

More Recursion

Lecture 11

Sorting

Quicksort:

QUICKSORT($A[1..n]$):

if ($n > 1$)

Choose a pivot element $A[p]$

$r \leftarrow \text{PARTITION}(A, p)$

QUICKSORT($A[1..r-1]$)

QUICKSORT($A[r+1..n]$)



Running time

- How to choose pivot?
- first/last/middle/median of 3?
- In all cases $T(n) \leq T(n-2) + T(1) + O(n)$





Median of 3

A	L	G	O	R	I	T	H	M	S
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A

R

S

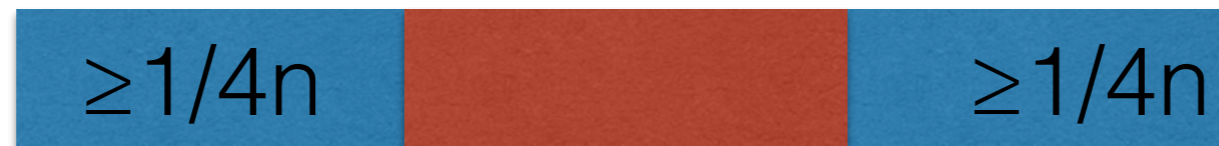
take median of first, last middle

Running time of Quicksort

- $O(n^2)$ time!
 - $T(n) = T(n-2) + T(1) + O(n)$
 $= O(n^2)$
- I want
 - Pick an element “near” the middle in $O(n)$ time



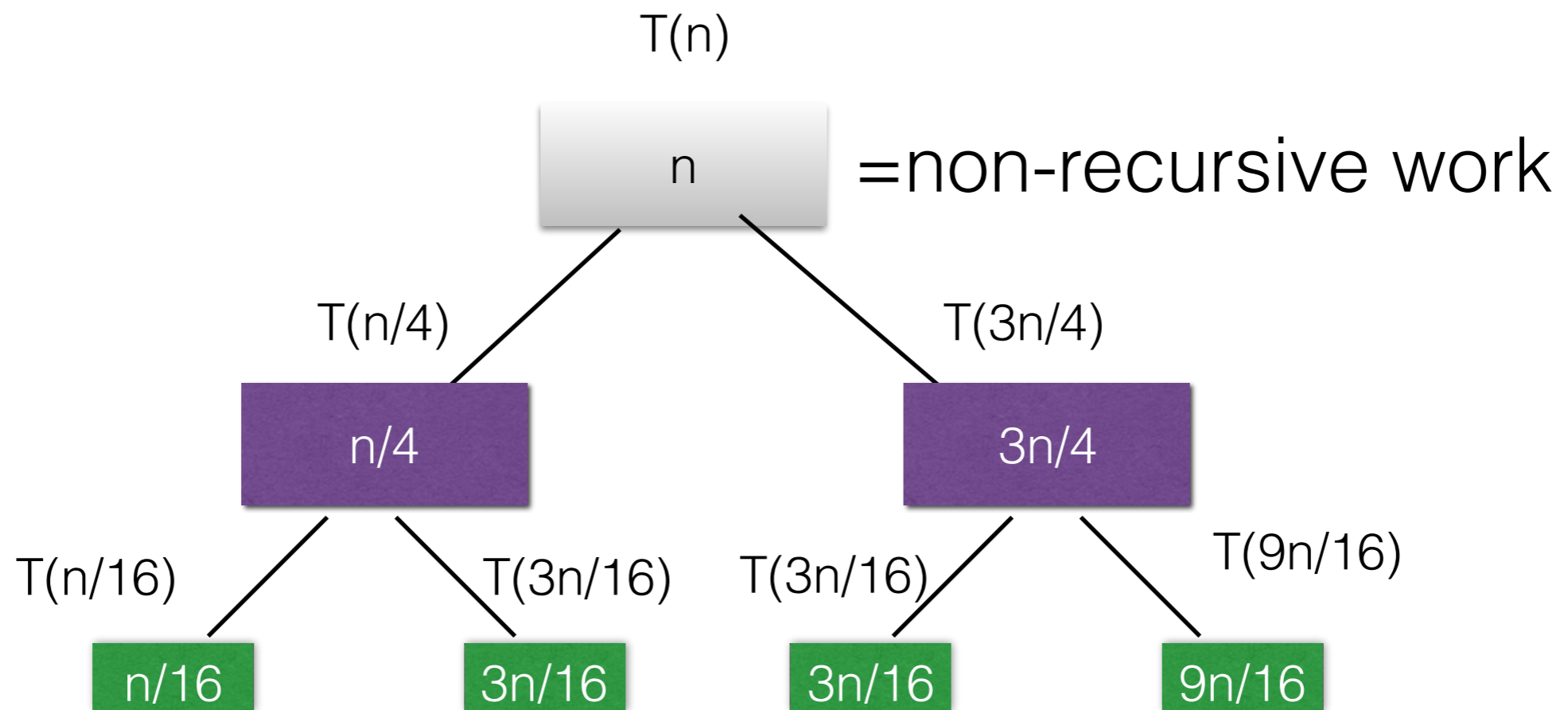
Running time of Quicksort



- Then the array partitions in smaller pieces.
- $T(n) = T(n/4) + T(3n/4) + O(n)$
- Solve with recursion trees



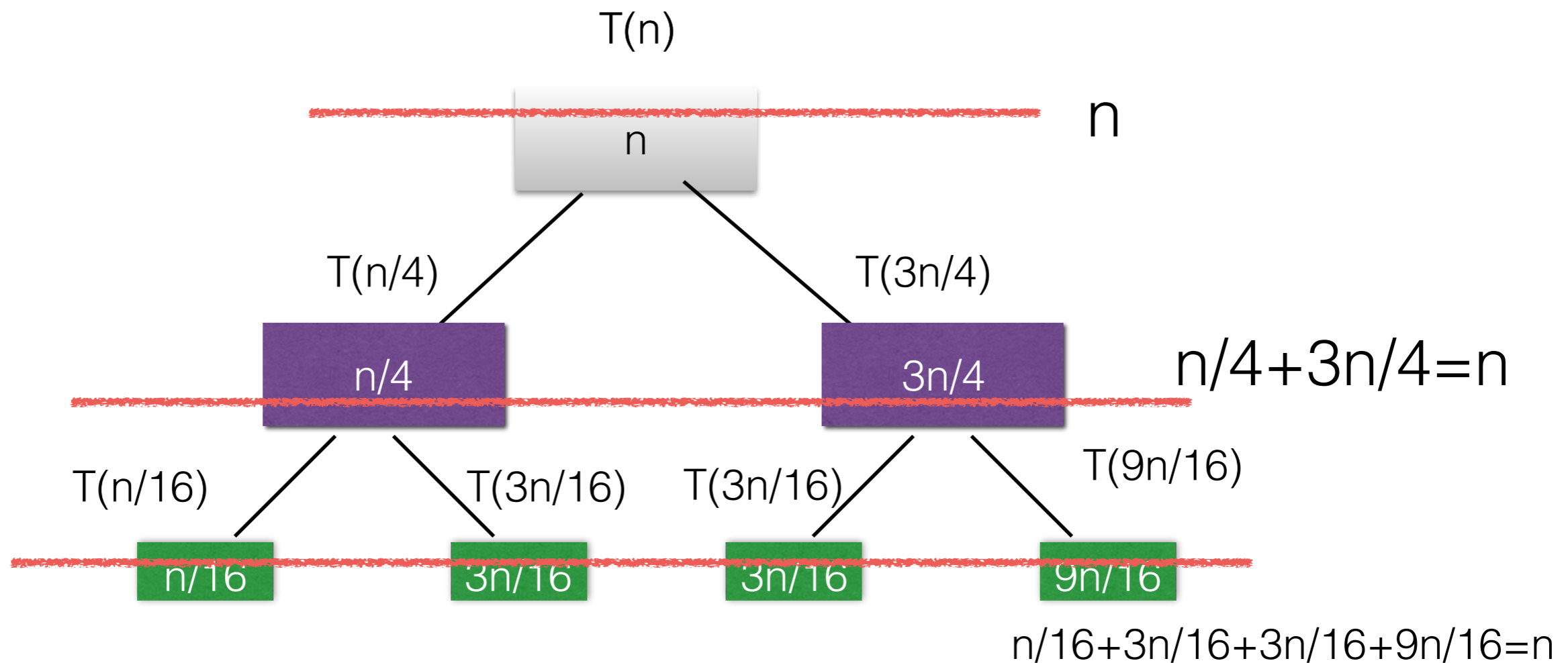
Running time of Quicksort



- Leaves on the left are shorter than leaves on the right!
- How do I get a reasonable bound?

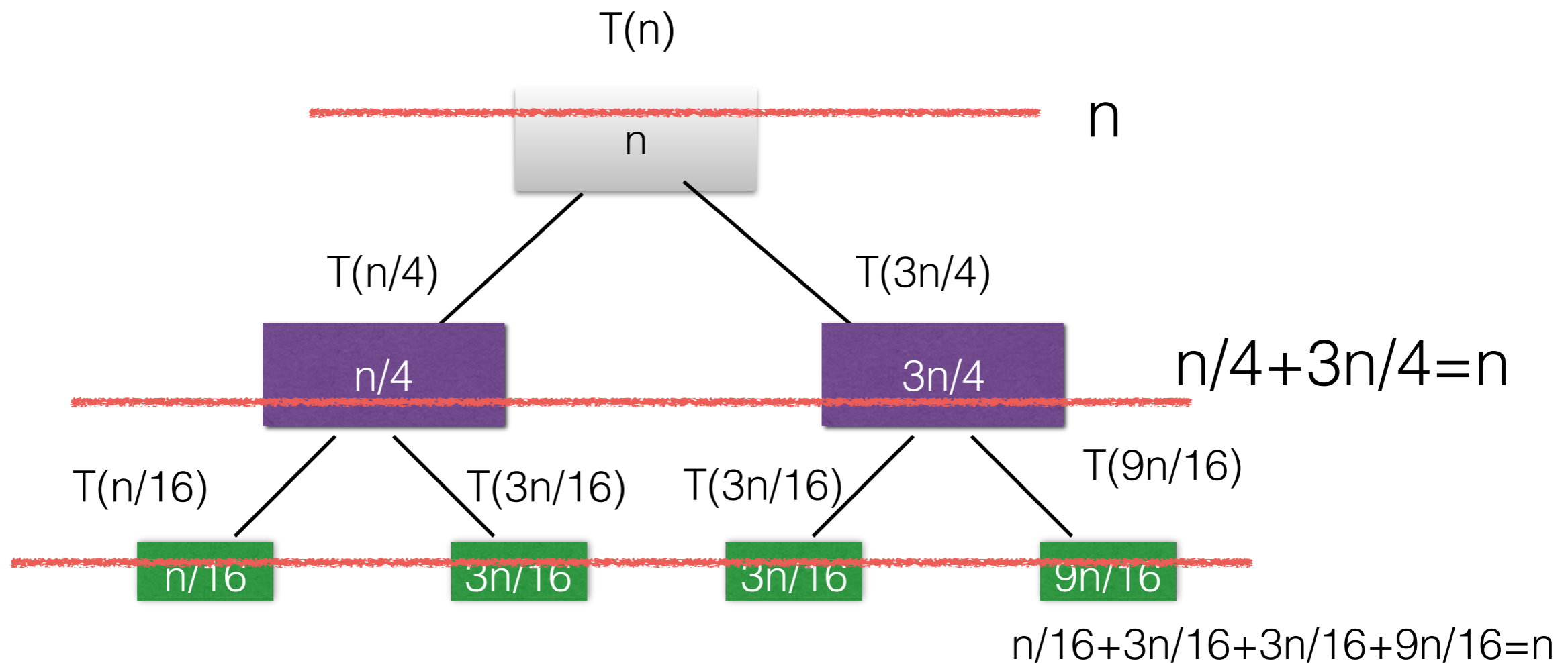


Running time of Quicksort



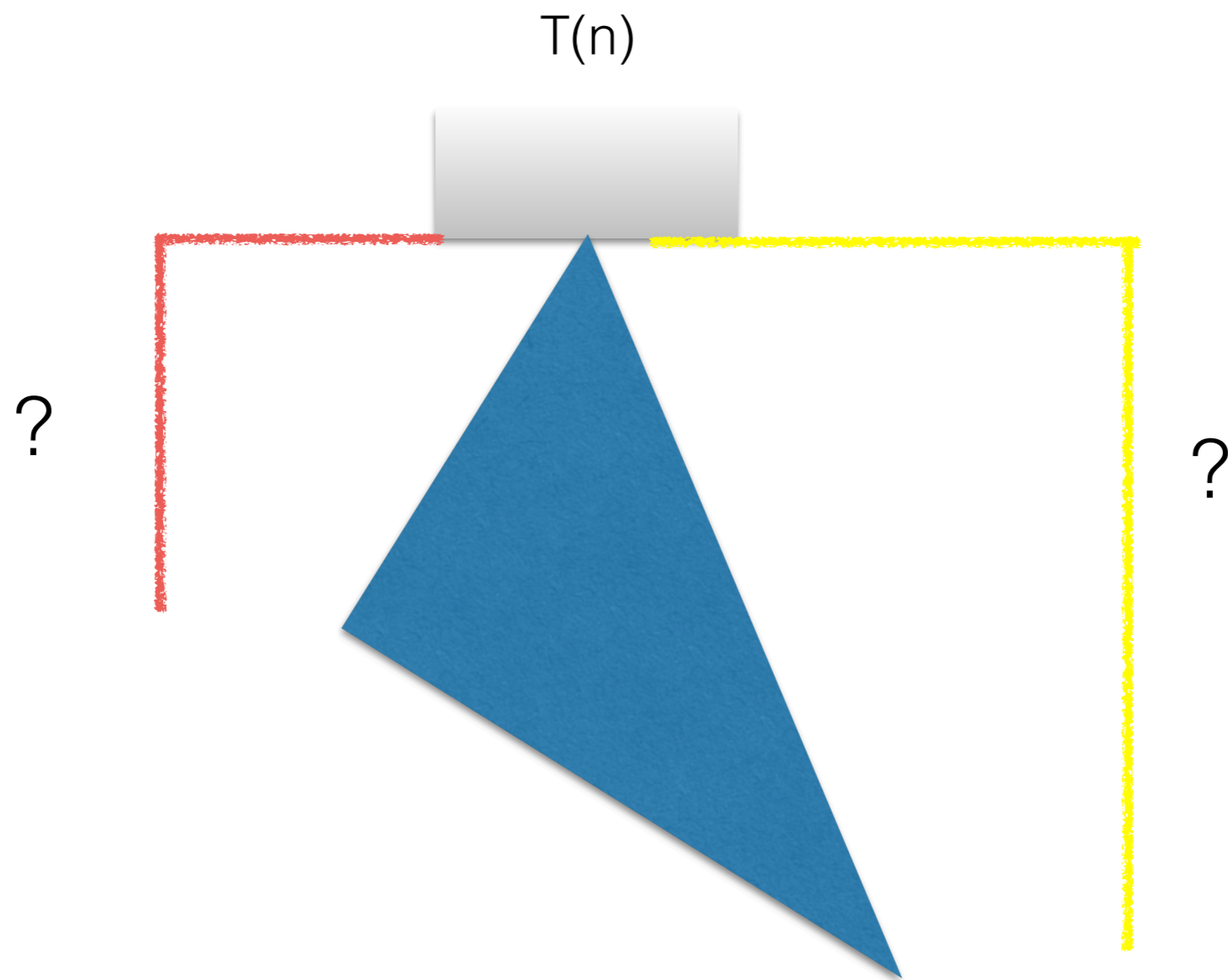
- $T(n) = T(n/4) + T(3n/4) + O(n)$
- Solve the recurrence by summing up work at each level

Running time of Quicksort

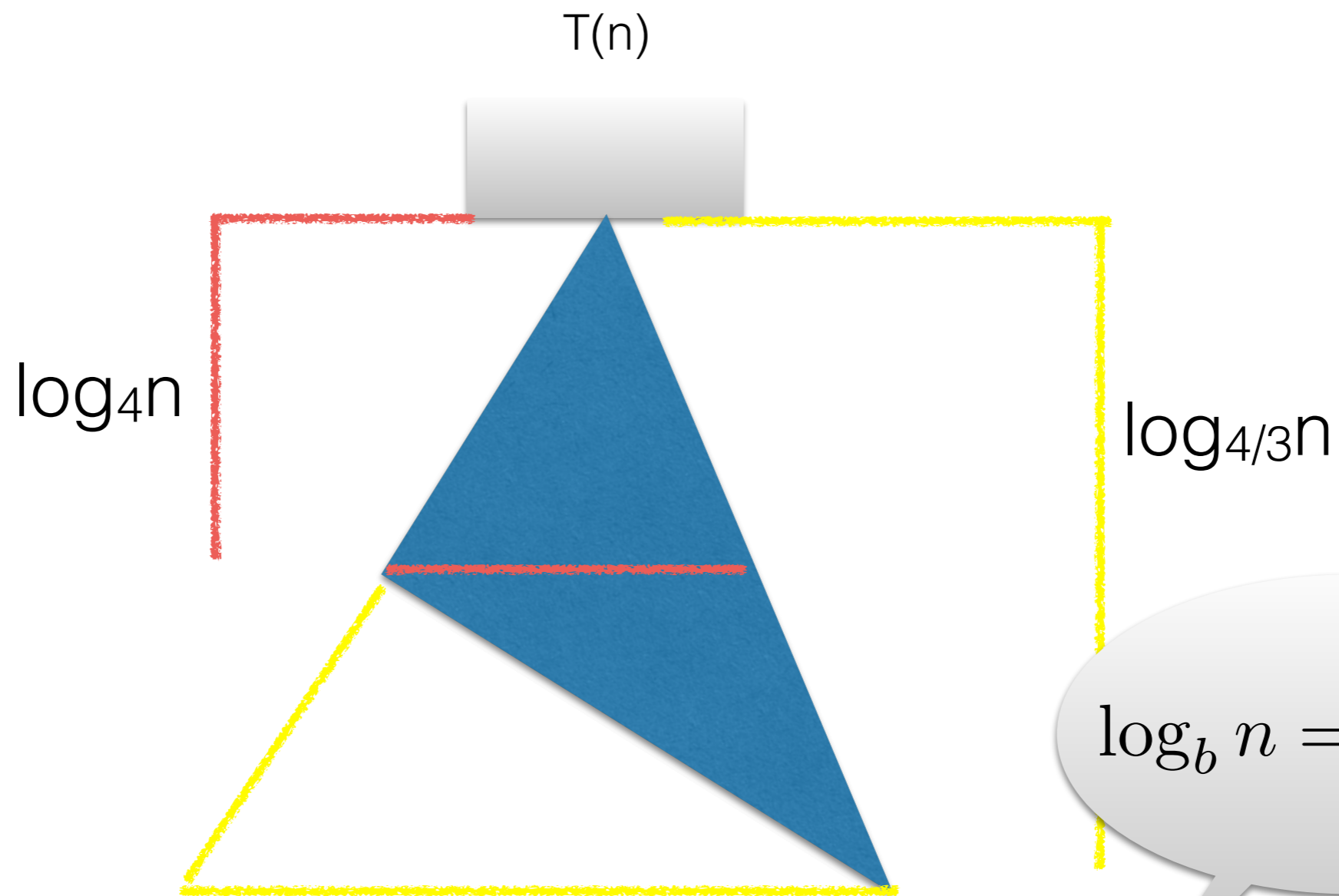


- $T(n) = T(n/4) + T(3n/4) + O(n)$
- What is the depth of shallow and deepest side of tree?

Running time of Quicksort



Running time of Quicksort



$$n \log_4 n \leq T(n) \leq n \log_{4/3} n$$

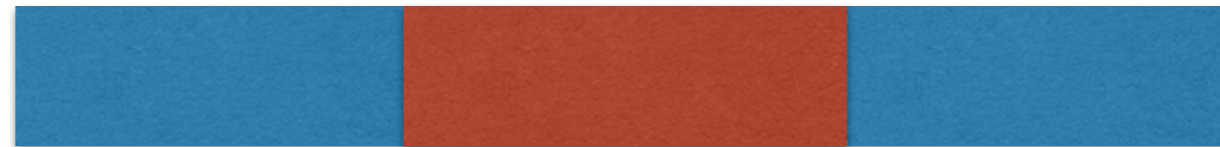
Running time of Quicksort

- I want ~~near~~ AT
 - Pick an element “near” the middle in $O(n)$ time
 - Median Selection : given $A[1\dots n]$ find $\lfloor n/2 \rfloor$ smallest element
 - Doesn't matter exactly which median, if n is even or odd etc



Running time of Quicksort

- I want

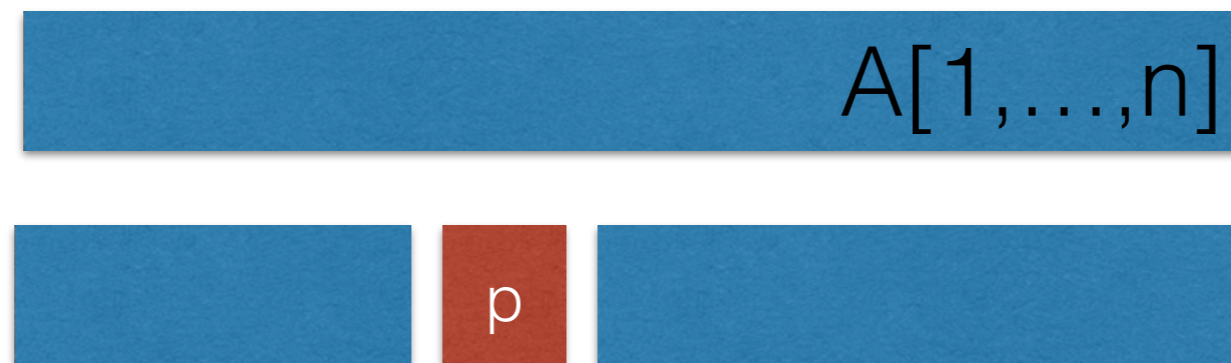


- Pick an element at the middle in $O(n)$ time
- Median Selection : given $A[1\dots n]$ find $\lfloor n/2 \rfloor$ smallest element
- Base case: if $n < 10$ brute force
- Or $n < 1000000000000000$
- Inputs less than a googlebyte either constant time or undecidable.



Median Selection

- Median Selection or “One Arm Quicksort”
- Pick a pivot and partition

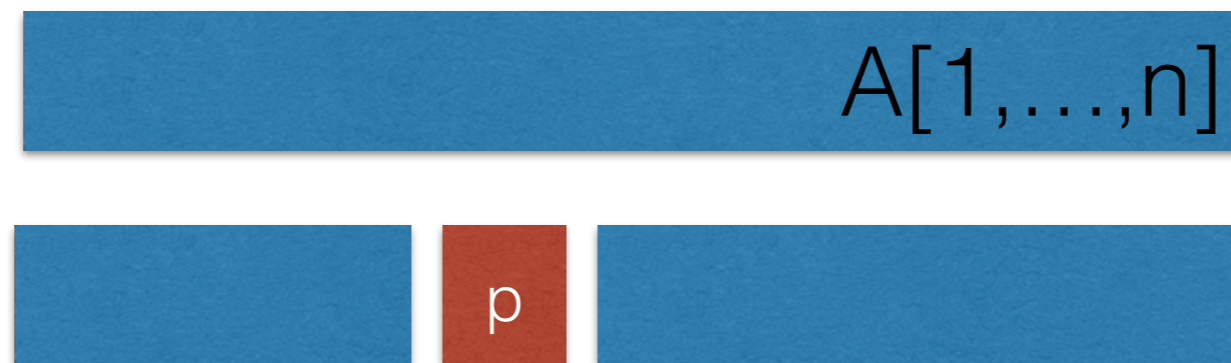


- If pivot index = $n/2$, done
- If pivot index $< n/2$ (left side of the array), then “recurse” on $A[p+1, \dots, n]$
- If pivot index $> n/2$ (right side of the array), then “recurse” on $A[1, \dots, p-1]$



Median Selection

- Median Selection or “One Arm Quicksort”
- Pick a pivot and partition

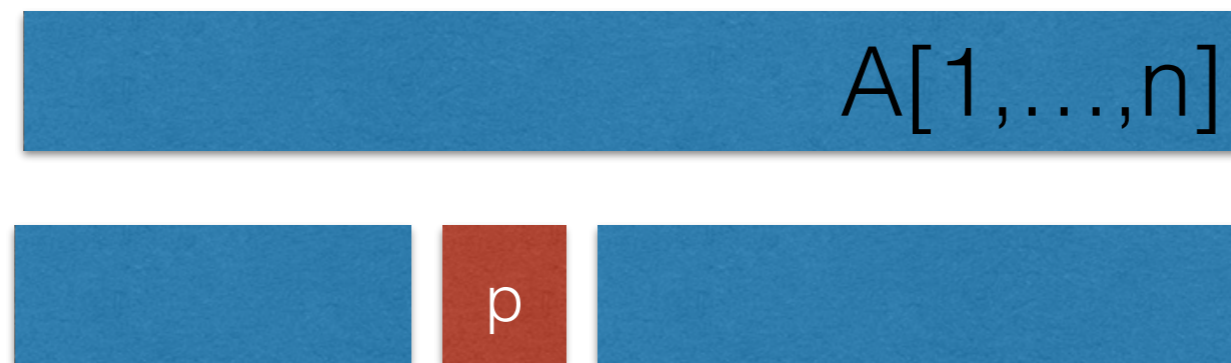


- If pivot index = $n/2$, done
- If pivot index $< n/2$ (left side of the array), then “recurse” on $A[p+1, \dots, n]$
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Median Selection

- Recursion would be wrong if I look for median!



- If pivot index = $n/2$, done
- If pivot index $< n/2$ (left side of the array), then “recurse” on $A[p+1, \dots, n]$
- If pivot index $> n/2$ (right side of the array), then “recurse” on $A[1, \dots, p-1]$



QuickSelect

- More General Problem:

QuickSelect($A[1, \dots, n], k$)

p

k

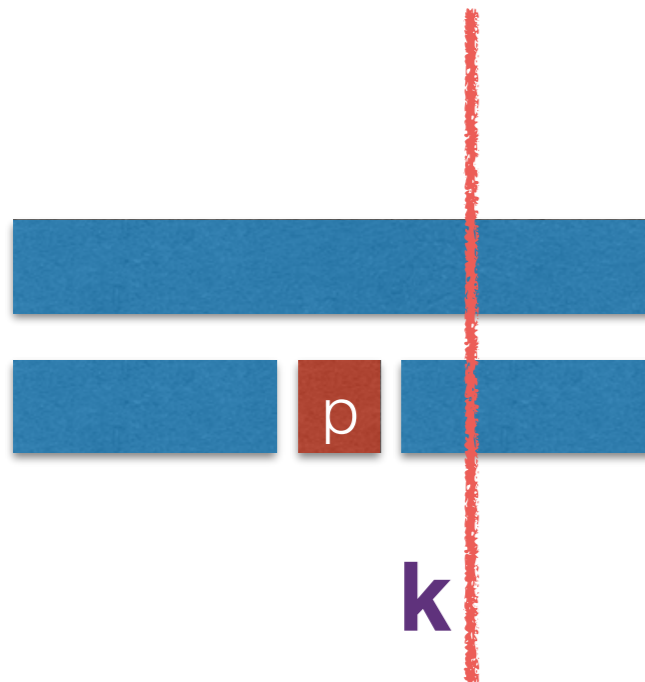
input = unsorted array $A[1, \dots, n]$, k

output = k th smallest element in A

- If pivot index = $n/2$, done
- If pivot index $< n/2$ (left side of the array), then **recurse** on $(A[p+1, \dots, n], k-p)$
- If pivot index $> n/2$ (right side of the array), then **recurse** on $(A[1, \dots, p-1], k)$



QuickSelect



QUICKSELECT($A[1..n], k$):

if $n = 1$

 return $A[1]$

else

Choose a pivot element $A[p]$

$r \leftarrow \text{PARTITION}(A[1..n], p)$

 if $k < r$

 return $\text{QUICKSELECT}(A[1..r-1], k)$

 else if $k > r$

 return $\text{QUICKSELECT}(A[r+1..n], k-r)$

 else

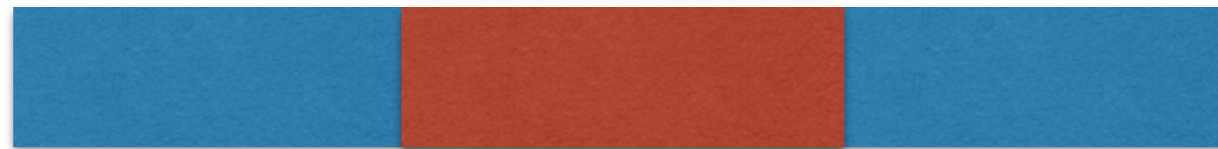
 return $A[r]$

How to choose pivot?
also recursive?

Same result as
Sort A
return $A(k)$



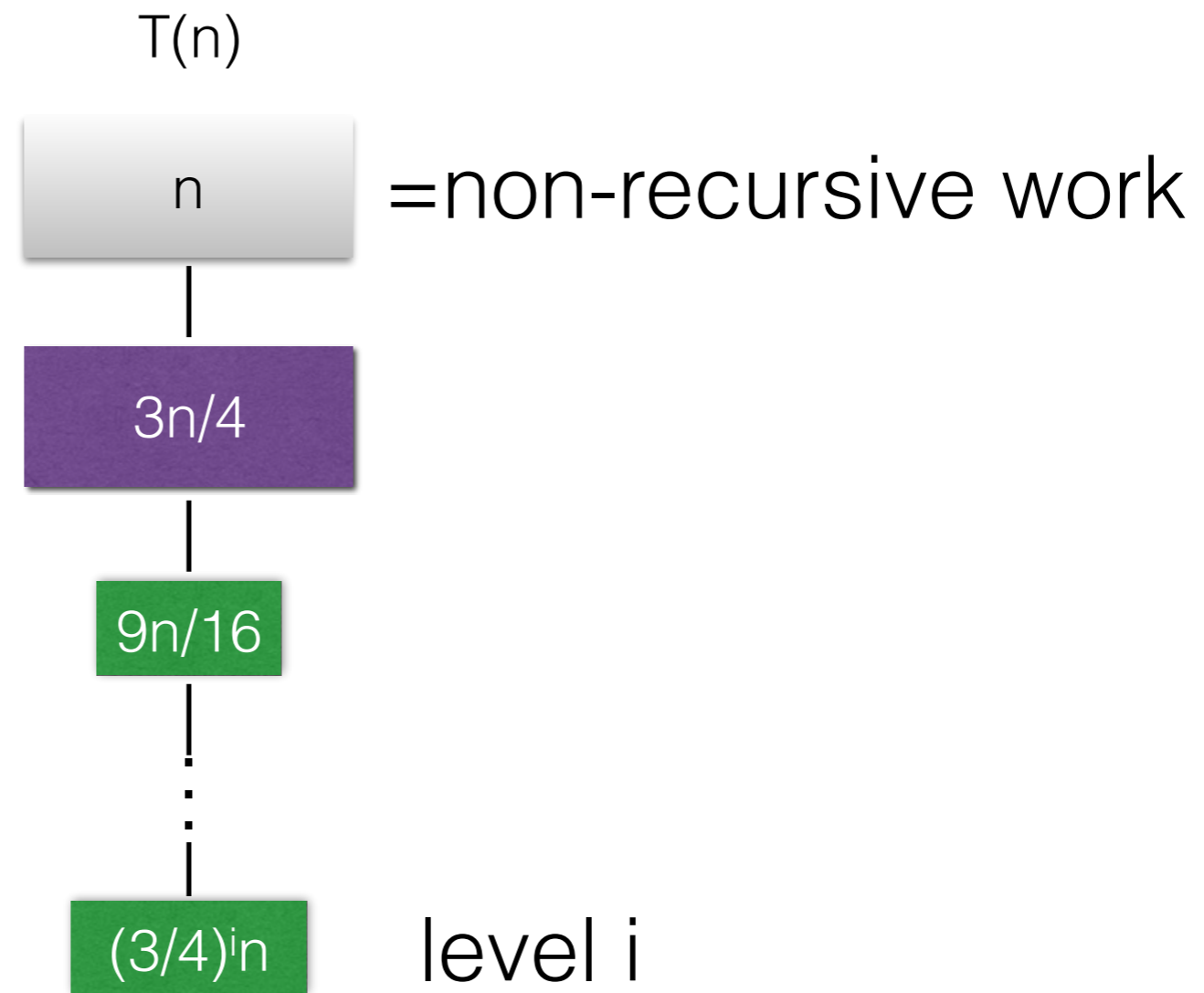
How to choose pivot?



- If I could choose something near the middle then:
- $T(n) \leq T(3n/4) + O(n)$
- Solve with recursion trees



Recursion Tree

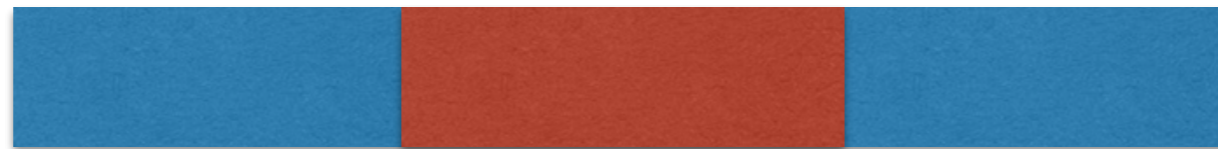


- Sum of all nodes: descending geometric series

$$n \sum \left(\frac{3}{4}\right)^i = n \frac{1}{1 - 3/4} = \frac{4}{3}n = O(n)$$



How to choose pivot?

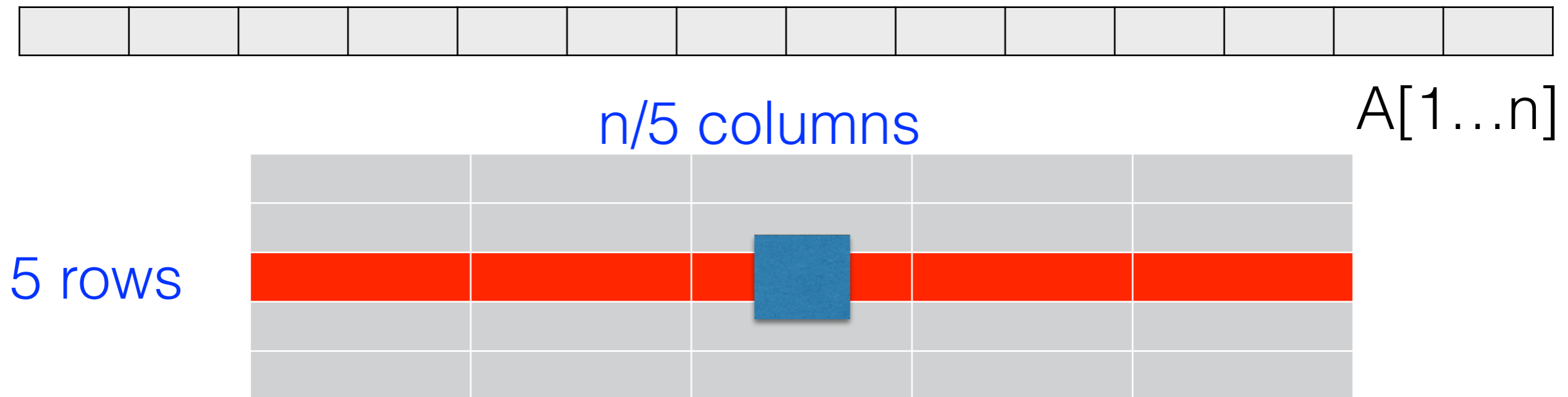


- If I could choose something near the middle then:
- $T(n) \leq T(3n/4) + O(n)$
- We don't have the magic to choose this pivot yet!



How to choose pivot?

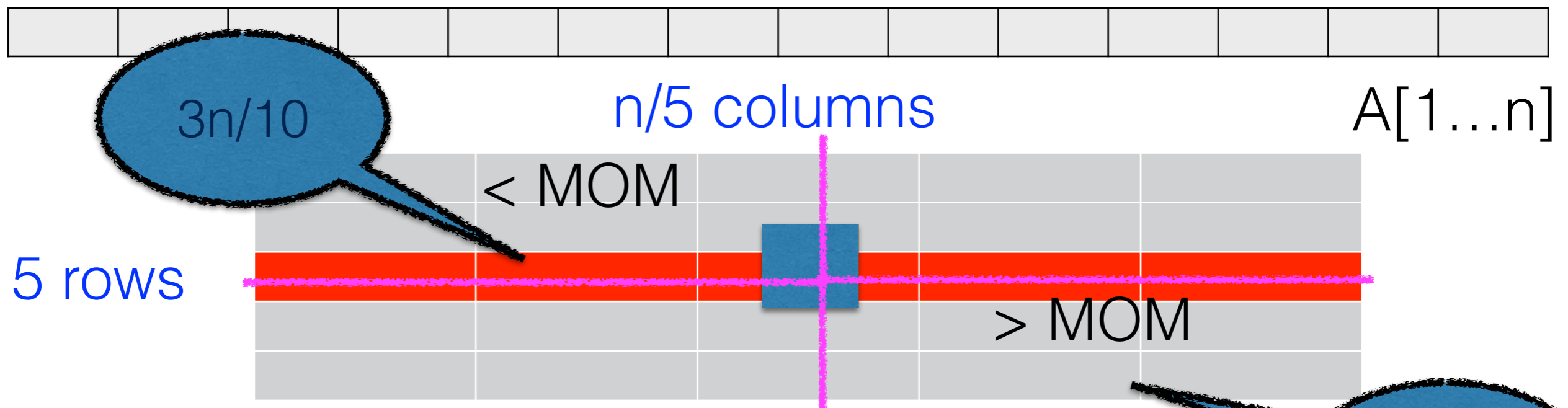
- Imagine I have a two dimensional array:



- Find median of each column (time?) $O(n)$ x constant
- Find median of each of those medians (MOM) $T(n/5)$



How to choose pivot?



- Find median of each column (time?) $3n/10$
- Find median of each of those medians (MOM) $T(n/5)$ time, recursion ferry!
- Use MOM as pivot, then one arm quicksort: $T(n) \leq T(7n/10) + O(n)$



MOMSelect

$3n/10$

< MOM

$3n/10$

> MOM

MOM5SELECT(A[1..n], k):

if $n \leq 25$

 use brute force

else

$m \leftarrow \lfloor n/5 \rfloor$

 for $i \leftarrow 1$ to m

$M[i] \leftarrow \text{MEDIANOFFIVE}(A[5i - 4..5i])$ *«Brute force!»*

$mom \leftarrow \text{MOMSELECT}(M[1..m], \lfloor m/2 \rfloor)$ *«Recursion!»*

$r \leftarrow \text{PARTITION}(A[1..n], mom)$

 if $k < r$

 return MOMSELECT(A[1..r - 1], k) *«Recursion!»*

 else if $k > r$

 return MOMSELECT(A[r + 1..n], k - r) *«Recursion!»*

 else

 return mom



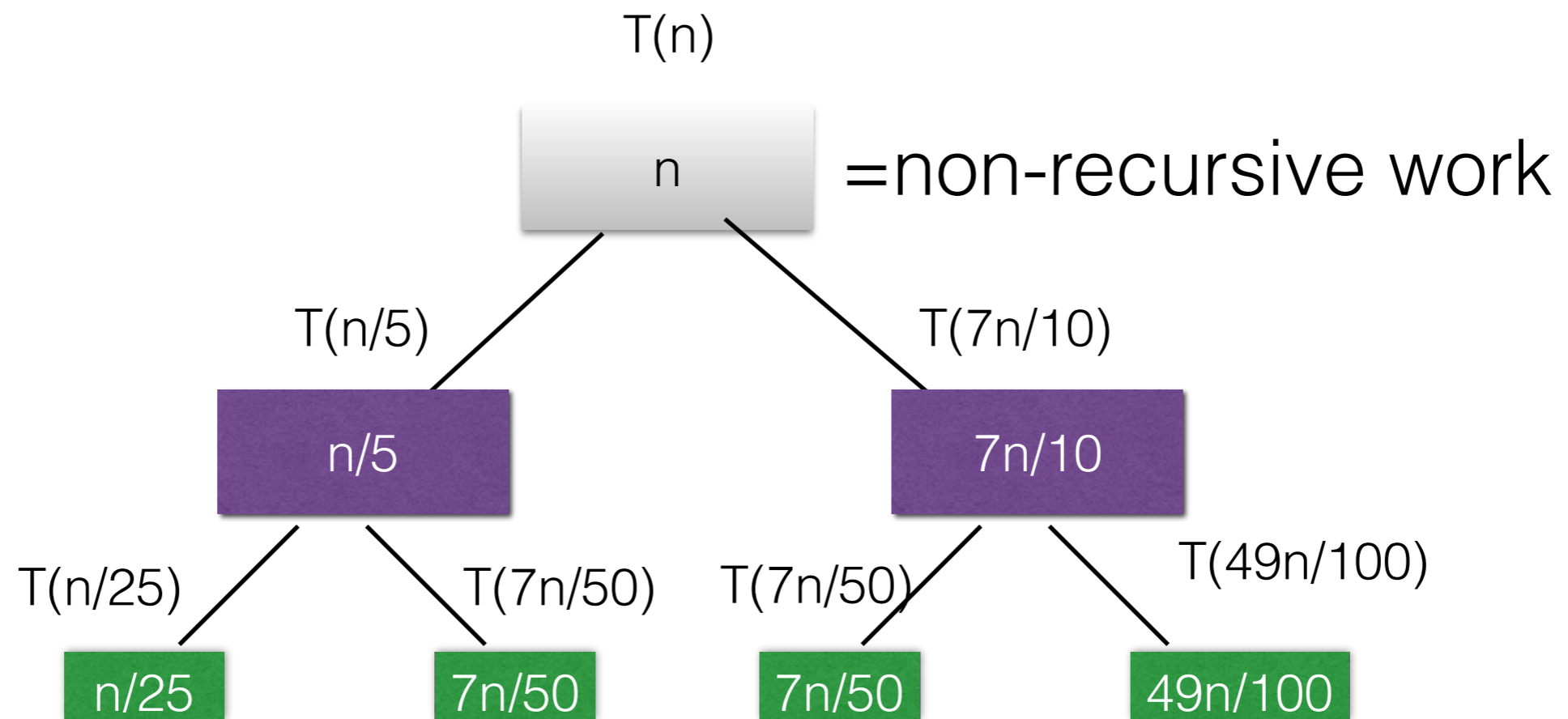
How to choose pivot?



- Subproblem I recurse on has at most 70 per cent of original array.
- Why the number 5?
- $T(n) = T(n/5) + T(7n/10) + O(n)$



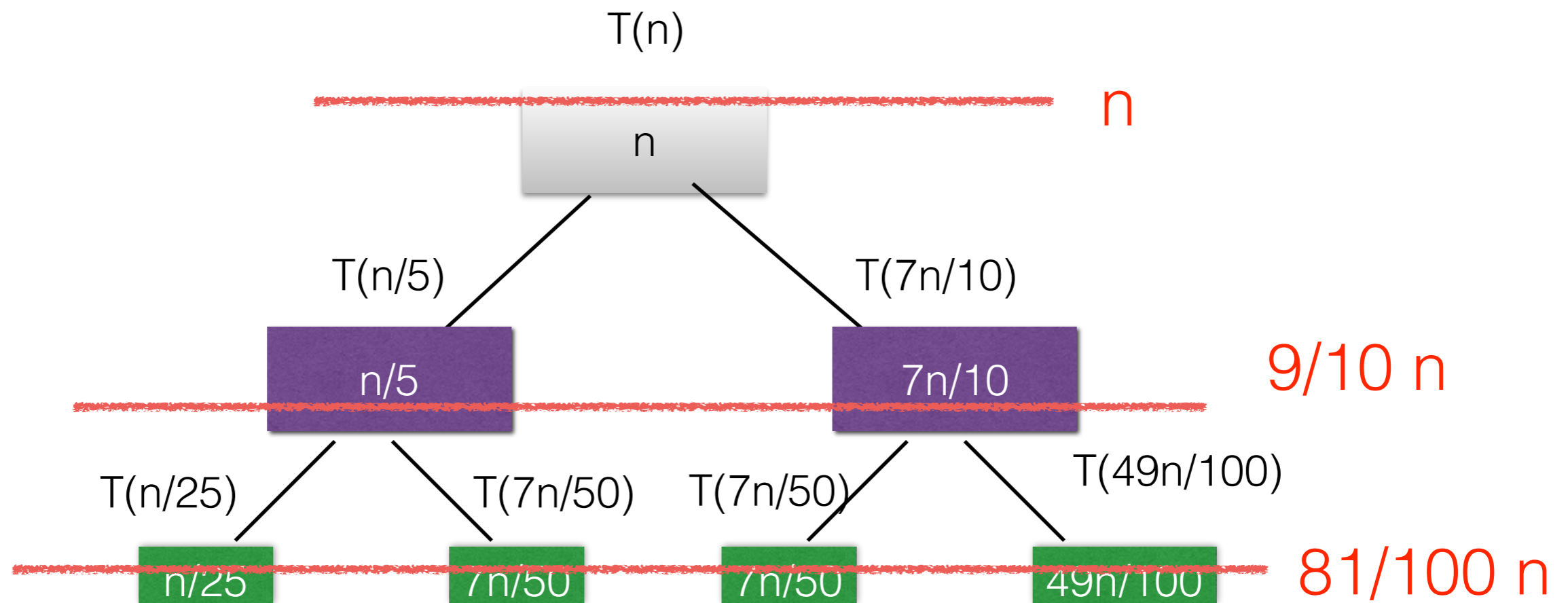
Running time of MOM



- $T(n) = T(n/5) + T(7n/10) + O(n)$



Running time of MOM



$$\text{level } i: (9/10)^i n$$

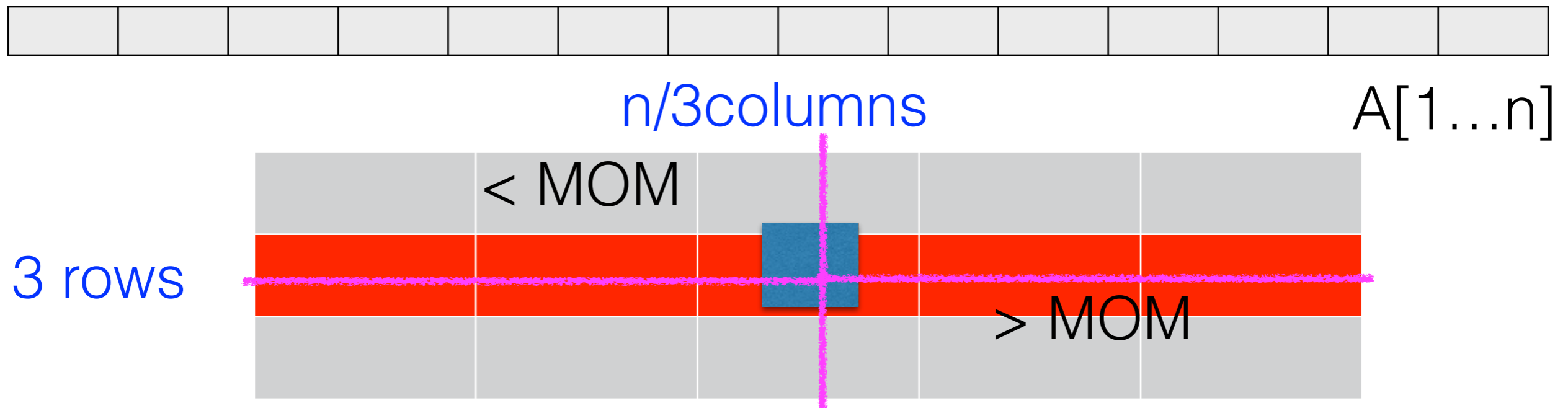
$$T(n) = T(n/5) + T(7n/10) + O(n)$$

Sum is geometric series, adds up to $O(n)$ but large constant!





Why 5?

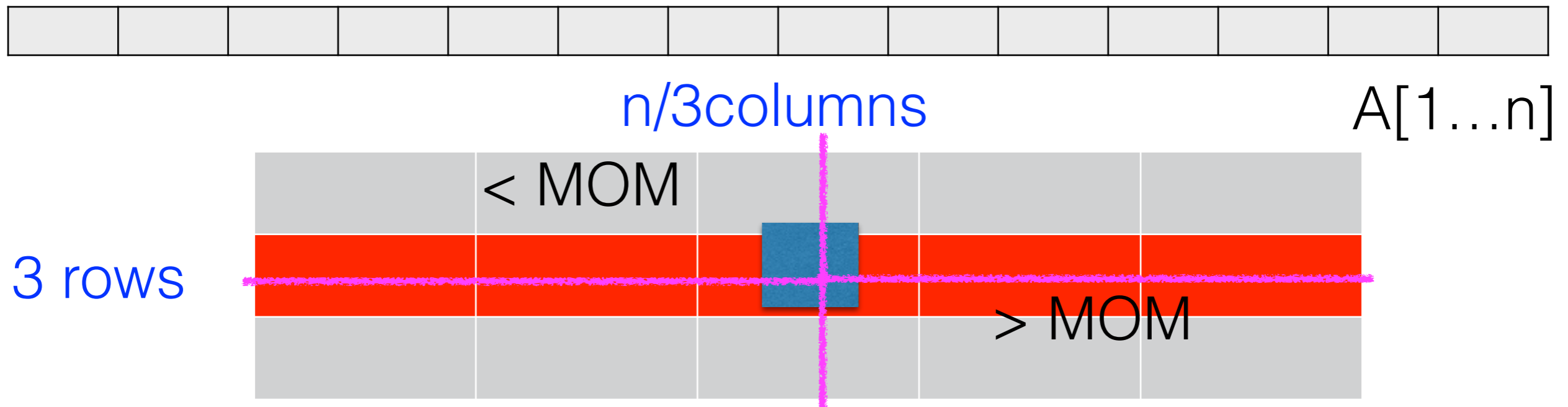


$$T(n) = T(n/3) + T(2n/3) + O(n)$$

what is the solution?



Why 5?



$$T(n) = T(n/3) + T(2n/3) + O(n)$$

$n \log n$, like sorting already!



Multiplication

- How to multiply two n digit numbers?

$$\begin{array}{r} 31415962 \\ \times 27182818 \\ \hline 251327696 \\ 31415962 \\ 251327696 \\ 62831924 \\ 251327696 \\ 31415962 \\ 219911734 \\ 62831924 \\ \hline 853974377340916 \end{array}$$

- two nested for loops
- runs in $O(n^2)$ time
- Is this the best you can do?



Multiplication

- How to multiply two n digit numbers?

$n/2$	$n/2$	$10^m a + b$
$n/2$	$n/2$	$10^m c + d$

$$(10^m a + b)(10^m c + d) = 10^{2m} ac + 10^m (bc + ad) + bd$$

reduce to multiply 4 $n/2$ digit numbers!

Multiplication

$10^m a + b$	$n/2$	$n/2$
$10^m c + d$	$n/2$	$n/2$

MULTIPLY(x, y, n):

if $n = 1$

return $x \cdot y$

else

$m \leftarrow \lceil n/2 \rceil$

$a \leftarrow \lfloor x/10^m \rfloor$; $b \leftarrow x \bmod 10^m$

$d \leftarrow \lfloor y/10^m \rfloor$; $c \leftarrow y \bmod 10^m$

$e \leftarrow \text{MULTIPLY}(a, c, m)$

$f \leftarrow \text{MULTIPLY}(b, d, m)$

$g \leftarrow \text{MULTIPLY}(b, c, m)$

$h \leftarrow \text{MULTIPLY}(a, d, m)$

return $10^{2m}e + 10^m(g + h) + f$

$$T(n) = 3T(n/2) + O(n) = O(n^2)$$

Didn't help much :(



Multiplication

$10^m a + b$	$n/2$	$n/2$
$10^m c + d$	$n/2$	$n/2$

$$(10^m a + b)(10^m c + d) = 10^{2m} ac + 10^m (bc + ad) + bd$$

$$ac + bd - (a - b)(c - d) = bc + ad$$



Multiplication

$10^m a + b$

$10^m c + d$

$n/2$	$n/2$
$n/2$	$n/2$

FASTMULTIPLY(x, y, n):

if $n = 1$

return $x \cdot y$

else

$m \leftarrow \lceil n/2 \rceil$

$a \leftarrow \lfloor x/10^m \rfloor$; $b \leftarrow x \bmod 10^m$

$d \leftarrow \lfloor y/10^m \rfloor$; $c \leftarrow y \bmod 10^m$

$e \leftarrow \text{FASTMULTIPLY}(a, c, m)$

$f \leftarrow \text{FASTMULTIPLY}(b, d, m)$

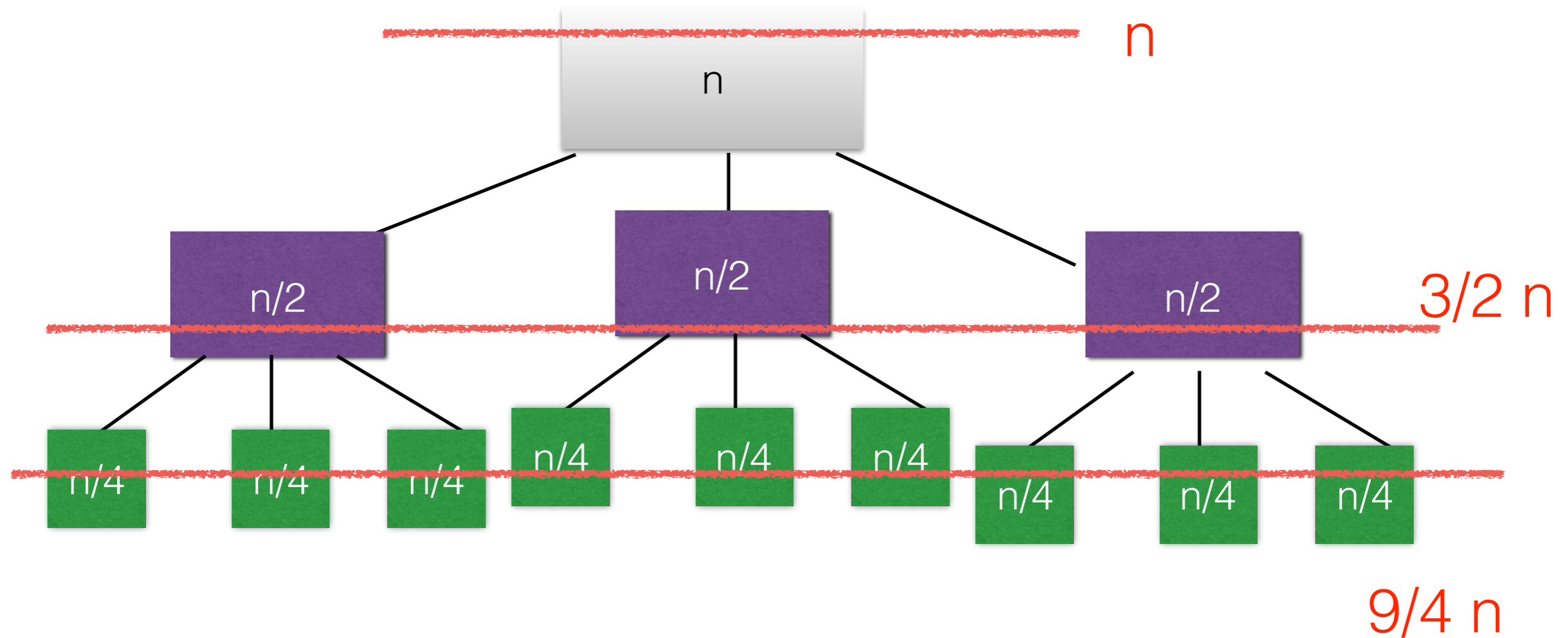
$g \leftarrow \text{FASTMULTIPLY}(a - b, c - d, m)$

return $10^{2m}e + 10^m(e + f - g) + f$



Multiplication Running time

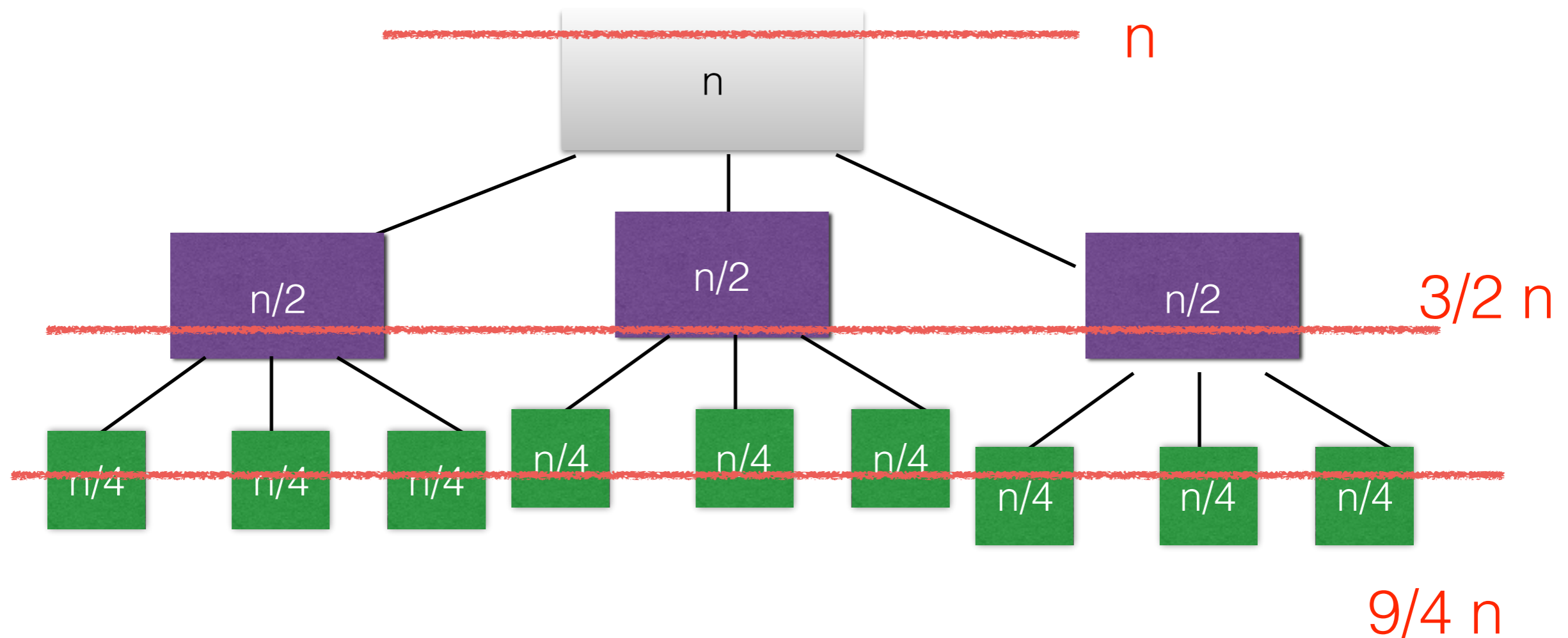
$$T(n) = 3T(n/2) + O(n)$$



Ascending geometric series, every level has 50% more work than the previous one
the only work that matters is at the last level (leaves)

Multiplication Running time

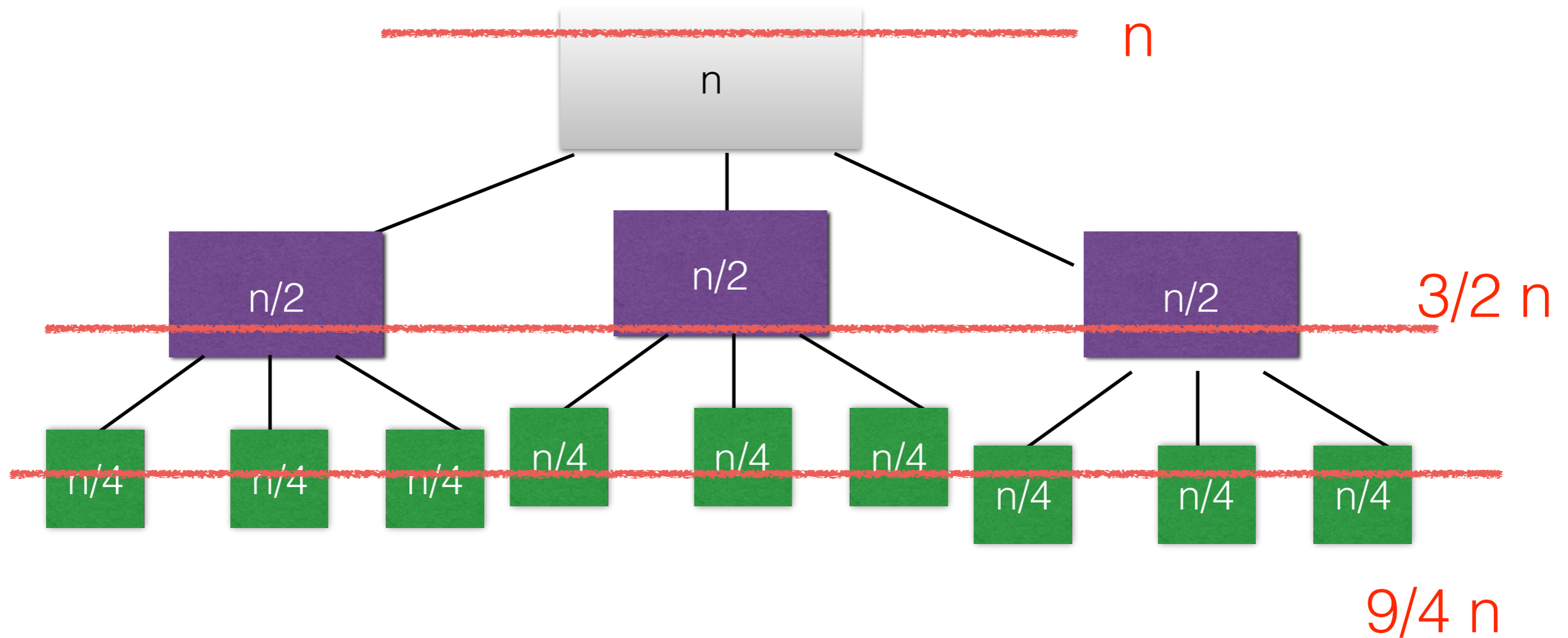
$$T(n) = 3T(n/2) + O(n)$$



- At the leaves, we have constant size, assume it's 1.
- total work \approx # leaves \times 1.
- how many leaves?

Multiplication Running time

$$T(n) = 3T(n/2) + O(n)$$



- # leaves = $3^{\text{depth}} = 3^{\log_2 n} = n^{\log_2 3} = n^{1.6}$

