

PROBLEM: REDUCE IMAGE



scaling: distortion

deleting column: distortion

delete the most invisible [seam](#)

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



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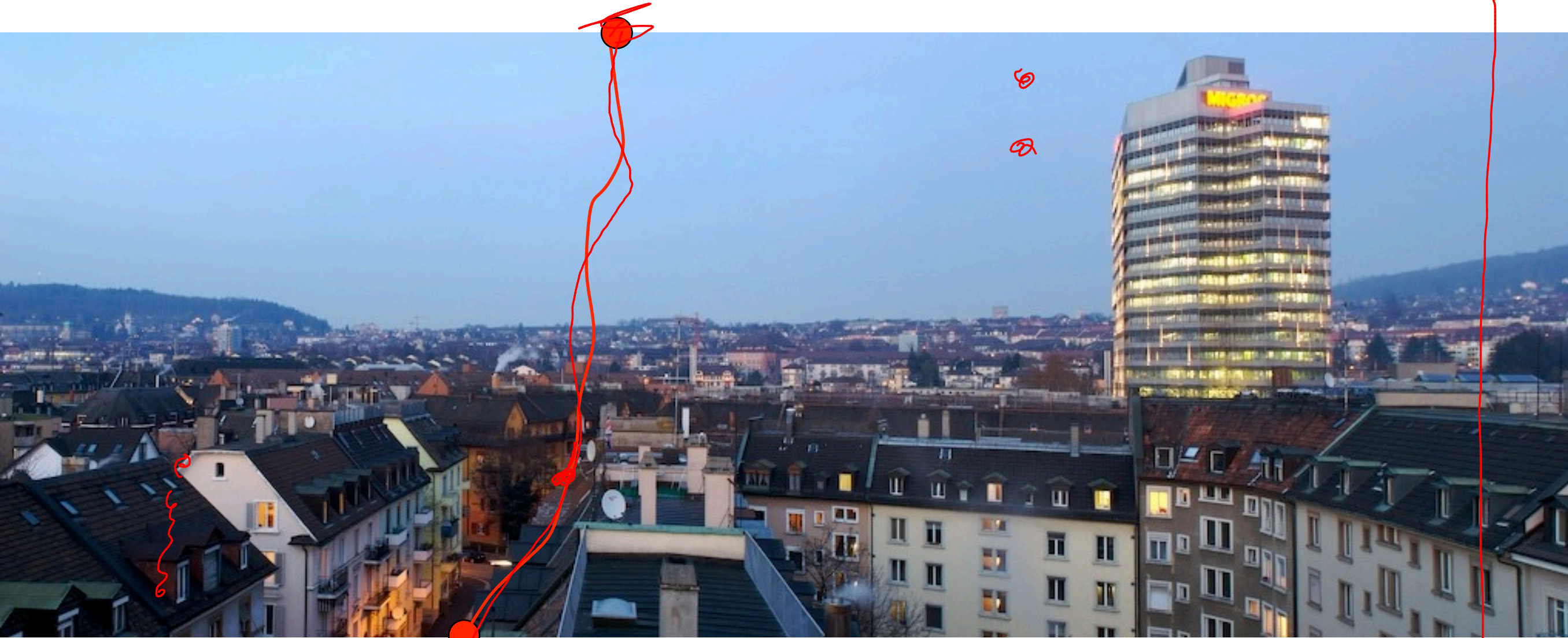
<http://www.youtube.com/watch?v=qadw0BRKeMk>

DEMO?

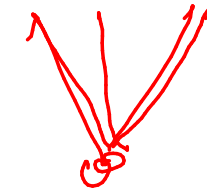
<http://rsizr.com/>



WHICH SEAM TO DELETE?



Remove a path



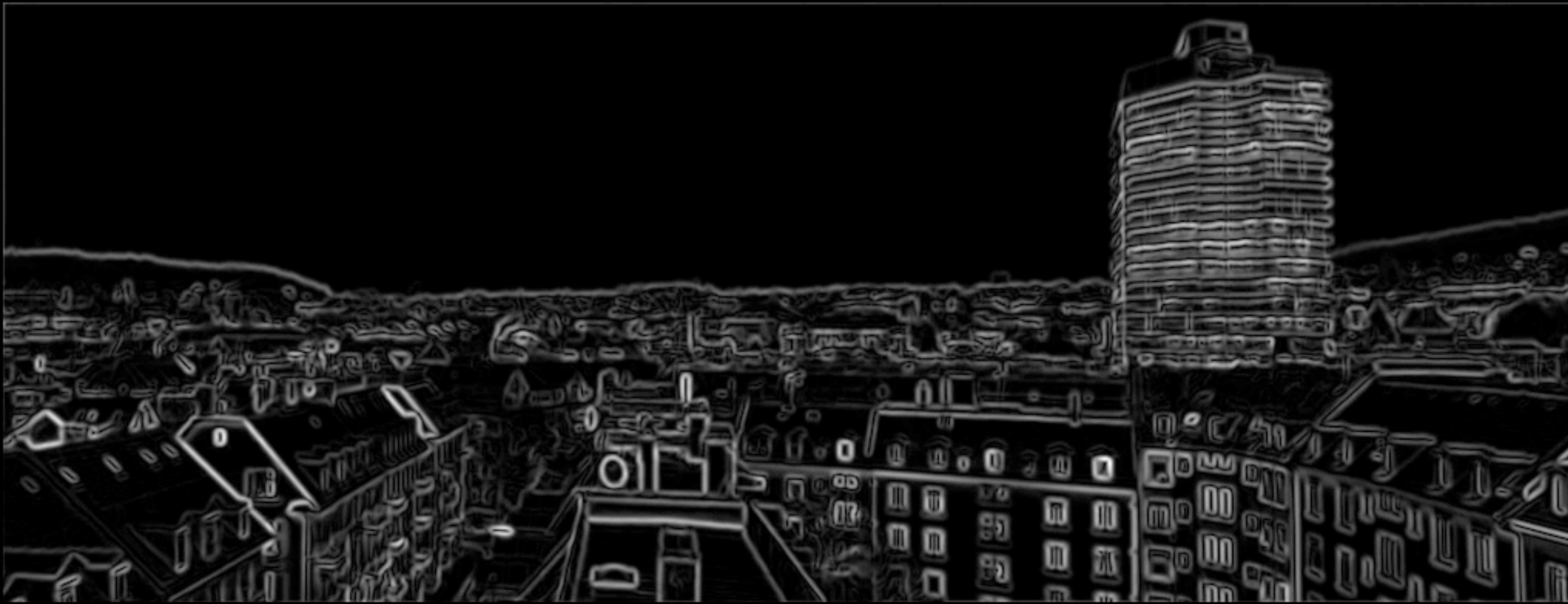
Seam: a path from the bottom row to the top row in which each pixel is connected to its UL, UM, UR neighbor

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”

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

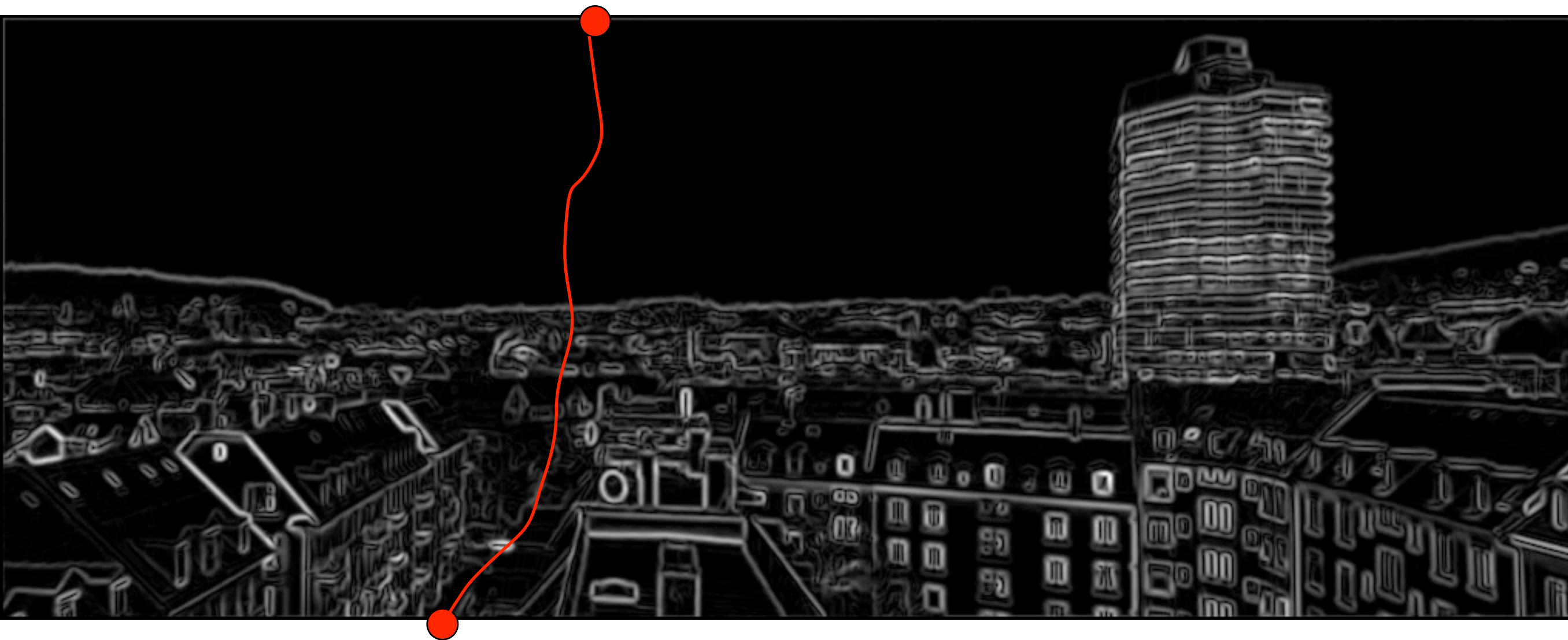


energy of sample image

thanks to Jason Lawrence for gradient software

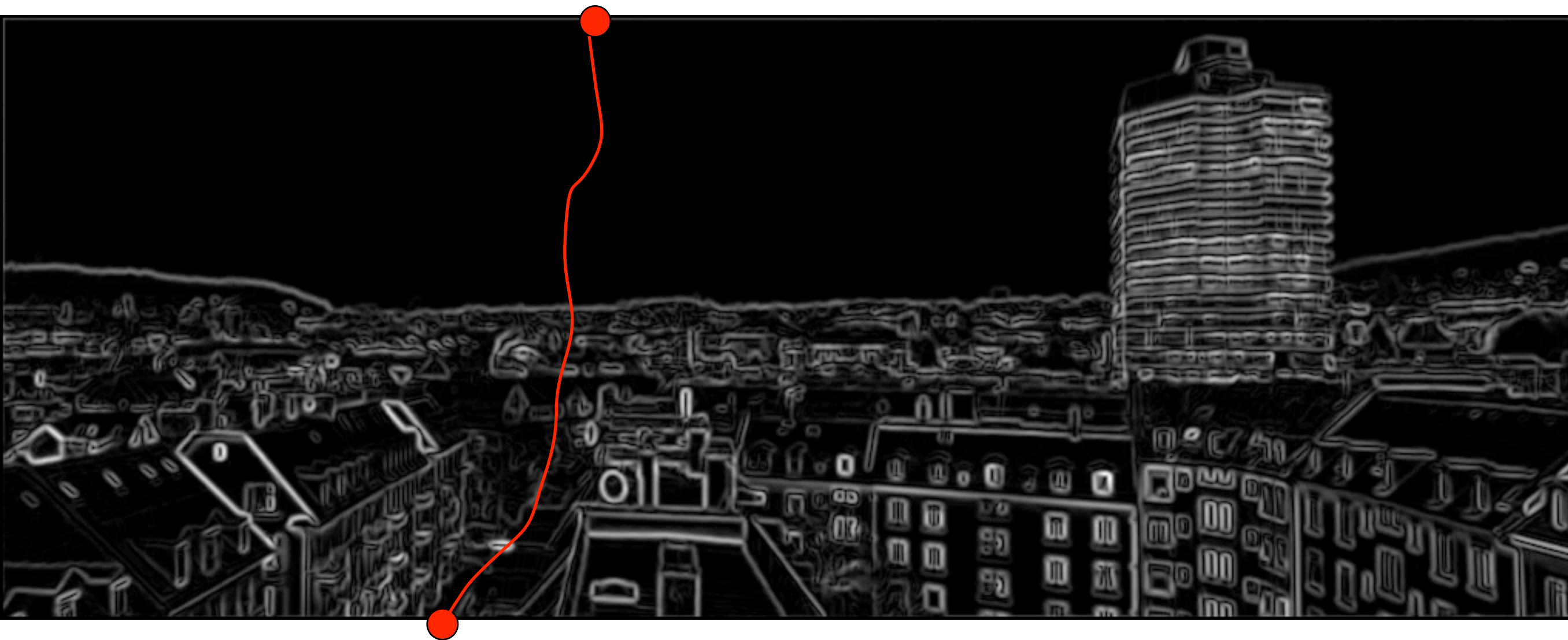


BEST SEAM HAS LOWEST ENERGY



identify
the
lowest
energy
seam

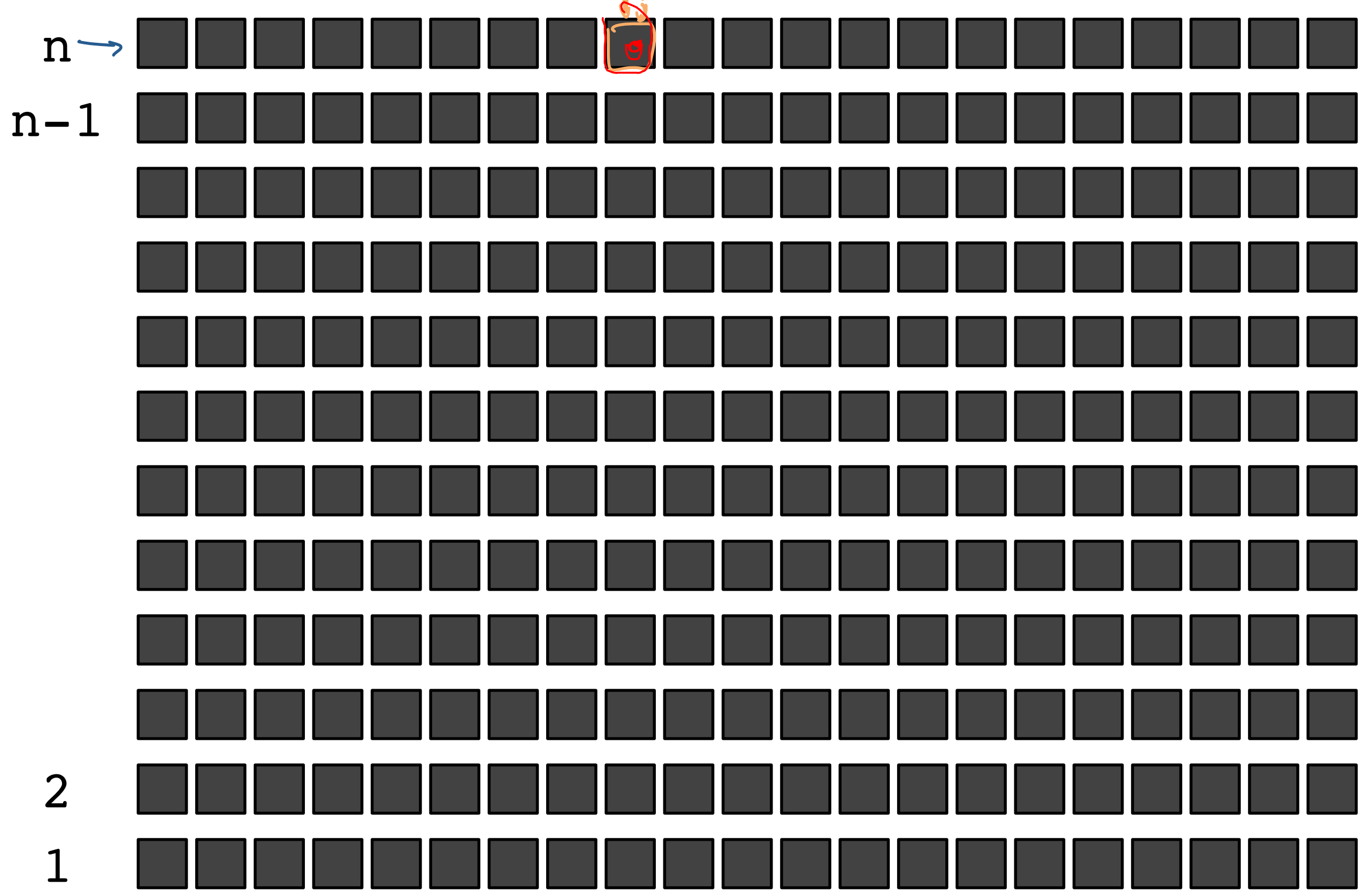
FINDING LOWEST ENERGY SEAM?



Define a variable:

$S_i(j)$: the total energy of the path that ends at pixel (i,j) and has the least energy

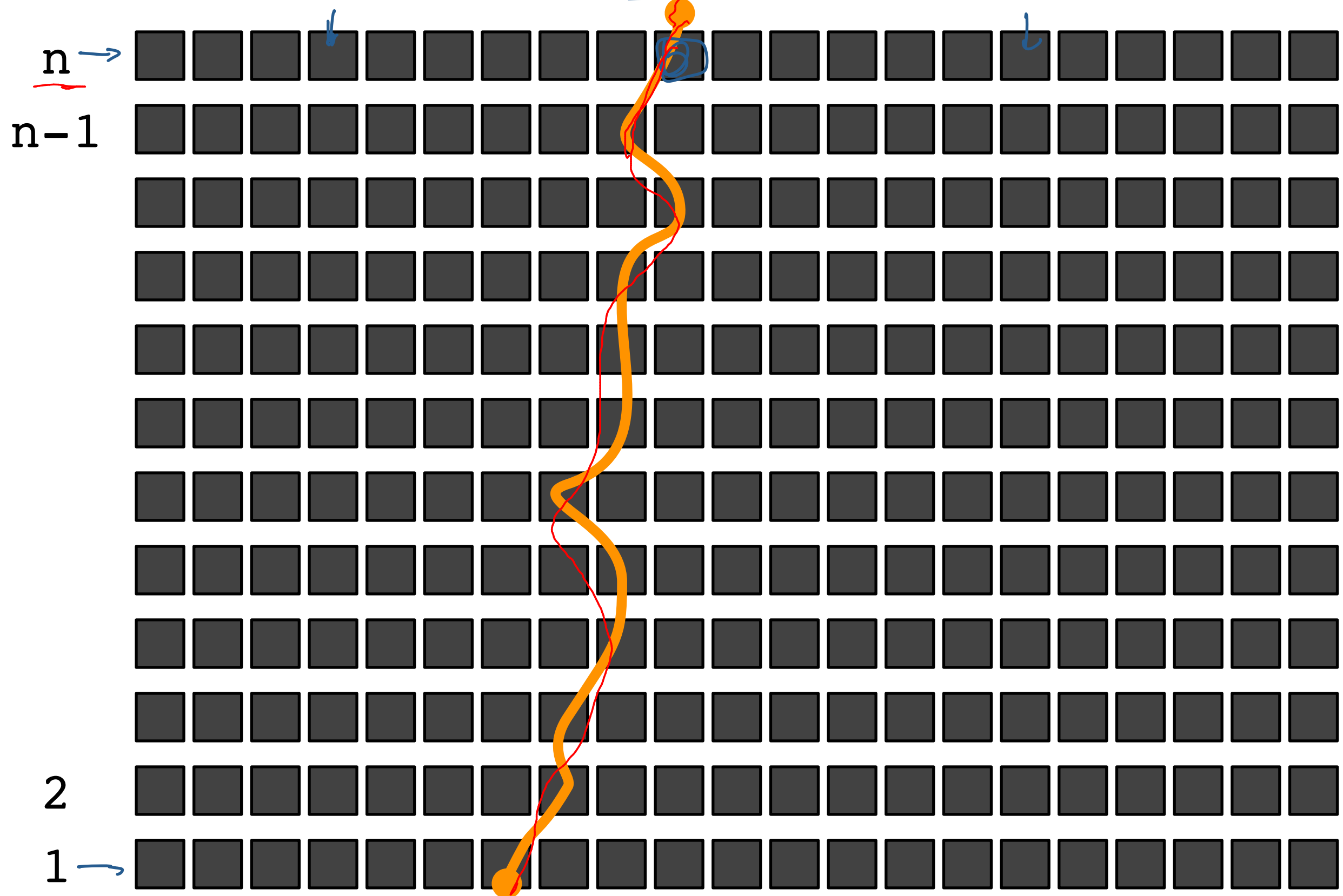
definition: $S_n(j)$: lowest energy seam that ends @ (n, j)



— n height of the image

definition:

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



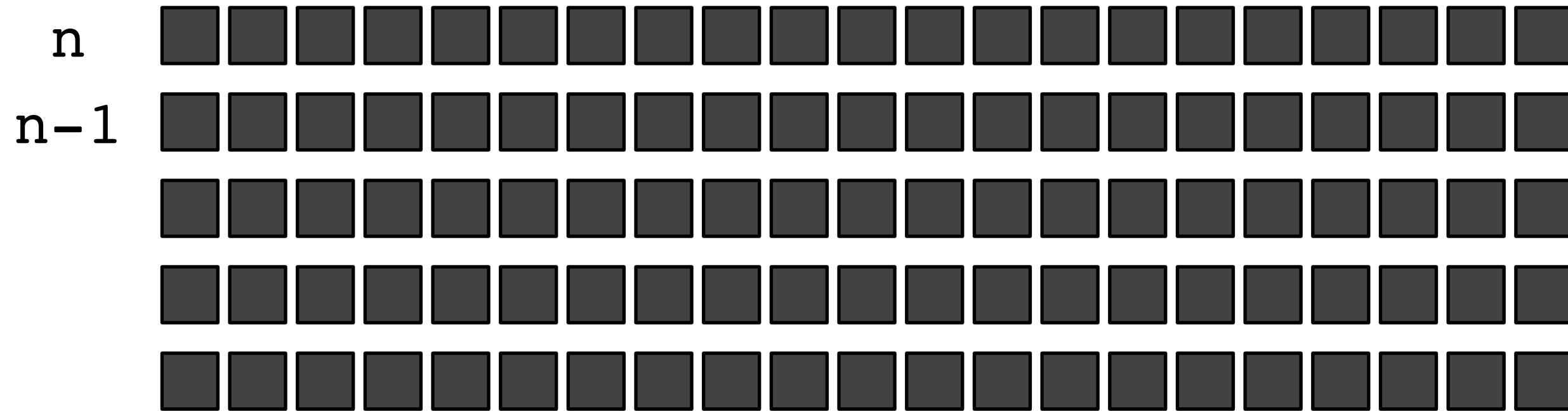
m width of image

BEST SEAM TO DELETE HAS
TO BE THE BEST AMONG

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

↪ find
min

IDEA: COMPUTE + COMPARE



• • • •

SMALLER PROBLEM APPROACH

How to compute $S_n(j)??$

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

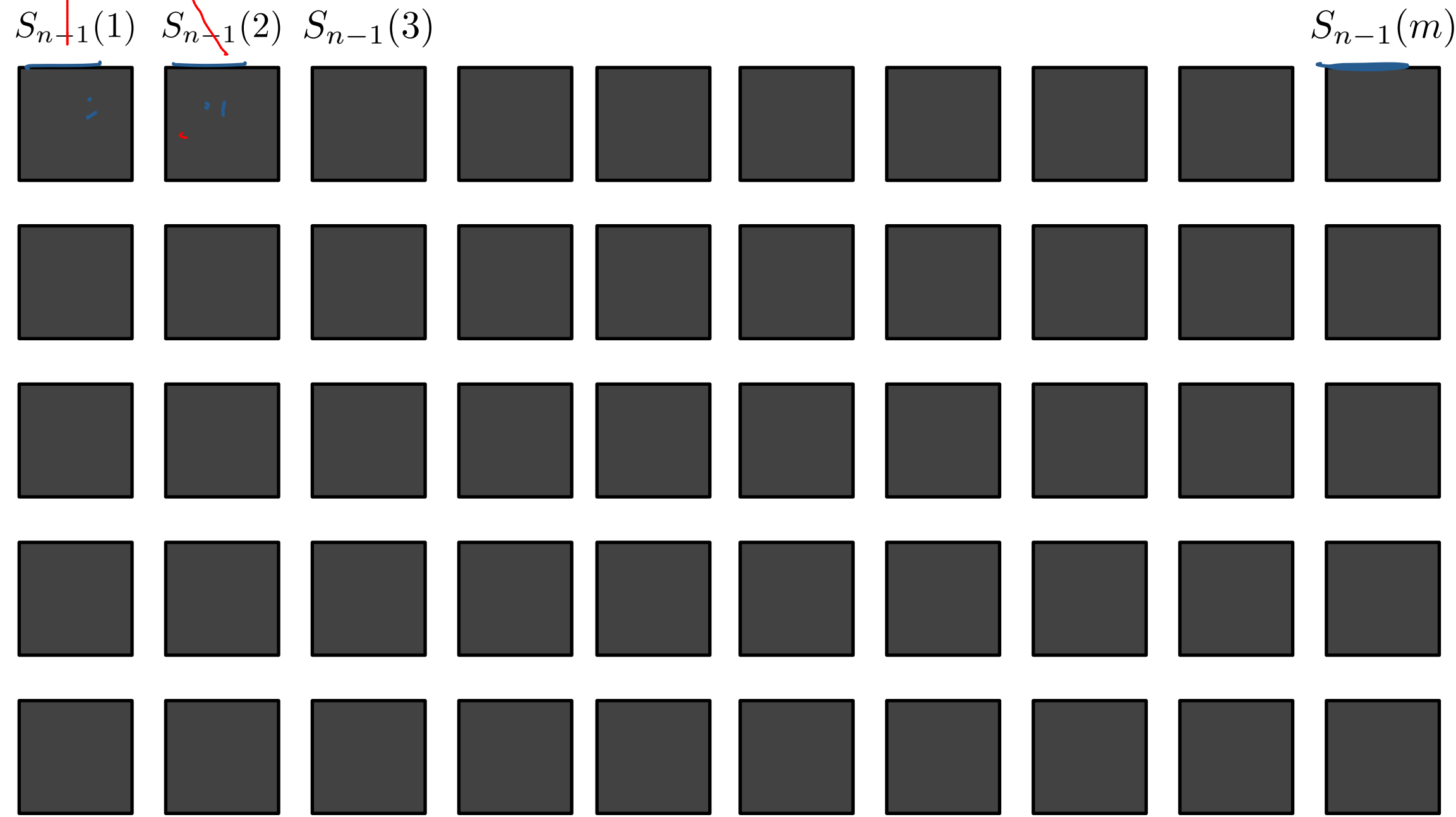
$S_n(i)$

n

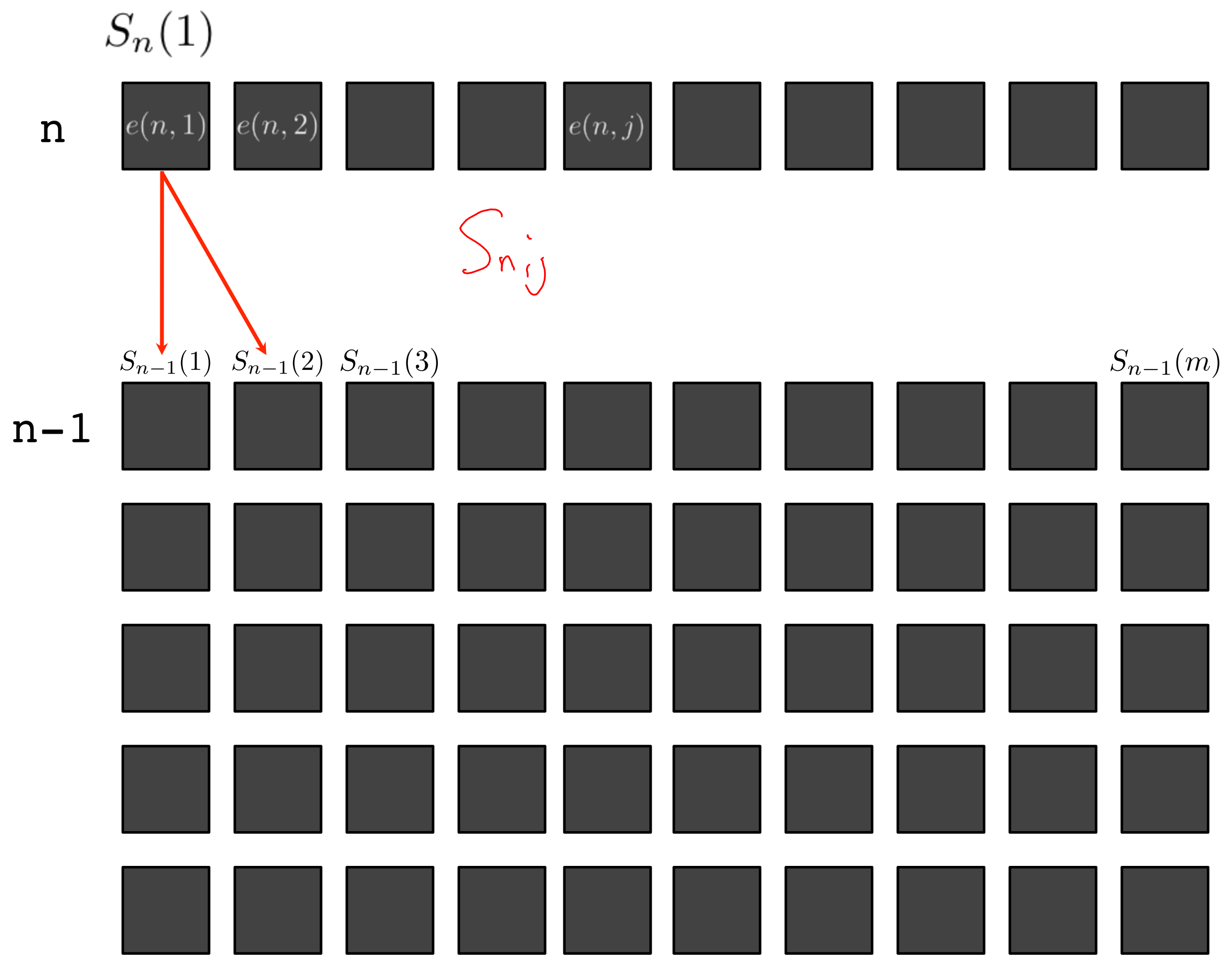


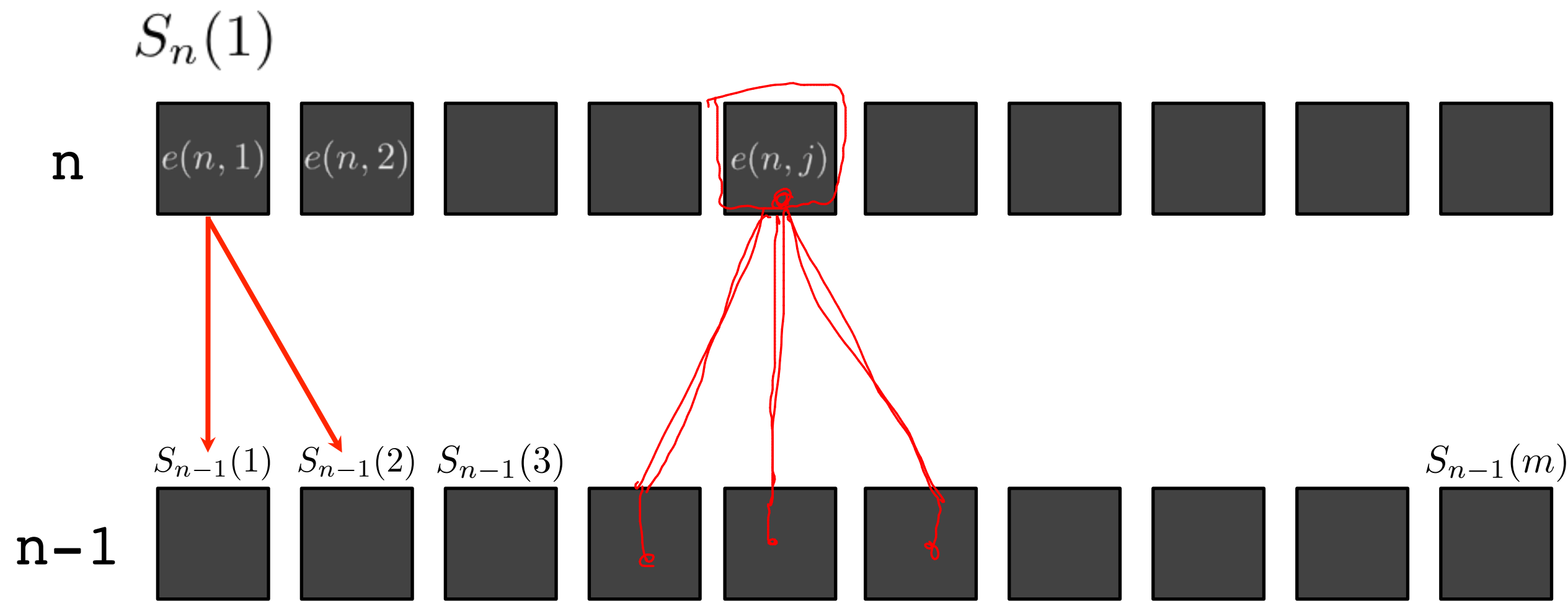
$$S_n(i) = \min \left\{ \begin{array}{l} S_{n-1}(1) \\ S_{n-1}(2) \end{array} \right\} + e(n,i)$$

n-1



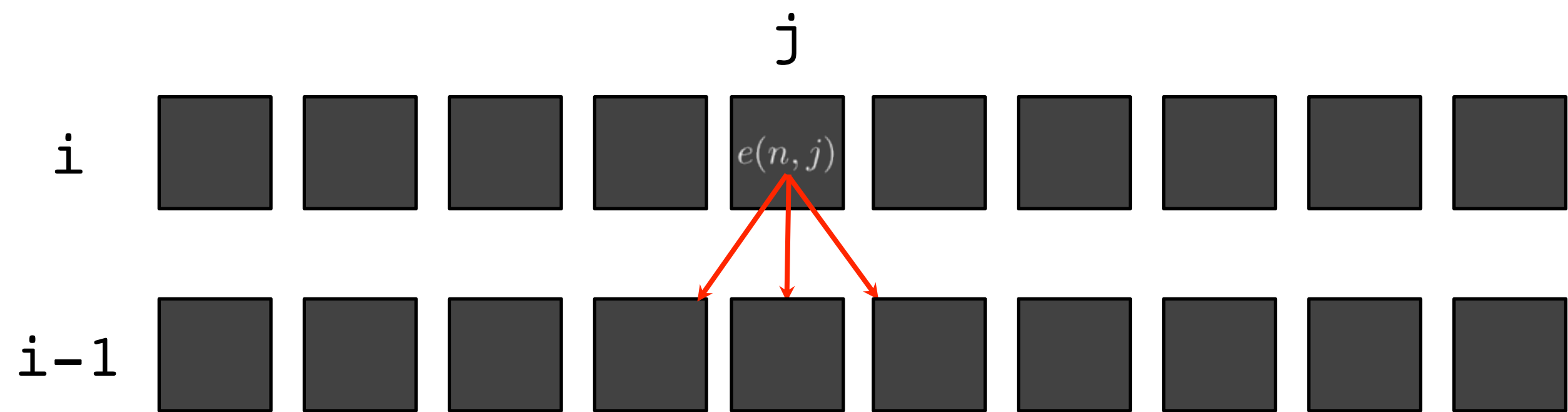
← spse you have the solutions for n-1



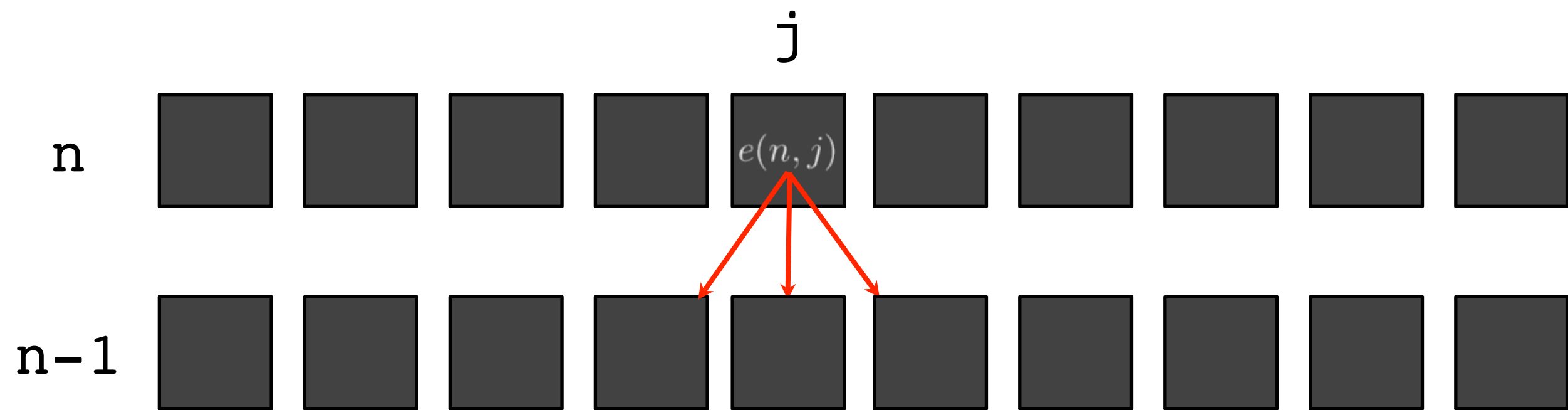


$$S_n(1) = e(n, 1) + \min\{S_{n-1}(1), S_{n-1}(2)\}$$

$$S_n(j) = \underline{e(n, j)} + \min \begin{cases} S_{n-1}(j-1) \\ S_{n-1}(j) \\ S_{n-1}(j+1) \end{cases} \quad \text{or } \infty \text{ if } j=1 \\ \text{or } \infty \text{ if } j=m$$



$$S_i(j) =$$



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

ALGORITHM

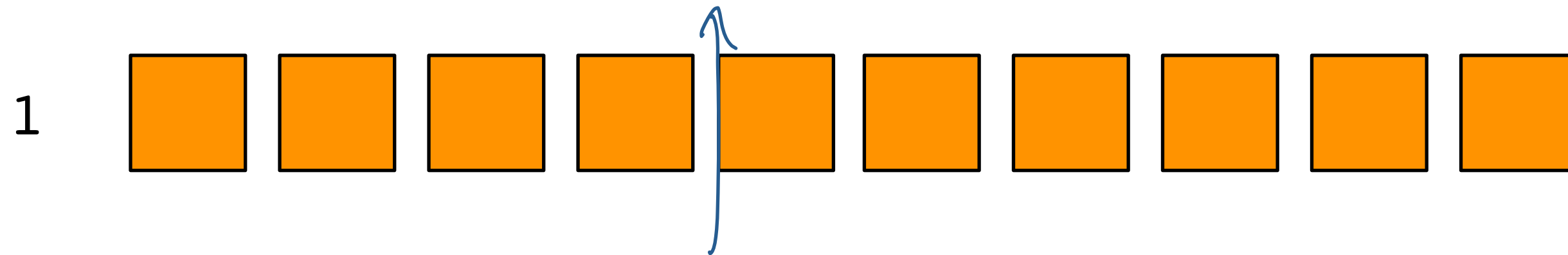
start at bottom of picture



$$S_1(i) = e(1,i)$$

ALGORITHM

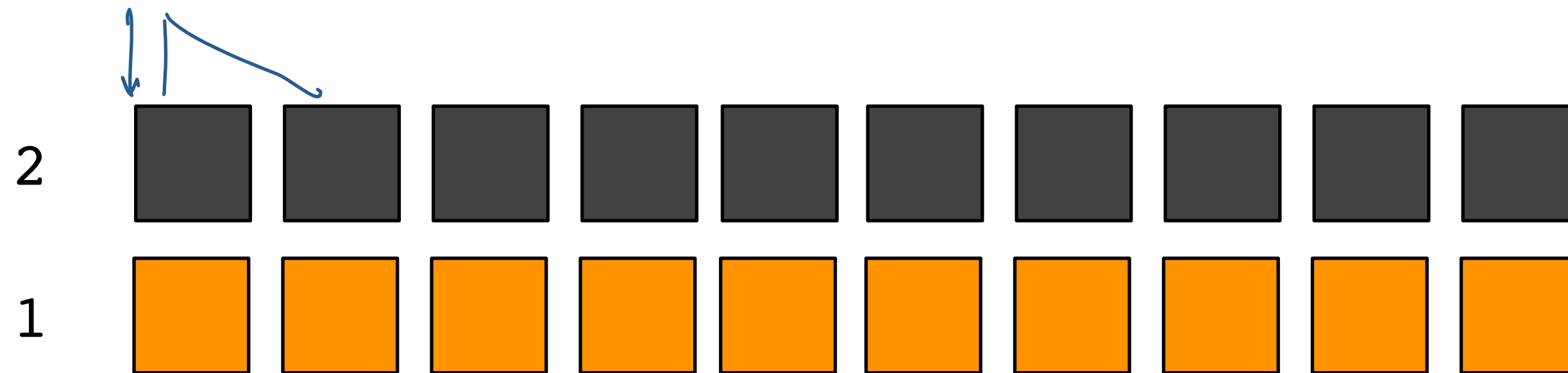
start at bottom of picture. initialize $S_1(i) = e(1, i)$



ALGORITHM

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

for $i=2, n$ 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

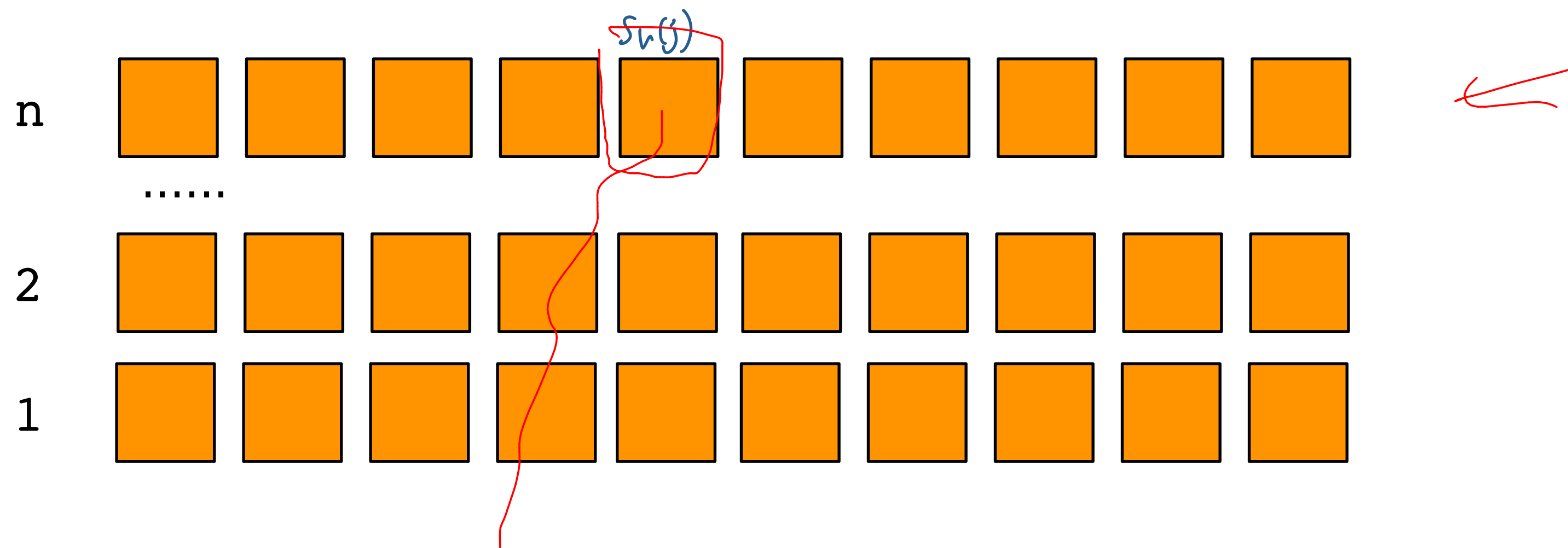
start at bottom of picture. initialize $S_1(i) = e(1, i)$

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

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

anonymous argument

identify the min among $S_n([1..m])$



ALGORITHM

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

for $i=2, \dots, n$ use formula to compute $S_{i+1}(\cdot)$
for $j=1, \dots, m$ $S_i(j) = e(i, j) + \min \begin{cases} S_{i-1}(j-1) \\ S_{i-1}(j) \\ S_{i-1}(j+1) \end{cases}$

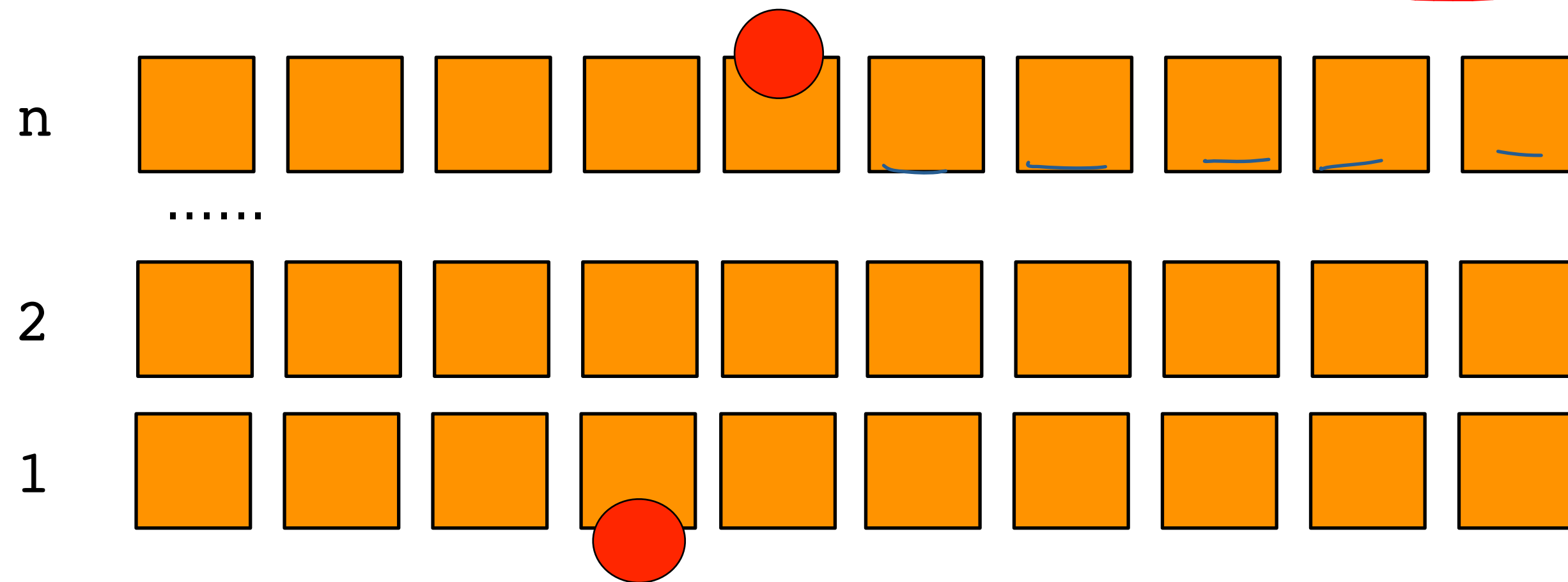
pick best among top row, backtrack.

Running time??

$\Theta(n \cdot m)$

$\Theta(m)$

$\Theta(n \cdot m)$



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 $S_{i+1}(\cdot)$

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

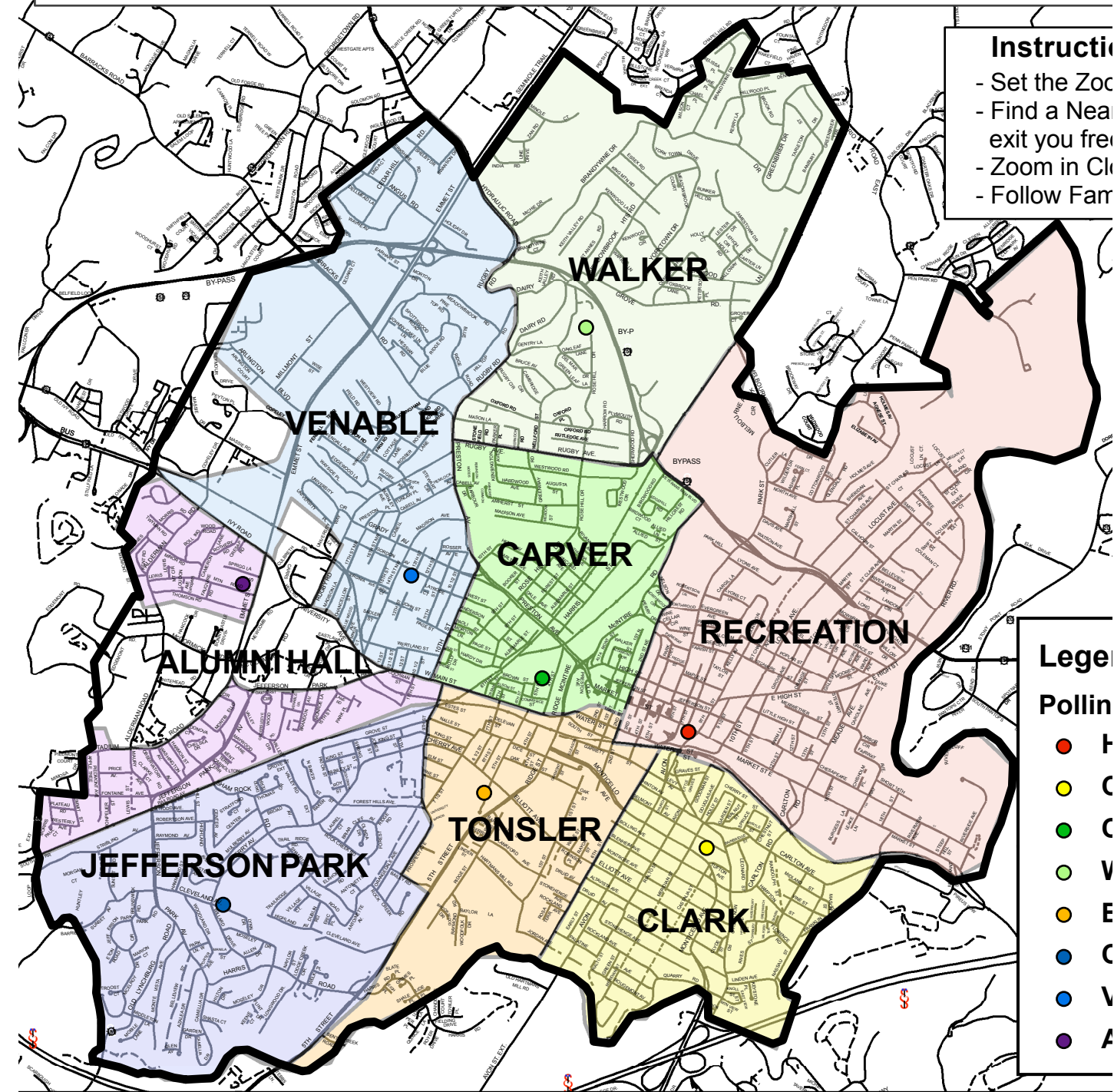
pick best among top row, backtrack.

Gerrymander

Congressional District 5



Map of Charlottesville Precincts and

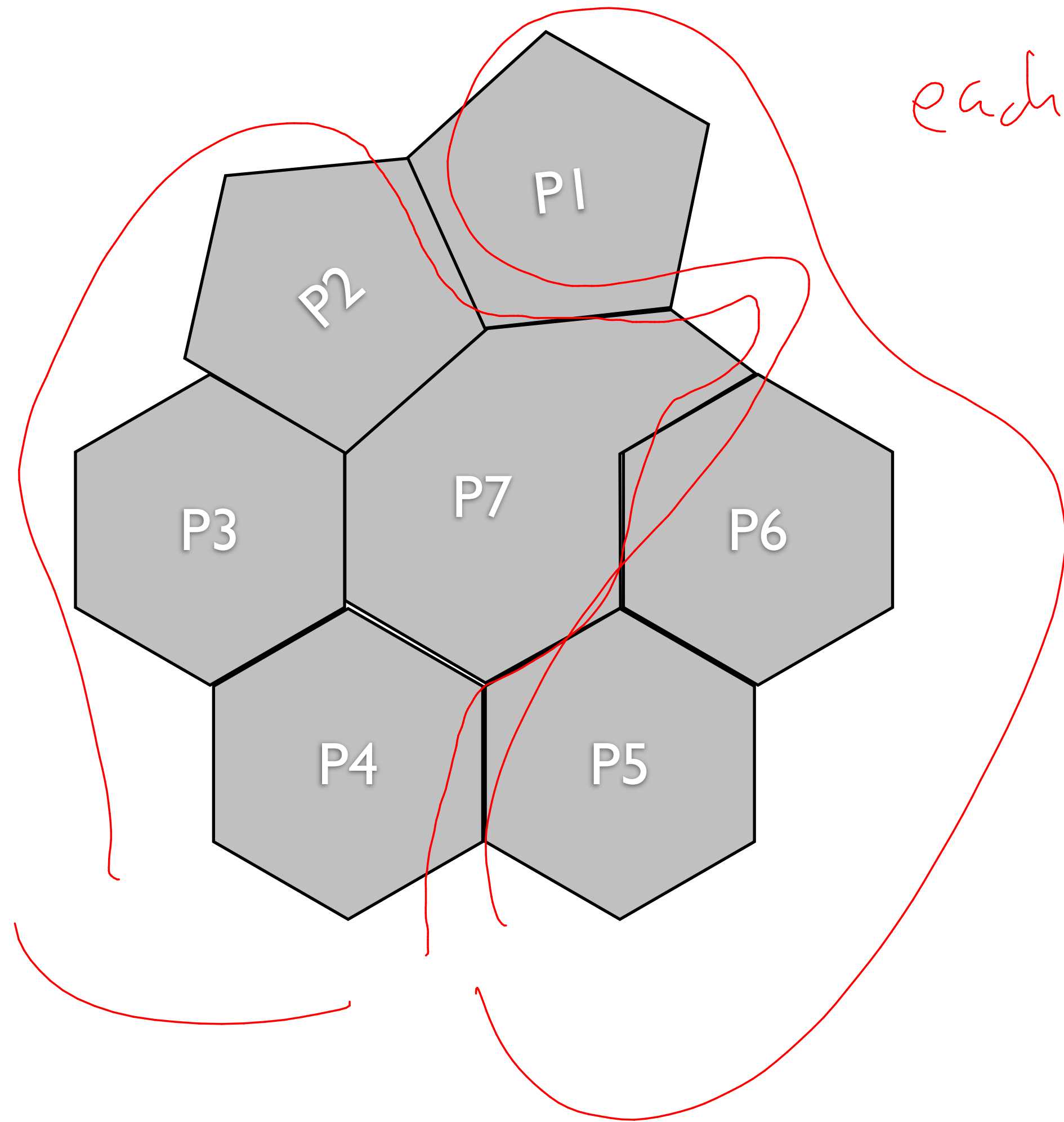


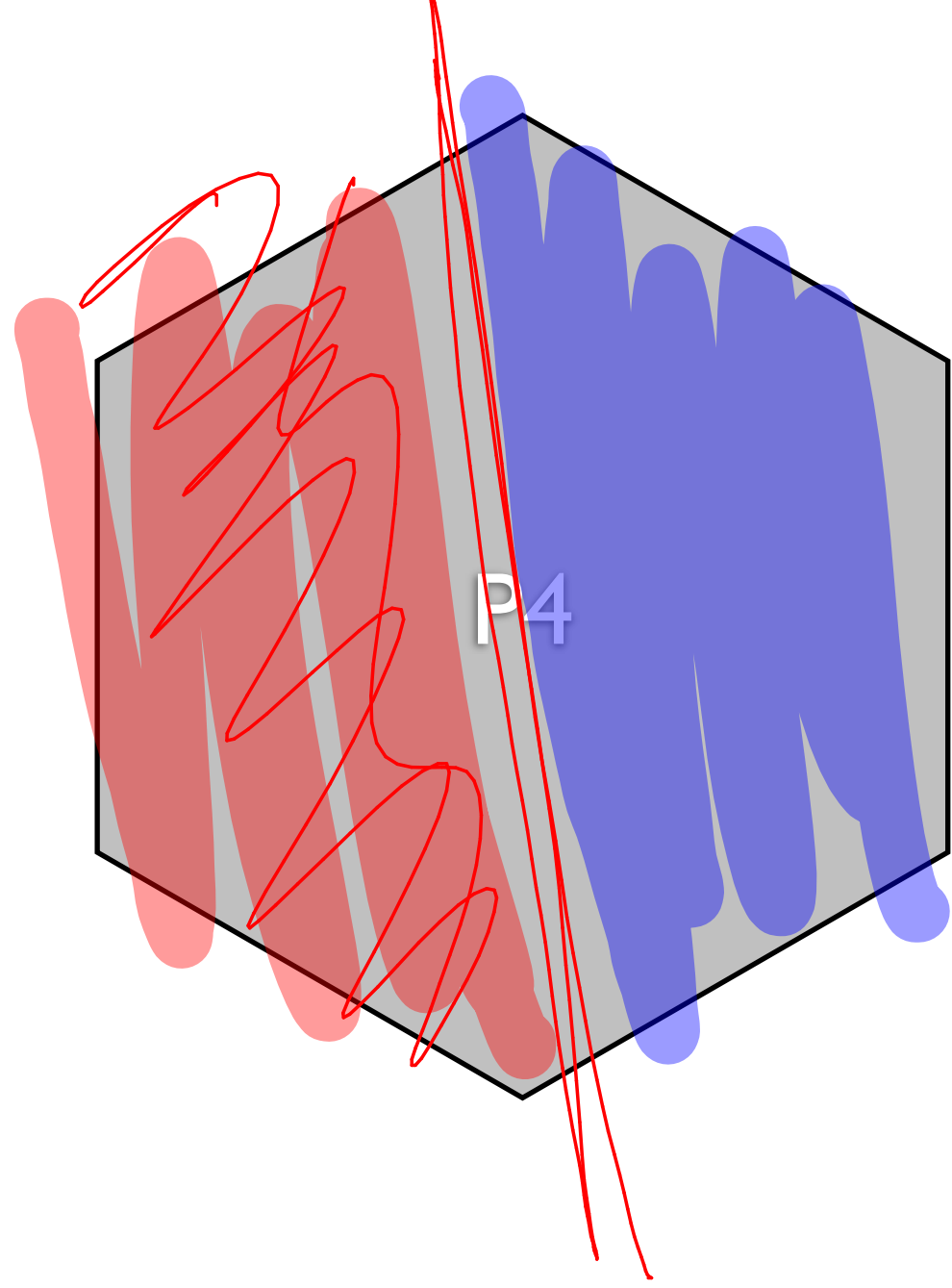
each precinct has M
people in it.

Consider a small state
that has only 2
districts

D_1

D_2

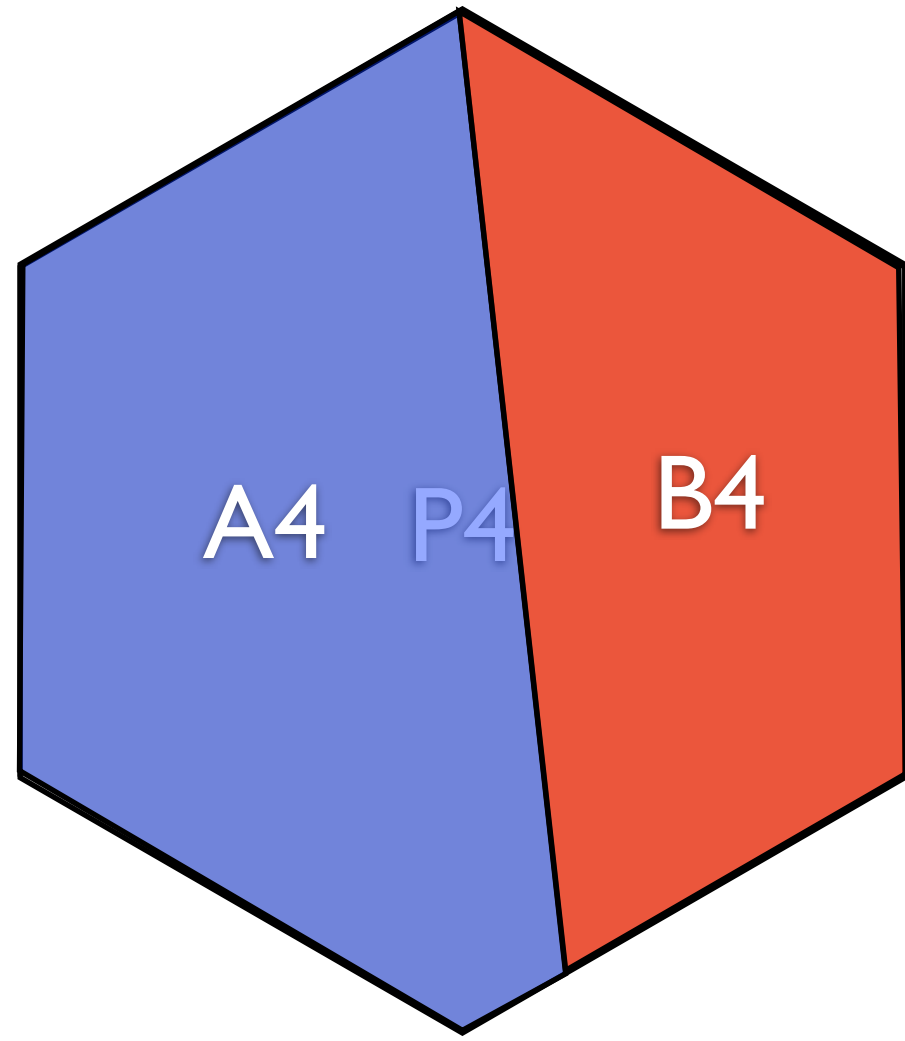




Some fraction of precinct y
that votes for party A.

$A_y \rightarrow \frac{\text{fraction for A}}{\text{\# of votes}}$

$$B_y = \underline{M - A_y}$$



GERRYMANDER PROBLEM

given: M, A_1, A_2, \dots, A_n ← n is even

output: D_1, D_2 2 districts

① $|D_1| = |D_2|$ i.e. same # of precincts

② $A(D_1) > \frac{n \cdot A}{4}$

$A(D_2) > \frac{n \cdot A}{4}$

i.e. A has a majority
in both
districts

GERRYMANDER PROBLEM

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

output: D_1, D_2

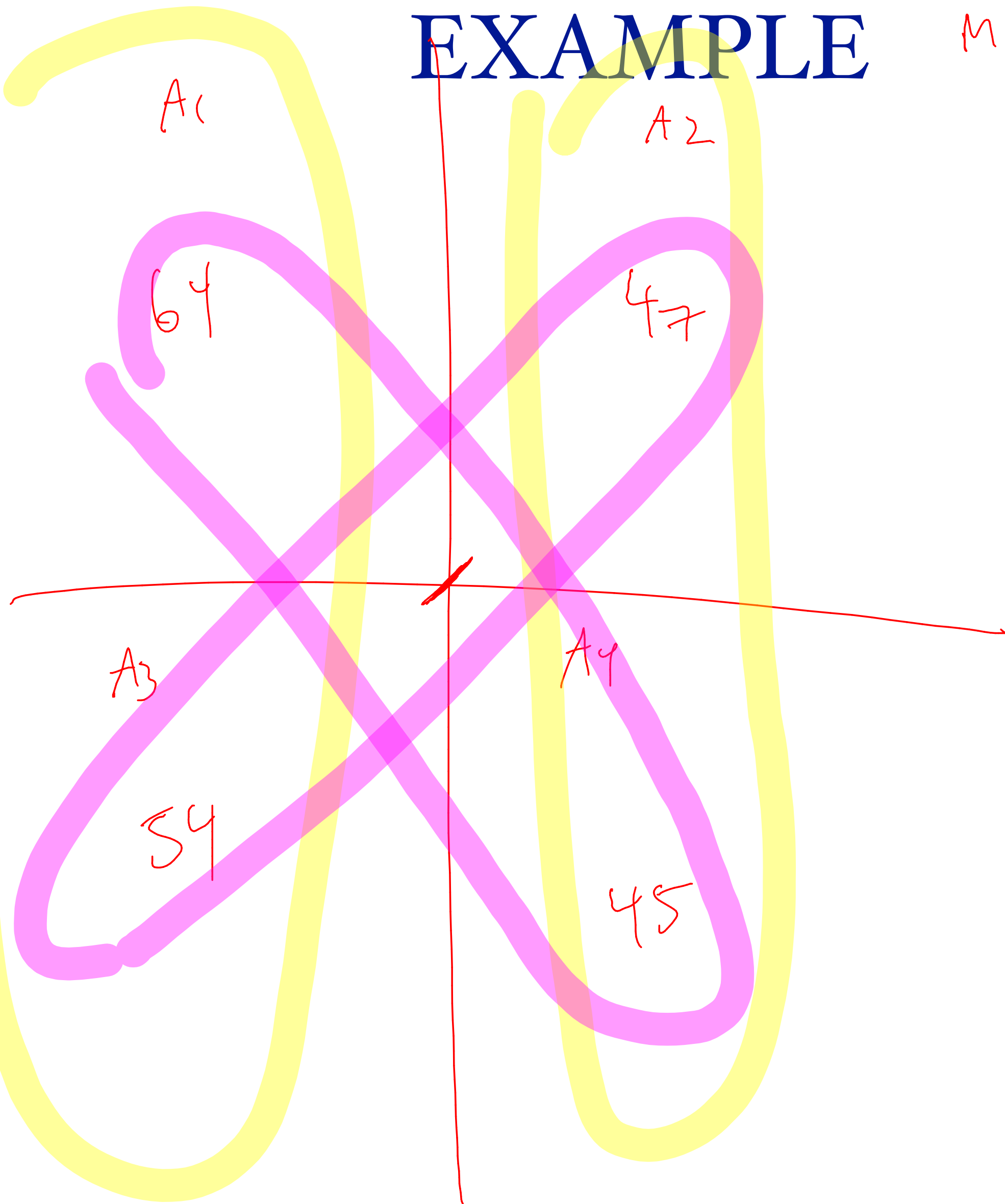
such that $|D_1| = |D_2|$

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

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

or “failure” if no such solution is possible

EXAMPLE



$$M = 100$$

$A_1, A_3 \rightarrow 119$ votes, majority in D ,

$A_2, A_4 \rightarrow 92$ votes, minority !!

$$A_1, A_4 = 109$$

$$A_2, A_3 = 101$$

$$S_{4,2,101,109} = \text{FALSE}$$

BUT $S_{4,2,101,109} = \text{True}$

THE TECHNIQUE

1d

2d

4d

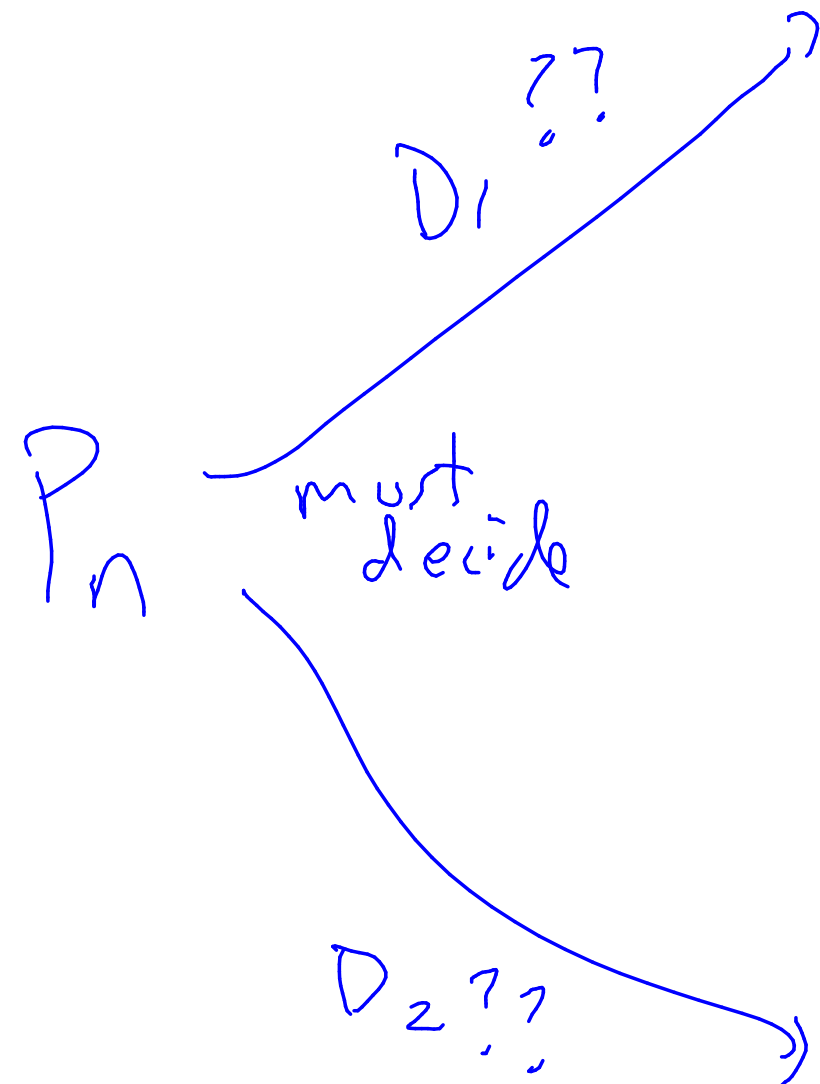
GERRYMANDER

imagine very last precinct and how it is assigned:

State of the solution

D_1 : k precincts
 x votes

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



state: $(k+1, x+A_n)$ $(n-k-1, y)$

state: (k, x) $(n-k, y+A_n)$

GERRYMANDER

$S_{j,k,x,y}$ = true or false:

true if \exists an assignment of the first
 j precincts such that

$$|D_1| = k \quad \text{and}$$

$$A(D_1) = x \quad \text{and}$$

$$A(D_2) = y$$

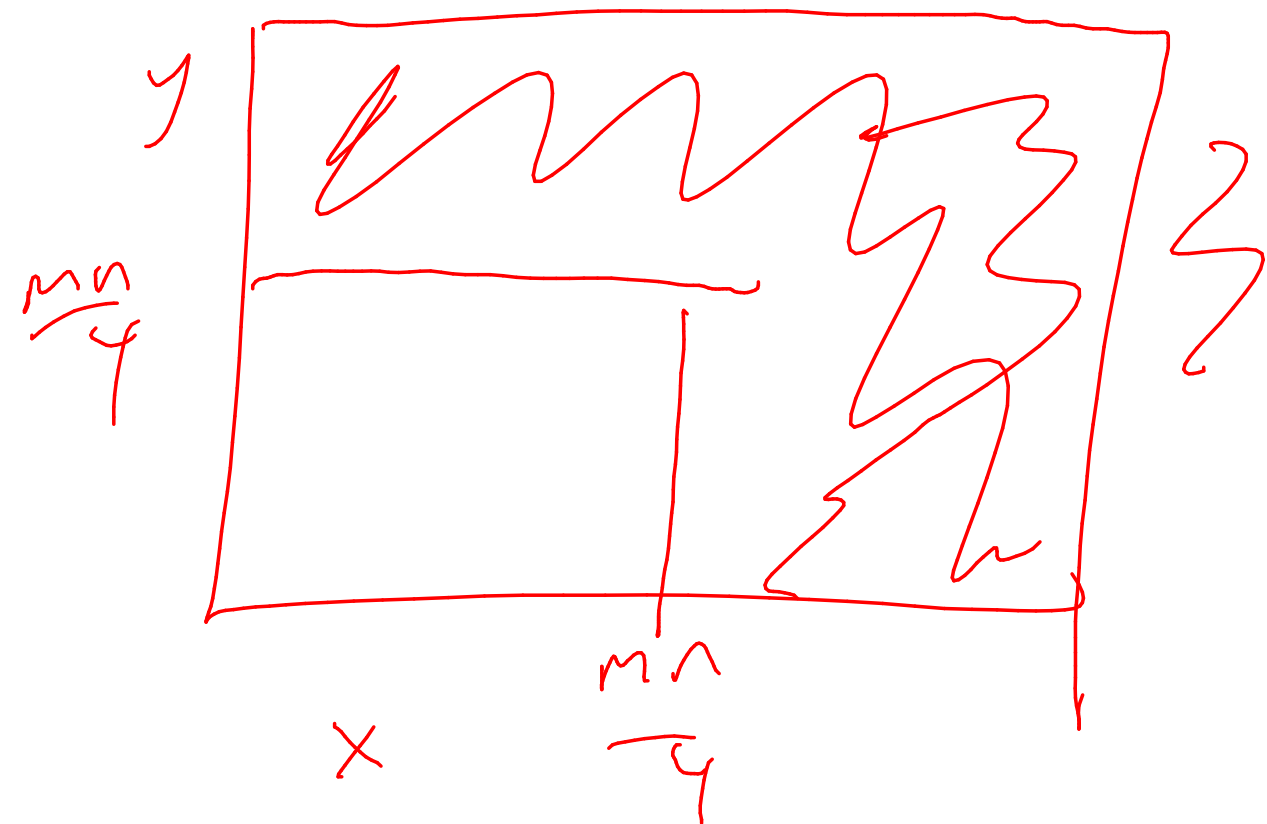
what if

$$S_{n, n/2, \frac{mn}{4}+1, \frac{mn}{4}} = ?? \text{ true } ??$$

if there any $S_{n, n/2, x, y}$ that is true when

$$x > \frac{mn}{4} \quad y > \frac{mn}{4}$$

$S_{n, n/2, \dots}$



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

$$S_{j,k,x,y} = S_{j-1,k-1,x-A_n,y} \quad \text{OR} \quad S_{j-1,k,x,y-A_n}$$

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

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[o,o,o,o]

for j=1,...,n

 for k=1,...,n/2

 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/4]

Scheduling

	start	end
sy333	2	3.25
en162	1	4
ma123	3	4
cs4102	3.5	4.75
cs4402	4	5.25
cs6051	4.5	6
sy333	5	6.5
cs1011	7	8