

**CSE 417**

**Network Flows (pt 2)**

**Modeling with Max Flow**

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UNIVERSITY *of* WASHINGTON



# **Reminders**

## **> HW6 is due on Friday**

- start early
- may take time to figure out the sub-structure



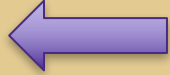
# Review of last lecture

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- > Defined the maximum flow problem
  - find the feasible flow of maximum value
  - flow is feasible if it satisfies edge capacity and node balance constraints
- > Described the Ford-Fulkerson algorithm
  - starts with a feasible flow (all zeros) and improves it (by augmentations)
  - non-greedy: augmentations can *undo* flow added by previous augmentations
  - essentially optimal if max capacity on edges into  $t$  is  $O(1)$
  - have not yet proven it correct...
- > Many, many other algorithms...



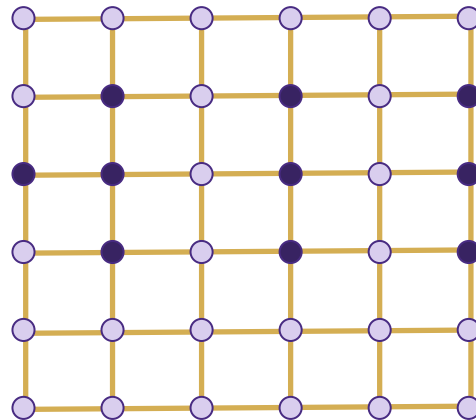
## **Outline for Today**

- > **Escape Problem** 
- > **Covering with Dominos**
- > **Token Placing**
- > **Processor Scheduling**
- > **Airline Scheduling**

**W**

# Escape Problem

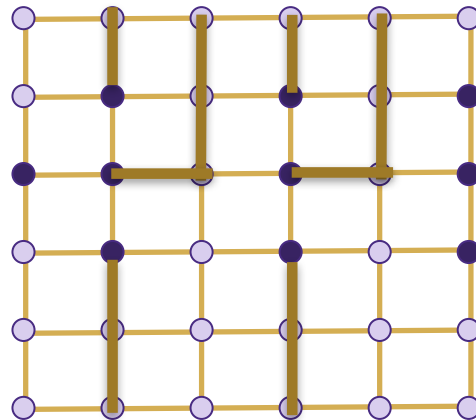
- > **Problem:** Given a set of points  $(x_1, y_1), \dots, (x_n, y_m)$  on an  $n \times n$  grid, determine whether there exists a set of paths along grid lines from each of the points to the boundary that *do not intersect*



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# Escape Problem Example

This example has a solution:

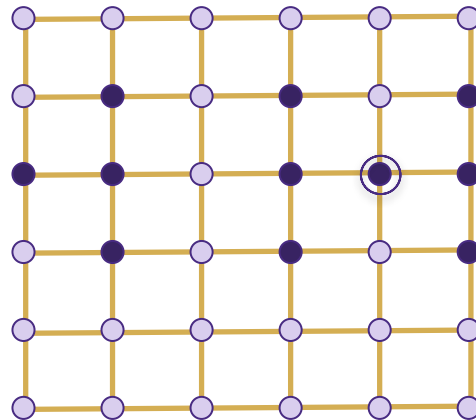


from "Introduction to Algorithms"



# Escape Problem Example 2

This example does not:



from "Introduction to Algorithms"







# Robber Problem

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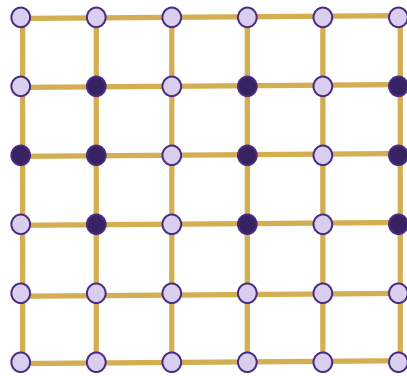
- > **Problem:** Bank robbers are planning to rob a number of banks around the city at exactly the same time. They will be pursued by the police as they flee. Find *escape routes* for the robbers that do not use any of the same roads or intersections.
  - (one robber doesn't want to run into the police chasing another robber)
- > Other assumptions:
  - city map is given as a graph with intersections as nodes and roads as edges
  - can assume all the banks are at the corners of intersections



# Robber Problem

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- > Generalization of the previous problem...
- > Here's what it might look like if the streets are a grid:

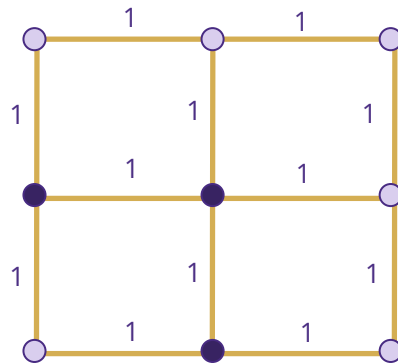


- > (from an ACM programming contest ~1997)



# Robber Problem

- > Solve by modeling with max flow:
  - roads become edges (in both direction) with capacity 1

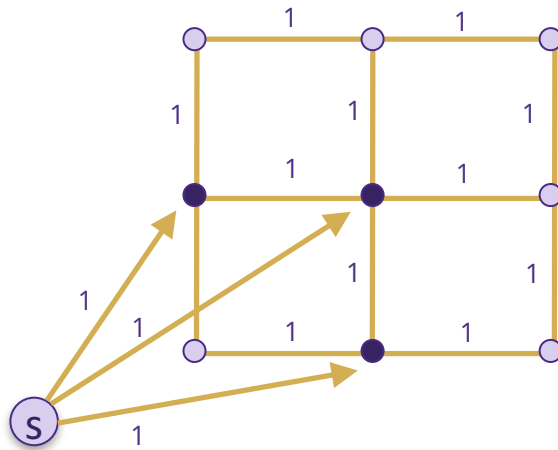


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# Robber Problem

> Solve by modeling with max flow:

- roads become edges (in both direction) with capacity 1
- source node has edges to each bank with capacity 1

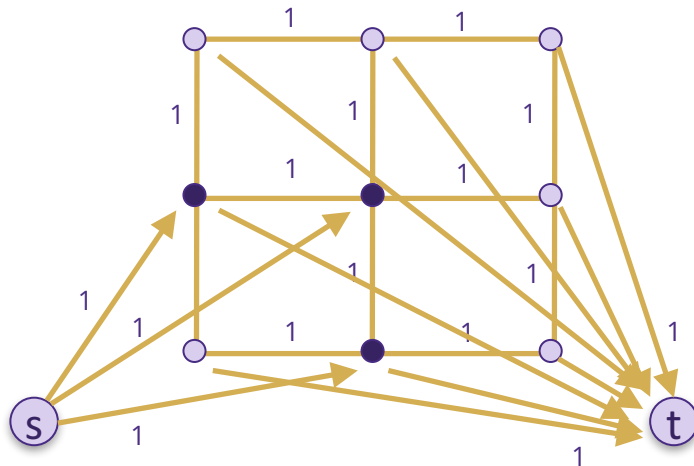


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# Robber Problem

> Solve by modeling with max flow:

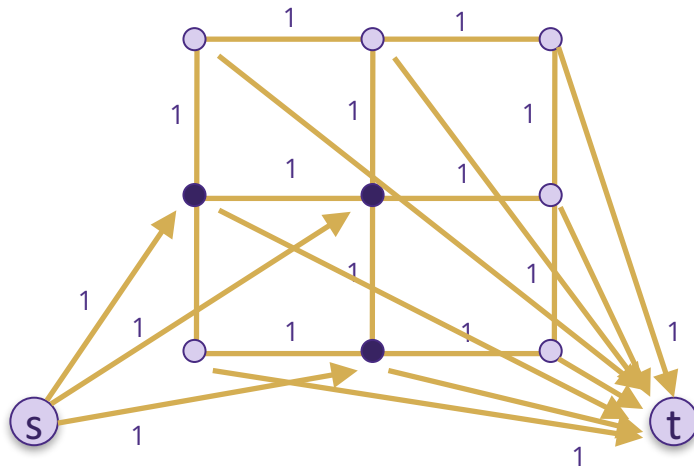
- roads become edges (in both direction) with capacity 1
- source node has edges to each bank with capacity 1
- edges from boundary nodes to the sink with capacity 1



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# Robber Problem

- > Solve by modeling with max flow
- > Has a solution iff the max flow equals the number of robbers



**W**

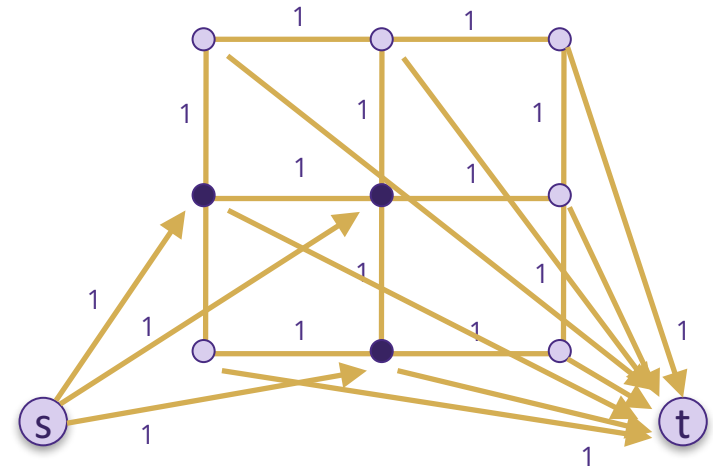
# Robber Problem

> Solve by modeling with max flow

> Has a solution iff the max flow equals the number of robbers:

- can assume flow is  $\{0, 1\}$  on each edge — (by F-F)
- flow on each edge  $(s,u)$  gives a path from  $u$  to the boundary...
  - > flow into  $u$  on  $(s,u)$  leaves on some edge  $(u,v)$
  - > flow into  $v$  on  $(u,v)$  leaves on some edge  $(v,w)$
  - > can only stop with an edge  $(z,t)$ , and  $z$  is a boundary node by construction
- two paths using the same edge would violate edge capacity

 (not as obvious as it sounds...)



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# Robber Problem

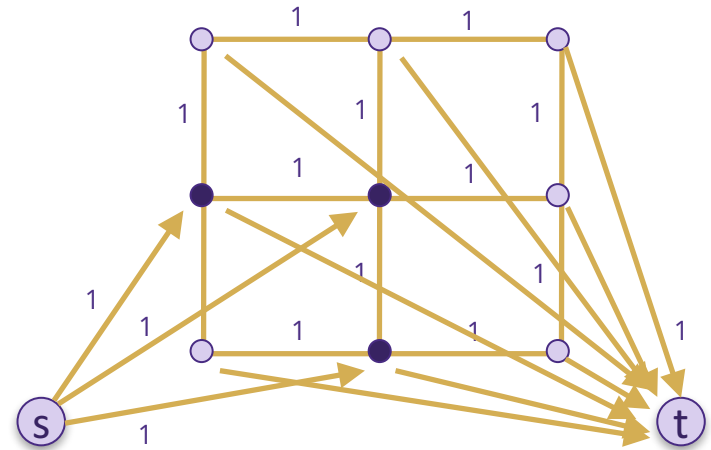
> Solve by modeling with max flow

> Has a solution iff the max flow equals the number of robbers

> **Q:** What's missing?

> **A:** Two paths could use the same intersection!

- as long as the paths enter and leave via different edges, it would be allowed
- somehow need to put a capacity on nodes also

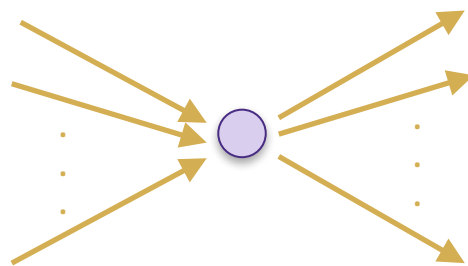


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# Node Capacity Constraints

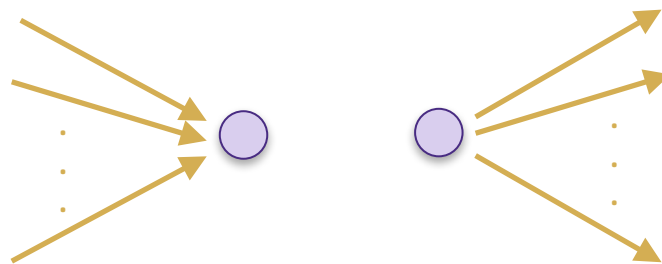
- > These are easy to add to any max flow problem
- > Consider any node...
  - it has some number of incoming edges and outgoing edges



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# Node Capacity Constraints

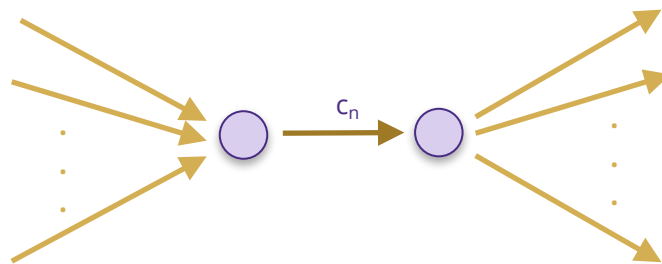
- > These are easy to add to any max flow problem
- > Consider any node...
  - split it into two parts
  - one part for incoming edges and one for outgoing edges



**W**

# Node Capacity Constraints

- > These are easy to add to any max flow problem
- > Consider any node...
  - split it into two parts
  - one part for incoming edges and one for outgoing edges
  - add edge between them with capacity for the node



**W**

# Node Capacity Constraints

- > These are easy to add to any max flow problem
- > Consider any node...
  - split it into two parts
  - one part for incoming edges and one for outgoing edges
  - add edge between them with capacity for the node
- > All flow through the node now goes through this internal edge
- > That allows us to limit the total flow using the node
  - node balance constraint is preserved...
  - flow balance constraint on the two nodes tell us:  
flow into the first node = flow along internal edge = flow out of the second node



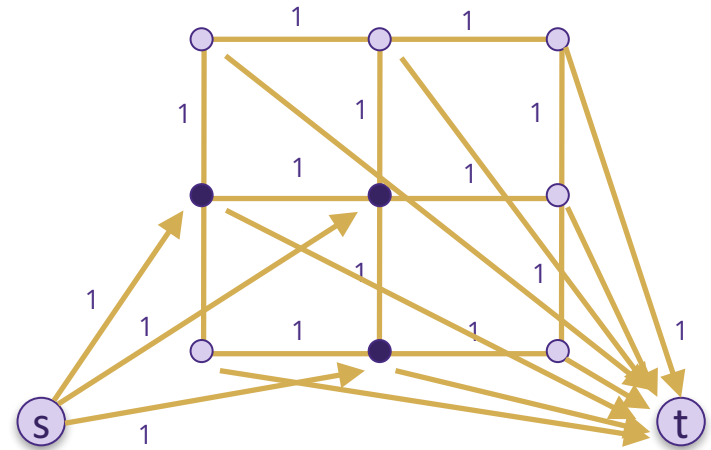
# Robber Problem

> Solve by modeling with max flow

- previous construction
- plus node capacities of 1

> Has a solution iff the max flow equals the number of robbers

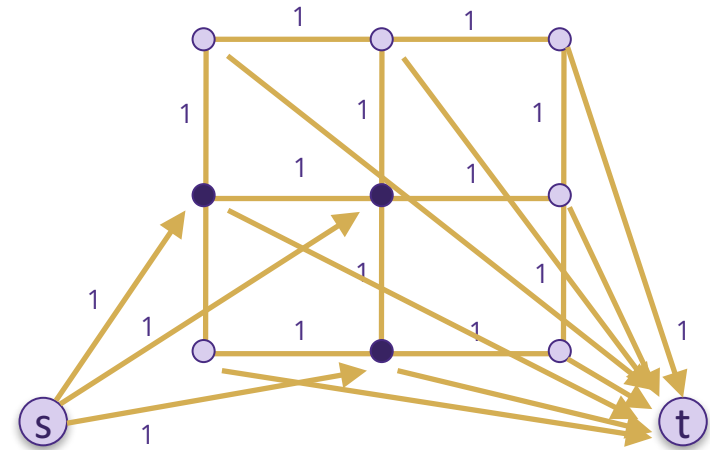
- already proved that paths must be edge-disjoint
- node capacity means paths must be node-disjoint as well



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# Robber Problem


- > Solve by modeling with max flow
  - previous construction
  - plus node capacities of 1



- > Has a solution iff the max flow equals the number of robbers
  - we have shown that this properly models the robber problem:
    - > every solution to the robber problem corresponds to a flow of value #robbers
    - > every 0/1 flow of value #robbers encodes escape paths for all robbers
- > Ford-Fulkerson runs in  $O(nm)$  time since  $U = 1$

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## **Outline for Today**

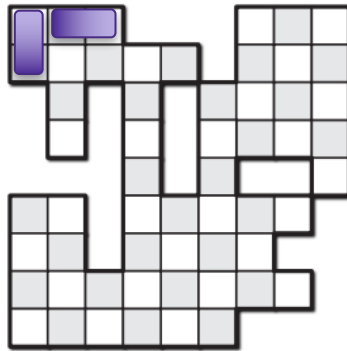
- > **Escape Problem**
- > **Covering with Dominos** 
- > **Token Placing**
- > **Processor Scheduling**
- > **Airline Scheduling**

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# Covering with Dominos

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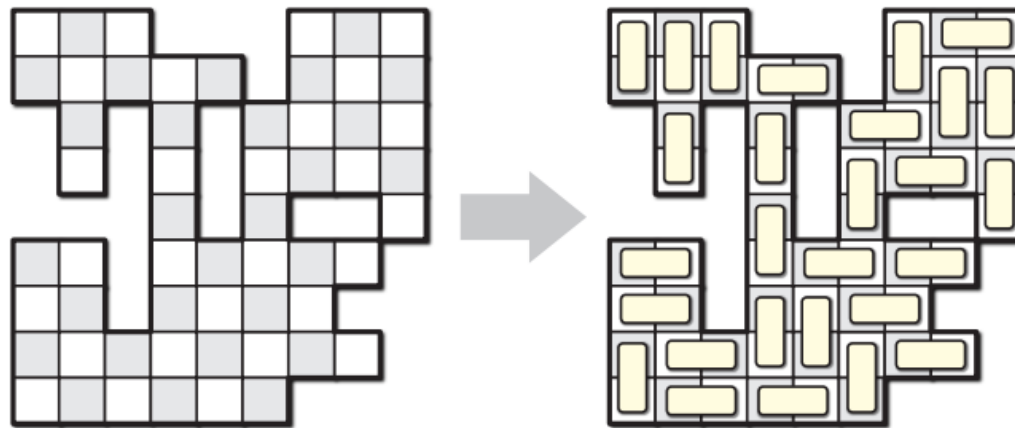
- > **Problem:** Given a checker board with some squares *deleted*, find a way to cover the board with dominos.
  - each domino covers two adjacent squares (vertical or horizontal)





# Covering with Dominos Example

- > **Problem:** Given a checker board with some squares *deleted*, find a way to cover the board with dominos.



from <http://jeffe.cs.illinois.edu/teaching/algorithms/notes/24-maxflowapps.pdf>



# Covering with Dominos

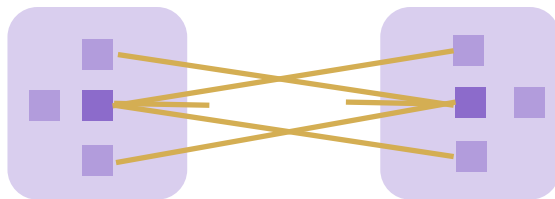
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- > **Observation:** This looks like a matching problem
  - each domino connects a *pair* of adjacent squares
- > Unfortunately, it looks like a general matching problem
  - graph has a node for each square and edges between ( $\leq 4$ ) adjacent ones
  - as noted before, the problem is harder than max flow on a general graph



# Covering with Dominos: False Start

- > **Observation:** This looks like a general matching problem
- > Could try putting every square on both the left & right side
  - allow matching squares on left and right only to adjacent ones (not selves)



- > BUT the matchings would not always be solutions...
  - e.g., square 1 on the left might be matched with square  $i$ , but square 1 on the right might be matched with square  $j \neq i$

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# Covering with Dominos

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- > **Observation:** This looks like a general matching problem
- > In fact, this is a *bipartite* matching problem!
- > **Q:** What are the two parts?
- > **A:** The dark squares and the light squares
  - each domino touches *exactly one of each*



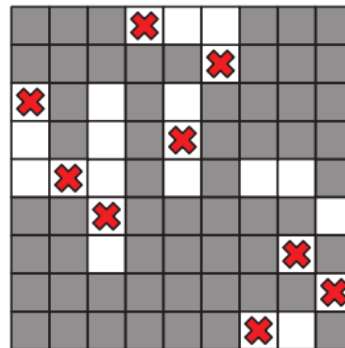
## **Outline for Today**

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- > **Token Placing** 
- > **Processor Scheduling**
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# Token Placing

- > **Problem:** Given a checker board with some squares deleted, find a set of locations to place tokens such that there is *exactly* one token in every row and one in every column.

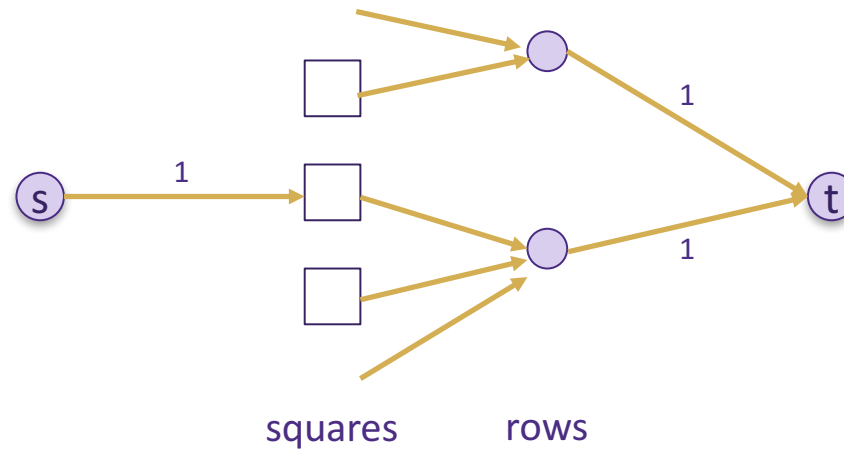


from <http://jeffe.cs.illinois.edu/teaching/algorithms/notes/24-maxflowapps.pdf>



# Token Placing: False Start

- > First thought: what the heck even is this?
- > Second thought: turn row / col restrictions into flow constraints?



**W**

# Token Placing: False Start

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- > First thought: what the heck even is this?
- > Second thought: turn row / col restrictions into flow constraints?
  - can use that to ensure only one in each row OR in each column
    - > (a useful idea we can use elsewhere)
  - BUT how can we do both at once?
    - > lose track of what column it came from when we flow into the row nodes
    - > could put 2 units of flow into a square, one for row & one for col, but there is no guarantee that the solution uses 2 units
  - doesn't seem to work...





# Token Placing

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- > **Hint:** this is a bipartite matching problem
- > **Q:** Matching what and what?
- > **A:** Between rows and columns
  - (row, col) pair = square on the board
  - white squares show which (row, col) pairs are allowed
  - matching because each row & col can only be used once
  - has a solution if there is a matching that uses all n rows & cols
    - > the matching says on what squares you place tokens



## **Outline for Today**

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- > **Processor Scheduling** ←
- > **Airline Scheduling**

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# Processor Scheduling

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- > **Problem:** Given  $n$  programs &  $m$  (single-core) processors along with:
  - times *after which* the programs can be started
  - times *by which* the programs must be completed
  - total processing time to complete the program**Find a schedule** for running the programs on processors that meets the deadlines.
- > Note that programs can be stopped, restarted, and moved between processors with no penalty.



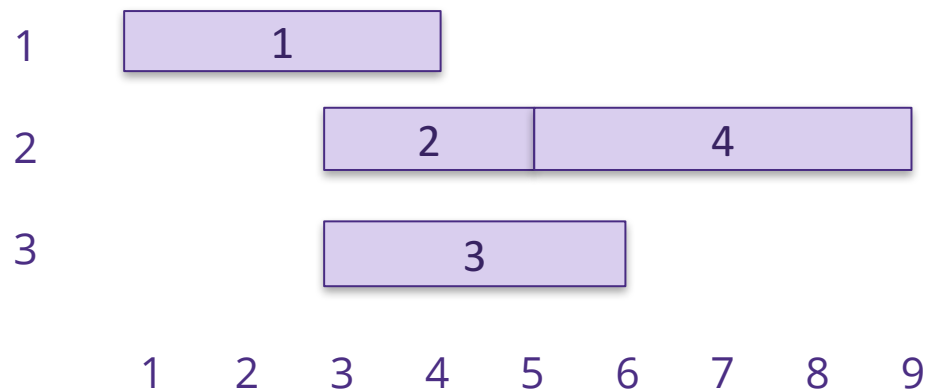
# Processor Scheduling: Example

program	start	end	req time
1	1	5	3
2	3	5	2
3	3	7	4
4	5	9	4

Find a schedule using 3 processors.



# Processor Scheduling: Example



program	start	end	req time
1	1	5	3
2	3	5	2
3	3	7	4
4	5	9	4



# Processor Scheduling

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- > Note that programs can be stopped, restarted, and moved between processors with no penalty.
- > If the program can be started at time  $s$  and must finish by time  $e$  and requires total processing time  $p$ , we need to find an assignment of the program to  $p$  1-second intervals in  $[s, e]$ .
  - i.e, this is essentially a matching problem
  - units of processing for programs need to be matched to intervals of available time on the processors
  - in this case,  $p$  units of time matched to intervals in  $[s, e]$



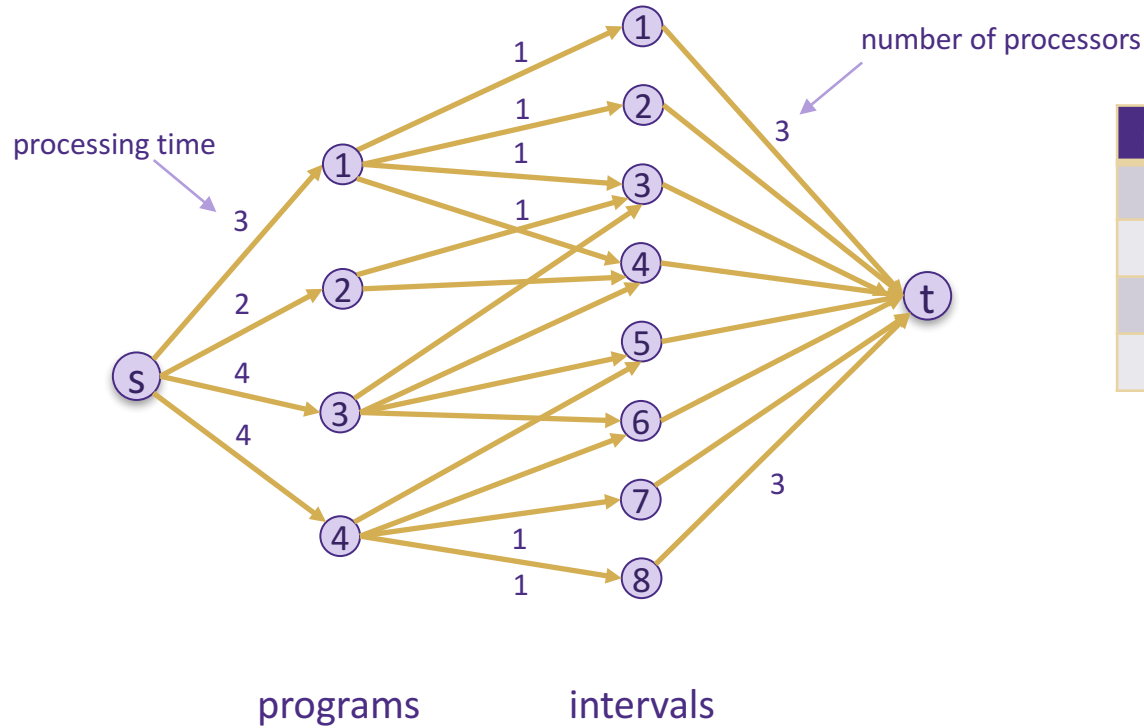
# Processor Scheduling

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- > Can make this more efficient...
  - as described, we have  $np$  nodes on the left and  $mT$  nodes on the right, where  $T = \text{last finish time} - \text{earliest start time}$
- > Can have only one node for each program and 1-second interval
  - allow a program requiring  $p$  units of time to be assigned to  $p$  intervals
  - allow each interval to be assigned  $m$  different programs (for  $m$  processors)



# Processor Scheduling: Example



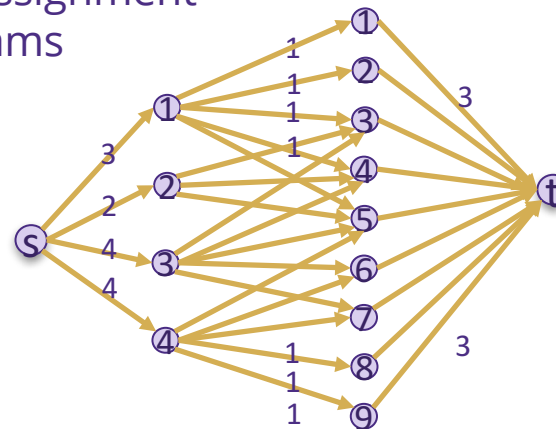
program	start	end	req time
1	1	5	3
2	3	5	2
3	3	7	4
4	5	9	4





# Processor Scheduling

- > Max flow of value equal to sum of processing times gives an assignment of each program to a set of *distinct* times such that the total assigned to each time is at most  $m$ 
  - can choose program  $\sim$  processor assignment arbitrarily since we can move programs around with no penalty



# Processor Scheduling

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- > Can make this more efficient...
- > Can have only one node for each program and 1-second interval
  - allow a program requiring  $p$  units of time to be assigned to  $p$  intervals
  - allow each interval to be assigned  $m$  different programs (for  $m$  processors)
- > Still pseudo-polynomial due to use of 1-second intervals
  - need  $T$  (= last finish time – earliest start time) intervals
  - instead, break into intervals containing no program start or end
  - time is completely fungible within each of these intervals



## **Outline for Today**

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- > **Airline Scheduling**



**W**

# Airline Scheduling

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- > **Problem:** Given a collection of  $n$  flights with departure times ( $s_j$ ) and arrival times ( $e_j$ ), determine whether there it is possible to schedule all of the flights using only  $m$  crews (pilots, etc.)
- > Can easily generalize this to require a certain amount of preparation time ( $t_{i,j}$ ) between particular pairs of flights
  - pilots and attendants might need breaks
  - they might also need to transit from one city to another



# Airline Scheduling: Example

> Suppose we have these **three** flights and **two** crews:

flight	start	end
1	0	2
2	3	4
3	3	4

delay	1	2	3
1		2	1
2	2		3
3	1	3	



# Airline Scheduling: Example

flight	start	end
1	0	2
2	3	4
3	3	4

delay	1	2	3
1		2	1
2	2		3
3	1	3	

- > Flights 2 & 3 cannot be serviced by 1 crew
  - they are flying at the same time
- > Flights 1 & 2 cannot be serviced by 1 crew :
  - 2 needs to start 1 hour after 1 but takes 2 hours to prepare
- > Flights 1 & 3 can be serviced by 1 crew



# Airline Scheduling: Example

flight	start	end
1	0	2
2	3	4
3	3	4

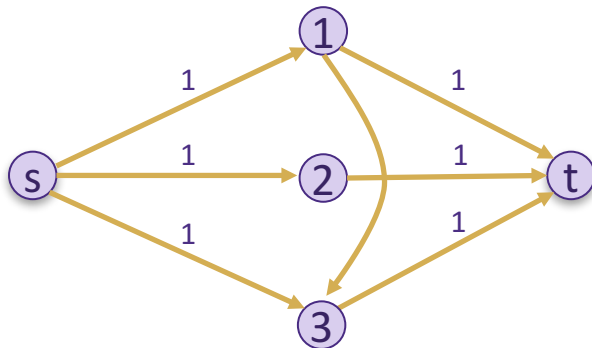
delay	1	2	3
1		2	1
2	2		3
3	1	3	

- > Optimal schedule:
- crew 1 runs 1 and then 3
  - crew 2 runs 2



# Airline Scheduling

- > Model single crew as a network flow where flow of 1 unit describes a schedule for one crew:



Arrow from  $i$  to  $j$  if  $j$  can be served after  $i$  (i.e., if  $s_j \geq e_i + t_{i,j}$ )

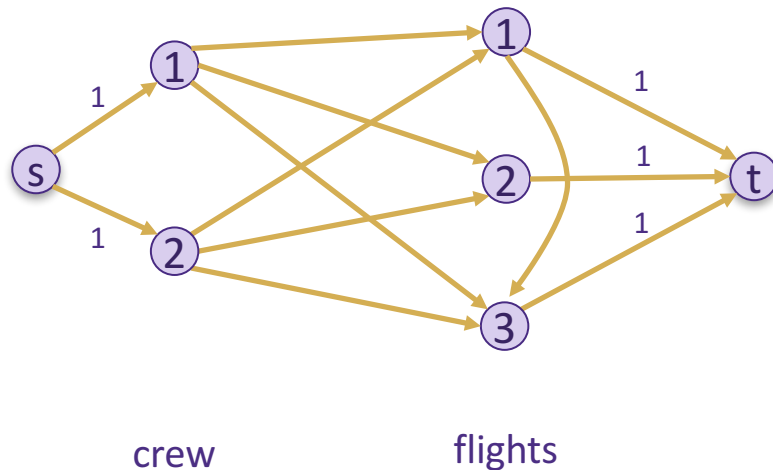
Paths from  $s$  to  $t$  are in 1-to-1 correspondence with valid schedules for one crew. (I.e., really a path problem so far.)

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# Airline Scheduling: False Start

> Identify each flow with an individual crew....



Flow of value of  $m$  schedules all crews

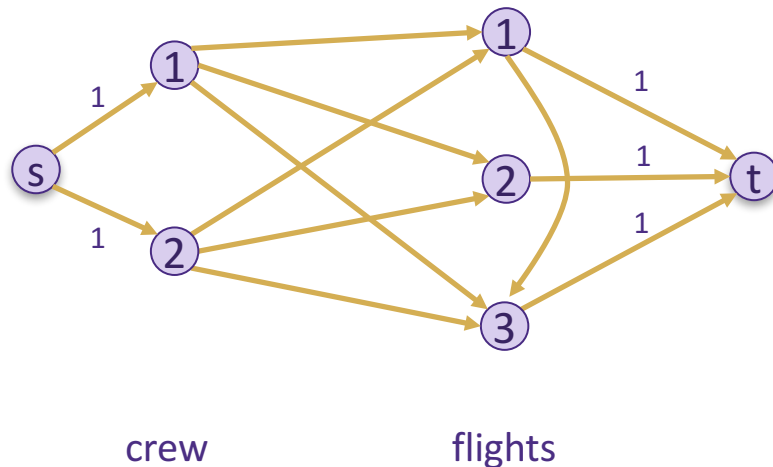
**Q:** What is wrong with this?

**A:** Doesn't tell us whether all flights are actually scheduled!

# W

# Airline Scheduling: False Start

> Identify each flow with an individual crew...



Need to ensure that some crew's path goes through every node

Saw how to set upper bounds on flow through a node, but what we really want here are *lower bounds* (of 1) on the flow

We will see how to support lower bounds **next lecture...**

# W

# Airline Scheduling v2

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- > **Problem:** Given a collection of  $n$  flights with departure times ( $s_j$ ) and arrival times ( $e_j$ ), determine the minimum number of crews needed to service all of the flights.
- > **Q:** How do we solve this?
- > **A:** Binary search
  - answer is between 0 and  $n$  (inclusive)
  - previous algorithm says if we need more or fewer crews

