## Review....

Ford-Fulkerson algorithm for max-flow: repeatedly augment flow along paths in the residual graph

If capacities are integers, F-F finds an integer valued flow

Running time: O((m+n)OPT), where OPT is the value of the max flow

Correctness?

## Today

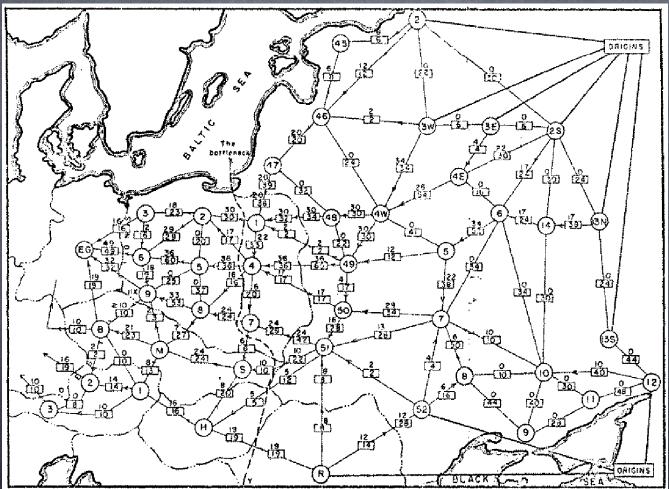
1) Prove that Ford-Fulkerson algorithm finds a maximum flow by proving the Max-Flow Min-Cut Theorem

 Fundamental result in combinatorial optimization (best know example of duality)

Independently proven in 1956 by Ford and Fulkerson AND by Elias, Feinstein and Claude Shannon

2) Bipartite matching

## Flows and Cuts are Intimately Related!



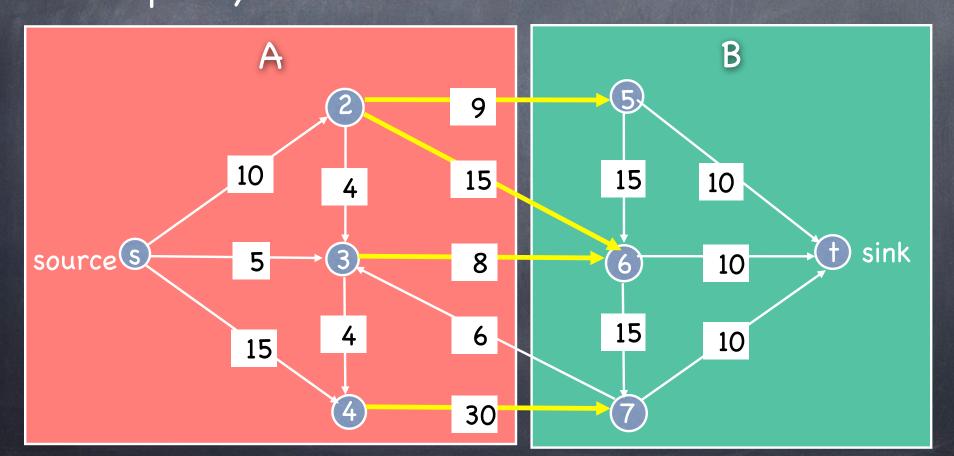
Reference: On the history of the transportation and maximum flow problems. Alexander Schrijver in Math Programming, 91: 3, 2002.

## Outline

Definitions: s-t cuts and their capacities
 Flow value lemma: how to measure a flow using different s-t cuts in the network
 The main event: Max-flow Min-Cut Theorem

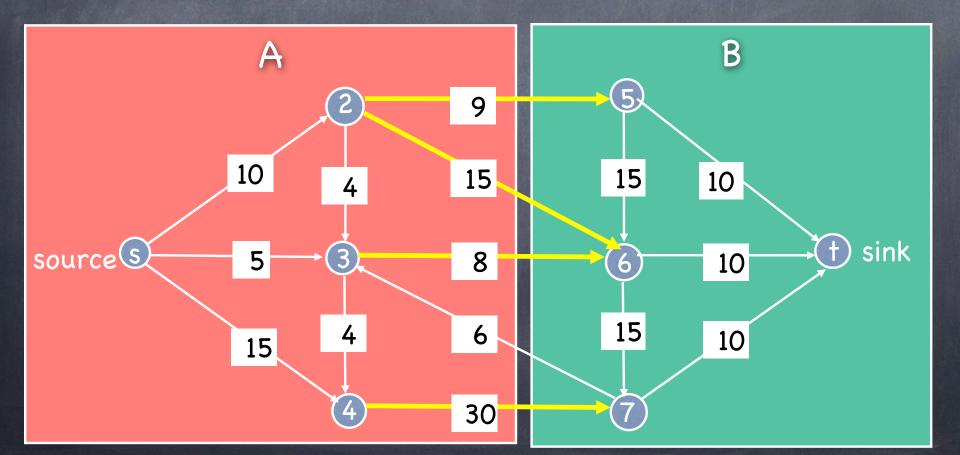
### Cuts

# An s-t cut is a partition (A, B) of V with s ∈ A and t ∈ B. The capacity of a cut (A, B) is: ∑ c(e) e out of A capacity of A-B cut = 9 + 15 + 8 + 30 = 62



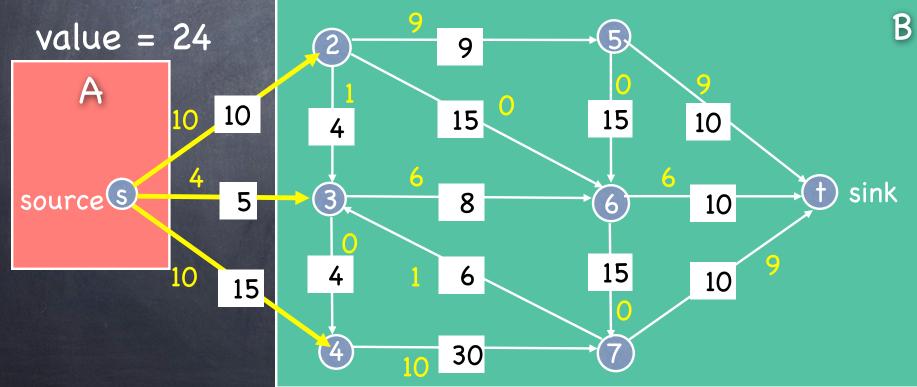
Cuts

capacity of cut = 9 + 15 + 8 + 30 = 62 (Capacity is sum of weights on edges leaving A.)



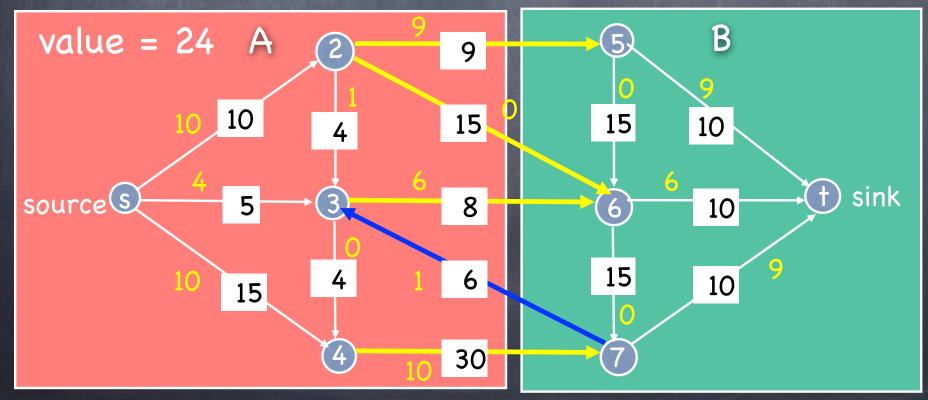
Flow value lemma. Let f be any flow, and let (A, B) be any s-t cut. Then, the net flow sent across the cut is equal to the amount leaving s.





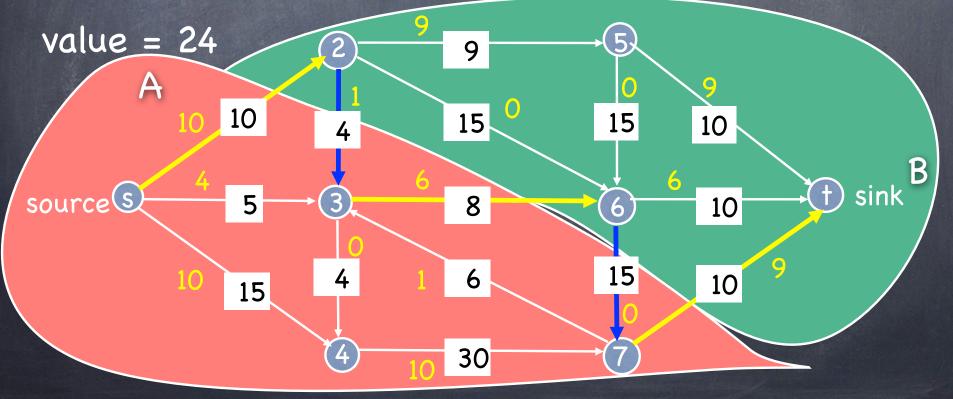
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$$\sum_{e \text{ out of } A} f(e) - \sum_{e \text{ into } A} f(e) = v(f)$$



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Another interpretation: we can measure the value of a flow by selecting any s-t cut, and looking at the net flow crossing the cut.

## Proof

#### Flow value lemma. Let f be any flow, and let (A, B) be any s-t cut. Then $\sum_{e \text{ out of } A} f(e) - \sum_{e \text{ into } A} f(e) = v(f)$ .

#### Proof on board.

## Important Corollary!

Flow value lemma. Let f be any flow, and let (A, B) be any s-t cut. Then  $\Sigma$  f(e) -  $\Sigma$  f(e) = v(f). e out of A e into A

Corollary. Let f be any flow, and let (A, B) be any s-t cut. Then  $v(f) \leq c(A, B)$ .

(See examples on previous slides)

Proof as exercise

## Important Corollary!

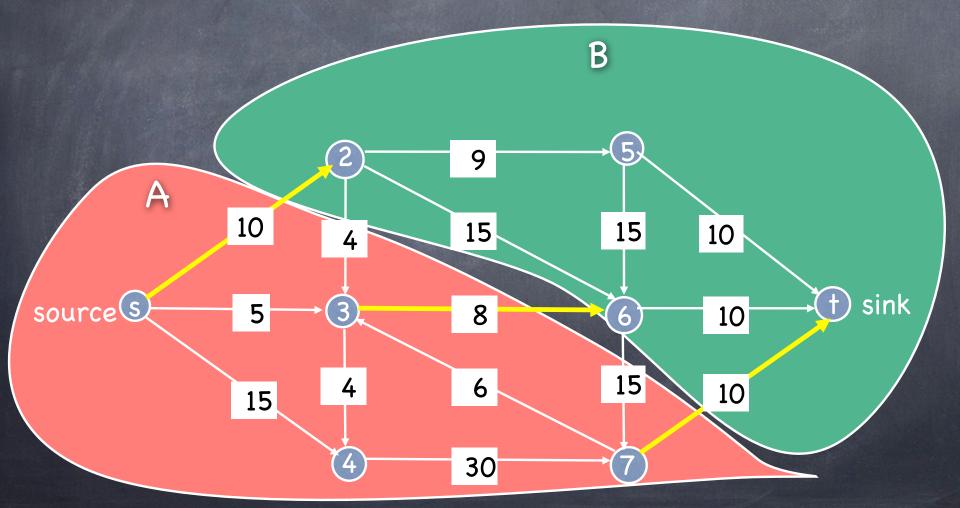
Corollary. Let f be any flow, and let (A, B) be any s-t cut. Then  $v(f) \leq c(A, B)$ .

Interpretation: every cut gives an upper bound on the value of every flow, and hence the value of the maximum flow

What is the best (i.e. smallest) upper bound?

## Minimum Cut Problem

Find an s-t cut of minimum capacity. capacity = 10 + 8 + 10 = 28



## Max-Flow Min-Cut Theorem

**Theorem:** Let f be a flow such that there are no s-t paths in the residual graph  $G_f$ . Let (A, B) be the s-t cut where A contains the nodes reachable from s in  $G_f$ , and B = V-A. Then v(f) = C(A, B), and f is a maximum flow and (A,B) is a minimum cut.

Corollary: Ford-Fulkerson returns a maximum flow.

Corollary: In any flow network, the value of the max flow is equal to the capacity of the min cut.

## Proof

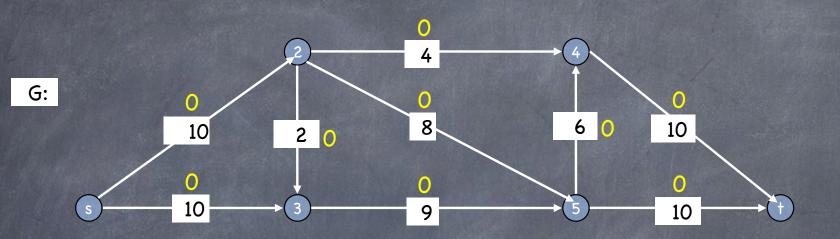
Proof on board

## Min-Cut

Another corollary: given a maximum flow, we can find a minimum cut in O(m+n) time.

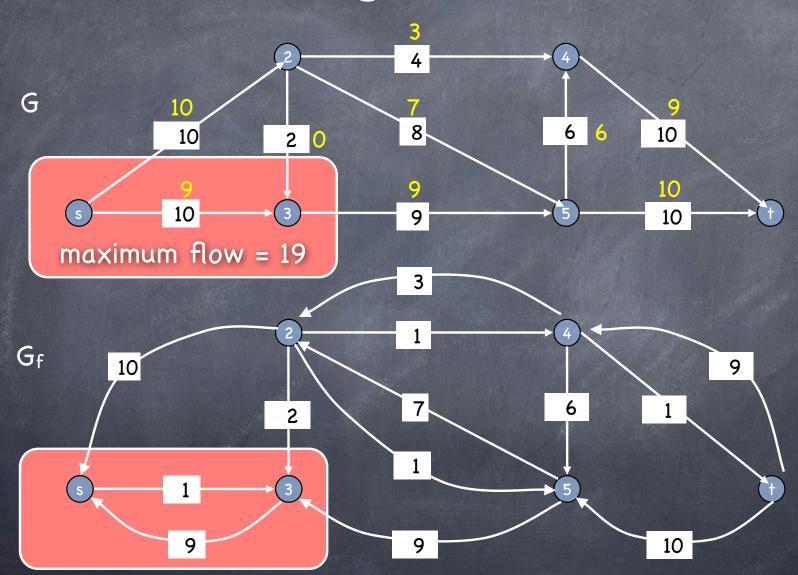
How?

## Finding Min Cut



Flow value = 0

## Finding Min Cut



## Ford-Fulkerson Wrap-Up

We've now shown that F-F: (1) runs in O((m+n)OPT) time → pseudo-polynomial (2) finds an integer-valued flow (if capacities are integers) (3) finds a maximum flow

By choosing good augmenting paths, F-F can be improved to run  $O(m^2 \log C)$  time, where C is the capacity of any cut, and hence an upper bound on OPT  $\rightarrow$  polynomial

Other max-flow algorithms run in  $O(n^2m)$  or  $O(n^3)$  time  $\rightarrow$  strongly polynomial

## OK! But what are they good for???

## Matching

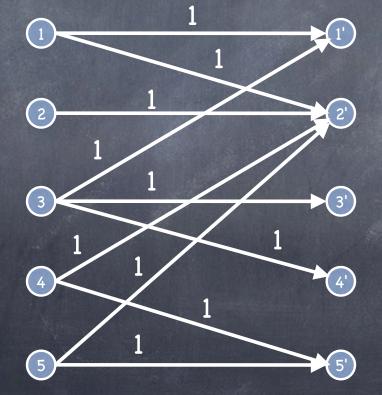
Matching.
Input: undirected graph G = (V, E).
M ⊆ E is a matching if each node appears in at most 1 edge in M.

Max matching: find a max cardinality matching.

#### Bipartite Matching Ø Bipartite matching. Input: undirected, bipartite graph G = (L $\cup$ R, E). $\oslash$ M $\subseteq$ E is a matching if each node appears in at most 1 edge in M. Max matching: find a max cardinality matching. matching 1-2', 3-1', 4-5' (2)2' Is this the max 3' matching? (4 R 5'

#### Bipartite Matching Ø Bipartite matching. Input: undirected, bipartite graph G = (L $\cup$ R, E). $\oslash$ M $\subseteq$ E is a matching if each node appears in at most 1 edge in M. Max matching: find a max cardinality matching. max matching (2) 2' 1-1', 2-2', 3-3' 4-5' 3' 4' R

## Max flow formulation. Direct all edges from L to R and assign capacity of 1.

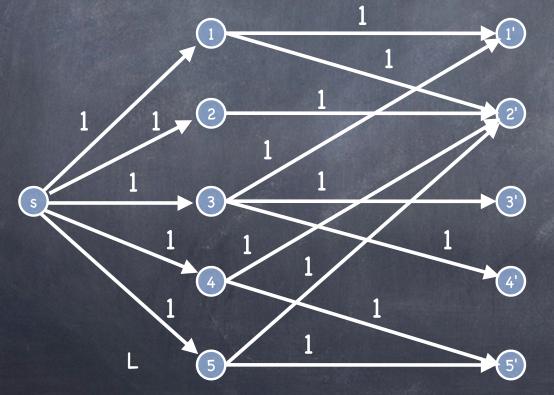


R

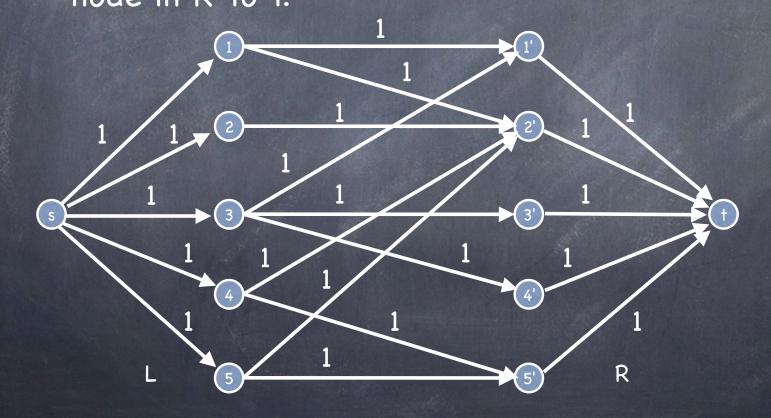
Max flow formulation.

Add source s, and unit capacity edges from s to each node in L.

R



Max flow formulation.
 Add sink t, and unit capacity edges from each node in R to t.



3

R

Max flow formulation.
Solve max flow problem.
Claim: edges between L and R with flow = 1 identify max matching.

## Proof

Show there is a bijection between a matching M in the original graph, and a flow f in the new graph, and that v(f) = |M|.

Thus, a maximum flow is a maximum matching. Details: exercise

## Next Time

More flow applications!