,i} \\ S_{n-1}(z) + E_{n,i} \end{array} \right.$$



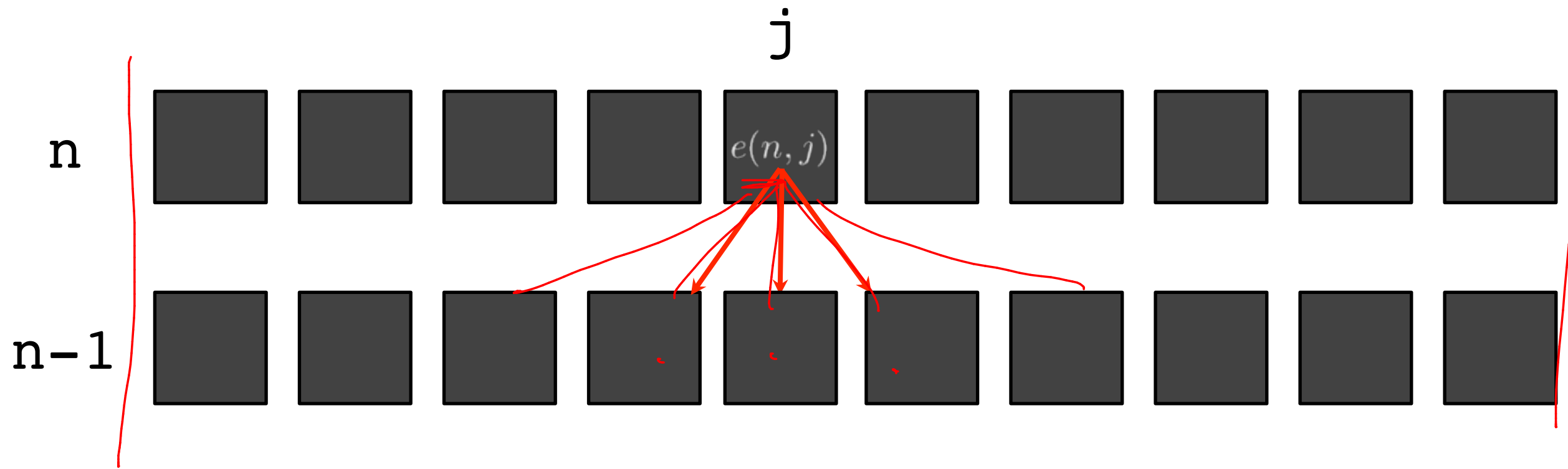




$$S_n(1) = \underline{e(n,1)} + \min\{S_{n-1}(1), S_{n-1}(2)\}$$



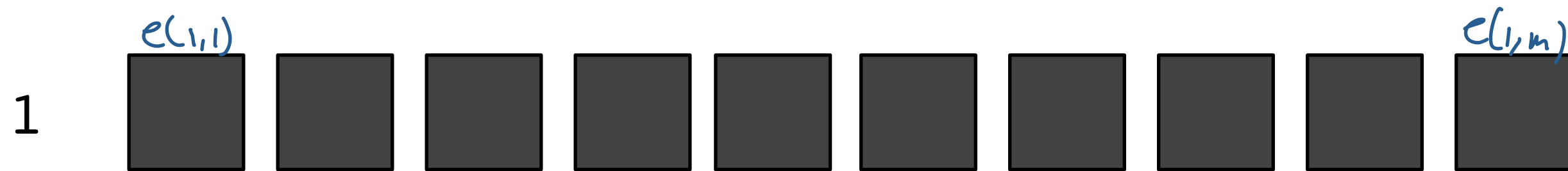
$$S_i(j) =$$



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

ALGORITHM

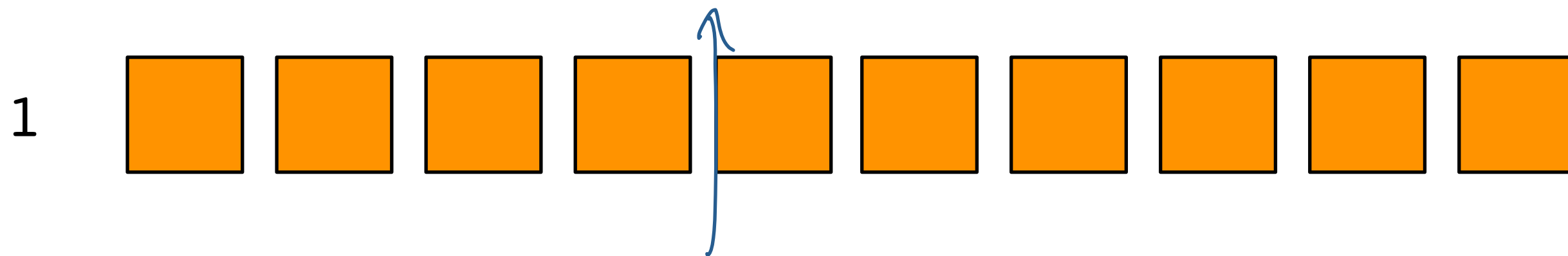
start at bottom of picture



$$S_{ij} = e_{i,j}$$

ALGORITHM

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

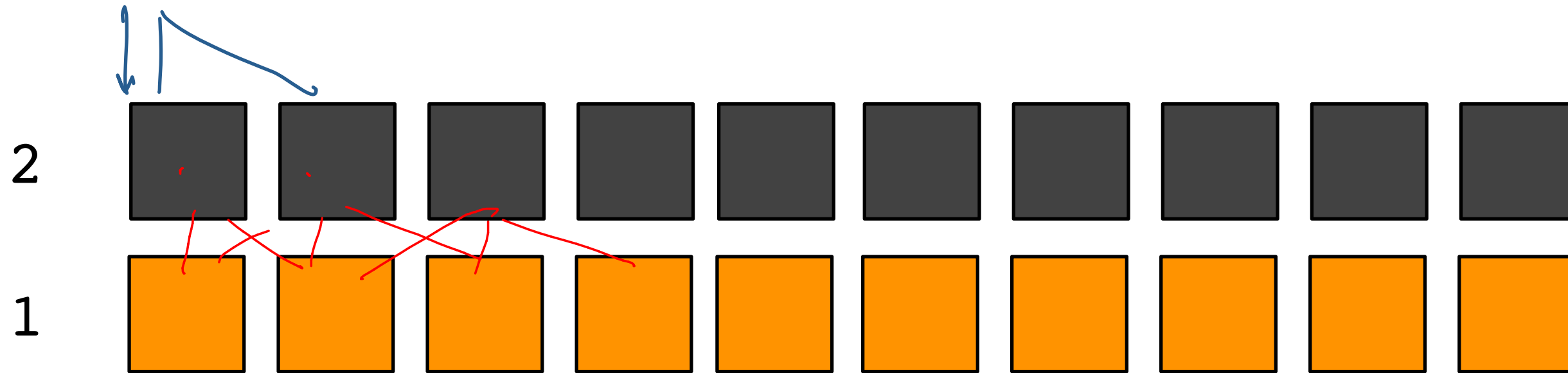


ALGORITHM

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

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

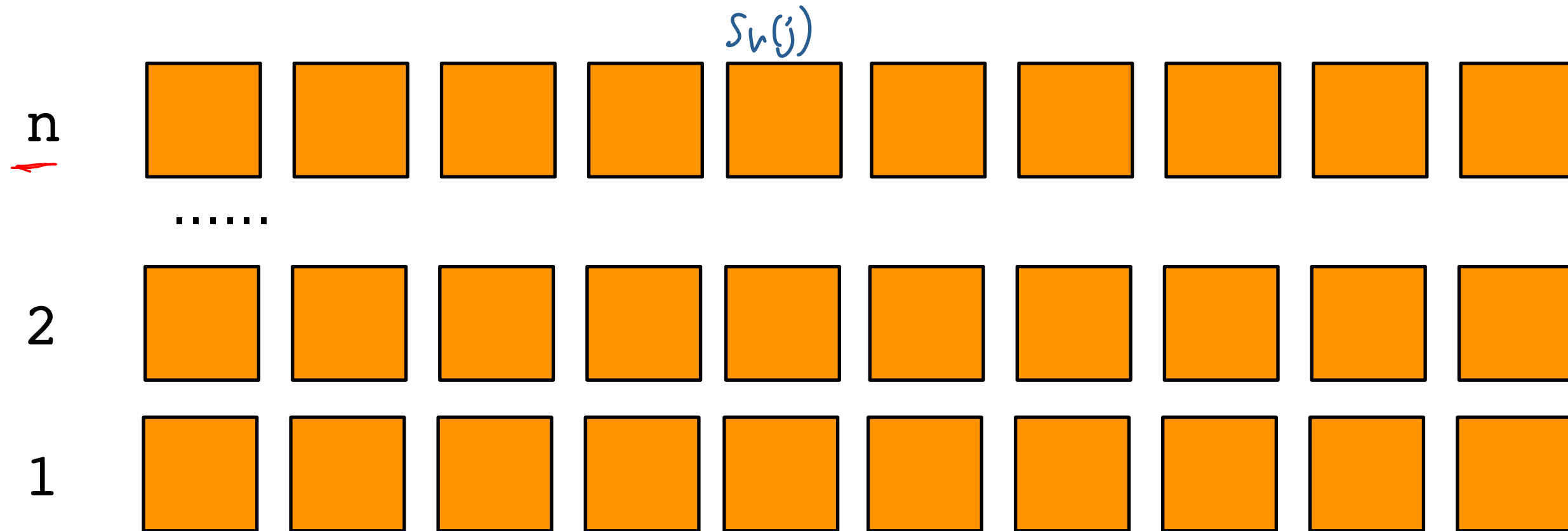
$$S_i(j) = e(i, j) + \min \begin{cases} S_{i-1}(j-1) \\ S_{i-1}(j) \\ S_{i-1}(j+1) \end{cases}$$



ALGORITHM

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

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

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


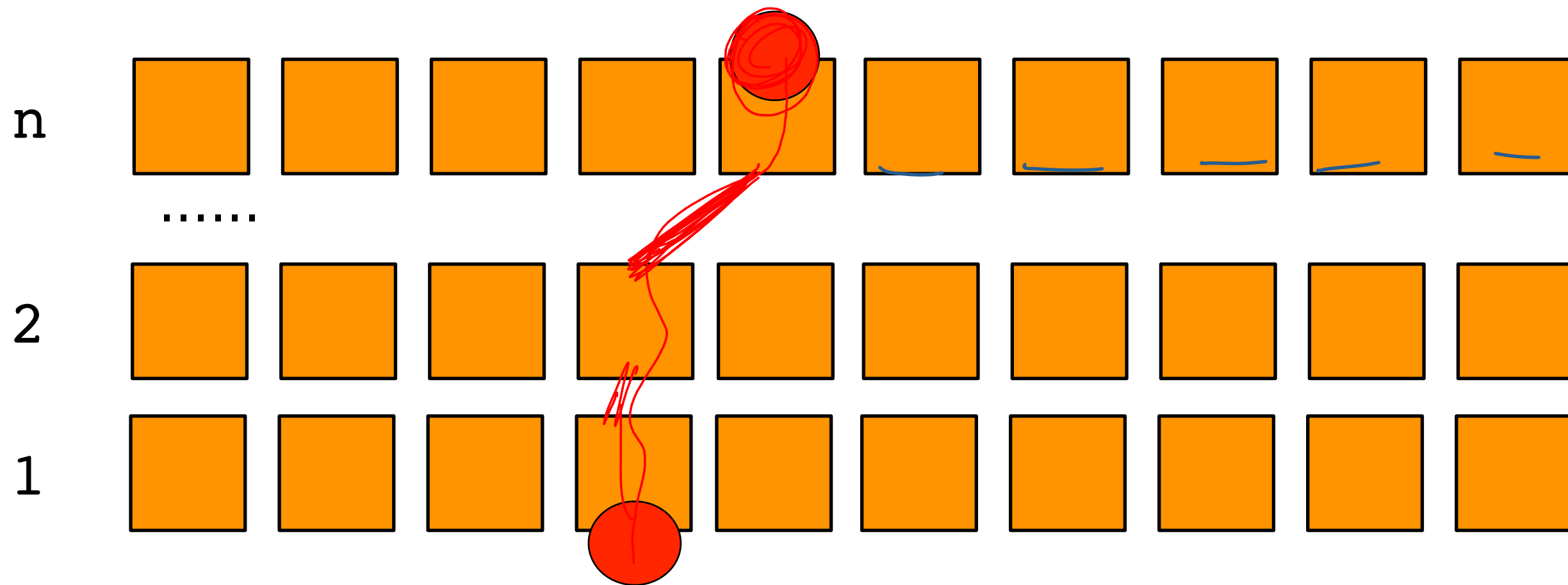
ALGORITHM

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

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

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

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.

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.