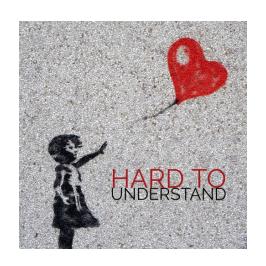
# (十二) 图论: 匹配与网络流 (Matching and Network Flow)

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3 Theorems + 1 Algorithm

To maximize the size of a mathematical structure S in G



#### Theorem

S is maximum iff G does not contain S-augmenting objects.

### Algorithm

Repeatedly finding S-augmenting objects until no more ones exist.

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To maximize the size of a mathematical structure S in G



To minimize the size of its dual mathematical structure S' in G

Theorem (Weak Duality Theorem)

The size of a maximum  $S \leq$  The size of a minimum S'

Theorem (Strong Duality Theorem)

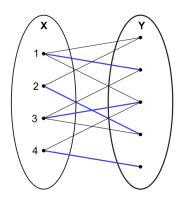
The size of a maximum S = The size of a minimum S'

let's get married today Ø The Marriage Problem (Philip Hall, 1935)

If there is a finite set of girls, each of whom knows several boys, under what conditions can all the girls marry boys in such a way that each girl marries a boy that she knows?



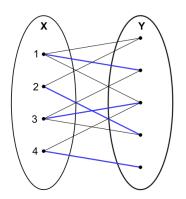
Philip Hall (1904  $\sim 1982$ )



### Definition (Matching (匹配))

(hfwei@nju.edu.cn)

A matching in a graph G is a set of edges with no shared endpoints.

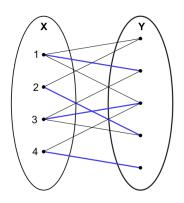


### Definition (X-Perfect Matching (X-Saturating Matching))

Let G = (X, Y, E) be a bipartite graph.

An X-perfect matching of G is a matching which covers each vertex in X.

$$|X| \le |Y|$$



$$\forall W\subseteq X. \ \Big|W\Big| \leq \Big|N(W)\Big|$$

### Theorem (Hall Theorem; 1935)

Let G = (X, Y, E) be a bipartite graph. There is an X-perfect matching of G iff

$$\forall W \subseteq X. |W| \le |N_G(W)|$$

By induction on the number |X| of vertices in X.

Basis Step: 
$$|X| = 1$$
.  $|X| \le |N_G(X)|$ . I am married!

Induction Hypothesis: Suppose that it holds if |X| < m.

Induction Step: Consider the case |X| = m.

Consider the case 
$$|X| = m$$
.

► Case I: Every k < m girls in X know  $\geq k + 1$  boys in Y.

Take any girl x and marry her to any boy y she knows.

$$G' = G - \{x, y\}$$

The Hall's Condition still holds for G'.

$$\forall W \subseteq X - \{x\}. \ |W| \le |N_{G'}(W)|$$

There is a  $(X - \{x\})$ -perfer matching in G'.

Therefore, there is a  $(X - \{x\})$ -perfer matching in G.

▶ Case II: There is a set of k < m girls in X who know k boys in Y.

There k girls can be married by induction to the k boys.

$$G' = G - \{\text{these } k \text{ girls}\} - \{\text{these } k \text{ boys}\}$$

G' satisfies the Hall's Condition.

### By contradition:

Suppose that in G', there are  $l \leq m - k$  girls who know < l boys.

Then, in G, there are k + l girls who know < k + l boys.

There is a  $(X - \{\text{these } k \text{ girls}\})$ -perfer matching in G'.

Therefore, there is a  $(X - \{x\})$ -perfer matching in G.

#### Theorem (Hall Theorem; 1935)

Let G = (X, Y, E) be a bipartite graph. There is a X-perfect matching of G iff

$$\forall W \subseteq X. |W| \le |N_G(W)|$$

### Definition (M-alternating Paths)

Let M be a matching. An M-alternating path is a path that alternates between edges in M and edges not in M.

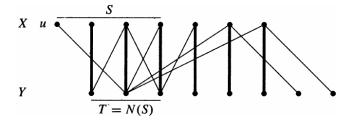


### Definition (M-augmenting Paths)

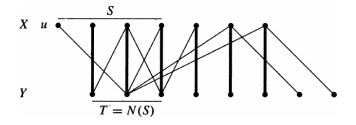
An M-augmenting path is an M-alternating path whose endpoints are unsaturated by M.

#### By contradiction.

Suppose that there is *no* X-perfect matching. We show that Hall's Condition is violated for some  $S \subseteq X$ .



Let M be a maximum matching. Let  $u \in X$  be a vertex of X not saturated by M. Consider all M-alternating paths starting from u.



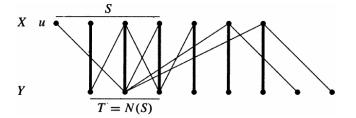
 $T \triangleq$  the set of vertices in Y reachable from u by M-alternating paths.  $S \triangleq$  the set of vertices in X reachable from u by M-alternating paths.

We will show that

$$T = N(S) \land \left| T \right| = \left| S - \{u\} \right|$$

$$|N(S)| = |T| = |S| - 1 < |S|$$

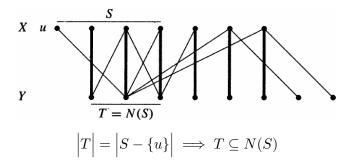
$$|T| = |S - \{u\}|$$



We show that there is a bijection from T to  $S - \{u\}$ .

M matches T with  $S - \{u\}$ .



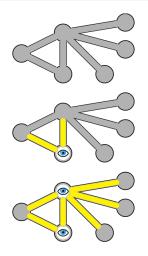


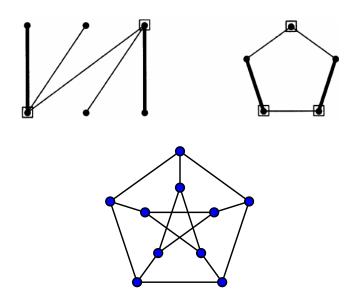
### We need to show that $N(S) \subseteq T$

Consider the neighbors of  $x \in S$ : x = u,  $x \in S - \{u\}$ 

### Definitions (Vertex Cover (点覆盖))

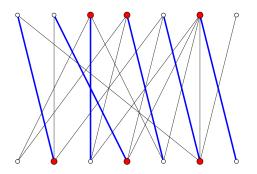
A vertex cover of a graph G is a set  $Q \subseteq V(G)$  that covers all edges.





### Theorem (Weak Duality Theorem (弱对偶定理))

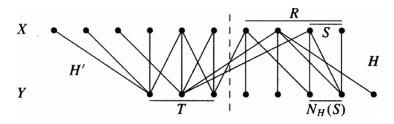
Let G be a graph. The maximum size of a mathching in  $G \le the minimum size of a vertex cover of <math>G$ .



### Theorem (König (1931), Egerváry (1931))

Let G be a bipartite graph. The maximum size of a mathching in G equals the minimum size of a vertex cover of G

Given a vertex cover Q, we construct a matching M of the same size.



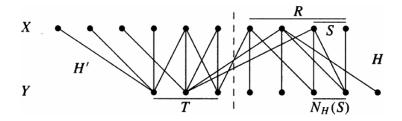
$$R = Q \cap X$$
  $T = Q \cap Y$ 

 $H \triangleq (R \cup (Y - T))$ -induced subgraph of G  $H' \triangleq (T \cup (X - R))$ -induced subgraph of G G has no edges from X-R to Y-T.

H has a R-perfect matching and H' has a T-perfect matching.

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## H has a R-perfect matching and H' has a T-perfect matching.



By contradition.

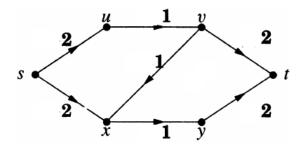
$$\exists S \subseteq R. \ \left| N_H(S) \right| < \left| S \right|$$

 $T \cup (R - S + N_H(S))$  is a smaller vertex cover than Q

### Definition (Network (网络))

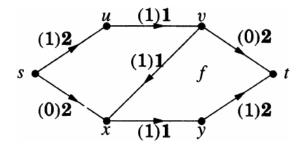
### A network is a digraph with

- ightharpoonup a distinguished source vertex s,
- $\triangleright$  a distinguished sink vertex t,
- ▶ a capacity  $c(e) \ge 0$  on each edge e



### Definition (Flow (流))

A flow f is a function that assigns a value f(e) to each edge e.



### Definition (Feasible Flow (可行流))

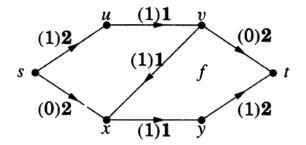
A flow f is feasible if it satisfies

### Capacity Constraints:

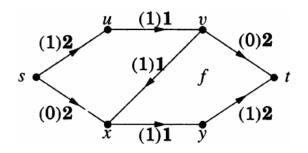
$$\forall e \in E. \ 0 \le f(e) \le c(e)$$

#### Flow Conservation:

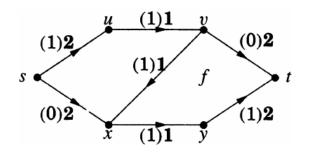
$$\forall v \in V. \ f^+(v) = f^-(v)$$



$$f^+(v) = \sum_{(v,w) \in E} f(v,w)$$
  $f^-(v) = \sum_{(u,v) \in E} f(u,v)$ 



$$f^{+}(U) = \sum_{u \in U, v \in \overline{U}, (u,v) \in E} f(u,v) \qquad f^{-}(U) = \sum_{v \in \overline{U}, u \in U, (v,u) \in E} f(v,u)$$



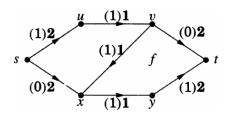
$$\forall U \subseteq (V - \{s, t\}). \ f^+(U) = f^-(U)$$

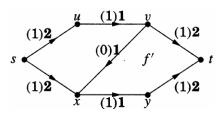
$$s \in U \land t \notin U \implies f^+(U) - f^-(U) = f^+(s)$$

### Definition (Value (值))

The value val(f) of a flow f is

$$val(f) = f^{-}(t) = f^{+}(s).$$

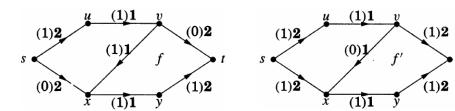




### Definition (Maximum Flow (最大流))

A maximum flow is a feasible flow of maximum value.

$$s-x-v-t$$



### Definition (f-augmenting Paths (增广路径))

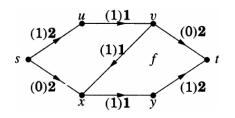
When f is a feasible flow, an f-augmenting path is a  $s \sim t$  path P in the underlying graph such that for each edge  $e \in E(P)$ ,

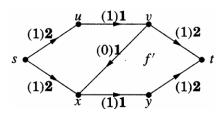
- (a) if P follows e in the forward direction, then f(e) < c(e);
- (b) if P follows e in the backward direction, then f(e) > 0.

### Definition (f-augmenting Paths)

Let P be an f-augmenting path.

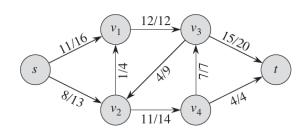
$$\epsilon(e) = \begin{cases} c(e) - f(e) & \text{if } e \text{ is forward on } P \\ f(e) & \text{if } e \text{ is backward on } P \end{cases}$$

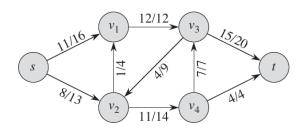




An f-augmenting path leads to a flow with larger value.

$$\min_{e \in E(P)} \epsilon(e)$$

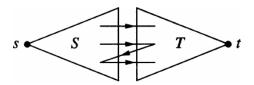


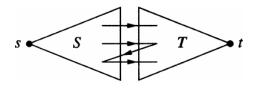


### Definition (Source/Sink Cut (割))

In a network, a source/sink cut [S, T] consists of the edges from a source set S to a sink set T, where

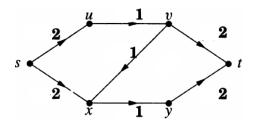
$$(T = V - S) \land (s \in S) \land (t \in T)$$





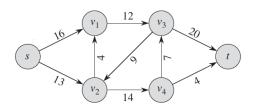
### Definition (Capacity of Cut (割的容量))

$$\operatorname{cap}(S,T) = \sum_{u \in S, v \in T, uv \in E} c(u,v)$$



# Definition (Minimum Cut (最小割))

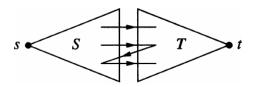
A minimum cut is a cut of minimum value.



# Theorem (Weak Duality (弱对偶定理))

Let f be any feasible flow and [S,T] be any source/sink cut.

$$val(f) \leq cap(S,T).$$



$$\mathsf{val}(f) = f^+(S) - f^-(S) \leq f^+(S) \leq \mathsf{cap}(S,T)$$

#### Lemma

$$\max_f \mathit{val}(f) \leq \min_{[S,T]} \mathit{cap}(S,T)$$

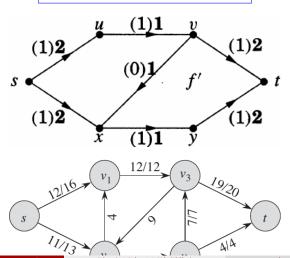
What if  $\mathsf{val}(f) = \mathsf{cap}(S, T)$  for some flow f and some cut [S, T]?

f is maximum and [S,T] is minimum

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$$val(f) = f^{+}(S) - f^{-}(S) = f^{+}(S) = cap(S, T)$$

$$f^{-1}(S) = 0 \wedge f^{+}(S) = \operatorname{cap}(S, T)$$



(十二) 图论: 匹配与网络流

# Theorem (Max-flow Min-cut Theorem (Ford and Fulkerson; 1956))

$$\max_{f} \mathit{val}(f) = \min_{[S,T]} \mathit{cap}(S,T)$$

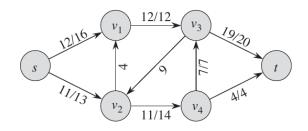
(Strong Duality)

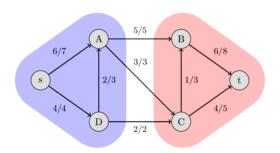


L. R. Ford Jr.  $(1927 \sim 2017)$ 



D. R. Fulkerson (1924  $\sim 1976$ )

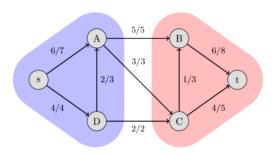




#### Theorem

## A feasible flow f is maximum iff there are no f-augmenting paths.

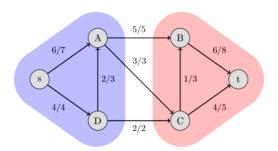
We construct a cut [S,T] with val(f) = cap(S,T).



 $S \triangleq \{\text{the vertices reachable from } s \text{ along partial } f\text{-augmenting paths}\}$ 

 $S \triangleq \{\text{the vertices reachable from } s \text{ along partial } f\text{-augmenting paths}\}$ 

$$T \triangleq V - S$$



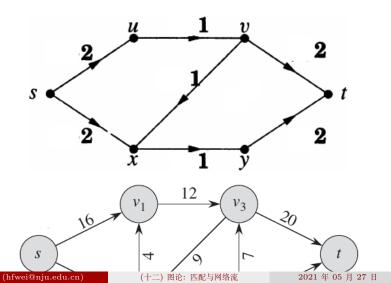
$$f^{-1}(S) = 0 \wedge f^+(S) = \operatorname{cap}(S, T)$$

$$val(f) = f^{+}(S) - f^{-}(S) = f^{+}(S) = cap(S, T)$$

#### The Ford-Fulkerson Method

魏恒峰

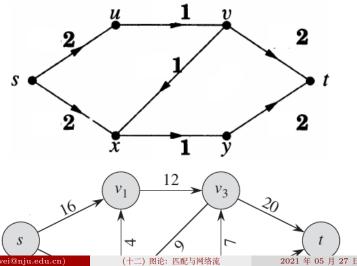
Repeatedly finding f-augmenting paths until no more ones exist.



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# The Edmonds-Karp Algorithm

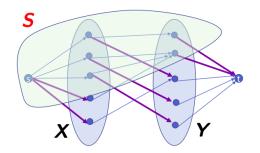
Using BFS (Breadth-first Search) to find f-augmenting paths.



### Theorem (Hall Theorem; 1935)

There is an X-perfect matching of G iff

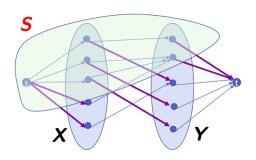
$$\forall W \subseteq X. |W| \le |N_G(W)|$$



$$\forall x \in X. \ c(s, x) = 1 \quad \forall y \in Y. \ c(y, t) = 1 \quad \forall x \in X, y \in Y. \ c(x, y) = \infty$$

We need to show that  $\max_{f} \mathsf{val}(f) = |X|$ .

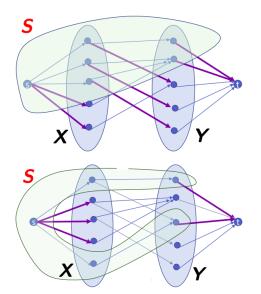
# We need to show that $\min_{[S,\overline{S}]} \operatorname{cap}(S,\overline{S}) = |X|$ .

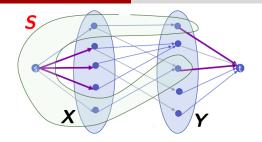


$$\min_{[S,\overline{S}]} \operatorname{cap}(S,\overline{S}) \leq \left|X\right|$$

Therefore, we need to show that  $\min_{[S,\overline{S}]} \mathsf{cap}(S,\overline{S}) \ge \left|X\right|$ .

Let  $[S, \overline{S}]$  be a minimum cut. We need to show that  $\mathsf{cap}(S, \overline{S}) = |X|$ .





$$\begin{split} \operatorname{cap}(S,\overline{S}) &= \sum_{u \in S, v \in \overline{S}} c(x,y) \\ &= \sum_{v \in \overline{S} \cap X} c(s,v) + \sum_{u \in S \cap Y} c(u,t) \\ &= \left| X \right| - \left| S \cap X \right| + \left| S \cap Y \right| \\ &\geq \left| X \right| - \left| S \cap X \right| + \left| N(S \cap X) \right| \\ &\geq \left| X \right| \end{split}$$

Theorem (König (1931), Egerváry (1931))

If G is a bipartite graph, then the maximum size of a mathching in G equals the minimum size of a vertex cover of G



# Thank You!



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