

$$T(n) \leq T\left(\frac{3}{4}n\right) + 2 \times O(n)$$

$$\Rightarrow O(n)$$

(more careful analysis:  $\lesssim 3.4n$  comps)  
 $\uparrow$   
 $2 + 2 \ln 2$

Method 2: Floyd-Rivest Alg'm ('75)

idea - random sampling

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Midterm 1 Stats

mean 60.28

median 58.75

max 98

stdev 17.6

90-100	4
80-89	14
70-79	13
60-69	16
50-59	21
40-49	14
<40	14

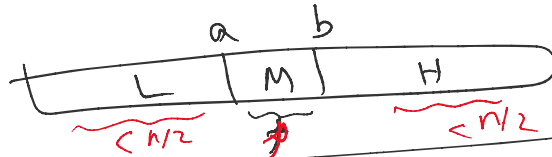
Floyd-Rivest Alg'm

1. pick subset  $R$  of  $r$  random elements  $y_1, \dots, y_r$

2. take  $\left(\frac{r}{2} - c/r\right)$ -th smallest  $a$  of  $R$   
 $\left(\frac{r}{2} + c/r\right)$ -th smallest  $b$  of  $R$

3.  $\{ \text{all elements } \leq a \}$

3. Let  $L = \{ \text{all elements} \leq a \}$   
 $M = \{ \text{all elems between } a \text{ \& } b \}$   
 $H = \{ \text{all elements} > b \}$



check:  $|L| \leq \frac{n}{2}$ ,  $|H| \leq \frac{n}{2}$ , and  $|M| \leq 4c \frac{n}{\sqrt{r}}$  (\*)

4. return  $(\frac{n}{2} |L|)^{\text{th}}$  smallest of  $M$  (Mark Carlo)

Runtime / # Comps:

line 2  $O(r \log r)$

line 4  $O(\frac{cn}{\sqrt{r}} \log \frac{cn}{\sqrt{r}})$

line 3  $n + \frac{n}{2} + 4c \frac{n}{\sqrt{r}}$

comp with a

comp with b

$O((cn)^{2/3} \log n)$

Set  $r$  st.  $r \approx \frac{cn}{\sqrt{r}} \Rightarrow r \approx (cn)^{2/3}$

$\Rightarrow$  # comps  $1.5n + O((cn)^{2/3} \log n)$

### Error Analysis:

Recall Markov's ineq:  
 $X > 0, E(X) = \mu \Rightarrow \text{Pr}(X \geq c\mu) \leq \frac{1}{c}$

Chebyshev's ineq:

$E(X) = \mu, \text{Var}(X) = \sigma^2$

$\Rightarrow \text{Pr}(|X - \mu| \geq c\sigma) \leq \frac{1}{c^2}$

r.t. ...

Chernoff's Bd:

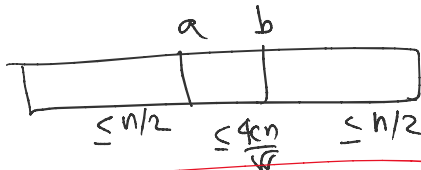
Let  $X_1, \dots, X_r$  be indep. 0-1 rand vars  
with  $\Pr(X_i=1) = p$ .

Let  $X = \sum_{i=1}^r X_i$ . Let  $\mu = pr$ .

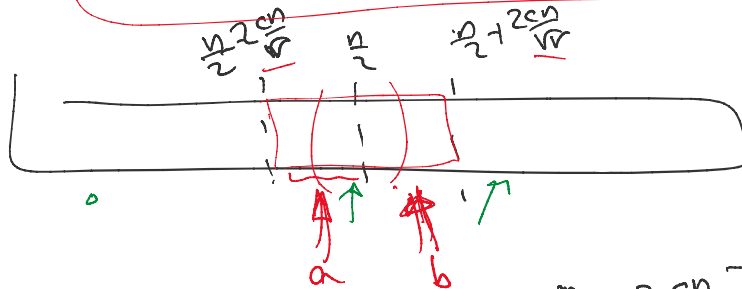
$$\Rightarrow \Pr(|X - \mu| \geq c\sqrt{\mu}) \leq e^{-\theta(c^2)}$$

(assuming  $c \leq \sqrt{\mu}$ )

How to analyze Prob of (\*):



(\*) is true if a has rank between  $\frac{n}{2} - \frac{2cn}{\sqrt{r}}$  and  $\frac{n}{2}$   
& b has rank between  $\frac{n}{2}$  and  $\frac{n}{2} + \frac{2cn}{\sqrt{r}}$

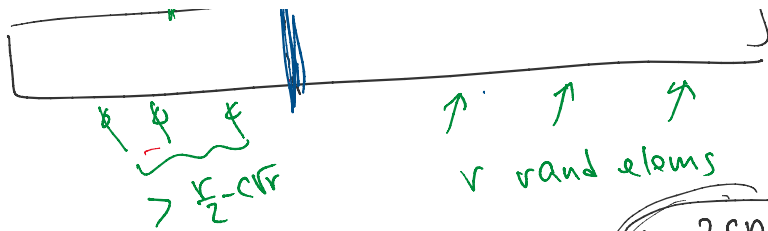


What's Prob [rank of a is  $< \frac{n}{2} - \frac{2cn}{\sqrt{r}}$ ]?

$$= \Pr\left(\# \text{elems in } R \text{ with rank } < \frac{n}{2} - \frac{2cn}{\sqrt{r}} > \frac{r}{2} - cr\right)$$

(recall  $a = \left(\frac{r}{2} - cr\right)^{\text{th}}$  smallest in  $R$ .)





Let  $X_i = \begin{cases} 1 & \text{if rank}(y_i) \leq \frac{n}{2} - \frac{2cn}{r} \\ 0 & \text{else} \end{cases}$

$$X = \sum_{i=1}^r X_i$$

$$p = \frac{\frac{n}{2} - \frac{2cn}{r}}{n} = \frac{1}{2} - \frac{2c}{r}$$

$$\mu = rp = \frac{r}{2} - 2cr$$

$$= \Pr(X_i = 1)$$

$$\Pr(X > \frac{r}{2} - cr)$$

$$\leq \Pr(X > \mu + \frac{r}{2} - cr)$$

$$\leq e^{-\Theta(c^2)}$$

Similar for  $\Pr[\text{rank of } a \text{ is } > \frac{n}{2}] \dots$

e.g. set  $c = n^{0.1} \Rightarrow$  # comps  $1.5n + o(n)$   
but err prob.  $e^{-\Theta(n^{0.1})}$

can convert to Las Vegas.

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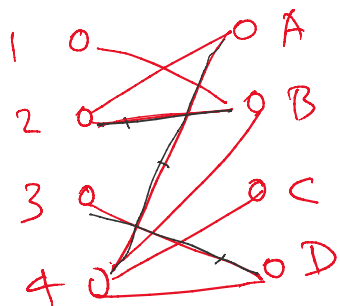
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OPTIMIZATION: Matching, Flows, & LP

# OPTIMIZATION: Matching, Flows, ...

Problem Given unweighted bipartite graph  $G=(V,E)$   
 $|V|=n, |E|=m, n \lesssim m \leq n^2$

find matching with max size  
↙ subgraph with max deg 1



{2B, 3D, 4A}

{1B, 2A, 3D, 4C}

brute force:  $\Omega(n!)$

greedy not work  
DP not work  
⋮

"Hungarian" Method (König-Egerváry '55 / Edmonds '65)

idea. local improvement  
(start with feasible sol'n,  
modify & improve ...)

Def Let  $M$  be a matching.

An augmenting path  $P$  for  $M$  is  
a path  $v_1 v_2 v_3 \dots v_k$  in  $G$

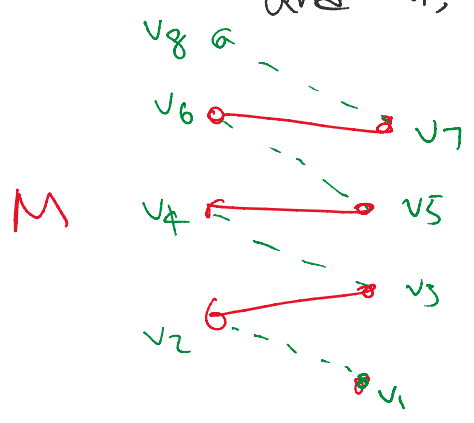
st.  $v_1 v_2 \notin M, v_2 v_3 \in M, v_3 v_4 \notin M, \dots$

$\dots v_{k-1} v_k \notin M$

↖ alternating path

$\dots \in M$

st.  $v_1, v_2, \dots, v_k, v_k \notin M$   
 and  $v_1, v_k$  are not covered by  $M$ .



Notation:  
 $S \oplus T$   
 $= S \cup T - (S \cap T)$

$\Rightarrow M \oplus P$  is a matching  
 with  $|M \oplus P| \geq |M| + 1$ .

Algm:  
 $M = \emptyset$   
 repeat {  
   find augmenting path  $P$  for  $M$   
   if not exist, return  $M$   
    $M = M \oplus P$   
 }

To Prove: matching  $M$  is optimal  
 $\Leftrightarrow$  it has no augmenting path.

each iteration:  $O(m)$  time  
 # iterations:  $\leq n$

$\Rightarrow O(mn)$

more details to come...