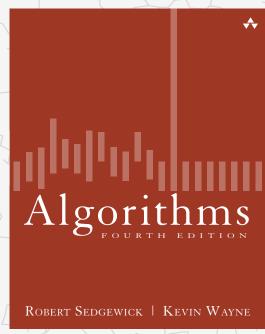
Algorithms

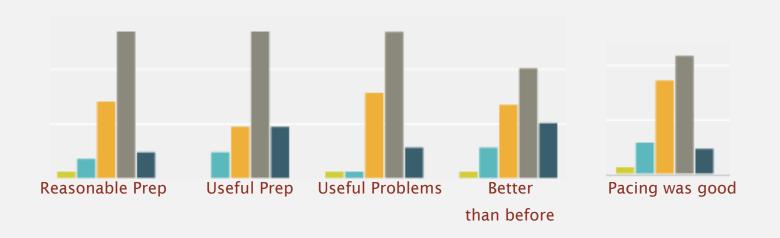


http://algs4.cs.princeton.edu

6.4 MAXIMUM FLOW

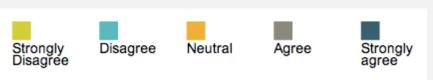
- introduction
- Ford-Fulkerson algorithm
- Java implementation
- maxflow-mincut theorem
- running time analysis
- applications

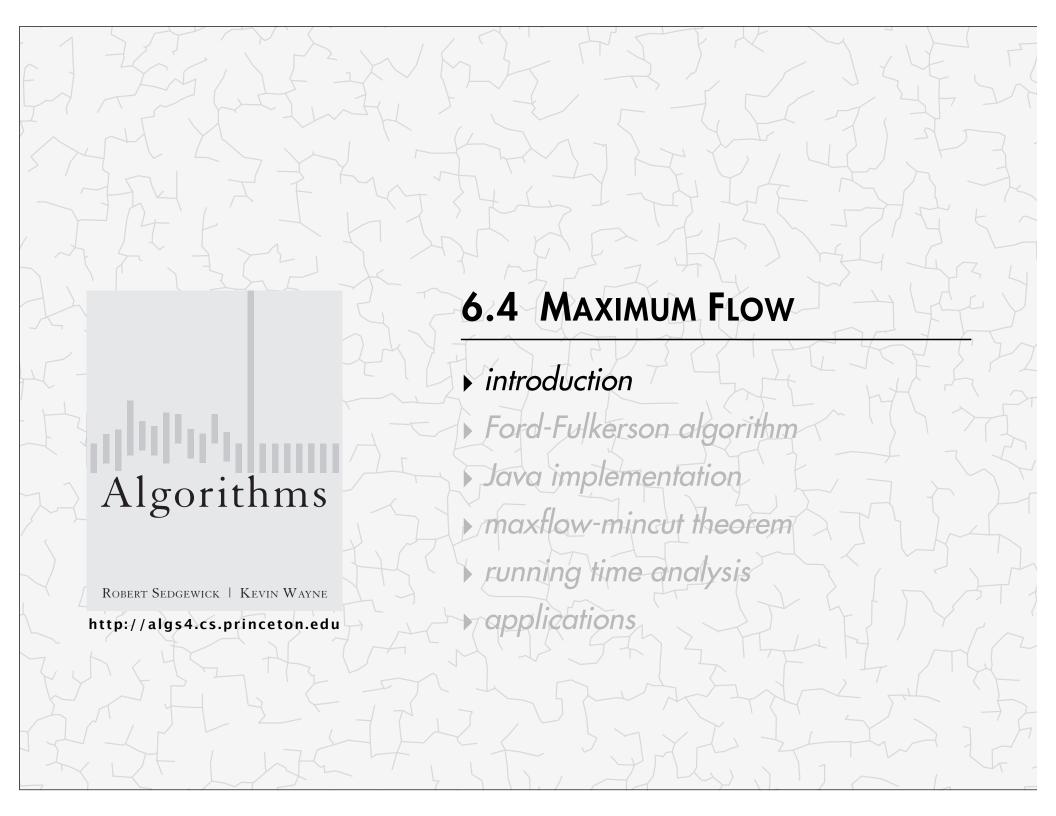
Flipped MST Lecture Week 7 Survey Results





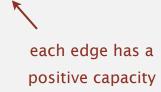


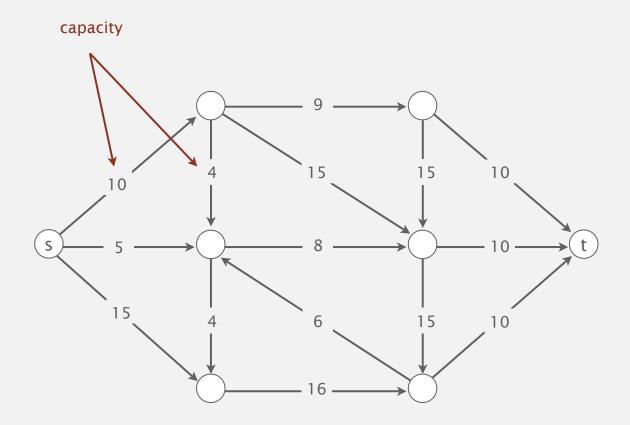




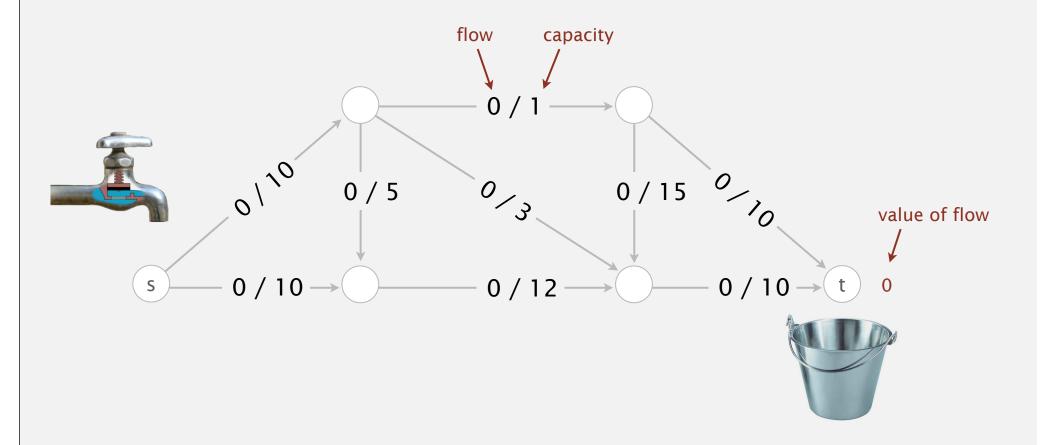
Max flow / Min cut problem

Input. An edge-weighted digraph, source vertex s, and target (sink) vertex t.

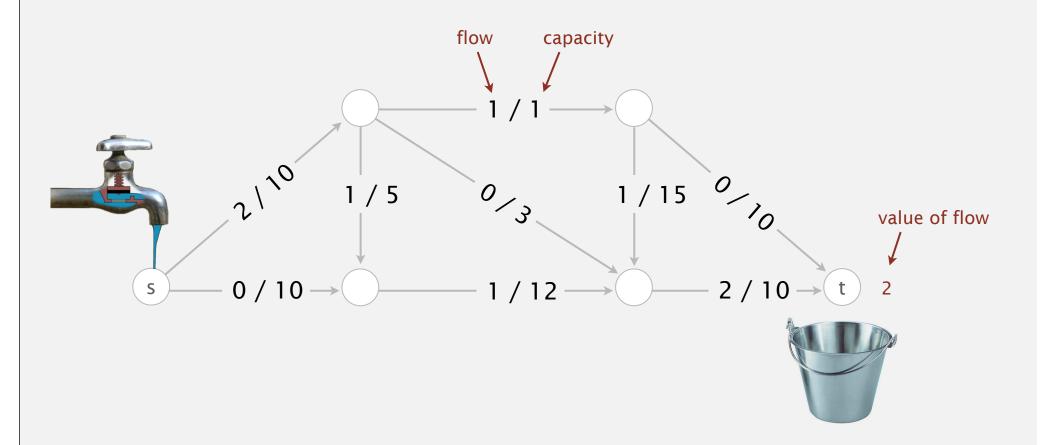




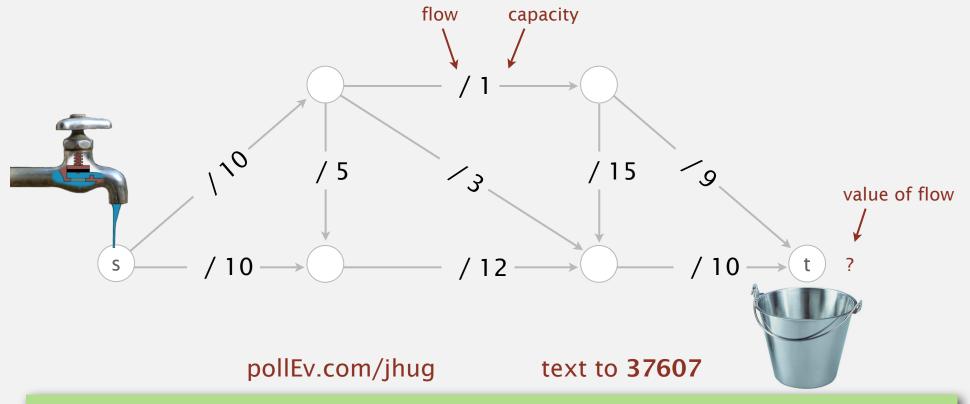
Max flow / min cut problem



Max flow / min cut problem



Max flow / min cut problem



Q: What is the value of the max flow?

A. 20

D. 11

B. 19

E. 10

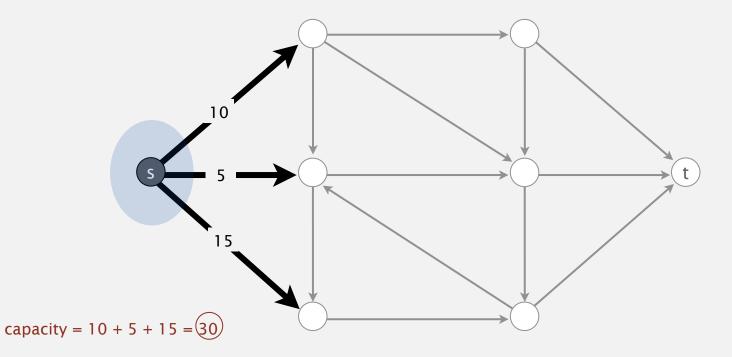
C. 16

Extra: Find a cut whose capacity equals the max flow.

Mincut problem

Def. A st-cut (cut) is a partition of the vertices into two disjoint sets, with s in one set A and t in the other set B.

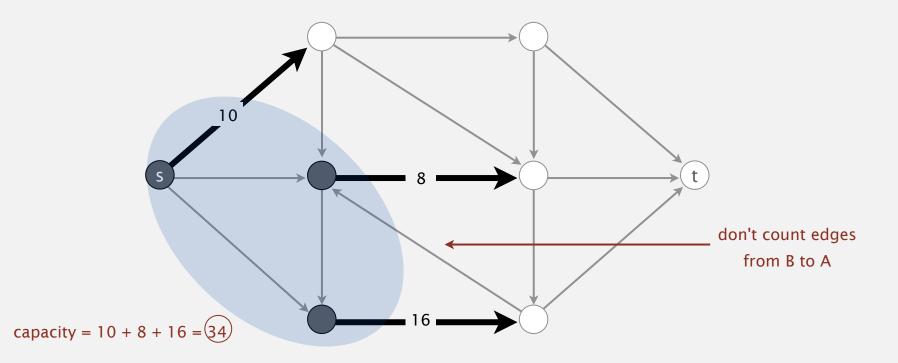
Def. Its capacity is the sum of the capacities of the edges from A to B.



Mincut problem

Def. A st-cut (cut) is a partition of the vertices into two disjoint sets, with s in one set A and t in the other set B.

Def. Its capacity is the sum of the capacities of the edges from A to B.

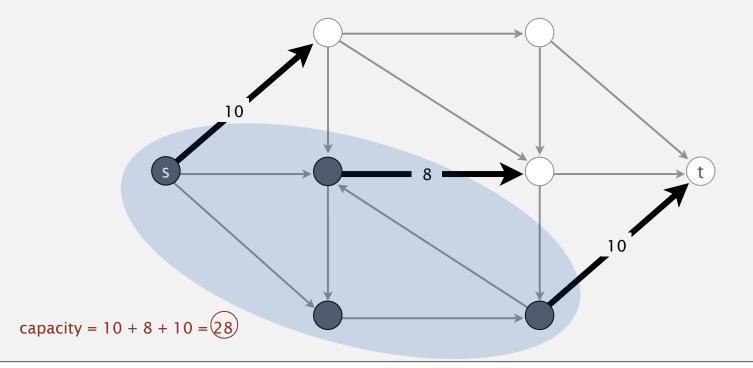


Mincut problem

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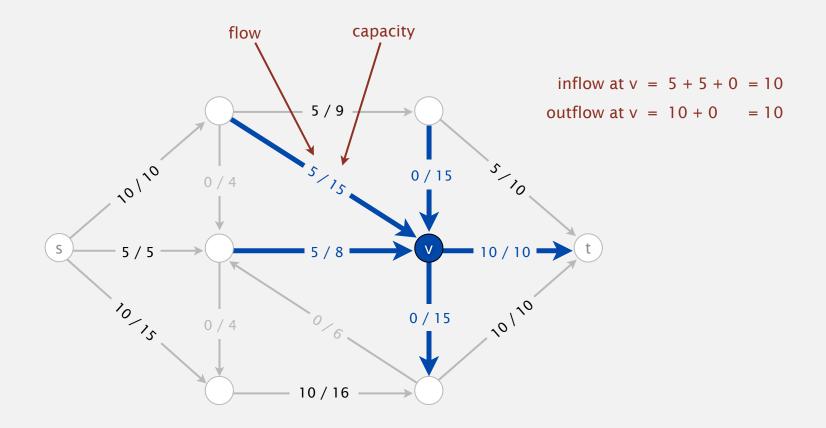
Minimum st-cut (mincut) problem. Find a cut of minimum capacity.



Maxflow problem

Def. An st-flow (flow) is an assignment of values to the edges such that:

- Capacity constraint: $0 \le \text{edge's flow} \le \text{edge's capacity}$.
- Local equilibrium: inflow = outflow at every vertex (except s and t).



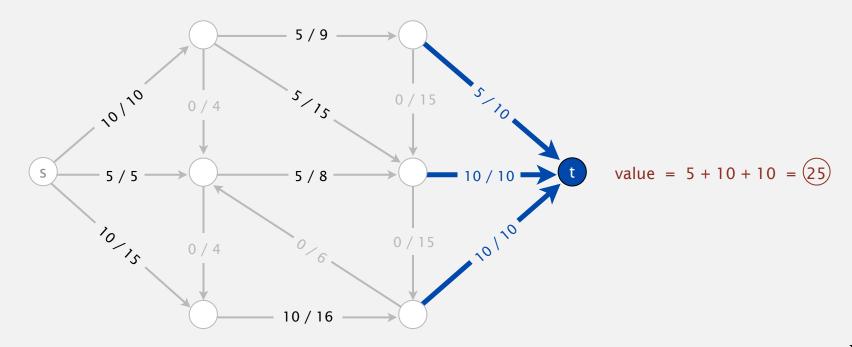
Maxflow problem

Def. An st-flow (flow) is an assignment of values to the edges such that:

- Capacity constraint: $0 \le \text{edge's flow} \le \text{edge's capacity}$.
- Local equilibrium: inflow = outflow at every vertex (except *s* and *t*).

Def. The value of a flow is the inflow at t.

we assume no edges point to s or from t



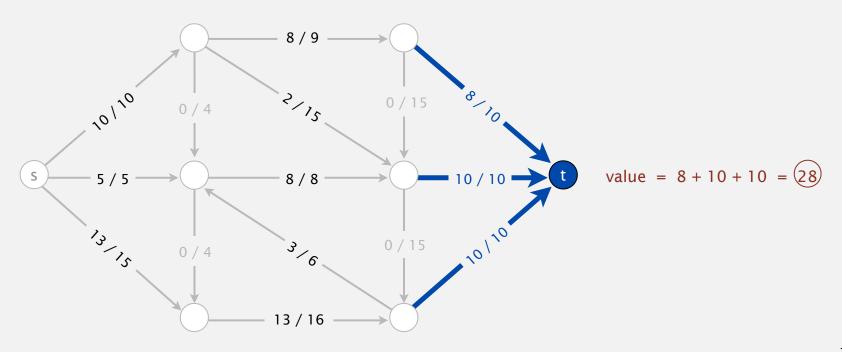
Maxflow problem

Def. An st-flow (flow) is an assignment of values to the edges such that:

- Capacity constraint: $0 \le \text{edge's flow} \le \text{edge's capacity}$.
- Local equilibrium: inflow = outflow at every vertex (except *s* and *t*).

Def. The value of a flow is the inflow at t.

Maximum st-flow (maxflow) problem. Find a flow of maximum value.

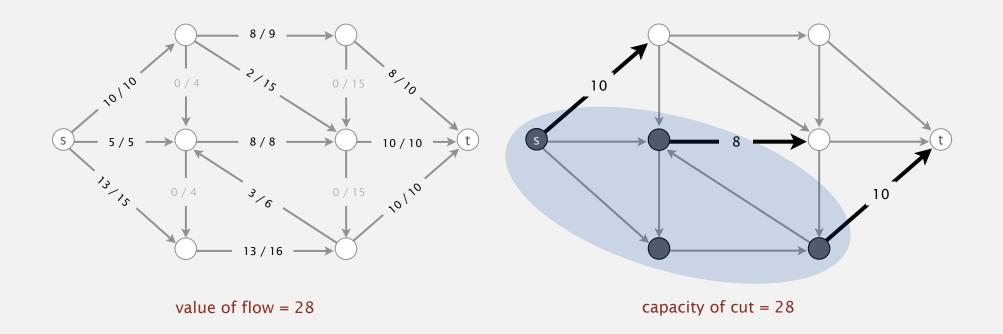


Summary

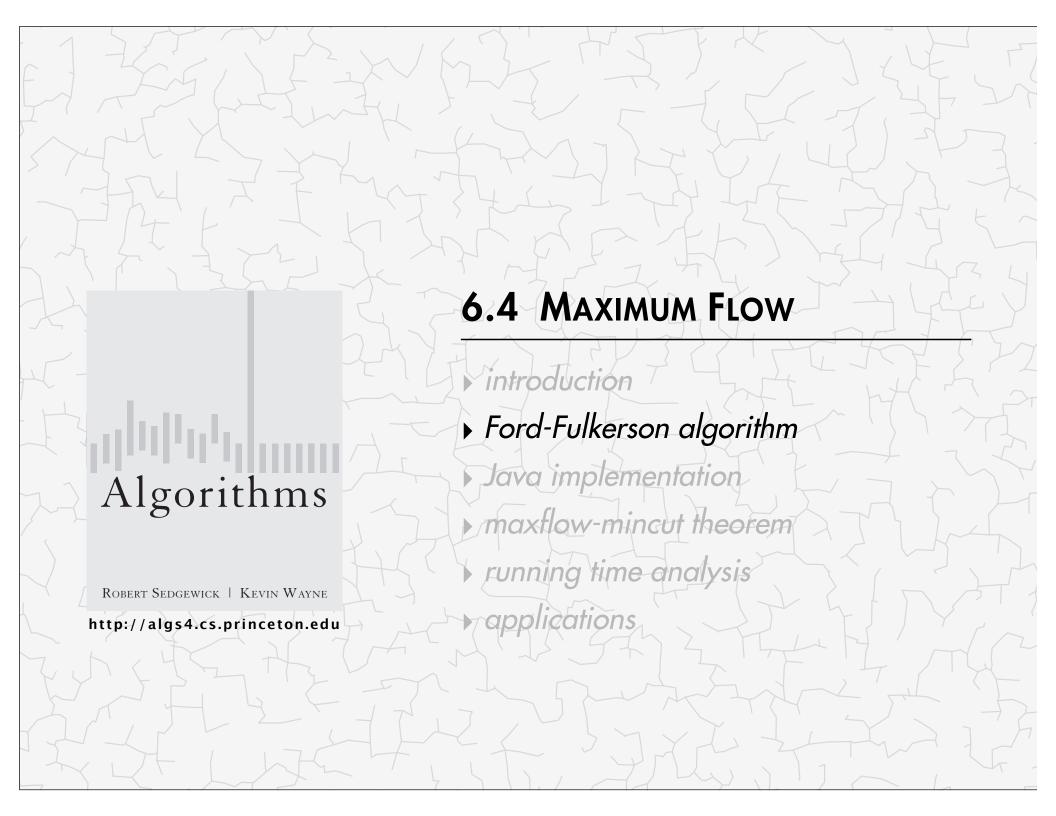
Input. A weighted digraph, source vertex s, and target vertex t.

Mincut problem. Find a cut of minimum capacity.

Maxflow problem. Find a flow of maximum value.

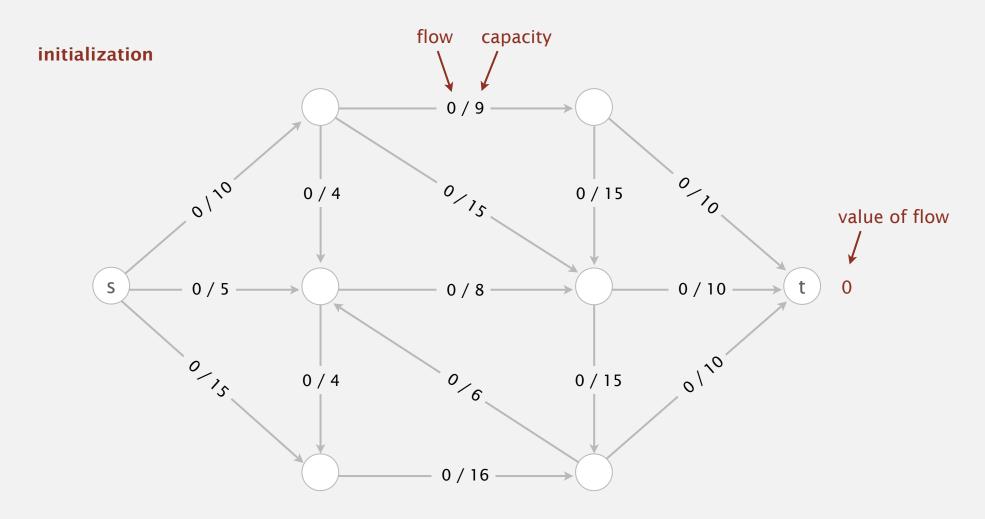


Remarkable fact. These two problems are dual!



Ford-Fulkerson algorithm

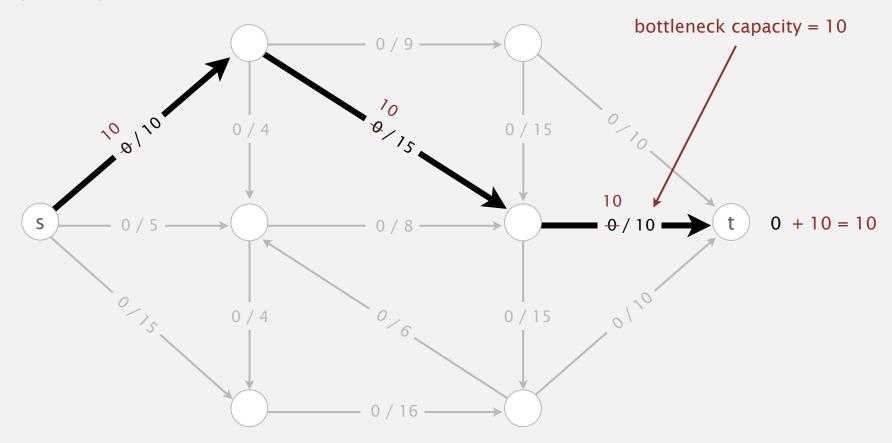
Initialization. Start with 0 flow.



Augmenting path. Find an undirected path from *s* to *t* such that:

- Can increase flow on forward edges (not full).
- Can decrease flow on backward edge (not empty).

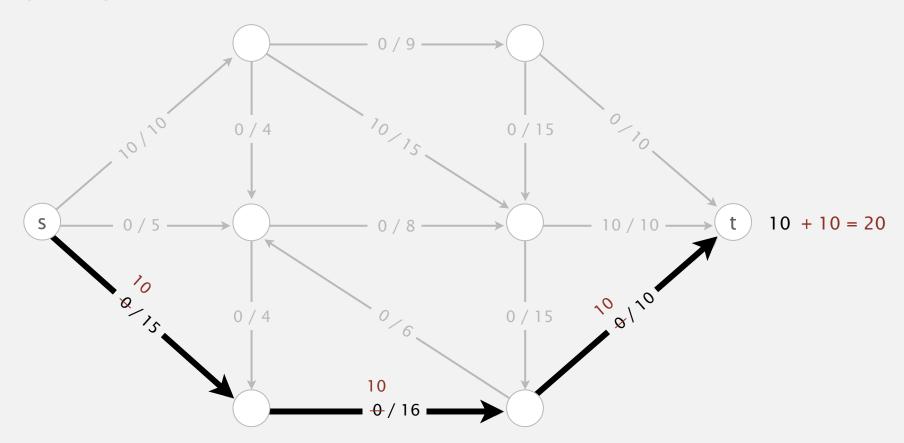
1st augmenting path



Augmenting path. Find an undirected path from *s* to *t* such that:

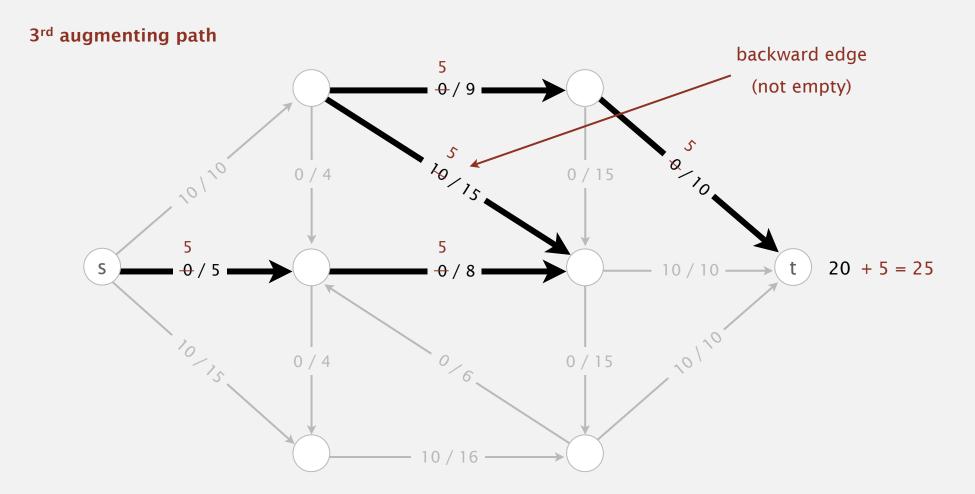
- Can increase flow on forward edges (not full).
- Can decrease flow on backward edge (not empty).

2nd augmenting path



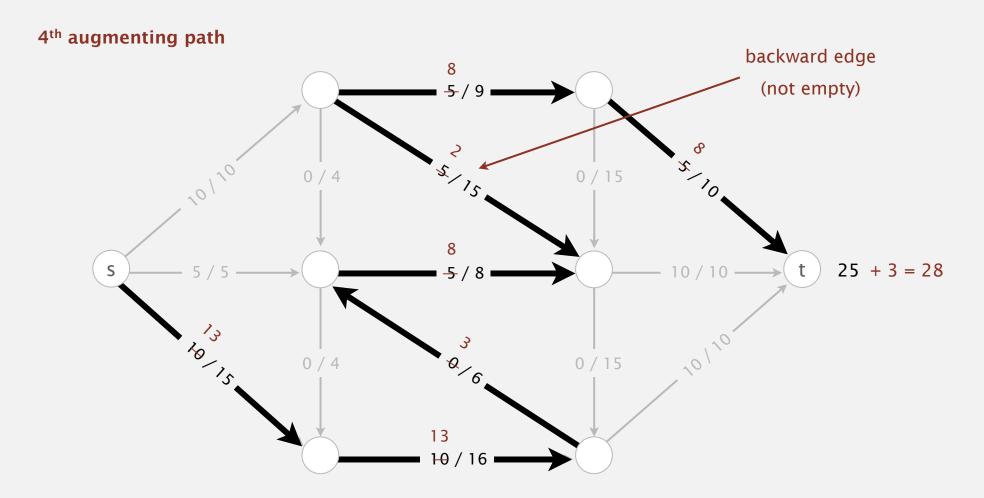
Augmenting path. Find an undirected path from *s* to *t* such that:

- Can increase flow on forward edges (not full).
- Can decrease flow on backward edge (not empty).



Augmenting path. Find an undirected path from *s* to *t* such that:

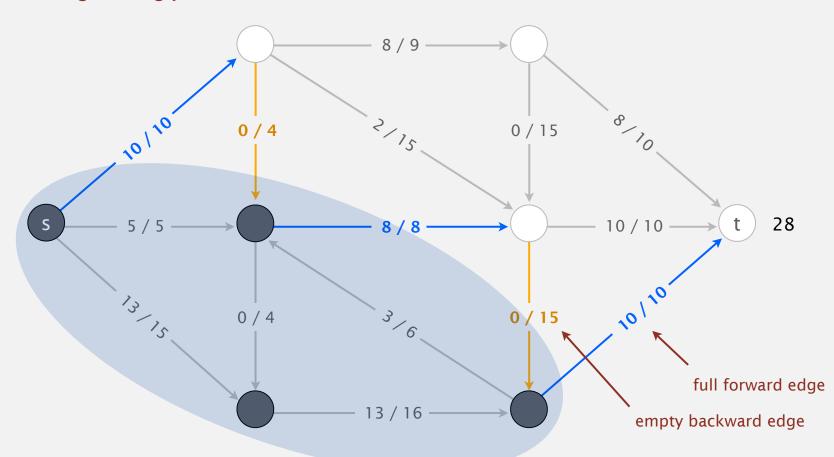
- Can increase flow on forward edges (not full).
- Can decrease flow on backward edge (not empty).



Termination. All paths from *s* to *t* are blocked by either a

- Full forward edge.
- Empty backward edge.

no more augmenting paths



Ford-Fulkerson algorithm

Ford-Fulkerson algorithm

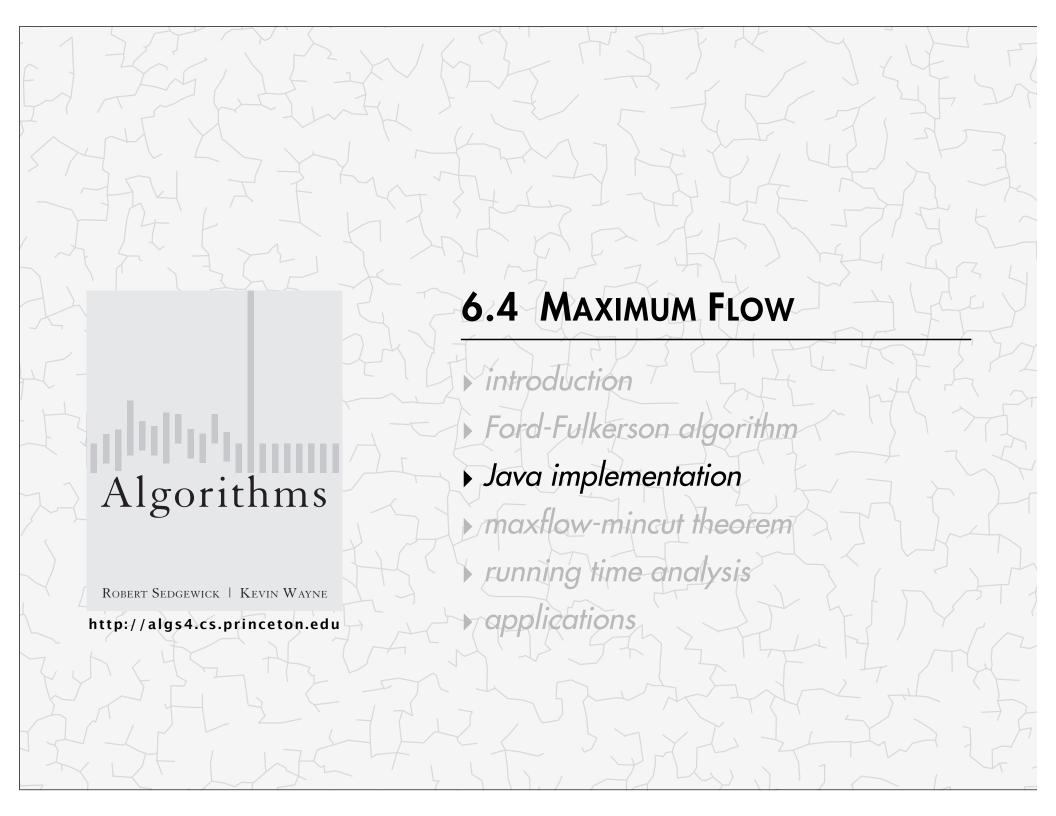
Start with 0 flow.

While there exists an augmenting path:

- find an augmenting path
- compute bottleneck capacity
- increase flow on that path by bottleneck capacity

Questions.

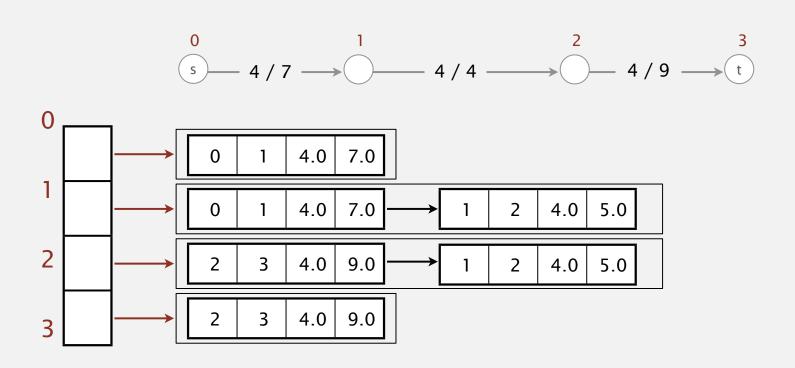
- How to find an augmenting path?
- If FF terminates, does it always compute a maxflow?
- How to compute a mincut?
- Does FF always terminate? If so, after how many augmentations?



```
public class FlowNetwork
                                                       same as EdgeWeightedGraph,
    private final int V;
                                                       but adjacency lists of
    private Bag<FlowEdge>[] adj;
                                                       FlowEdges instead of Edges
    public FlowNetwork(int V)
       this.V = V;
       adj = (Bag<FlowEdge>[]) new Bag[V];
       for (int v = 0; v < V; v++)
          adj[v] = new Bag<FlowEdge>();
    public void addEdge(FlowEdge e)
       int v = e.from();
       int w = e.to();
       adj[v].add(e);
                                                       add forward edge
       adj[w].add(e);
                                                       add backward edge
    public Iterable<FlowEdge> adj(int v)
    { return adj[v]; }
```

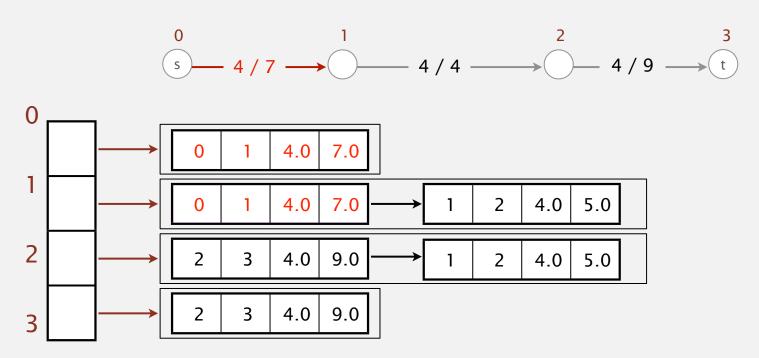
Ford-Fulkerson inspired details

• Both forward and backward edges are provided



Ford-Fulkerson inspired details

- Both forward and backward edges are provided.
- Edges can report their **residual capacity**.

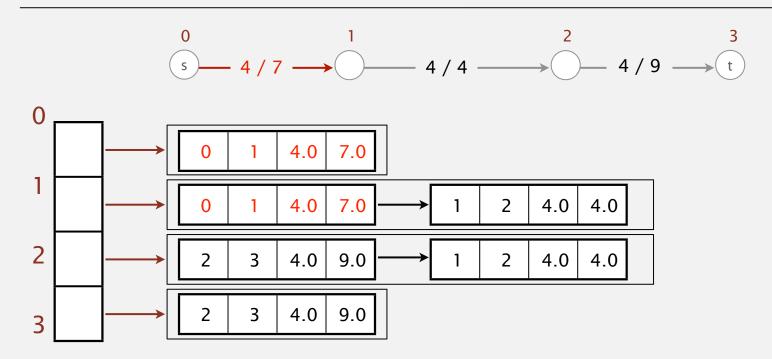


- e.edgeFrom(): 0 e.edgeTo(): 1
- e.residualCapacityTo(1): 3

Forward edge, residual capacity is capacity - flow

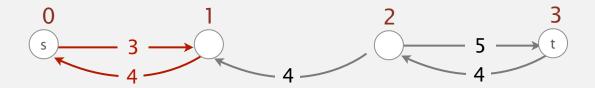
e.residualCapacityTo(0): 4

Backward edge, residual capacity is flow



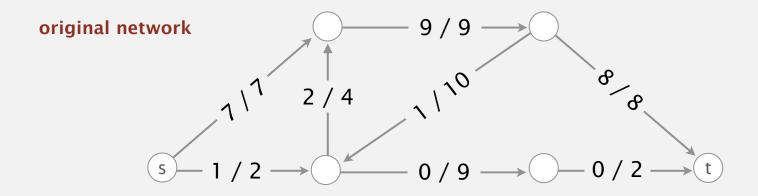
Residual Network

- Edge weighted digraph representing how much spare (used) capacity is available on a forward (backward) edge. If none, no edge.
- Represented *IMPLICITLY* by e.residualCapacityTo().



Residual Networks - Groups of 3

Draw the residual network corresponding to the graph below.



What is the result of the code below?

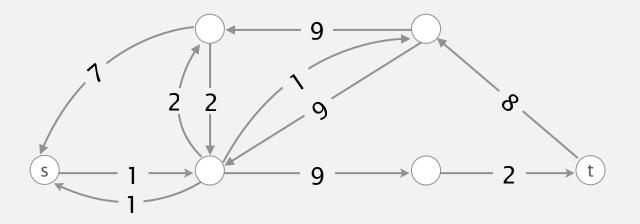
```
for (FlowEdge e : G.adj(s)) {
   int v = e.from(); int w = e.to();
   System.out.println(e.residualCapacityTo(w));
}
```

How can you find an augmenting path using the residual network graph?

Finding a shortest augmenting path (cf. breadth-first search)

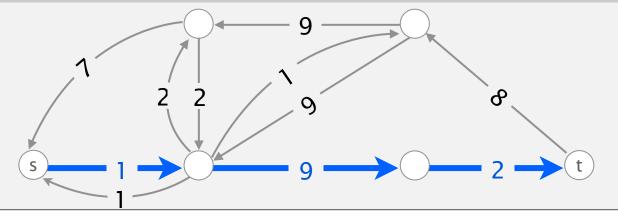
```
private boolean hasAugmentingPath(FlowNetwork G, int s, int t)
{
   edgeTo = new FlowEdge[G.V()];
   marked = new boolean[G.V()];

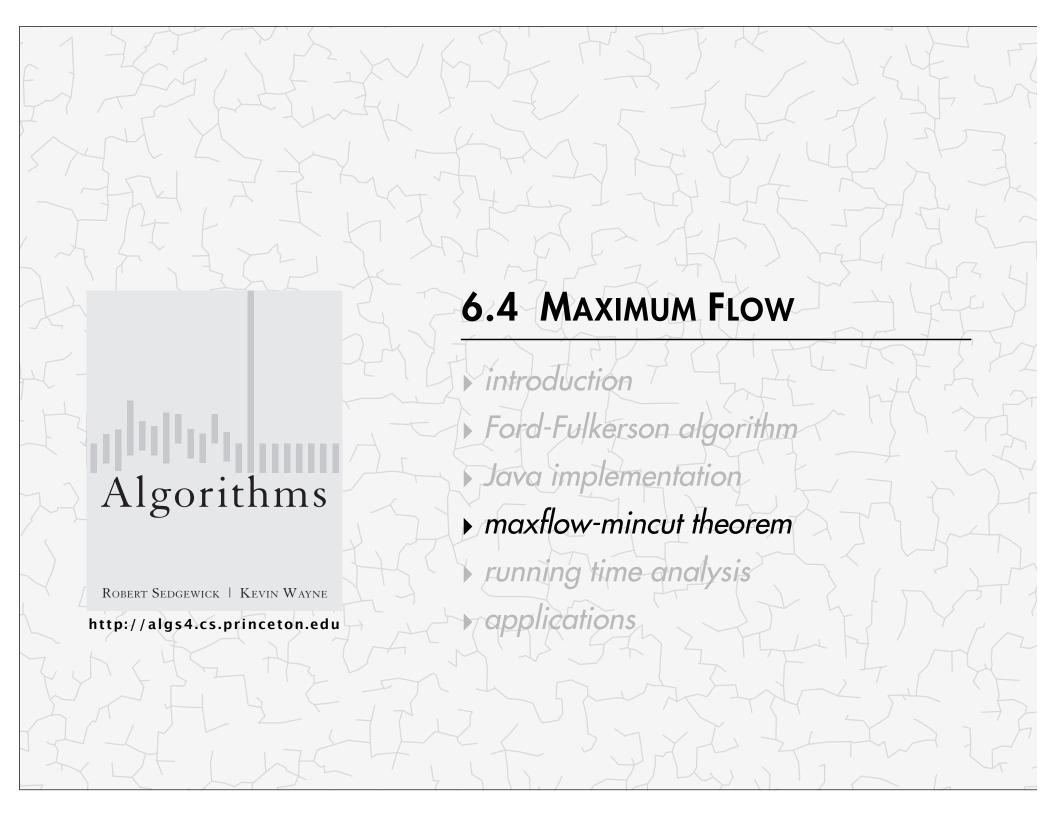
   Queue<Integer> queue = new Queue<Integer>();
}
```



Ford-Fulkerson: Java implementation

```
public class FordFulkerson
   private boolean[] marked; // true if s->v path in residual network
   private FlowEdge[] edgeTo; // last edge on s->v path
   private double value; // value of flow
   public FordFulkerson(FlowNetwork G, int s, int t)
      value = 0.0;
                                                             walk backwards from t
      while (hasAugmentingPath(G, s, t))
                                                             and compute
         double bottle = Double.POSITIVE_INFINITY;
                                                             bottleneck capacity
         for (int v = t; v != s; v = edgeTo[v].other(v))^*
            bottle = Math.min(bottle, edgeTo[v].residualCapacityTo(v));
         for (int v = t; v != s; v = edgeTo[v].other(v))
            edgeTo[v].addResidualFlowTo(v, bottle);
         value += bottle;
                                                            walk backwards from
                                                            t and augment flow
```





Ford-Fulkerson algorithm

Ford-Fulkerson algorithm

Start with 0 flow.

While there exists an augmenting path:

- find an augmenting path
- compute bottleneck capacity
- increase flow on that path by bottleneck capacity

Questions.

- How to find an augmenting path? BFS (or other).
- If FF terminates, does it always compute a maxflow?
- How to compute a mincut?
- Does FF always terminate? If so, after how many augmentations?

Maxflow-mincut theorem

Augmenting path theorem. A flow f is a maxflow iff no augmenting paths. Maxflow-mincut theorem. Value of the maxflow = capacity of mincut.

- Pf. The following three conditions are equivalent for any flow f:
 - i. There exists a cut whose capacity equals the value of the flow f.
- ii. f is a maxflow.
- iii. There is no augmenting path with respect to f.

Overall Goal:

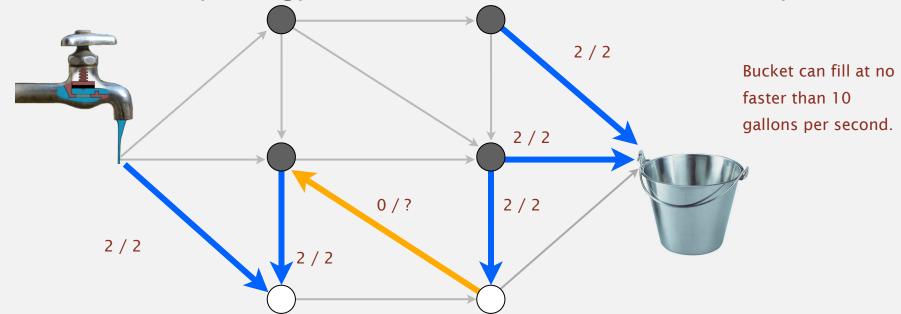
- Prove that $i \Rightarrow ii$. [Trivial]
- Prove that ii ⇒ iii. [Trivial]
- Prove that iii ⇒ i. [A little work]

Maxflow-mincut theorem

Augmenting path theorem. A flow f is a maxflow iff no augmenting paths. Maxflow-mincut theorem. Value of the maxflow = capacity of mincut.

- Pf. The following three conditions are equivalent for any flow f:
- i. There exists an st-cut whose capacity equals the value of the flow f.
- \blacktriangleright ii. f is a maxflow.
 - iii. There is no augmenting path with respect to f.

[$i \Rightarrow ii$]: Trivial by analogy with water flow [see slides for technical proof].



Maxflow-mincut theorem

Augmenting path theorem. A flow f is a maxflow iff no augmenting paths. Maxflow-mincut theorem. Value of the maxflow = capacity of mincut.

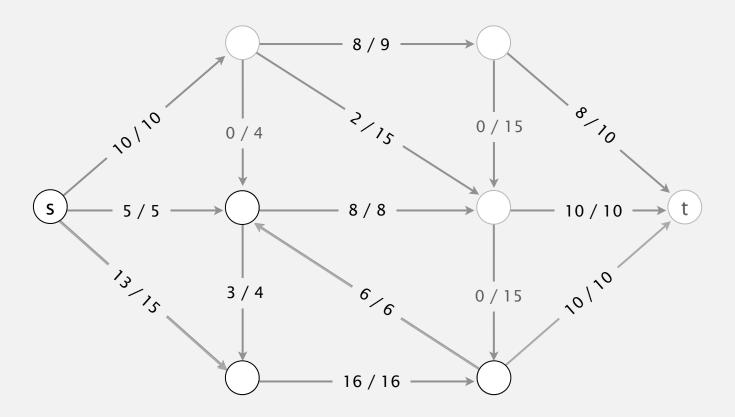
- Pf. The following three conditions are equivalent for any flow f:
 - i. There exists a cut whose capacity equals the value of the flow f.
- ii. f is a maxflow.
- iii. There is no augmenting path with respect to f.

```
[ii \Rightarrow iii] Trivial, we prove contrapositive: \simiii \Rightarrow \simii.
```

- Suppose that there is an augmenting path with respect to f.
- Can improve flow f by sending flow along this path.
- Thus, f is not a maxflow.

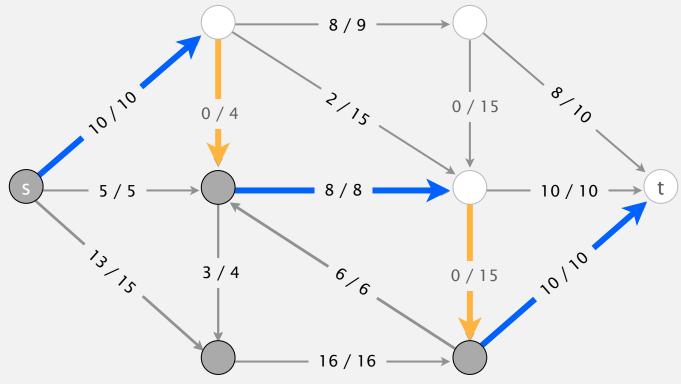
Computing a mincut from a maxflow

Find an augmenting path.



Computing a mincut from a maxflow

We've found a cut whose capacity equals the value of the flow.



Find an augmenting path.

- Couldn't find an augmenting path (some edges block us).
 - These edges form a cut.
 - There is no backward flow from t to s.
 - All edges from s to t are full.

Maxflow-mincut theorem

Augmenting path theorem. A flow f is a maxflow iff no augmenting paths. Maxflow-mincut theorem. Value of the maxflow = capacity of mincut.

Pf. The following three conditions are equivalent for any flow f:

i. There exists a cut whose capacity equals the value of the flow f.

ii. f is a maxflow.

iii. There is no augmenting path with respect to f.

Overall Goal:

Prove that i ⇒ ii. [Analogy with water, see slides for technical proof]

Prove that ii ⇒ iii. [Trivial by proving contrapositive]

Prove that iii ⇒ i. [By example, see slides for technical proof]

Ford-Fulkerson algorithm

Ford-Fulkerson algorithm

Start with 0 flow.

While there exists an augmenting path:

- find an augmenting path
- compute bottleneck capacity
- increase flow on that path by bottleneck capacity

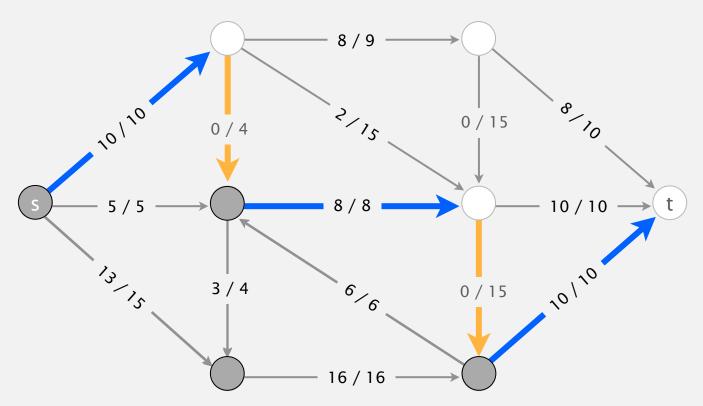
Questions.

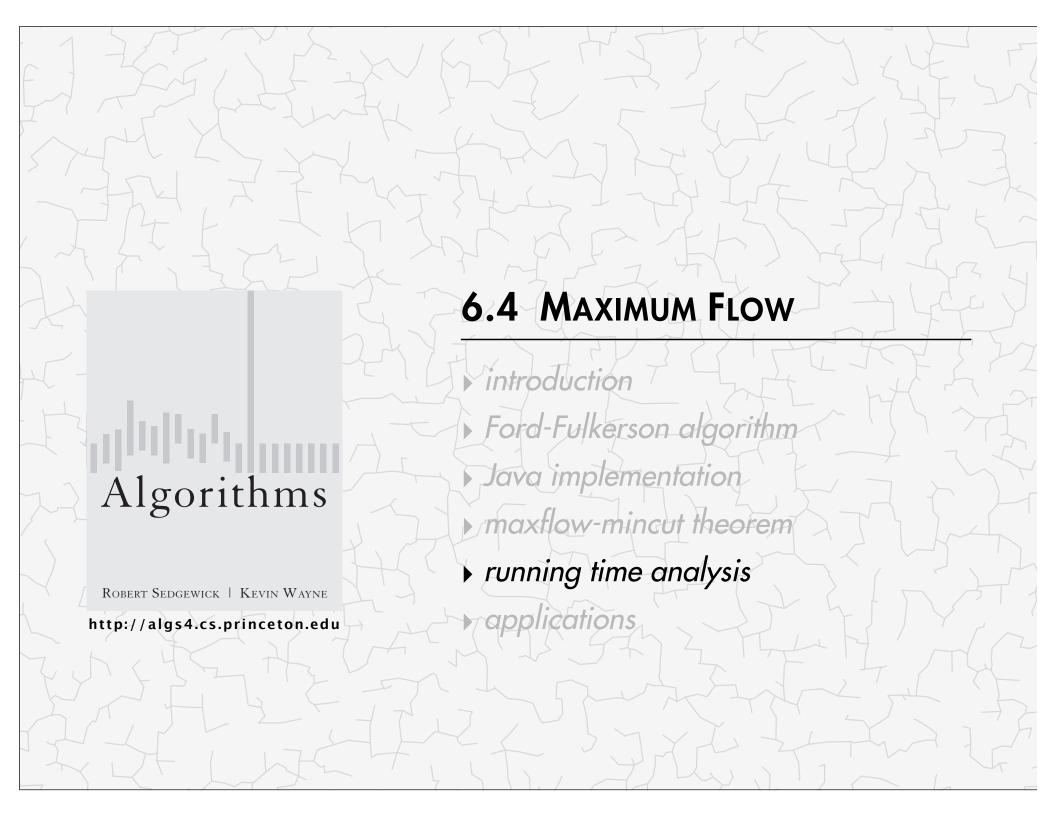
- How to find an augmenting path? BFS (or other).
- If FF terminates, does it always compute a maxflow?
 - Yes, because non-existence of augmenting path implies max flow.
 - $iii \Rightarrow i \Rightarrow ii$
- How to compute a mincut?
- Does FF always terminate? If so, after how many augmentations?

Computing a mincut from a maxflow

Find an augmenting path.

- Couldn't find an augmenting path (some edges block us).
 - These edges form a cut.
 - There is no backward flow from t to s.
 - All edges from s to t are full.
- We've found a cut whose capacity equals the value of the flow.





Ford-Fulkerson algorithm

Ford-Fulkerson algorithm

Start with 0 flow.

While there exists an augmenting path:

- find an augmenting path
- compute bottleneck capacity
- increase flow on that path by bottleneck capacity

Questions.

- How to find an augmenting path? BFS (or other).
- If FF terminates, does it always compute a maxflow? Yes. 🗸
- How to compute a mincut? Easy.
- Does FF always terminate? If so, after how many augmentations?

yes, provided edge capacities are integers (or augmenting paths are chosen carefully)

requires clever analysis

Ford-Fulkerson algorithm with integer capacities

Important special case. Edge capacities are integers between 1 and U.

flow on each edge is an integer

Invariant. The flow is integer-valued throughout Ford-Fulkerson.

Pf. [by induction]

- Bottleneck capacity is an integer.
- Flow on an edge increases/decreases by bottleneck capacity.

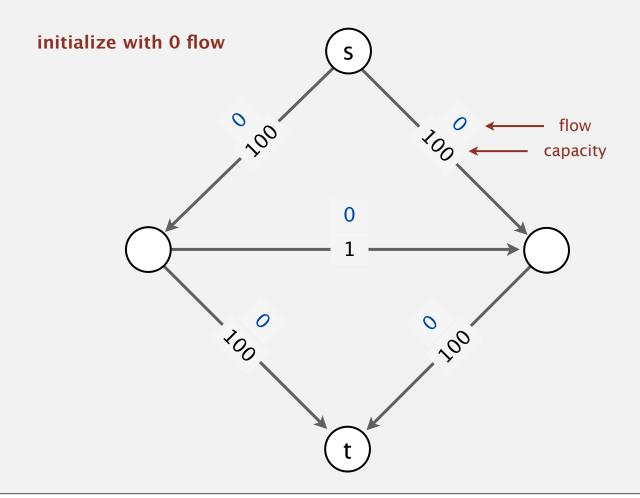
Proposition. Number of augmentations ≤ the value of the maxflow.

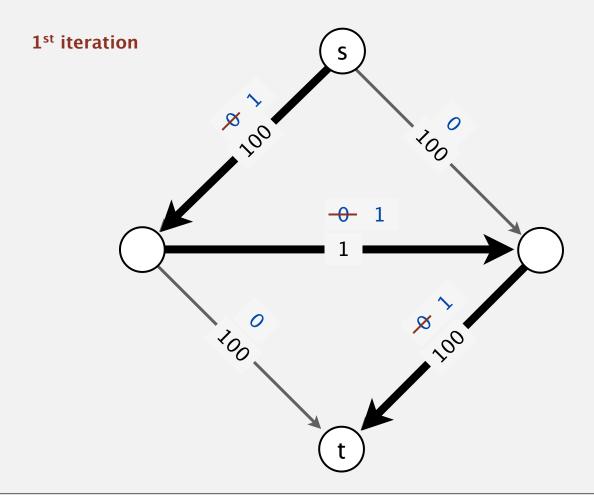
Pf. Each augmentation increases the value by at least 1.

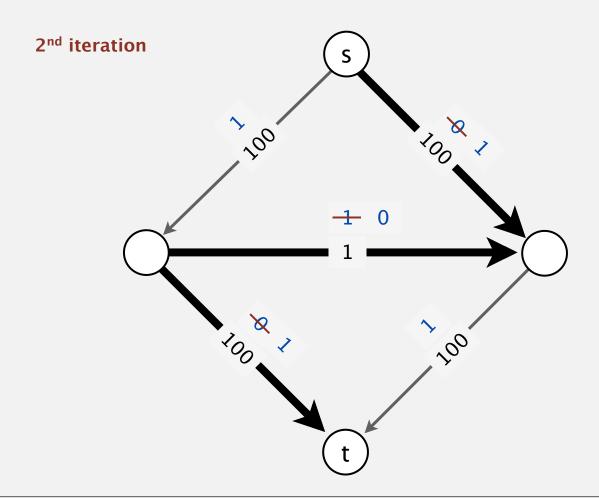
important for some applications (stay tuned) and FF finds one!

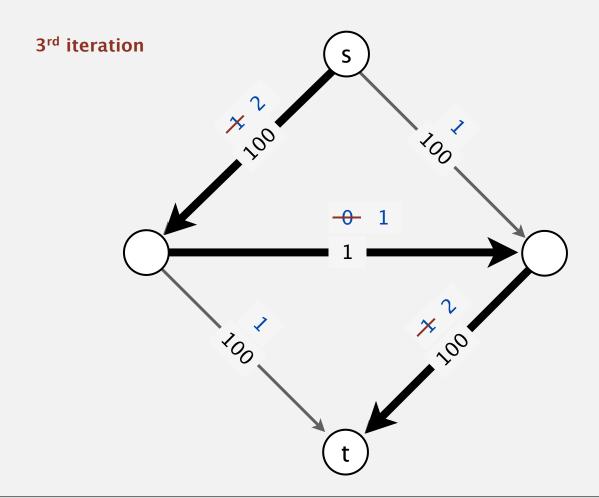
Integrality theorem. There exists an integer-valued maxflow.

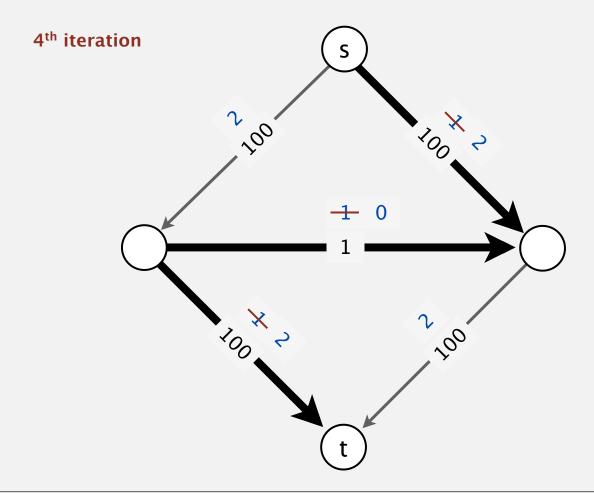
Pf. Ford-Fulkerson terminates and maxflow that it finds is integer-valued.





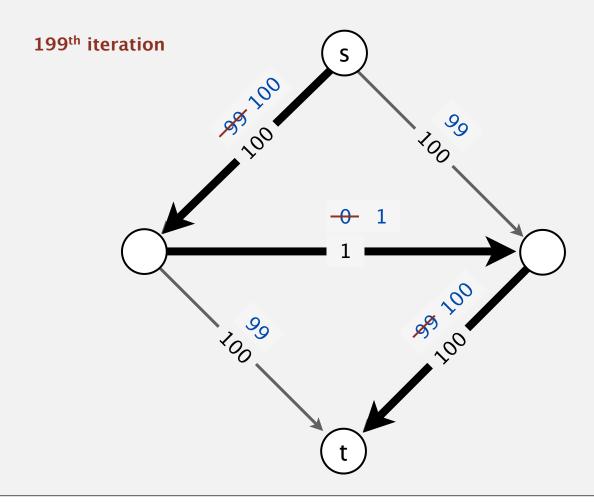


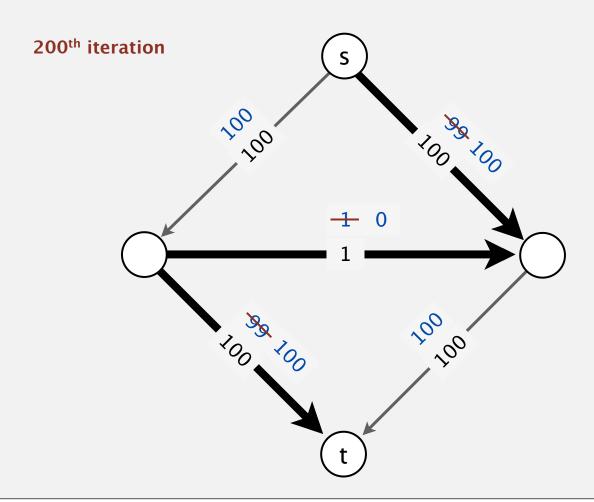




Bad news. Even when edge capacities are integers, number of augmenting paths could be equal to the value of the maxflow.

• • •

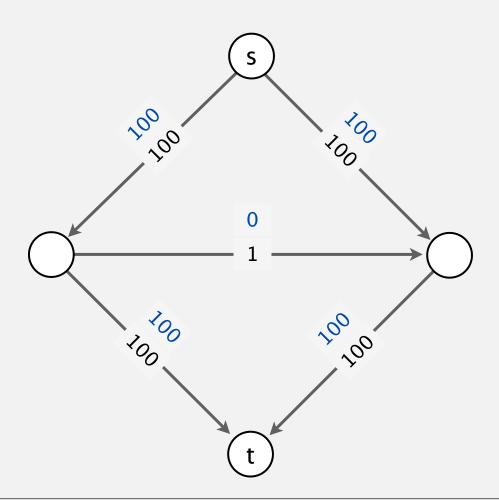




Bad news. Even when edge capacities are integers, number of augmenting paths could be equal to the value of the maxflow.

can be exponential in input size

Good news. This case is easily avoided. [use shortest/fattest path]

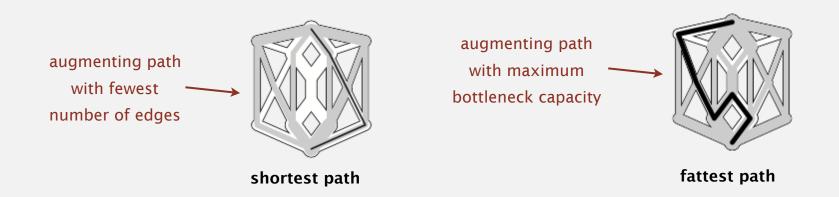


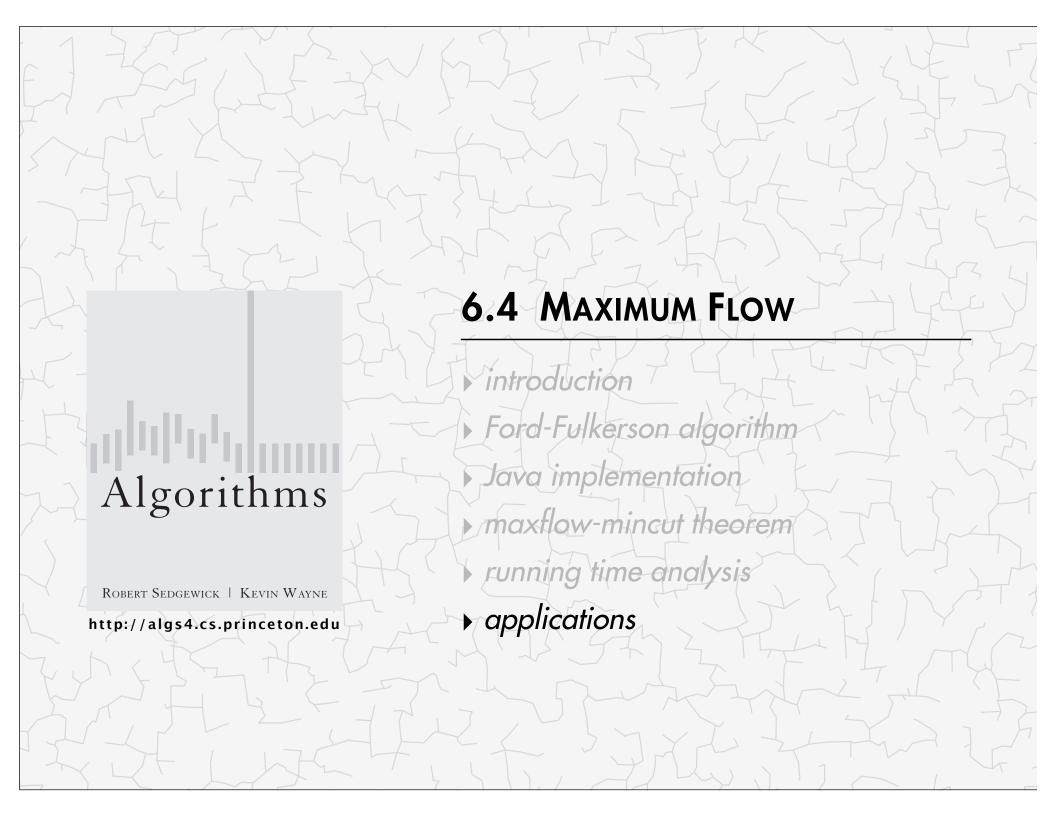
How to choose augmenting paths?

FF performance depends on choice of augmenting paths.

augmenting path	number of paths	implementation
DFS path	≤ E U	stack (DFS)
fattest path	≤ E In(E U)	priority queue
shortest path	≤ ½ E V	queue (BFS)

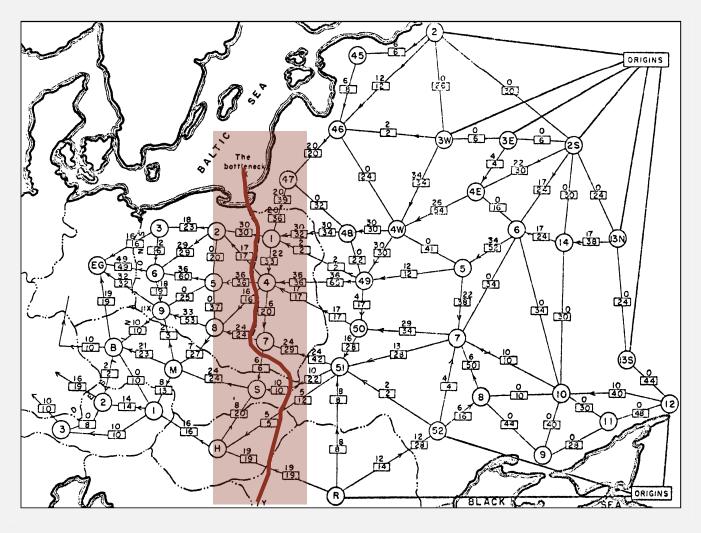
digraph with V vertices, E edges, and integer capacities between 1 and U





Mincut application (RAND Corporation - 1950s)

"Free world" goal. Cut supplies (if cold war turns into real war).

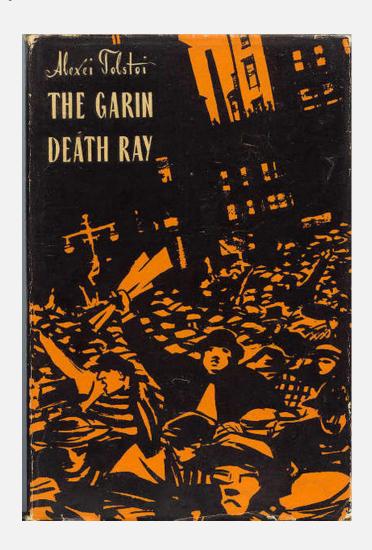


rail network connecting Soviet Union with Eastern European countries (map declassified by Pentagon in 1999)

Maxflow application (1950s)

Soviet Union goal. Maximize flow of supplies to Eastern Europe.

- Originally studied by writer Alexei Tolstoi in the 1930s (ad hoc approach).
- Later considered by Ford & Fulkerson via min cut approach.



Maxflow and mincut applications

Maxflow/mincut is a widely applicable problem-solving model.

- Data mining.
- Open-pit mining.
- Bipartite matching.
- Network reliability.
- Baseball elimination.
- Image segmentation.
- Network connectivity.
- Distributed computing.
- Security of statistical data.
- Egalitarian stable matching.
- Multi-camera scene reconstruction.
- Sensor placement for homeland security.
- Many, many, more.



liver and hepatic vascularization segmentation

Bipartite matching problem

N comrades apply for N jobs.



Each gets several offers.



Is there a way to match all comrades to jobs?



bipartite matching problem

1	Akakiy	6	Agitprop
	Agitprop		Akakiy
	Defense		Boris
	Justice		Izolda
2	Boris	7	Defense
	Agitprop		Akakiy
	Defense		Boris
3	Izolda		Izolda
	Agitprop		Polina
	Information	8	Information
	Justice		Izolda
4	Polina	9	Justice
	Agitprop		Akakiy
	Literacy		Izolda
5	Yaroslav	10	Literacy
	Agitprop		Polina
	Literacy		Yaroslav

Bipartite matching problem

Given a bipartite graph, find a perfect matching.

- Task (Groups of 3): How do you cast this problem as a max-flow problem?
- Extra: What does the mincut tell us?

perfect matching (solution)

Akakiy — Agitprop

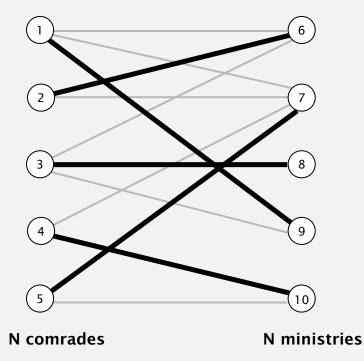
Boris — Defense

Izolda — Information

Polina — Justice

Yaroslav — Literacy

bipartite graph



bipartite matching problem

1 Akakiy 6 Agitprop Agitprop Akakiy Defense Boris Izolda Justice 2 Boris 7 Defense Agitprop Akakiy Defense Boris 3 Izolda Izolda Polina Agitprop Information 8 Information Izolda lustice 4 Polina 9 Justice Akakiy Agitprop Izolda Literacy 5 Yaroslav 10 Literacy Agitprop Polina Yaroslav Literacy

Network flow formulation of bipartite matching

- Create *s*, *t*, one vertex for each comrade, and one vertex for each ministry.
- Add edge from *s* to each comrade (capacity 1).
- Add edge from each ministry to t (capacity 1).

flow network

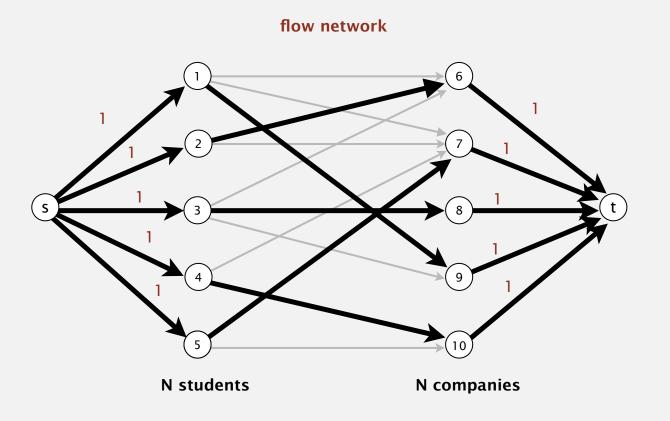
Add edge from comrade to each job offered (infinite capacity).

bipartite matching problem

1	Akakiy	6	Agitprop
	Agitprop		Akakiy
	Defense		Boris
	Justice		Izolda
2	Boris	7	Defense
	Agitprop		Akakiy
	Defense		Boris
3	Izolda		Izolda
	Agitprop		Polina
	Information	8	Information
	Justice		Izolda
4	Polina	9	Justice
	Agitprop		Akakiy
	Literacy		Izolda
5	Yaroslav	10	Literacy
	Agitprop		Polina
	Literacy		Yaroslav

Network flow formulation of bipartite matching

1-1 correspondence between perfect matchings in bipartite graph and integer-valued maxflows of value N.

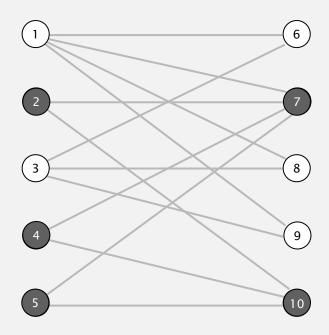


bipartite matching problem

1 Akakiy 6 Agitprop **Akakiy** Agitprop Defense Boris Justice Izolda 2 Boris 7 Defense Agitprop Akakiy Defense Boris 3 Izolda Izolda Polina Agitprop Information 8 Information lustice Izolda 4 Polina 9 Justice Agitprop Akakiy Izolda Literacy 5 Yaroslav 10 Literacy Polina Agitprop Yaroslav Literacy

What the mincut tells us

Goal. When no perfect matching, explain why.



no perfect matching exists

$$SC = \{ 2, 4, 5 \}$$

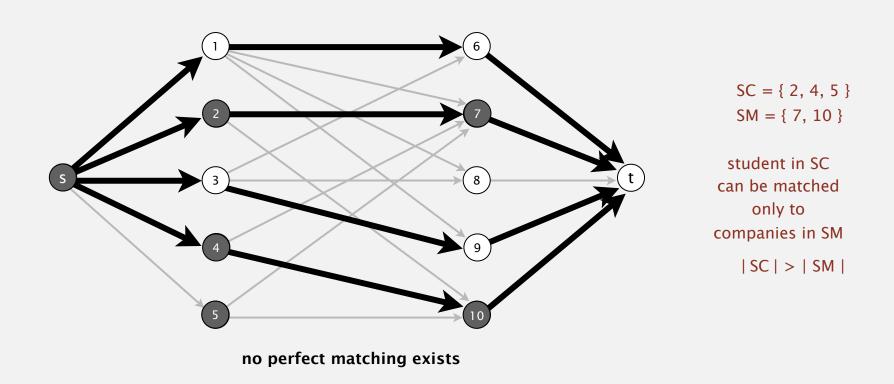
 $SM = \{ 7, 10 \}$

Comrade in SC can be matched only to ministries in SM

What the mincut tells us

Mincut. Consider mincut (A, B).

- Let SC =comrades on s side of cut.
- Let *SM* = ministries on *s* side of cut.
- Fact: |SC| > |SM|; comrades in SC can be matched only to ministries in SM.



Bottom line. When no perfect matching, mincut explains why.

Baseball elimination problem

Q. Which teams have a chance of finishing the season with the most wins?

i		team	wins	losses	to play	ATL	PHI	NYM	MON
0	A	Atlanta	83	71	8	_	1	6	1
1	Phillips	Philly	80	79	3	1	_	0	2
2	Mets	New York	78	78	6	6	0	_	0
3	PPOS	Montreal	77	82	3	1	2	0	-

Montreal is mathematically eliminated.

- Montreal finishes with ≤ 80 wins.
- Atlanta already has 83 wins.

Baseball elimination problem

Q. Which teams have a chance of finishing the season with the most wins?

i		team	wins	losses	to play	ATL	PHI	NYM	MON
0	A	Atlanta	83	71	8	-	1	6	1
1	Phillips	Philly	80	79	3	1	-	0	2
2	Mets	New York	78	78	6	6	0	-	0
3	PAPOS	Montreal	77	82	3	1	2	0	-

Philadelphia is mathematically eliminated.

- Philadelphia finishes with ≤ 83 wins.
- Either New York or Atlanta will finish with ≥ 84 wins.

Observation. Answer depends not only on how many games already won and left to play, but on whom they're against.

Baseball elimination problem

Q. Which teams have a chance of finishing the season with the most wins?

i		team	wins	losses	to play	NYY	BAL	BOS	TOR	DET
0	Vanfrees	New York	75	59	28	-	3	8	7	3
1	E TO LES	Baltimore	71	63	28	3	-	2	7	4
2	OSTOP PID SOS	Boston	69	66	27	8	2	-	0	0
3	SONT OF THE PROPERTY OF THE PR	Toronto	63	72	27	7	7	0	-	0
4	O TROIT	Detroit	49	86	27	3	4	0	0	-

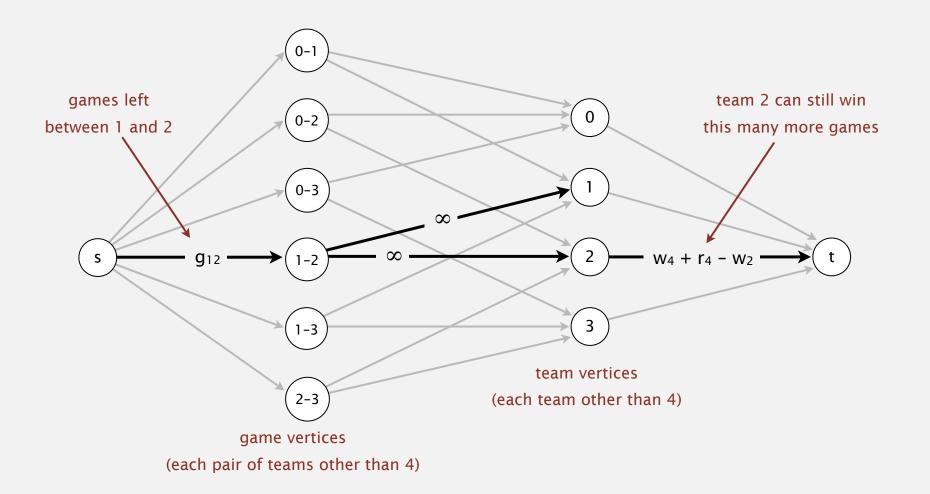
AL East (August 30, 1996)

Detroit is mathematically eliminated.

- Detroit finishes with ≤ 76 wins.
- Wins for $R = \{ NYY, BAL, BOS, TOR \} = 278.$
- Remaining games among { NYY, BAL, BOS, TOR } = 3 + 8 + 7 + 2 + 7 = 27.
- Average team in R wins 305/4 = 76.25 games.

Baseball elimination problem: maxflow formulation

Intuition. Remaining games flow from s to t.



Fact. Team 4 not eliminated iff all edges pointing from s are full in maxflow.

Maximum flow algorithms: theory

(Yet another) holy grail for theoretical computer scientists.

year	method	worst case	discovered by
1951	simplex	E ³ U	Dantzig
1955	augmenting path	E ² U	Ford-Fulkerson
1970	shortest augmenting path	E ³	Dinitz, Edmonds-Karp
1970	fattest augmenting path	E ² log E log(EU)	Dinitz, Edmonds-Karp
1977	blocking flow	E 5/2	Cherkasky
1978	blocking flow	E 7/3	Galil
1983	dynamic trees	E ² log E	Sleator-Tarjan
1985	capacity scaling	E ² log U	Gabow
1997	length function	E ^{3/2} log E log U	Goldberg-Rao
2012	compact network	E ² / log E	Orlin
?	?	Е	?

maxflow algorithms for sparse digraphs with E edges, integer capacities between 1 and U

Maximum flow algorithms: practice

Warning. Worst-case order-of-growth is generally not useful for predicting or comparing maxflow algorithm performance in practice.

Best in practice. Push-relabel method with gap relabeling: $E^{3/2}$.

On Implementing Push-Relabel Method for the Maximum Flow Problem

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Abstract. We study efficient implementations of the push-relabel method for the maximum flow problem. The resulting codes are faster than the previous codes, and much faster on some problem families. The speedup is due to the combination of heuristics used in our implementations. We also exhibit a family of problems for which the running time of all known methods seem to have a roughly quadratic growth rate.



JOURNAL OF OPERATIONAL RESEARCH

EUROPEAN

European Journal of Operational Research 97 (1997) 509-542

Theory and Methodology

Computational investigations of maximum flow algorithms

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Received 30 August 1995; accepted 27 June 1996

Summary

Mincut problem. Find an st-cut of minimum capacity.

Maxflow problem. Find an st-flow of maximum value.

Duality. Value of the maxflow = capacity of mincut.

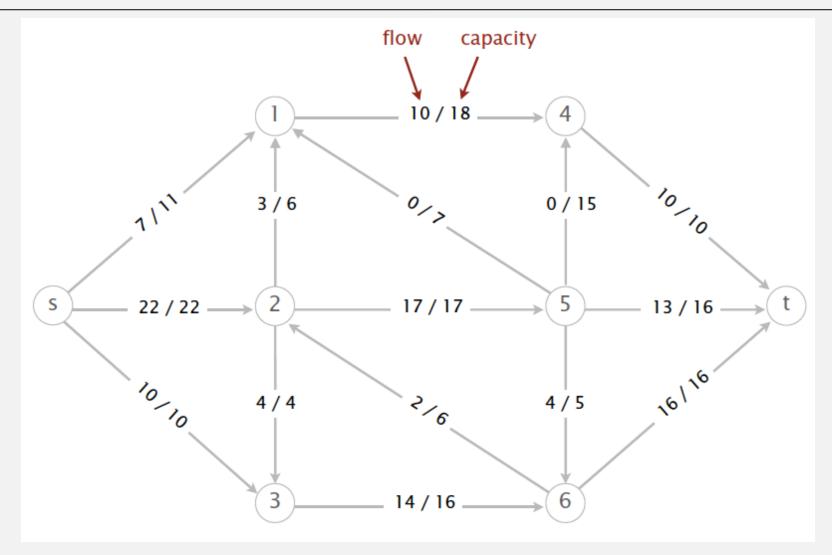
Proven successful approaches.

- Ford-Fulkerson (various augmenting-path strategies).
- Preflow-push (various versions).

Open research challenges.

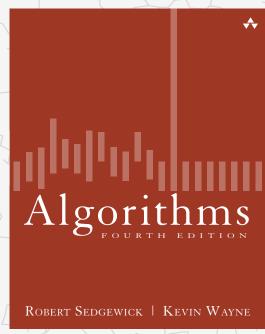
- Practice: solve real-word maxflow/mincut problems in linear time.
- Theory: prove it for worst-case inputs.
- Still much to be learned!

Old exam problem



- 1. Perform one iteration of Ford-Fulkerson
- 2. What is the value of the maximum flow?
- 3. List the vertices on the s side of the minimum cut.

Algorithms



http://algs4.cs.princeton.edu

6.4 MAXIMUM FLOW

- introduction
- Ford-Fulkerson algorithm
- Java implementation
- maxflow-mincut theorem
- running time analysis
- applications