

1. what is the general approach to solving a max-flow problem?
finding augineting pathic in residua graphs.
2. when FF finishes, how do we know the answer is correct?

Because we can identify a cut associded with the resulting flow such that $|f|=\|S, T\|$. By MAX-flow-mincut hm, this $\Rightarrow f$ is max. userid:

## Max flow

Min Cut

## FORD-FULKERSON

$$
\begin{aligned}
& \text { Initialize } \frac{f(u, v) \leftarrow 0 \forall u, v}{\text { while exists an augmenting path } p \text { in }} G_{f} \\
& \qquad \underline{\text { aUGMENT } f \text { with } c_{f}}(p)=\min _{(u, v) \in p} c_{f}(u, v)
\end{aligned}
$$

why does FF work? (high level)

## EDMONDS-KARP

$$
\begin{aligned}
& \text { Initialize } f(u, v) \leftarrow 0 \forall u, v \\
& \text { While exists an augmenting path } p \text { in } G_{f} \xlongequal{\text { (use BFS to find it) }} \begin{array}{l}
\text { aUGMENT } f \text { with } c_{f}(p)=\min _{(u, v) \in p} c_{f}(u, v)
\end{array}
\end{aligned}
$$



FOR EVERY AUGMENTING PATH, SOME EDGE IS CRITICAL.


CRITICAL EDGES ARE REMOVED IN NEXT RESIDUAL GRAPH.


KEY IDEA: HOW MANY TIMES CAN AN EDGE BE CRITICAL?

e becomes
critical
Outline of the argument

first time ( $u, v$ ) is critical:

time i+1: (u,v) is critical: $\quad \delta_{i+1}(s, v) \geq \delta_{i}(s, u)+1$

time j: Edge (u,v) STRIKES BACK


time $\mathrm{i}+\mathrm{r}:(\mathrm{u}, \mathrm{v})$ is critical:

$$
\delta_{i+1}(s, v) \geq \delta_{i}(s, u)+1
$$


time j: Edge (u,v) STRIKES BACK


time j: Edge (u,v) STRIKES BACK

$$
\begin{aligned}
\delta_{i+1}(s, v) & \geq \delta_{i}(s, u)+1 \\
\delta_{j}(s, u) & =\delta_{j}(s, v)+1
\end{aligned}
$$


time k : RETURN OF THE ( $\mathrm{u}, \mathrm{v}$ ) critical


QUESTION: How many times can (uv) be critical?
$\Rightarrow$ edge $e$ can become critical $\leq \frac{\sqrt{2}}{2}$ time
$b / c$ after $\frac{J}{2}$ times $\delta(5, u) ? V$,
thus $e$ cannot be on a simple path free $S \sim t$.
edge critical only $\quad \sqrt{2}$ times.
there are only $\quad E \quad$ edges.
ergo, total \# of augmenting paths:

$$
\frac{E V}{2}
$$ time to find an augmenting path:

$$
\theta(E+U) \quad(B F S)
$$

total running time of $\mathrm{E}-\mathrm{K}$ algorithm:

$$
\theta\left(E^{2} U\right)
$$

ff


APPLICATIONS OF MAX FLOW

## Bipartite <br> Matchings

MAXIMUM BIPARTITE MATCHING


MAXIMUM BIPARTITE MATCHING


BIPARTITE MATCHING
problem: Given a graph $\left(L_{T}, R_{C} E\right)$, find the largest set rods
of edges $M \subseteq E$ such that
each vertex is incident to at mort one edge in M.

(1) $\theta(u)$
(2) $\qquad$
(3) $\theta(E+v)$

## ALGORITHM

I. MAKE NEW G' FROM INPUT G.
2. RUN FF ON G'
3. OUTPUT ALL MIDDLE EDGES WITH FLOW $\mathrm{F}(\mathrm{E})=\mathrm{I}$.


Why does this work??

Need to show:
$G$ has a matching $|M|=K \Leftrightarrow G^{\prime}$ has MaxFlow $K$.

CORRECTNESS
$\stackrel{\mu}{\operatorname{IF} \text { G HAS A mATCHING OF SIZE K, THEN }} \underset{\sim}{\Rightarrow} G_{0}$ has a flow of $K$.
(1) for each edge $e=(x, y) \in M$, set $\quad f(e)=1$ in $G$.

$$
\begin{aligned}
& f(s, x)=1 \\
& f(y, t)=1
\end{aligned}
$$

(2) Verify that this is a prows.
flow constraint capacity constraint
$|m|=k \quad \Rightarrow$ outgoing flow free $S$ is $k$

$$
\Rightarrow \quad|f|=k
$$

CORRECTNESS
IF G' HASA FLOW OF K, THEN $G$ has a matching of size $K$. tricky example:

flow if I unit.

$$
C(e)=l \text { for all edges. }
$$

INTEGRALITY THEOREM
IF CAPACITIES ARE ALL INTEGRAL, THEN $\exists$ a MAXFLOW that will be integral
(i.e all flow values will be integers)

Why is this true??
Consider what FF does. At the start, capacities are integral. $t$ flow See this is true for the fint $k$ iterations of the ff 100 p . On the next loop, the augmenting path will have an integer as the bottleneck edge:
$\Rightarrow$ next residua graph will have integral capacities.
$\Rightarrow$ flow will be integral

CORRECTNESS

IF G' HAS A FLOW OF K, THEN G HAS K-MATCHING.
U) Jan integral flow with valve K.
$\Rightarrow$ since capacities are 1 , then the $f(e)=0$ or I
$\Rightarrow$ Now, consider all middle edges $e=(x, y)$ sit. $f(e)=1$

$$
M=\{e \mid f(e)=1 \& e=(\underset{\sim}{x}(y)\}
$$


properties of flow,
flow constraint.
only ore edge only one edge form $S$ to $x \rightarrow$, in $M$ that touche, $x$.

RUNNING TIME
$\theta(E U)$
En E
$\max$ flow $|f| \leq U$, by ff anayges, the

$$
\begin{gathered}
\text { sunning time is } \theta(t \cdot f+1) \\
\Rightarrow \theta(E \cdot U)
\end{gathered}
$$

## EDGE-DISJOINT PATHS



## ALGORITHM



ANALYSIS
IF G HAS K DISJOINT PATHS, THEN $G$ ) has a flow with value $K$.

If $G$ has a flow of vale $k, \Rightarrow J$ disjoint paths firm $s$ to $t$.

## ANALYSIS

VERTEX-DISJOINT PATHS
(d)


- edge disjoint, but mot vertex disjoint


BASEBALL ELIMINATION

|  |  |  | Against |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | W | L | Left | A | P | N | M |
| ATL | 83 | 71 | 8 | - | 1 | 6 | I |
| PHL | 80 | 79 | 3 | 1 | - | 0 | 2 |
| NY | 78 | 78 | 6 | 6 | 0 | - | 0 |
| MONT | 77 | 82 | 3 | 1 | 2 | 0 | - |

BASEBALL ELIMINATION

|  | W | L | Left | N | B | Against |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | Bo | T | D |
| NY | $75^{76}$ | 59 | 28 |  | 3 | $8{ }^{(1)}$ | 7 | 37 |
| BAL | 7 PY $^{710}$ | 63 | 28 | 3 |  | 2 | 7 | 4 |
| BOS | 6976 | 66 | 27 | 78 | 2 |  |  |  |
| TOR | 6370 | 72 | 27 | 707 | 76 |  |  |  |
| DET | 49 | 86 | $\underline{27}$ | 3 | 4 |  |  |  |
|  | 76 |  |  |  |  |  |  |  |

BASEBALL ELIMINATION



|  | W | L | Left | N | B | Bo | T | D |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| NY | 75 | 59 | 28 |  | 3 | 8 | 7 | 3 |
| BAL | 71 | 63 | 28 | 3 |  | 2 | 7 | 4 |
| BOS | 69 | 66 | 27 | 8 | 2 |  |  |  |
| TOR | 63 | 72 | 27 | 7 | 7 |  |  |  |
| DET | 49 | 86 | 27 | 3 | 4 |  |  |  |



|  | W | L | Left | N | B | Bo | T | D |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| NY | 75 | 59 | 28 |  | 3 | 8 | 7 | 3 |
| BAL | 71 | 63 | 28 | 3 |  | 2 | 7 | 4 |
| BOS | 69 | 66 | 27 | 8 | 2 |  |  |  |
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