

# ORDER STATISTICS - MEDIAN FINDING, RANK SELECTION

Given  $n$  unsorted elements, find the  $k$ -th smallest.

We will assume distinct elements.

↳ easy  $O(n)$  if  $k = O(1)$  or  $n - O(1)$ .  
(median is hardest)

Algorithm by: Blum, Floyd, Pratt, Rivest, Tarjan

1973

Let this run in time  $T(n)$  we are looking for the element w/ rank  $r$

↙  $\text{Select}(r, 1 \dots n)$  // find  $r^{\text{th}}$  smallest # within array  $[1 \dots n]$

1) Form  $\frac{n}{5}$  groups of 5 elements // the last group can have  $\leq 5$

2) Find median in each group // brute force.

3) Recursively find  $x = \text{median-of-medians}$

4) Compare all elements to  $x \rightarrow \text{compute rank}[x] = p$

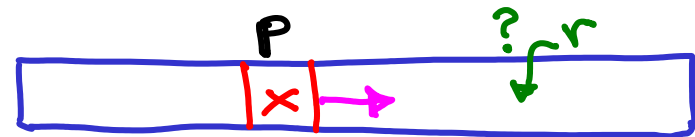
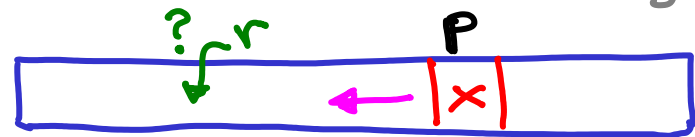
5) if  $\text{rank}[x] = p = r$ , DONE, Else use  $x$  as pivot to partition input  
(set up binary search)

6) if  $p > r$  //  $\text{rank}[x] > r$ , so search lower

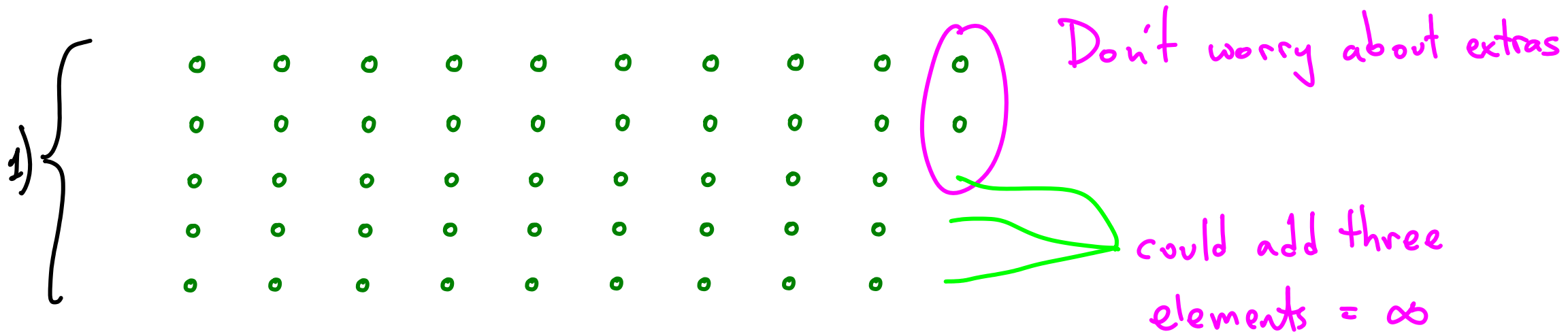
$\text{Select}(r, 1 \dots p-1)$

else //  $p < r$ , so search higher

$\text{Select}(r-p, p+1 \dots n)$



1) Form  $\frac{n}{5}$  groups of 5 elements  $\Theta(n)$  ... in fact, no work



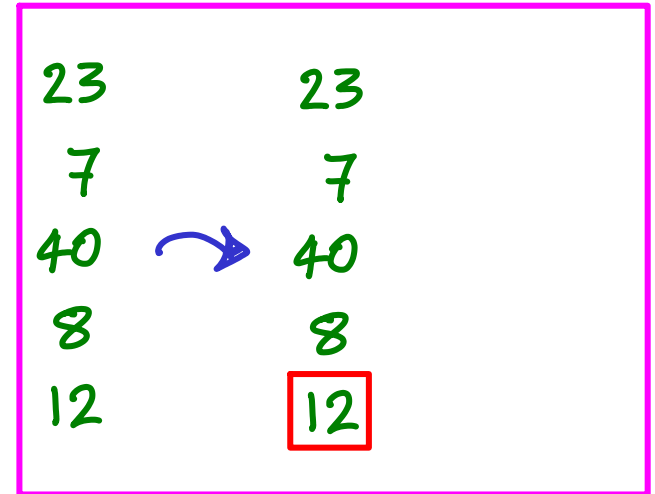
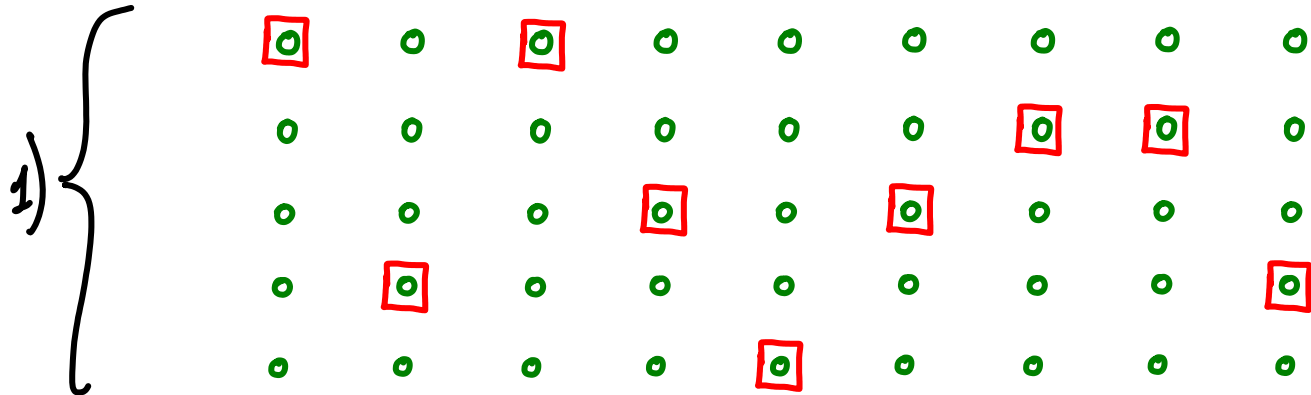
OR

remove MAX & MAX-1  
 $\Theta(n)$

1) Form  $\frac{n}{5}$  groups of 5 elements  $\Theta(n)$

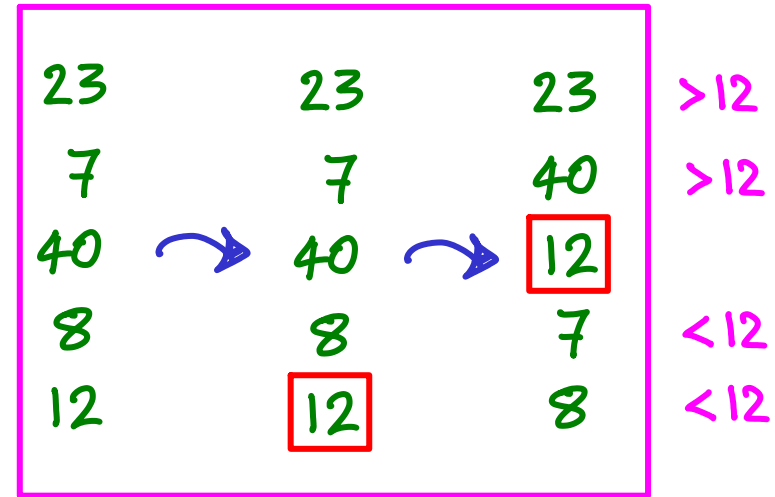
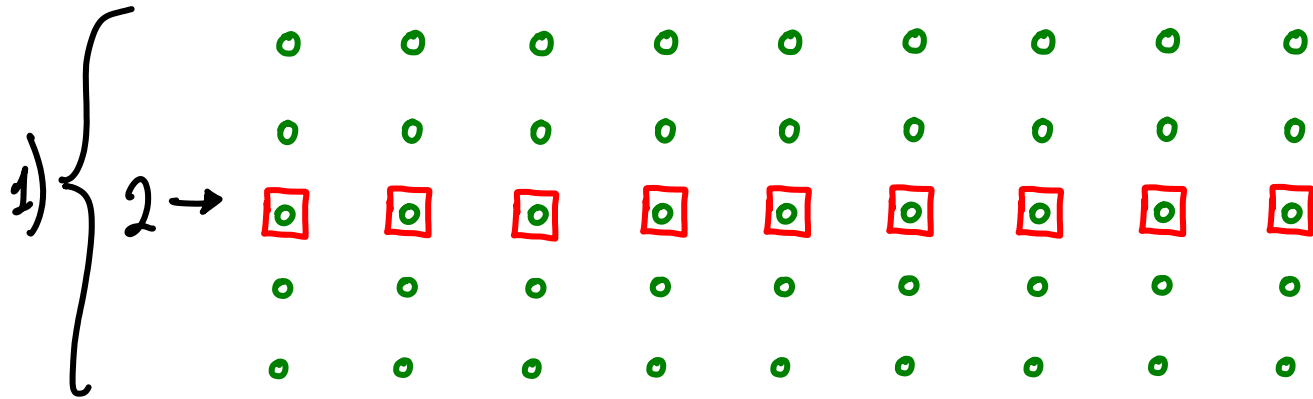
2) Find median in each group

$$\frac{n}{5} \cdot \Theta(1) = \Theta(n)$$



1) Form  $\frac{n}{5}$  groups of 5 elements  $\Theta(n)$

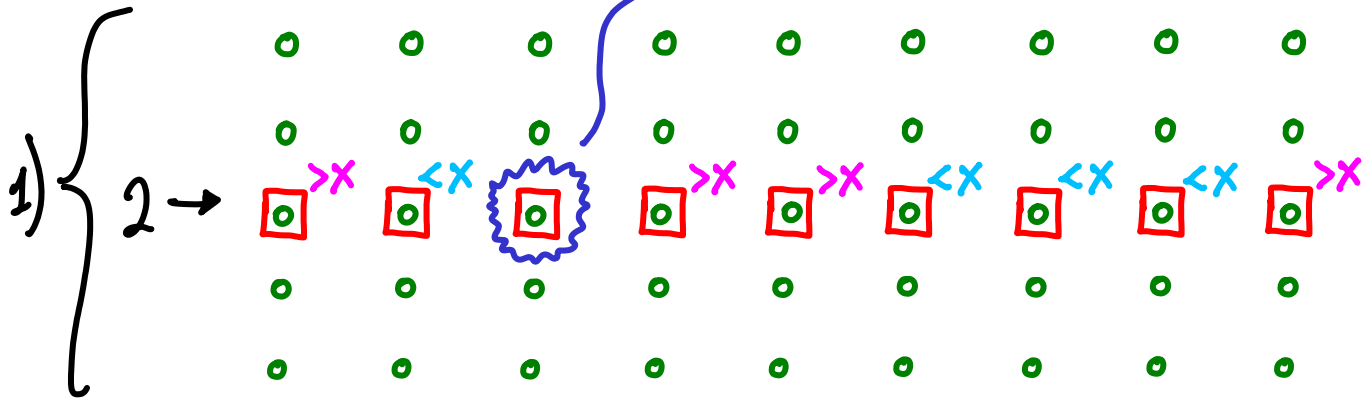
2) Find median in each group (and re-organize)  $\frac{n}{5} \cdot \Theta(1) = \Theta(n)$



1) Form  $\frac{n}{5}$  groups of 5 elements  $\Theta(n)$

2) Find median in each group (and re-organize)  $\frac{n}{5} \cdot \Theta(1) = \Theta(n)$

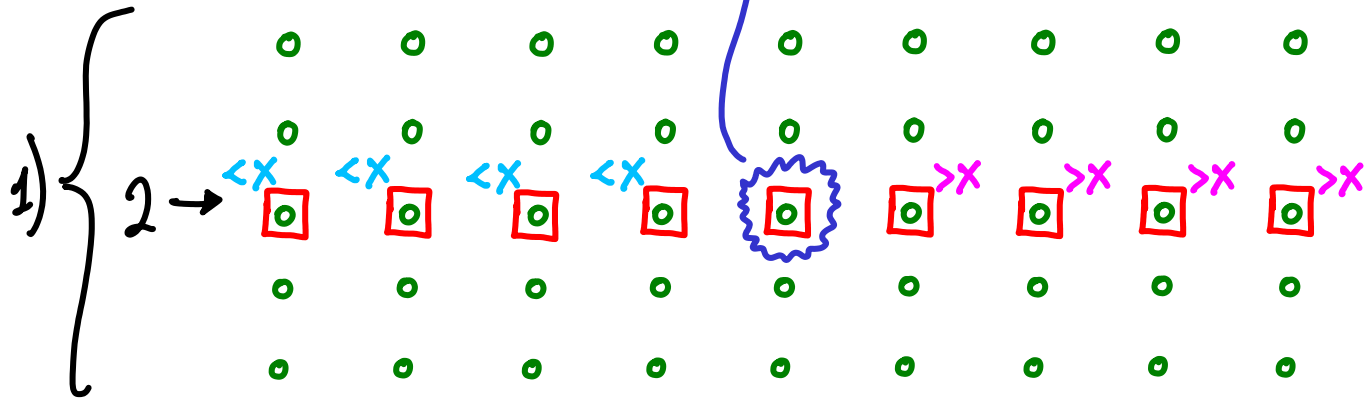
3) Recursively find  $x = \text{median-of-medians}$  TIME  $\rightarrow T(\frac{n}{5})$



1) Form  $\frac{n}{5}$  groups of 5 elements  $\Theta(n)$

2) Find median in each group (and re-organize)  $\frac{n}{5} \cdot \Theta(1) = \Theta(n)$

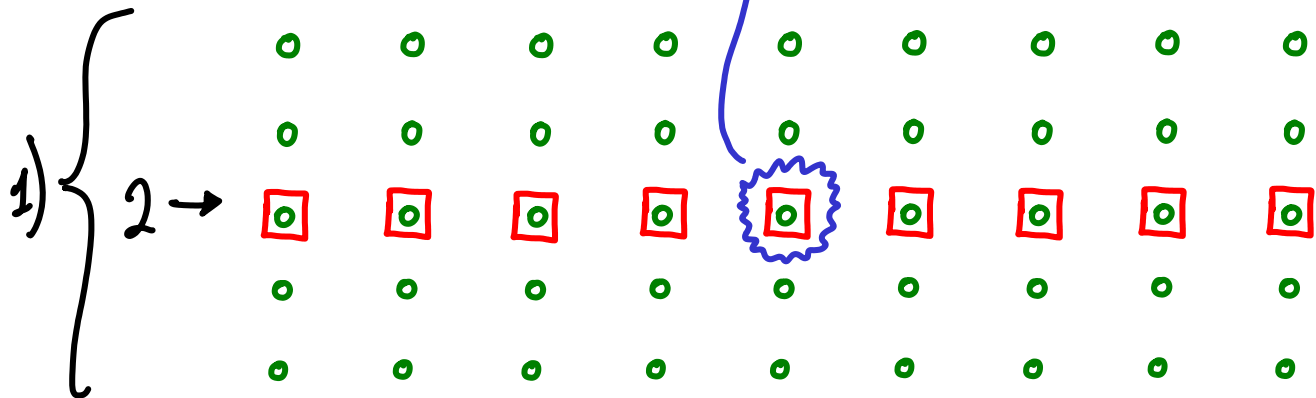
3) Recursively find  $x = \text{median-of-medians}$  (and re-organize)  $T(\frac{n}{5}) + \Theta(n)$



1) Form  $\frac{n}{5}$  groups of 5 elements  $\Theta(n)$

2) Find median in each group (and re-organize)  $\frac{n}{5} \cdot \Theta(1) = \Theta(n)$

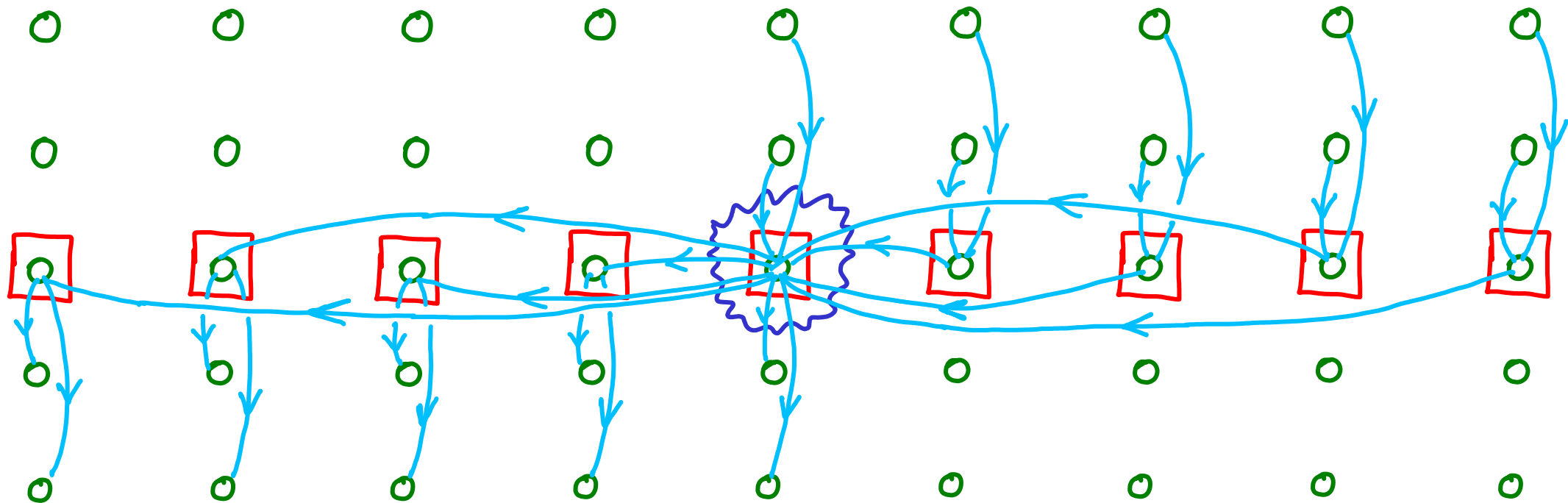
3) Recursively find  $x = \text{median-of-medians}$  (and re-organize)  $T(\frac{n}{5}) + \Theta(n)$



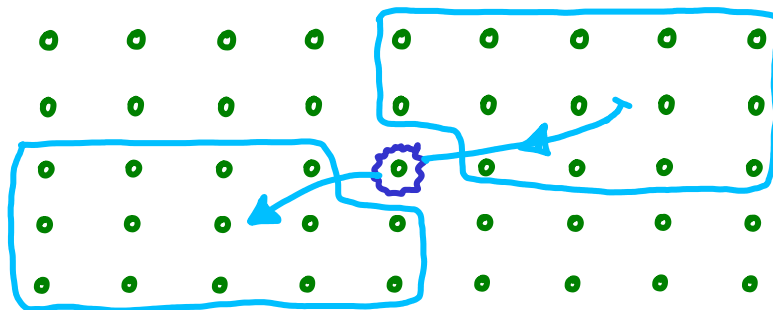
Re-organizing is not part of the algorithm. It's part of the proof.  
(although we could afford it)

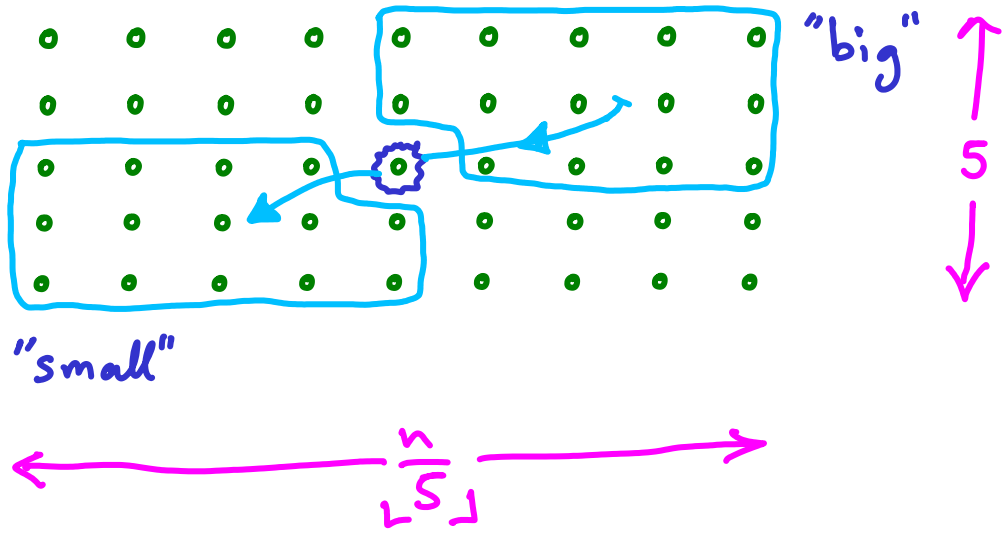
That's the algorithm. Now to find  $T(n)$

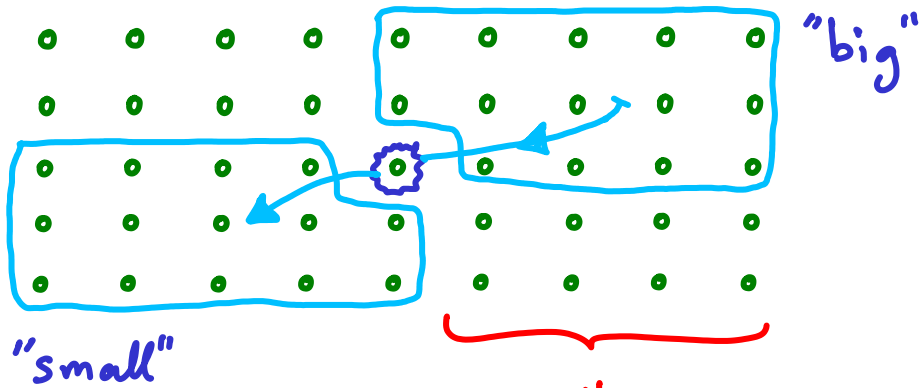




Let  $x \rightarrow y$  mean  $x > y$



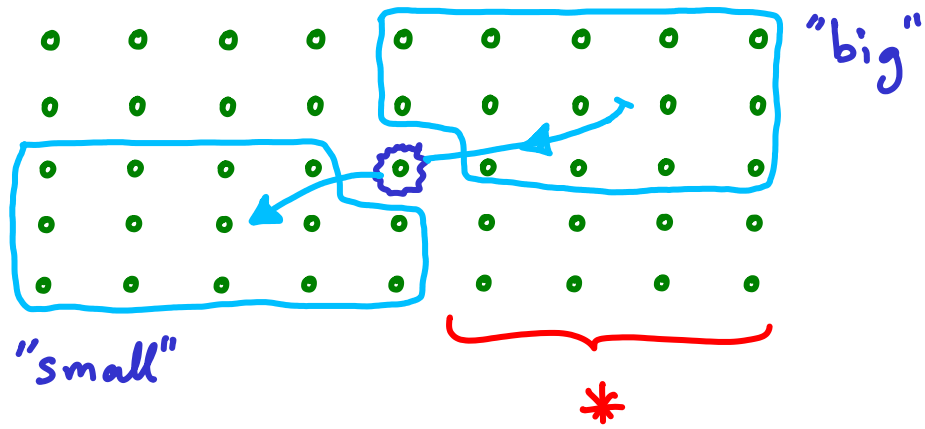




$$\# \text{"big"} = \# \text{"small"} \geq 3 \cdot \frac{\lfloor n/5 \rfloor}{\lfloor 2 \rfloor}$$

big items per column

columns containing big elements



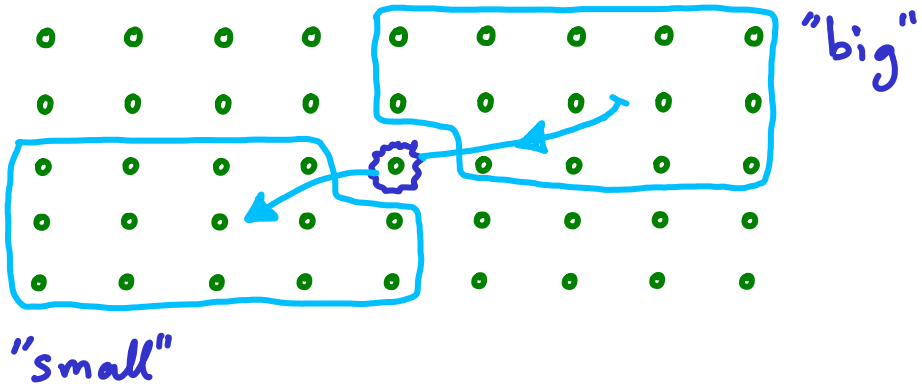
$$\# \text{"big"} = \# \text{"small"} \geq 3 \cdot \frac{\lfloor n/s \rfloor}{2} \geq 3 \cdot \lfloor \frac{n}{10} \rfloor$$

\*

$\Theta(n)$  work  
takes care  
of this

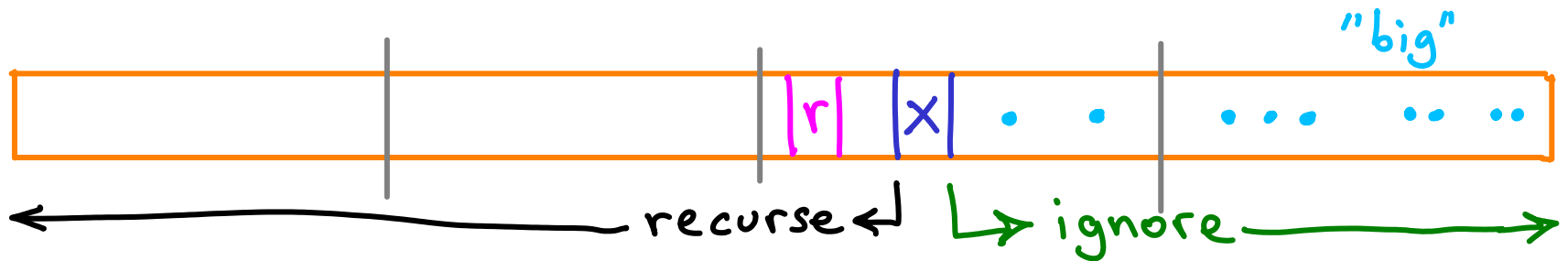
$\lfloor \frac{n}{5} \rfloor \rightarrow \frac{n}{5}$  if we ignore incomplete column

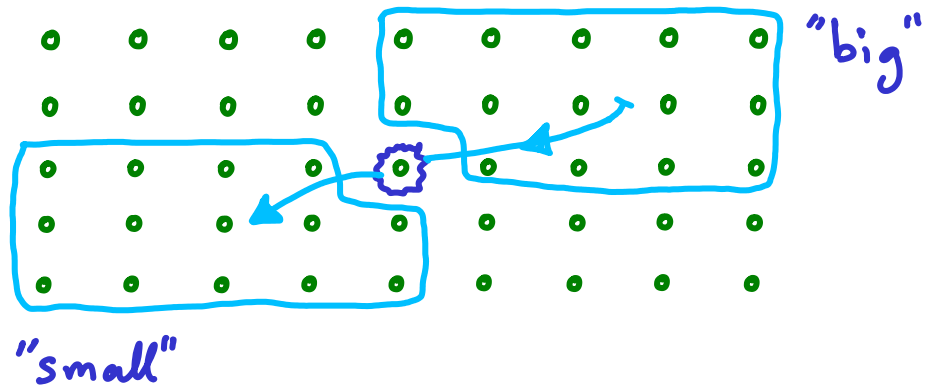
$\lfloor \frac{n}{2} \rfloor \rightarrow \frac{n}{2}$  if  $n$ : even



$$\begin{aligned} \# \text{"big"} = \# \text{"small"} &\geq 3 \cdot \frac{L^{n/5}}{\lfloor 2 \rfloor} \geq 3 \cdot \frac{n}{\lfloor 10 \rfloor} \\ &\geq \frac{1}{4}n \quad \text{For } n \geq 50 \end{aligned}$$

if  $\otimes$  is not at the target rank/index, and we need to search lower (i.e.,  $\text{rank}(x) > \text{target}$ ), then recurse on all elements except "big"  
 [symmetrically, if searching for  $\text{target} > \text{rank}(x)$ , recurse on all except "small"]





$$\# \text{"big"} = \# \text{"small"} \geq 3 \cdot \frac{\lfloor n/5 \rfloor}{2} \geq 3 \cdot \lfloor \frac{n}{10} \rfloor$$

$$\geq \frac{1}{4}n \quad \text{For } n \geq 50$$

if  $x$  is not at the target rank/index, and we need to search lower (i.e.,  $\text{rank}(x) > \text{target}$ ), then recurse on all elements except "big" [symmetrically, if searching for  $\text{target} > \text{rank}(x)$ , recurse on all except "small"]

$$T(n) \leq T\left(\frac{n}{5}\right) + T\left(\frac{3n}{4}\right) + \Theta(n)$$

find  $x$  —————  $T\left(\frac{n}{5}\right)$   
 —————  $T\left(\frac{3n}{4}\right)$  ————— recurse if  $\text{rank}(x) \neq \text{target}$   
 —————  $\Theta(n)$  ————— steps 1&2: split into groups & find medians of 5 & partition

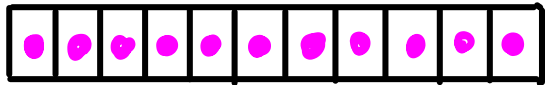
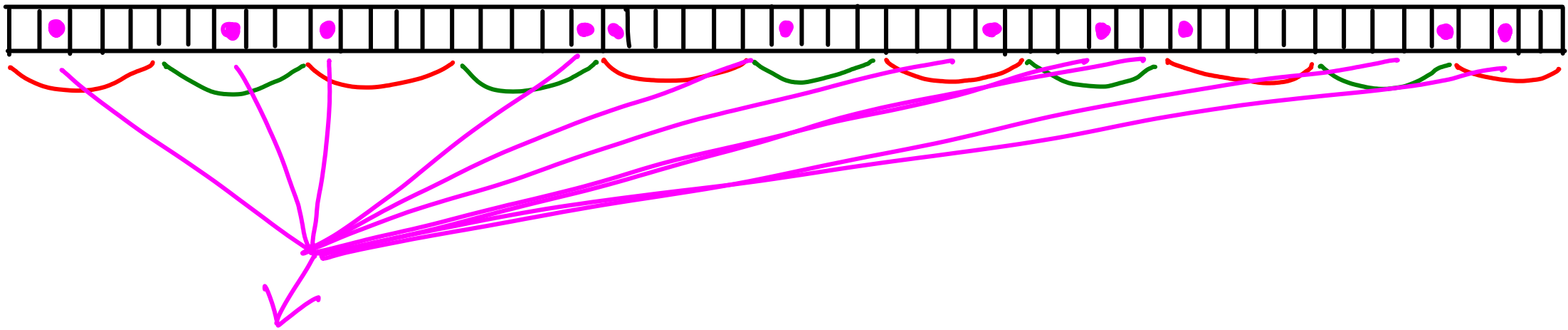
$$T(n) \leq T\left(\frac{n}{5}\right) + T\left(\frac{3n}{4}\right) + \Theta(n)$$

Claim  $T(n) \leq c \cdot n$

$$\leq c \cdot \frac{n}{5} + c \cdot \frac{3n}{4} + dn$$

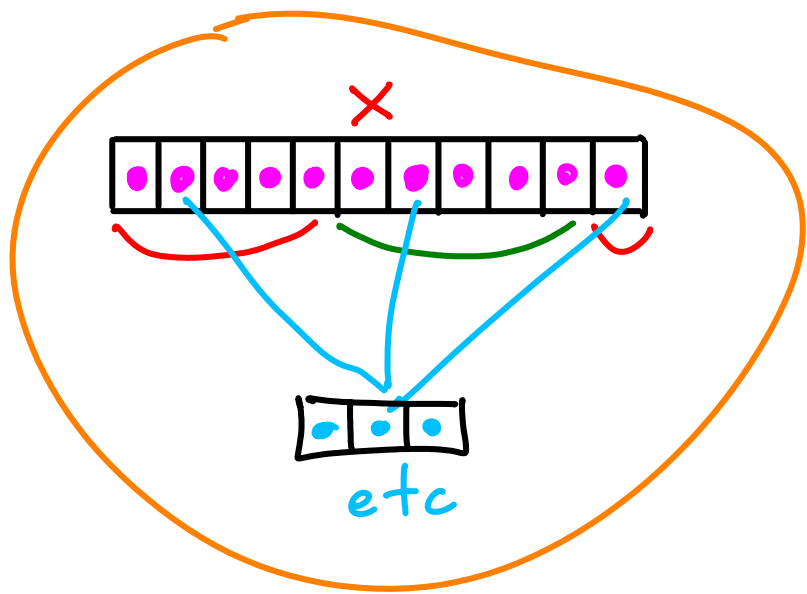
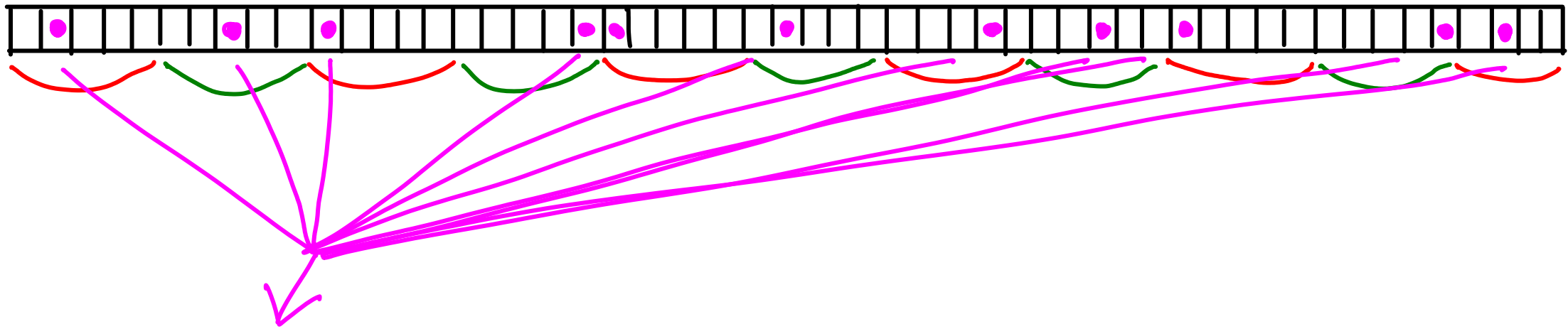
$$= \frac{19}{20}cn + dn = cn - \left(\frac{1}{20}cn - dn\right) \leq \underline{cn} \text{ if } c > 20d$$

**QED**



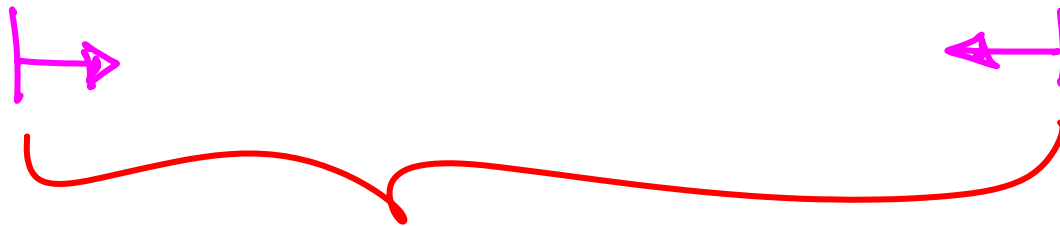
collect medians-of-5



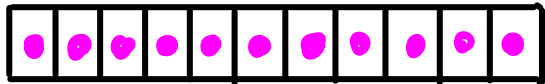


$$T\left(\frac{n}{5}\right)$$

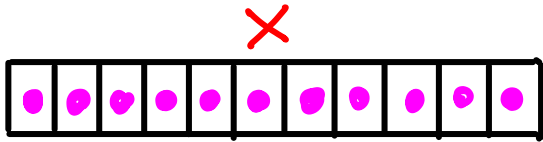
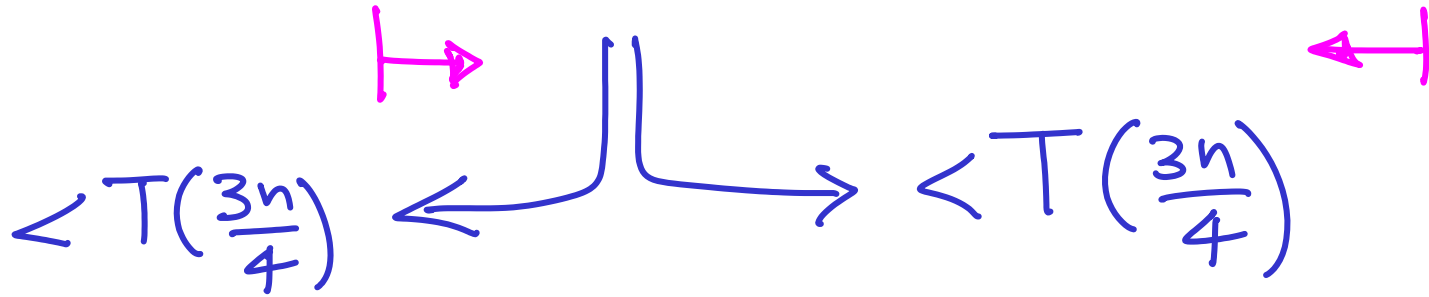
solve new problem  
(return median)



x



x will rank somewhere  
in middle 50% of original list



Find rank(x)

if  $x \neq$  target, recurse on  $\leq \frac{3}{4}$  of list

What were they thinking? (my guess)

- Goal:  $\Theta(n)$  [ $\Omega(n)$  lower bound;  $O(n \log n)$  is trivial]

- Exploit  $\sim$  geometric series:  $T(n) = T(\frac{n}{b}) + O(n)$

OR  $T(n) = T(xn) + T(yn) + O(n)$

... where  $x+y < 1$

↪ spend  $T(xn) + O(n)$  time

to make sure that only  $yn$  candidates remain