

# Network Flow Applications

# Bicycle Sharing



Ever wonder why they don't all end up at the bottom of a hill somewhere?

# Bicycle Sharing Problem

Let  $d(v)$  be the number of additional bikes needed at location  $v$  for the following morning's commute

$d(v) > 0$ : demand

$d(v) < 0$ : supply

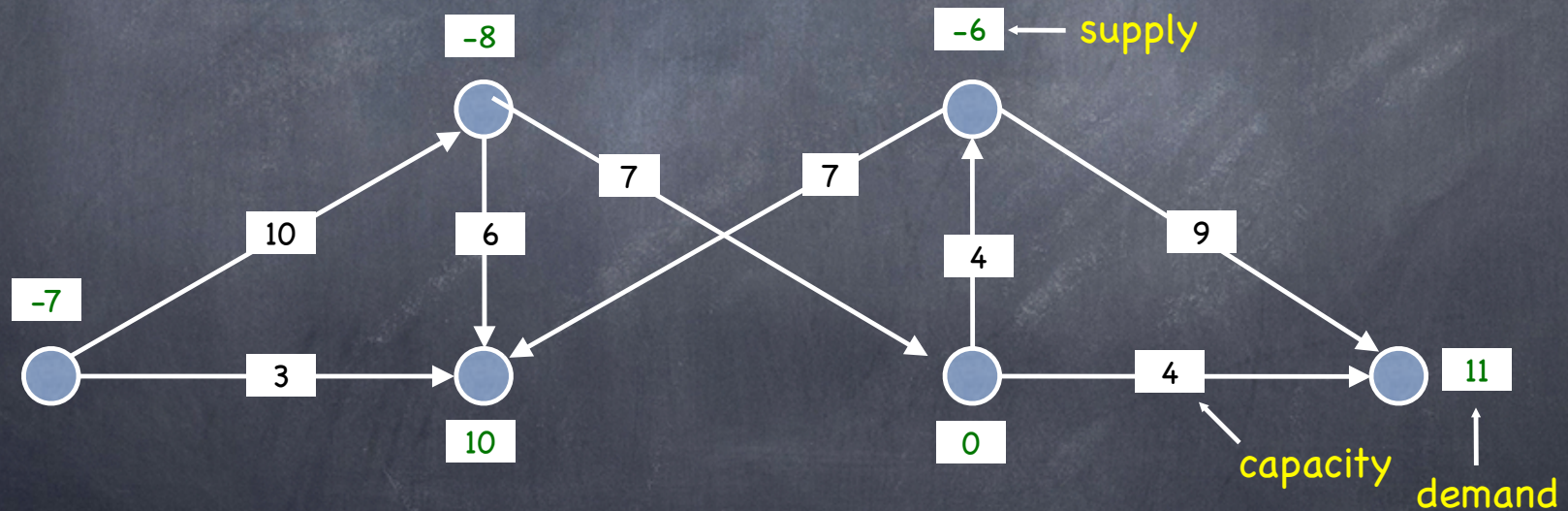
For certain location pairs  $e = (u, v)$ , a van is available to transport up to  $c(e)$  bicycles from  $u$  to  $v$

Do you have enough vans to move the bikes?

# Circulation with Demands

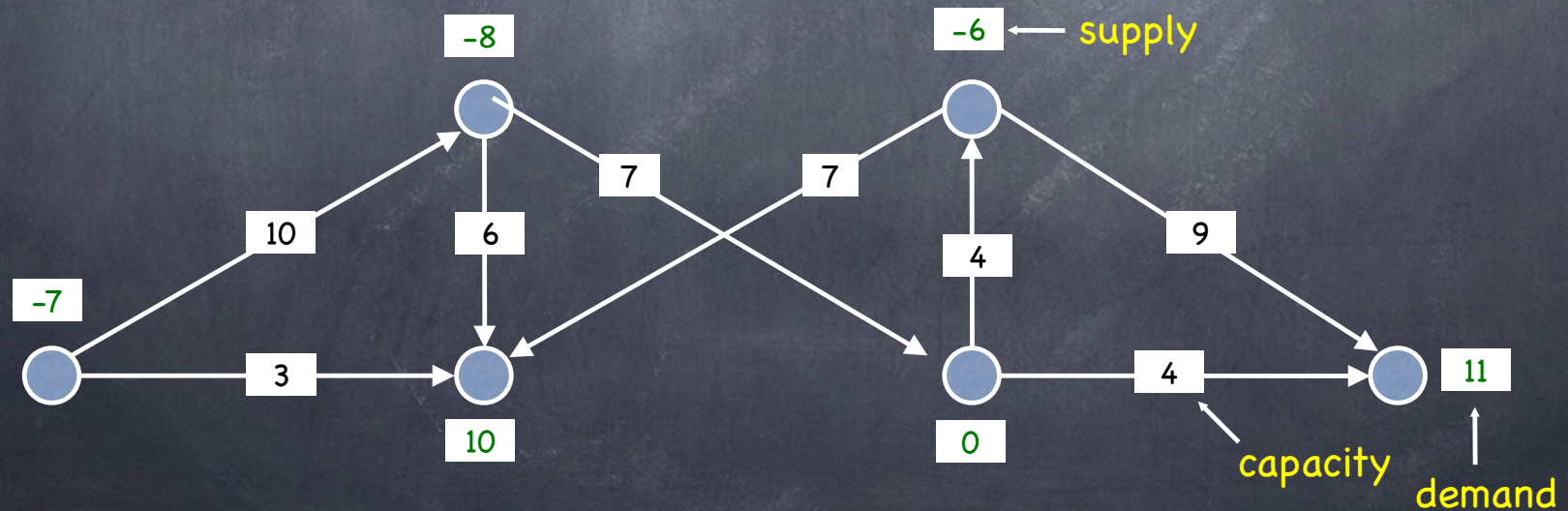
- Directed graph  $G = (V, E)$ .
- Edge capacities  $c(e)$ ,  $e \in E$ .
- Node supply/demand  $d(v)$ ,  $v \in V$ .

$d(v) > 0 \rightarrow$  "demand node"  
 $d(v) < 0 \rightarrow$  "supply node"



# Circulation with Demands

- A **feasible circulation** satisfies:
  - **Capacity condition:** For each  $e \in E$ :  $0 \leq f(e) \leq c(e)$
  - **Conservation condition:** For each  $v \in V$ :  
$$\sum_{e \text{ into } v} f(e) - \sum_{e \text{ out of } v} f(e) = d(v)$$
- **Circulation problem:** does there exist a feasible circulation?

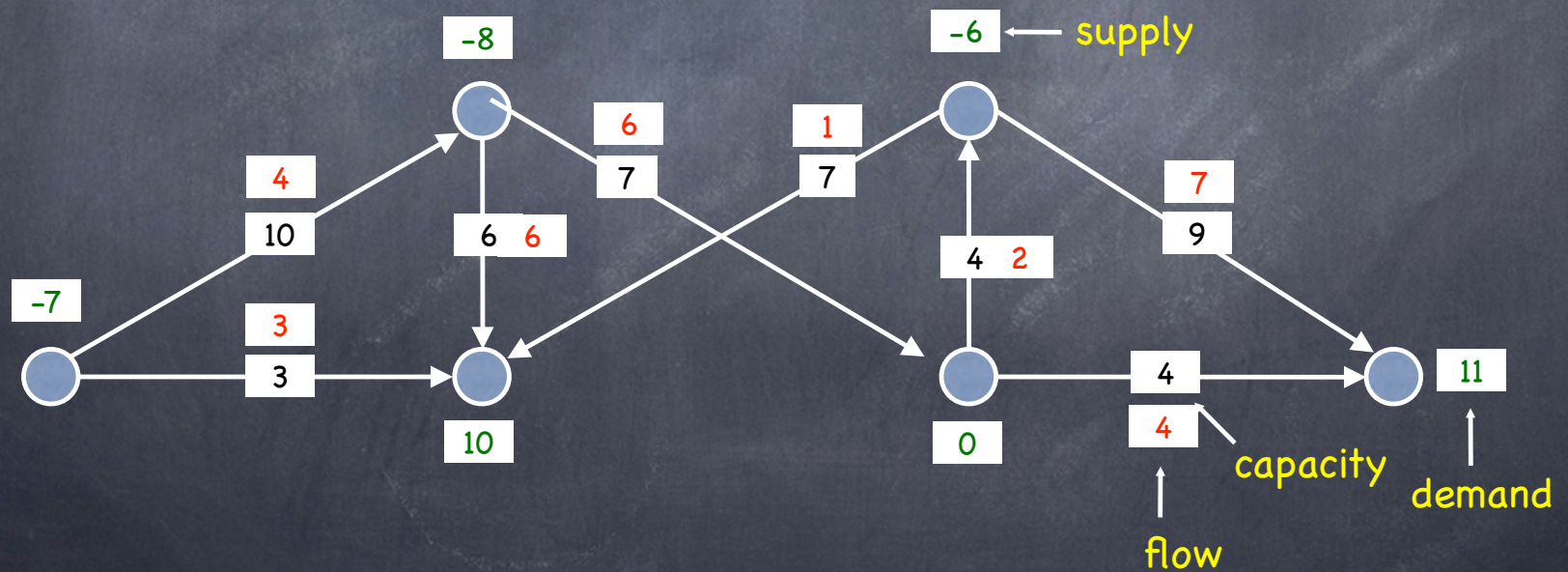


# Note

- This is a flow network, but flow can enter and leave at many places.

# Circulation with Demands

- Necessary condition:** sum of supplies = sum of demands.  $D = \sum_{v: d(v) > 0} d(v) = \sum_{v: d(v) < 0} -d(v)$



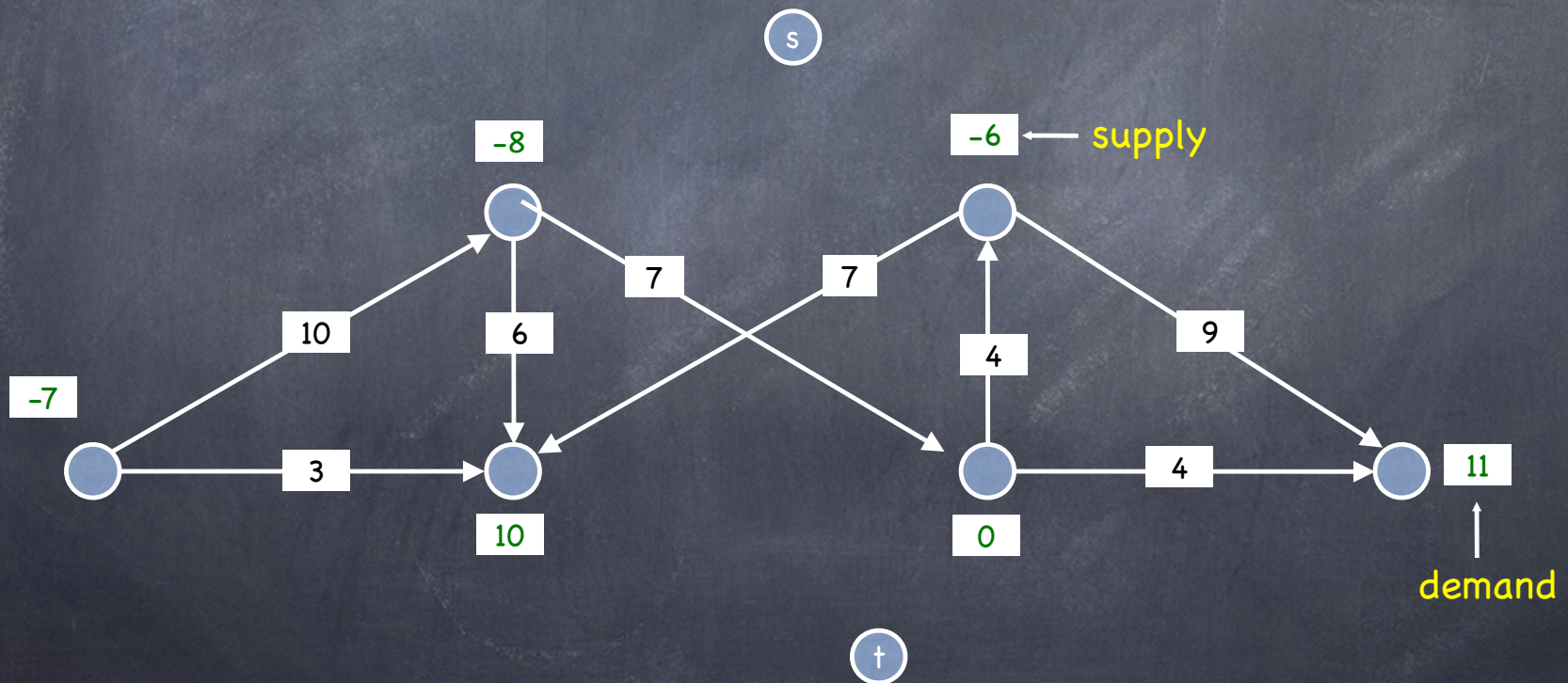
# Exercise

- Can you solve the circulation problem using max flow?
- How to transform this into a flow network?
- How to use max. flow value to decide if there is a feasible circulation?



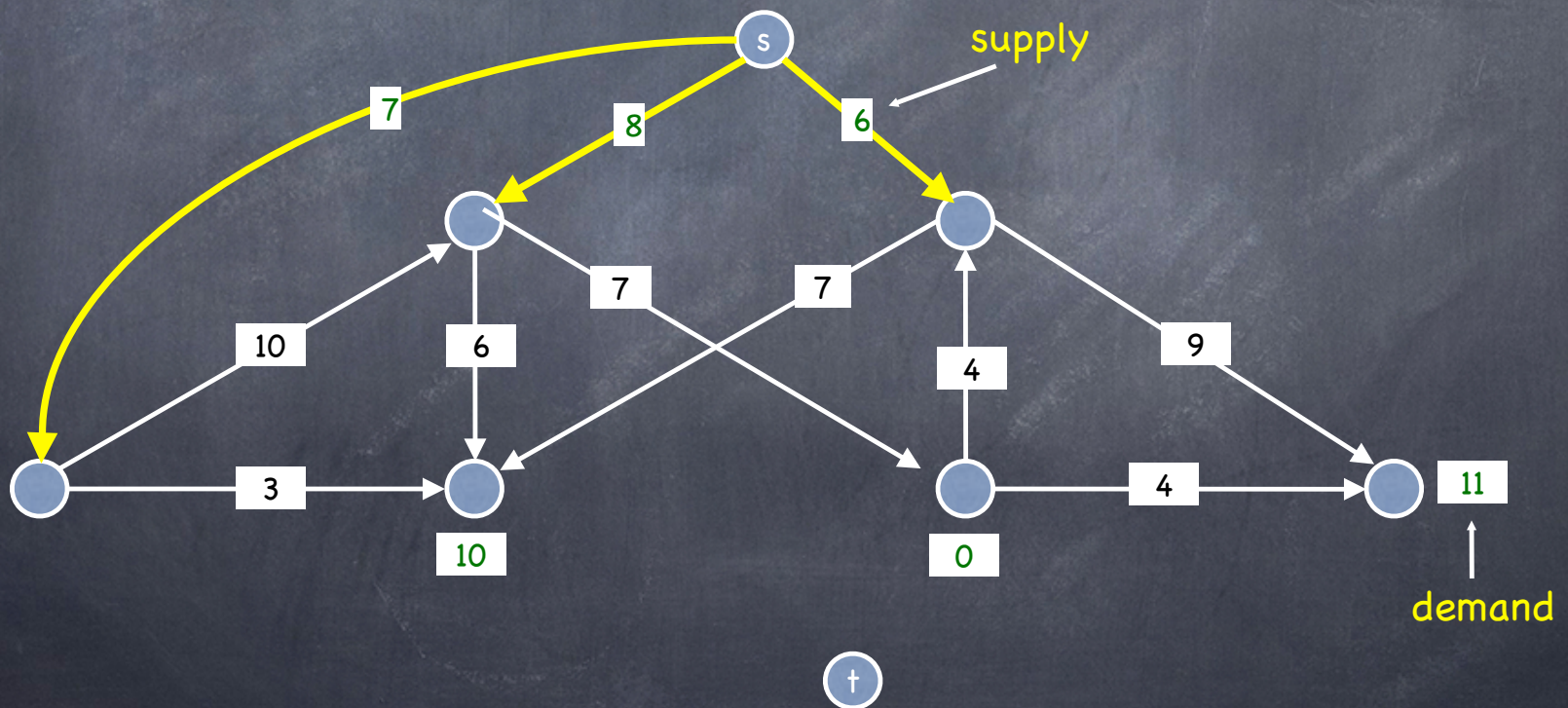
# Max Flow Formulation

- Add new source  $s$  and sink  $t$ .
- For each supply node, add edge  $(s, v)$  with capacity  $-d(v)$ .
- For each demand node, add edge  $(v, t)$  with capacity  $d(v)$ .
- Claim:  $G$  has feasible circulation iff  $G'$  has max flow of value  $D$ .



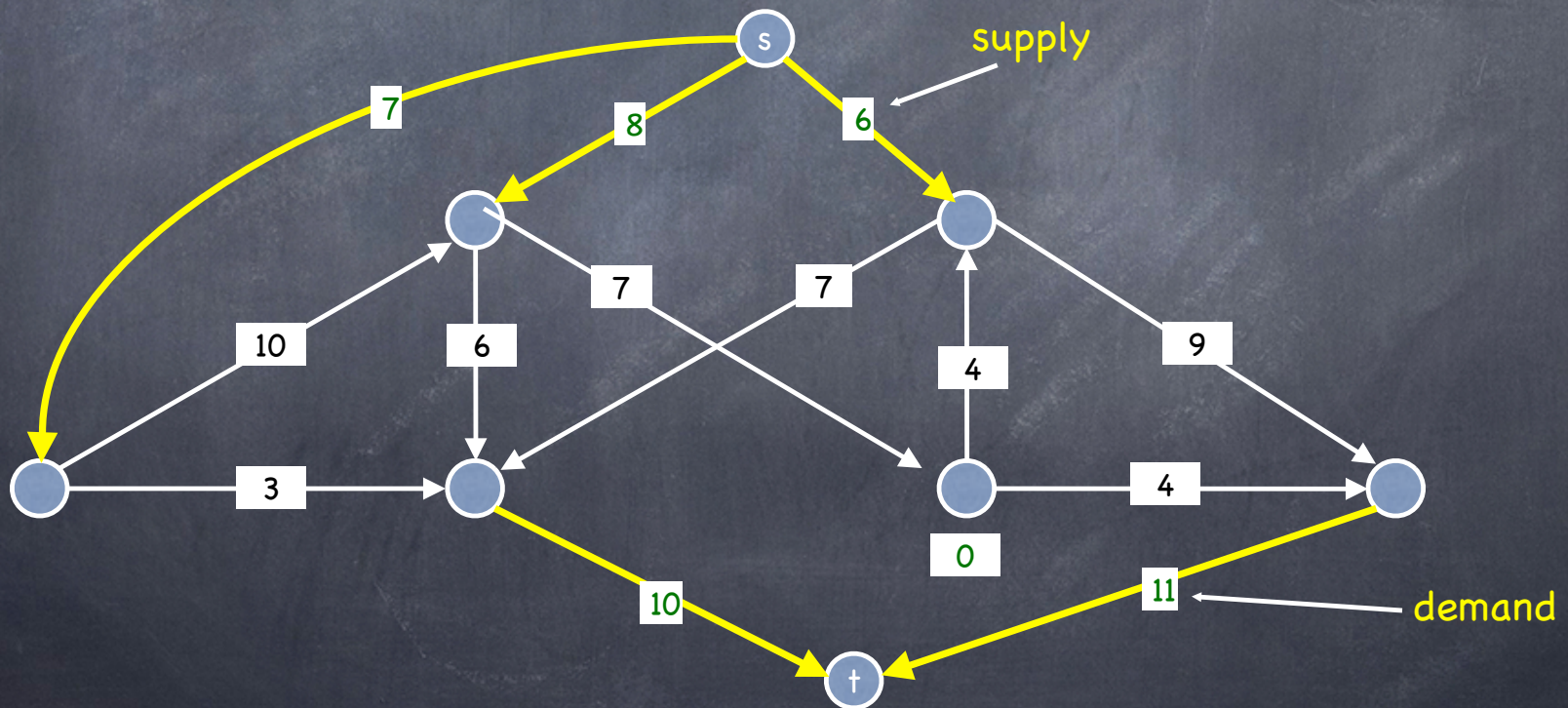
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# Max Flow Formulation

**Claim:**  $G$  has feasible circulation iff  $G'$  has max flow of value  $D$ .

## Proof sketch

- Max flow in  $G'$  is at most  $D$  (=total supply). **Why?**
- ( $\rightarrow$ ) Let  $f$  be a feasible circulation. Saturate all edges from source/sink to get a flow of value  $D$ .
- ( $\leftarrow$ ) Let  $f$  be a max flow of value  $D$ . Ignore flow on edges from source/sink to get a valid circulation.

# Integrality

**Corollary:** if there is a feasible circulation, then there is one that is integer-valued (\*)

(\*) assuming capacities and demands are integers

# Circulation with Demands and Lower Bounds

One more twist is very useful in applications. Require **at least**  $l(e)$  units of flow on edge  $e$

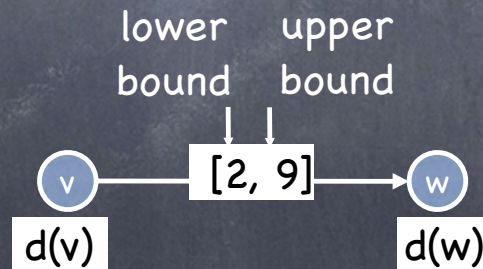
**New capacity condition:**  $l(e) \leq f(e) \leq c(e)$ ,  $e \in E$

**Conservation condition:** same

**Problem:** Does there exist a feasible circulation?

# Circulation with Demands and Lower Bounds

This problem can be reduced to circulation problem without lower bounds in a couple different ways.  
(Further details omitted!)



# Airline Scheduling

- Can you fulfill all of these flight segments with at most  $k$  planes?
  - Boston (6 AM) → DC (7 AM)
  - Philadelphia (7 AM) → Pittsburgh (8 AM)
  - DC (8 AM) → LA (11 AM)
  - Philadelphia (11 AM) → San Francisco (2 PM)
  - San Francisco (2:15 PM) → Seattle (3:15 PM)
  - Las Vegas (5 PM) → Seattle (6 PM)
- Assume 1 hour for maintenance



# Airline Scheduling

**Input:** list of  $m$  flight segments (starting and ending airports and times)

## Rules

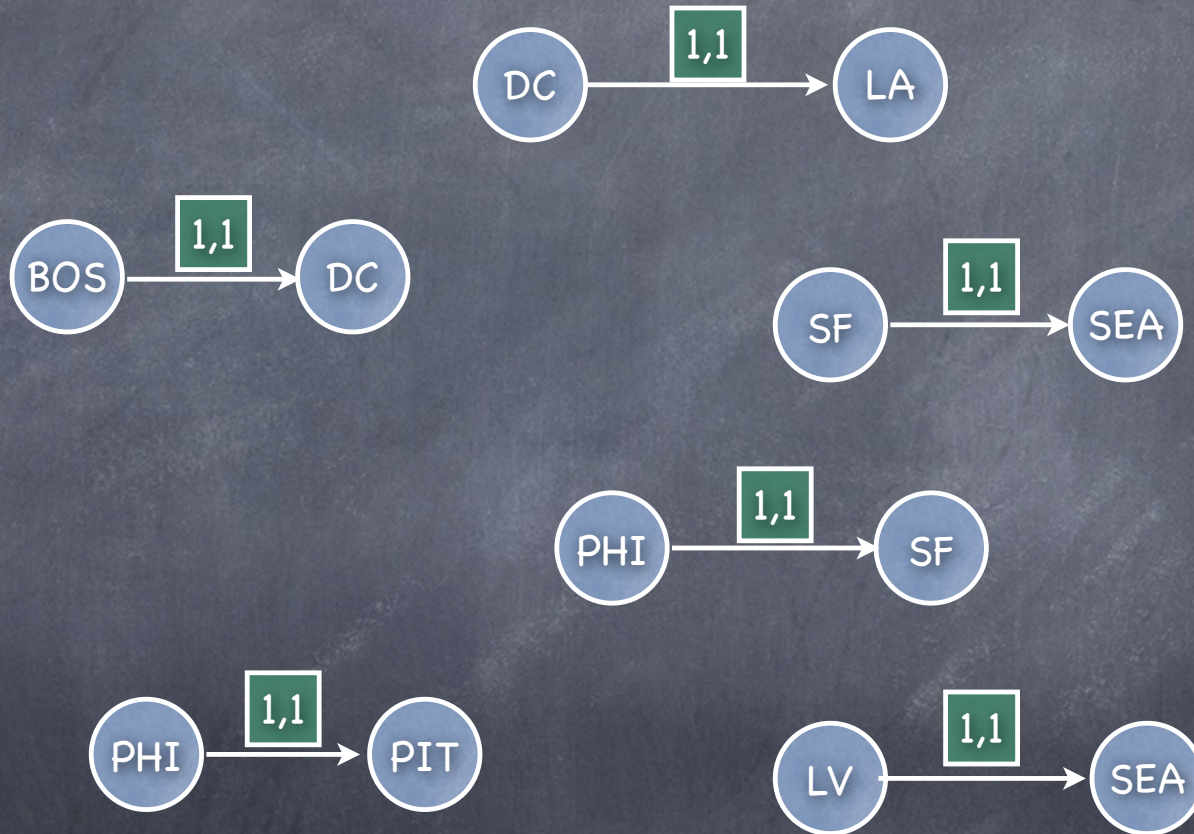
- One hour maintenance required before each flight
- It's ok to add a flight segment to get a plane to a different airport

**Problem:** Can you schedule all the flights with  $k$  planes?

Exercise

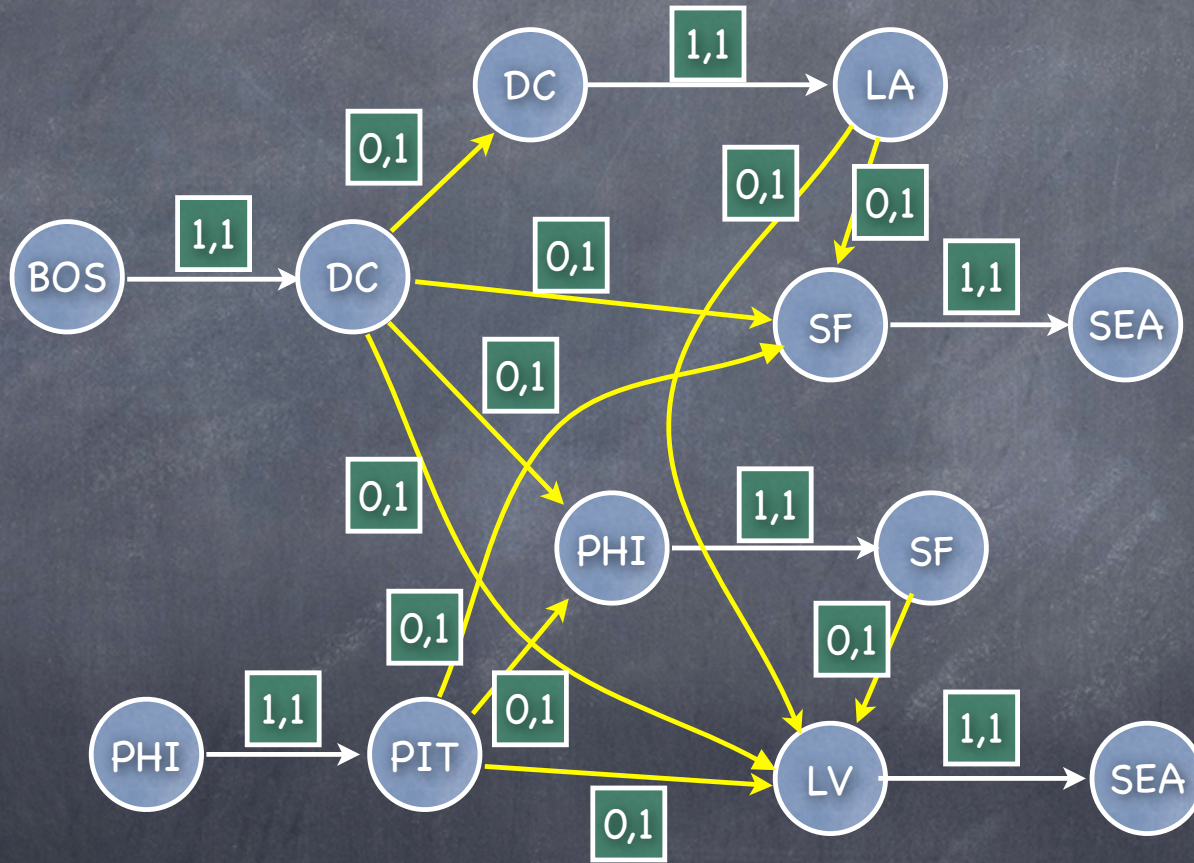
# Solution

Add edge for each flight segment.



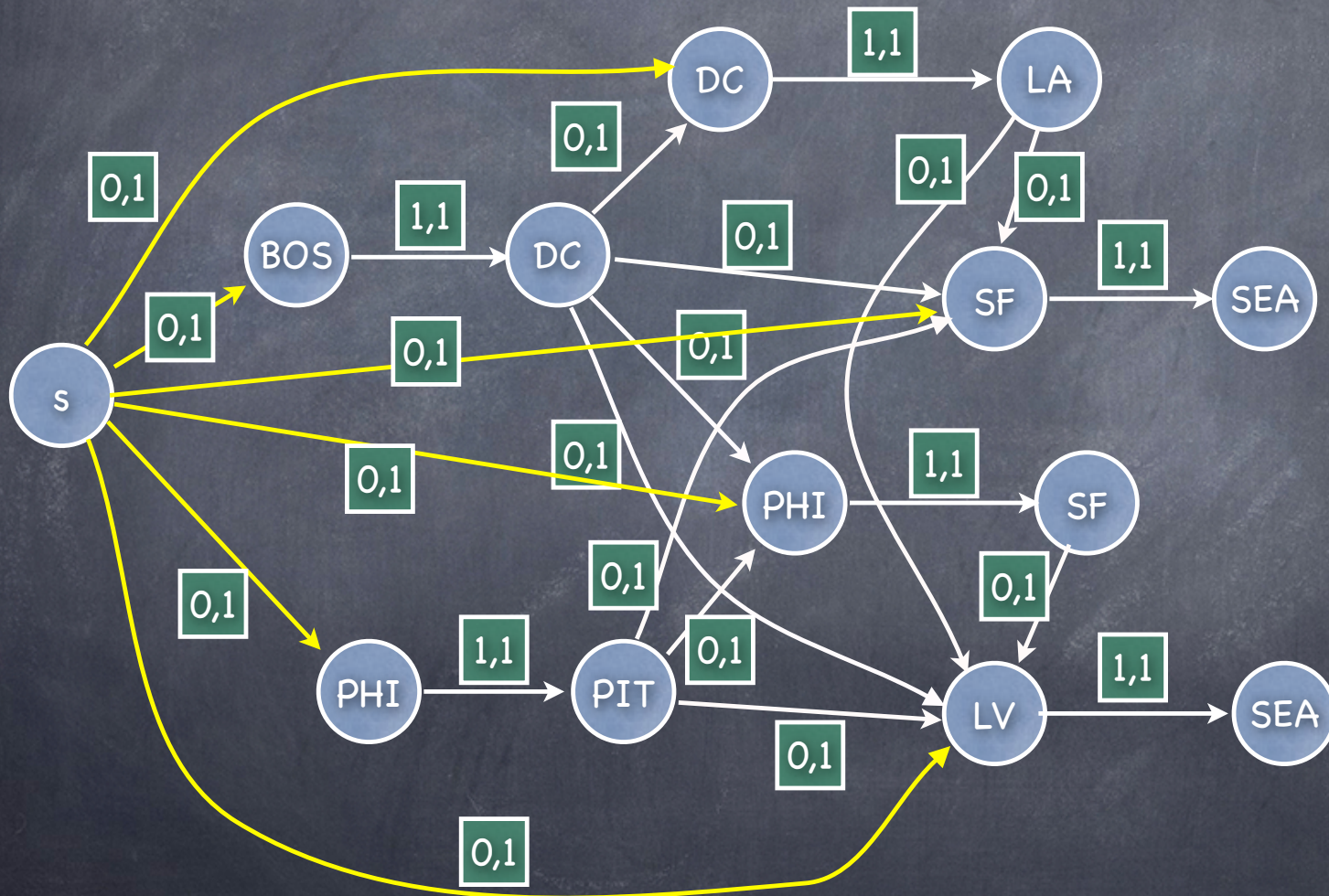
# Solution

Add reachability edges.



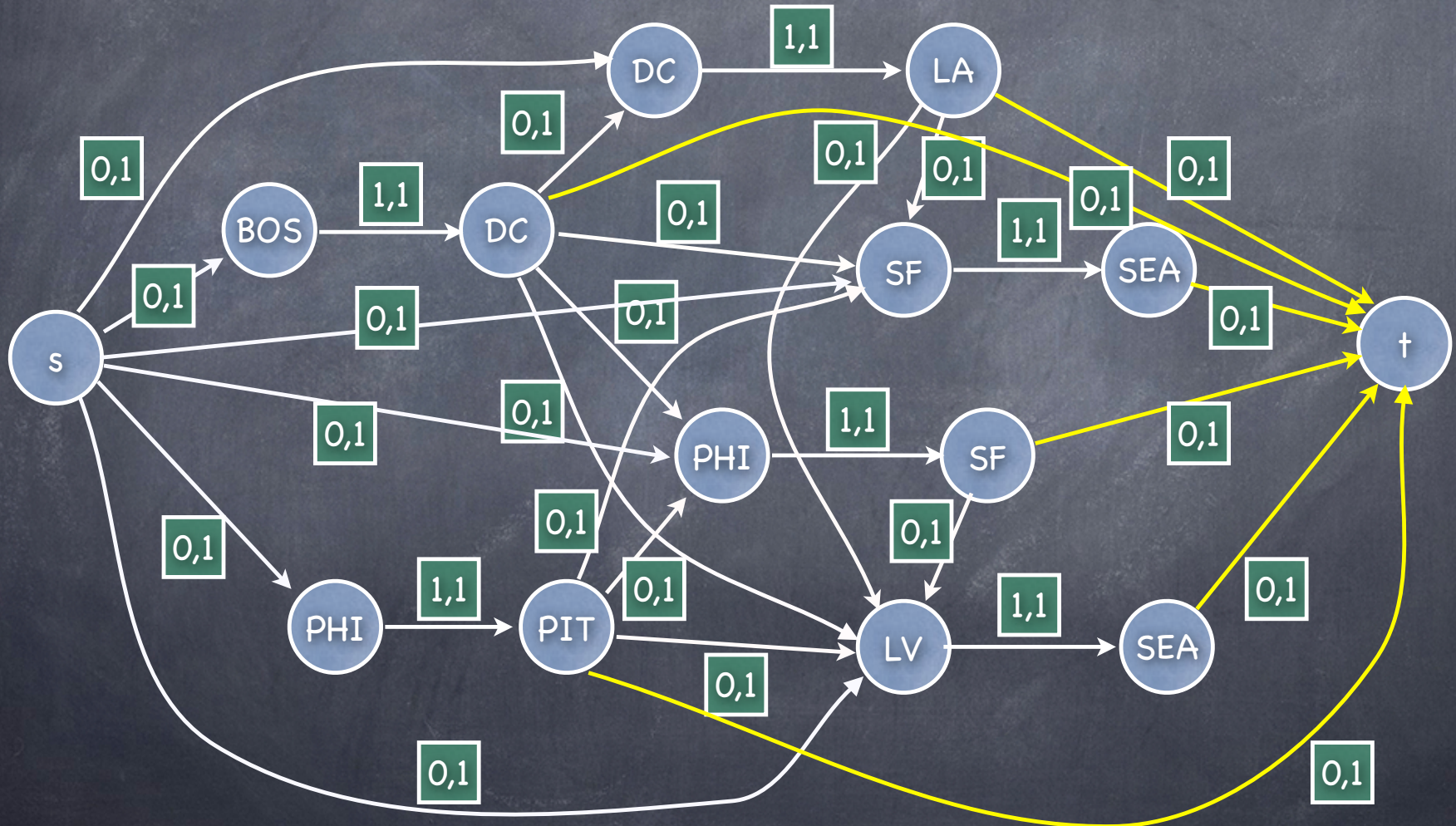
# Solution

Add edges to model first flights.

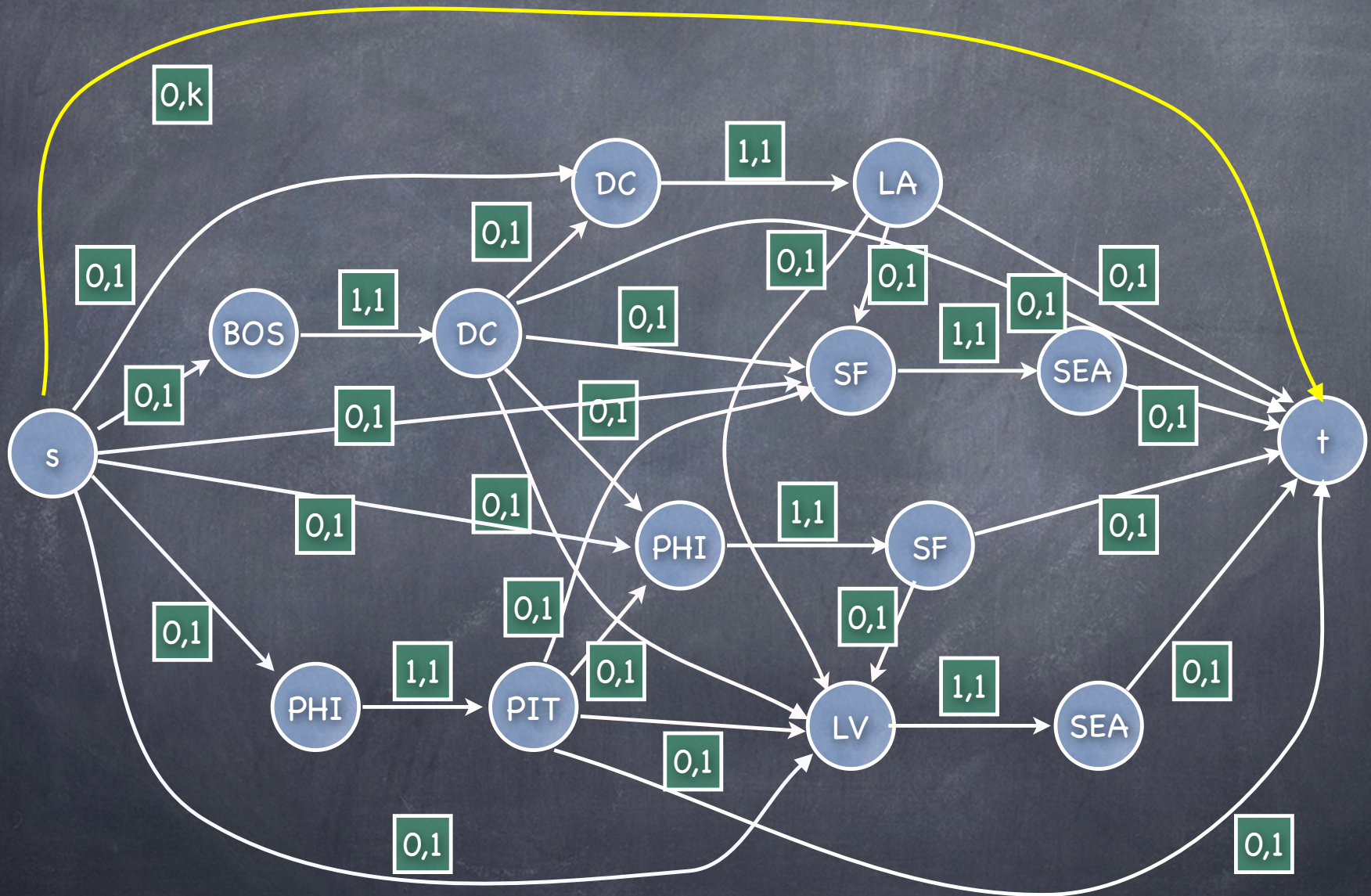


# Solution

Add edges to model last flights.



Add edge for excess planes.



Add demands for all planes.

