

1.206J/16.77J/ESD.215J  
Airline Schedule Planning

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# 1.206J/16.77J/ESD.215J Airline Schedule Planning

## Outline

- Sign-up Sheet
- Syllabus
- The Schedule Planning Process
- Flight Networks
  - Time-line networks
  - Connection networks
- Acyclic Networks
- Shortest Paths on Acyclic Networks
- Multi-label Shortest Paths on Acyclic Networks

Time Horizon

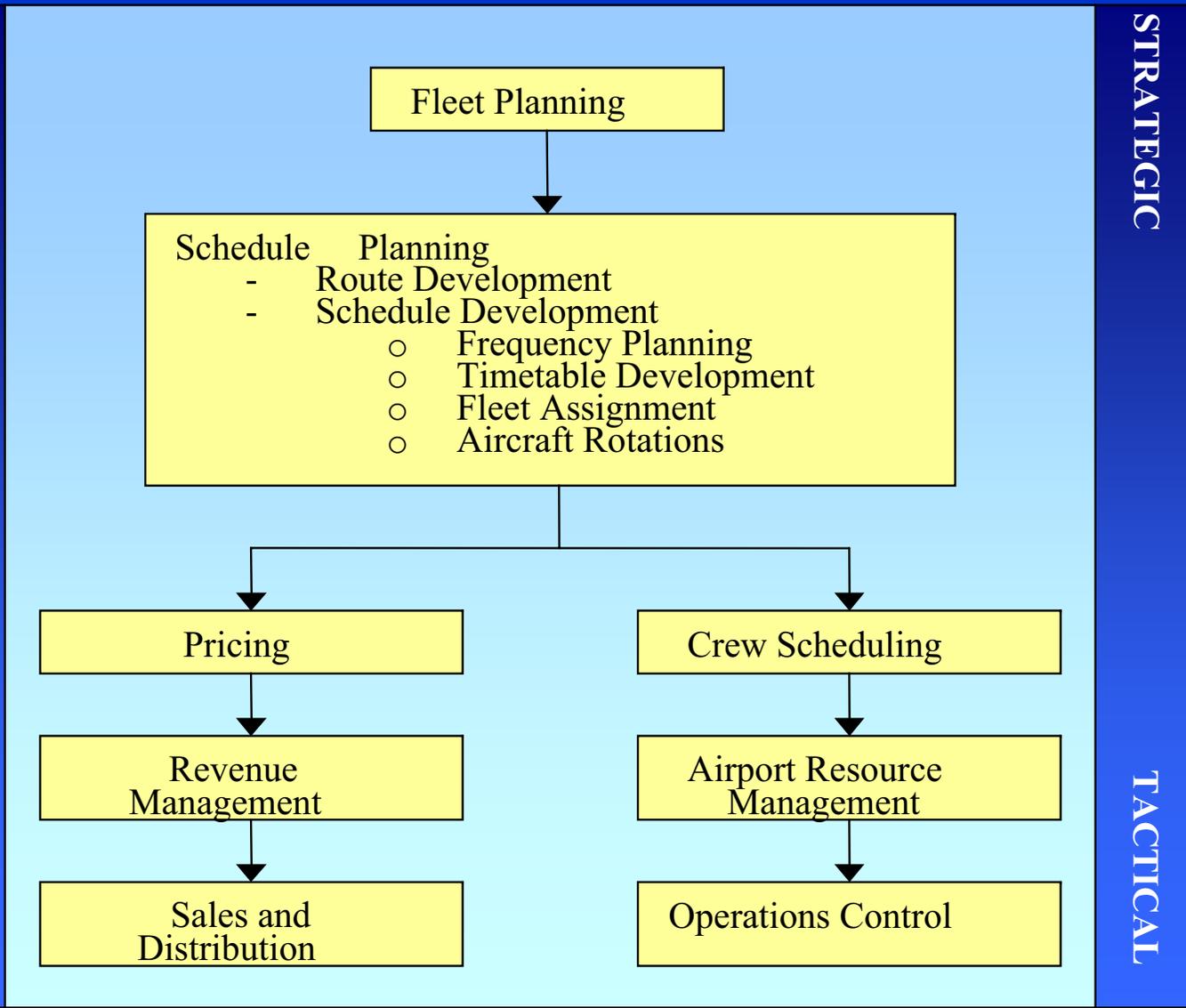
LONG TERM

SHORT TERM

STRATEGIC

TACTICAL

Types of Decision



# Airline Schedule Planning

Schedule Design



Fleet Assignment



Aircraft Routing



Crew Scheduling

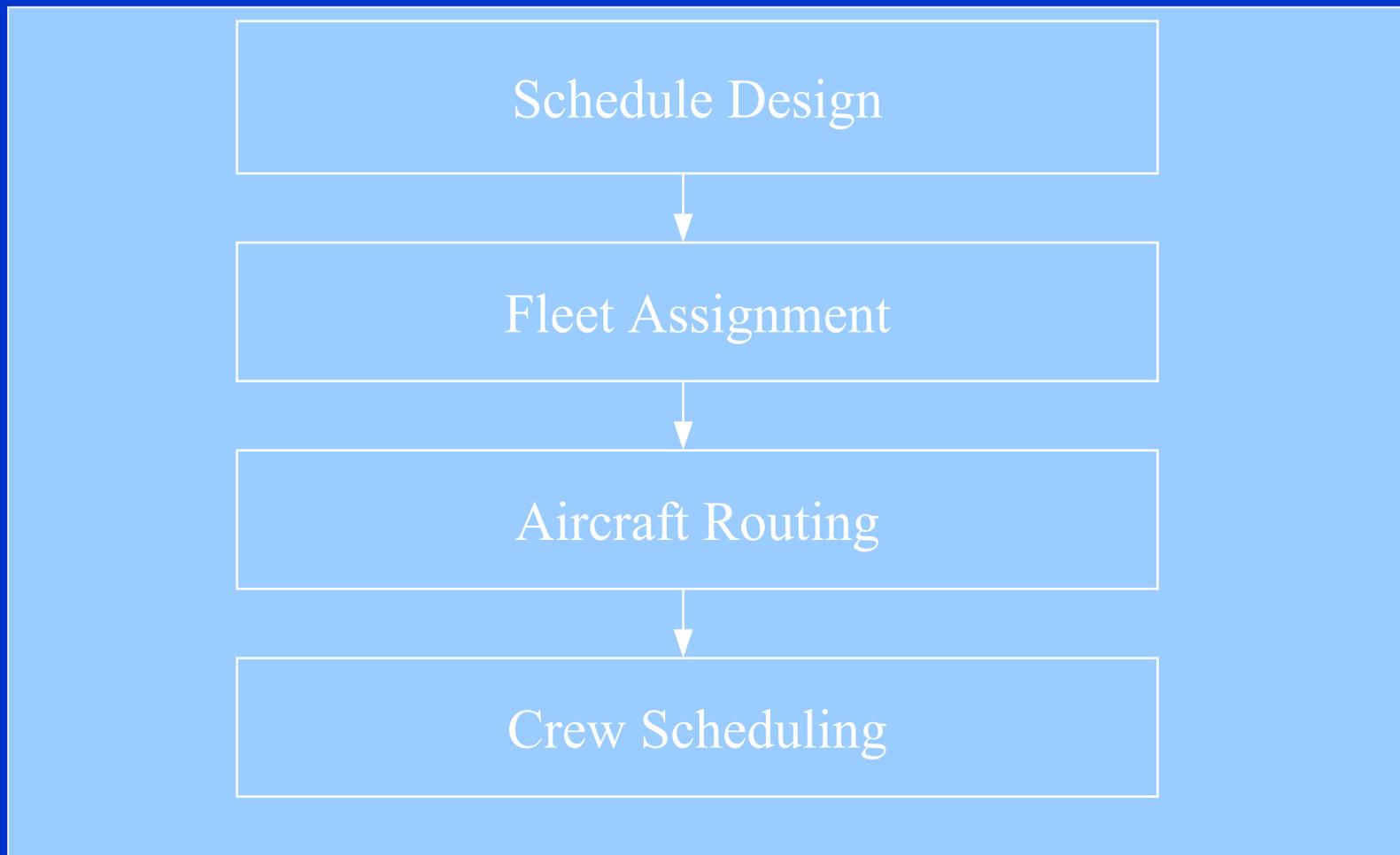
Select optimal set of *flight legs*  
in a schedule

A flight specifies origin, destination,  
and departure time

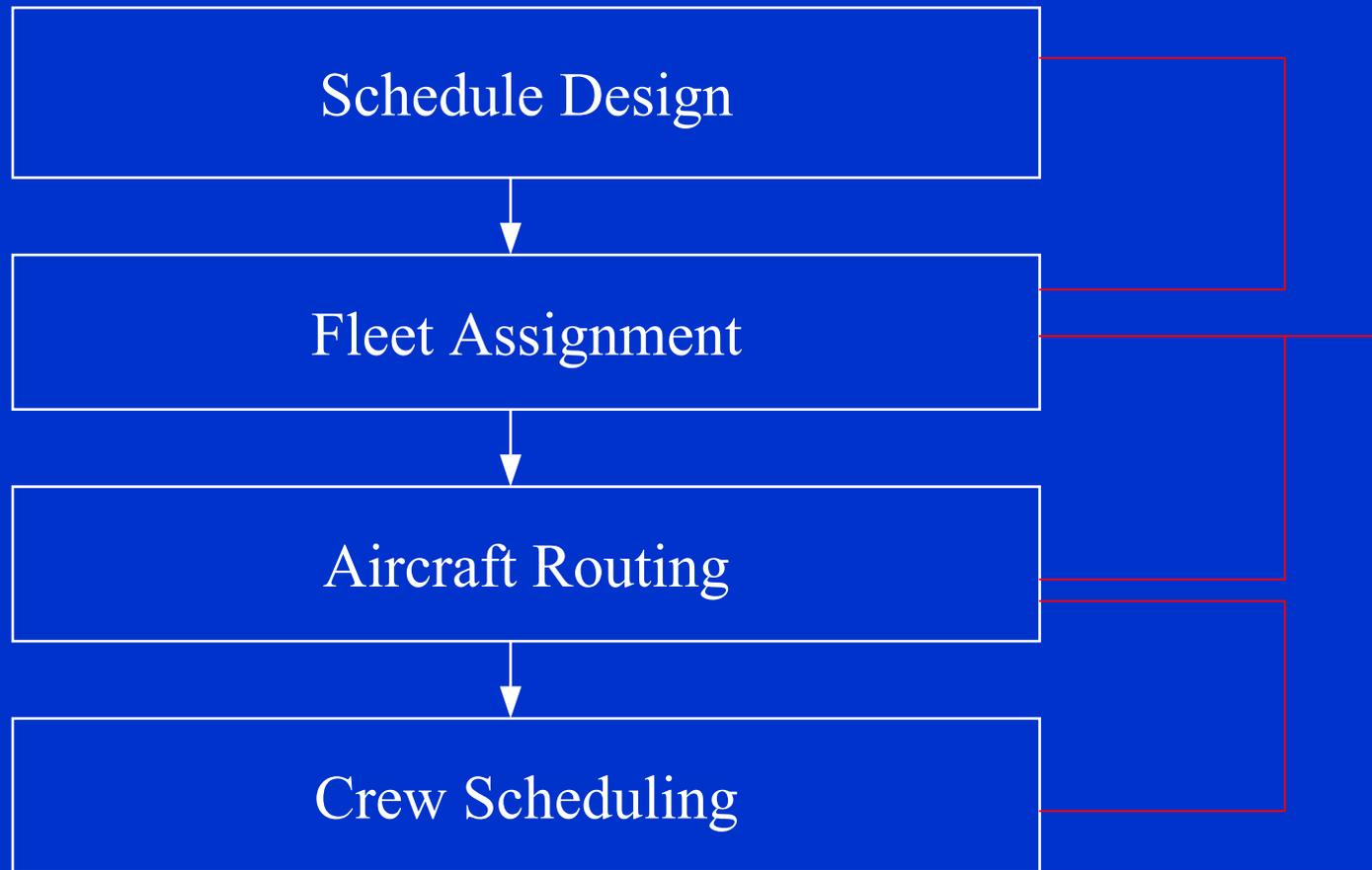
Contribution = Revenue - Costs

Assign crew (pilots and/or flight  
attendants) to flight legs

# Airline Schedule Planning: Integration



# Airline Schedule Planning: Integration



# Flight Schedule

- Minimum turn times = 30 minutes

Flight No.	Origin	Destin.	Dep. Time	Arrival Time
1	A	B	6:30	8:30
2	B	C	9:30	11:00
3	C	B	16:00	17:00
4	B	A	18:00	20:00

# Time-Space Flight Network Nodes

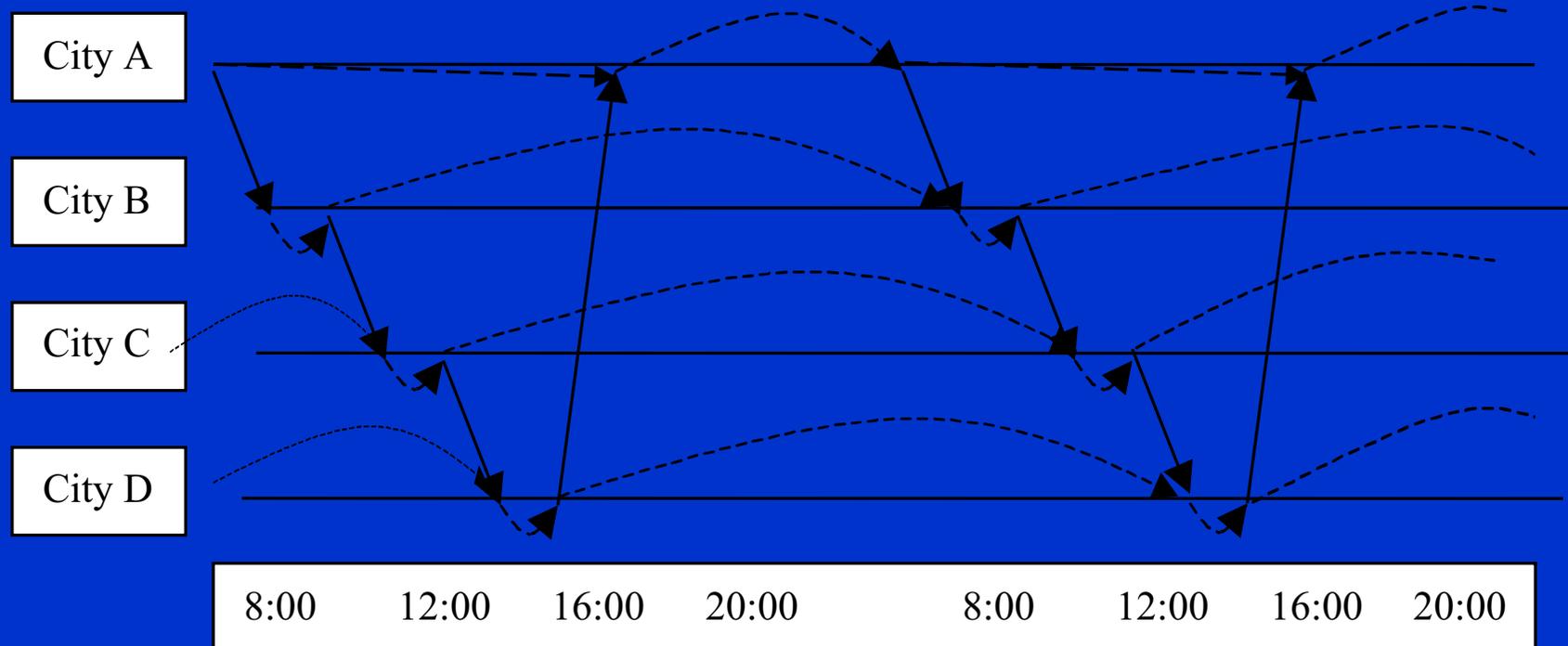
- Associated with each node  $j$  is a **location**  $l(j)$  and a **time**  $t(j)$
- **A Departure Node**  $j$  corresponds to a flight departure from location  $l(j)$  at time  $t(j)$
- **An Arrival Node**  $j$  corresponds to a flight arrival at location  $l(j)$  at time  $t(j) - \text{min\_turn\_time}$ 
  - $t(j) = \text{arrival time of flight} + \text{min\_turn\_time} = \text{flight ready time}$

# Time-Space Flight Network Arcs

- Associated with each arc  $jk$  (with endnodes  $j$  and  $k$ ) is an aircraft movement in space and time
- **A Flight Arc  $jk$**  represents a flight departing location  $l(j)$  at time  $t(j)$  and arriving at location  $l(k)$  at time  $t(k) - \text{min\_turn\_time}$
- **A Ground Arc or Connection Arc  $jk$**  represents an aircraft on the ground at location  $l(j)$  ( $= l(k)$ ) from time  $t(j)$  until time  $t(k)$

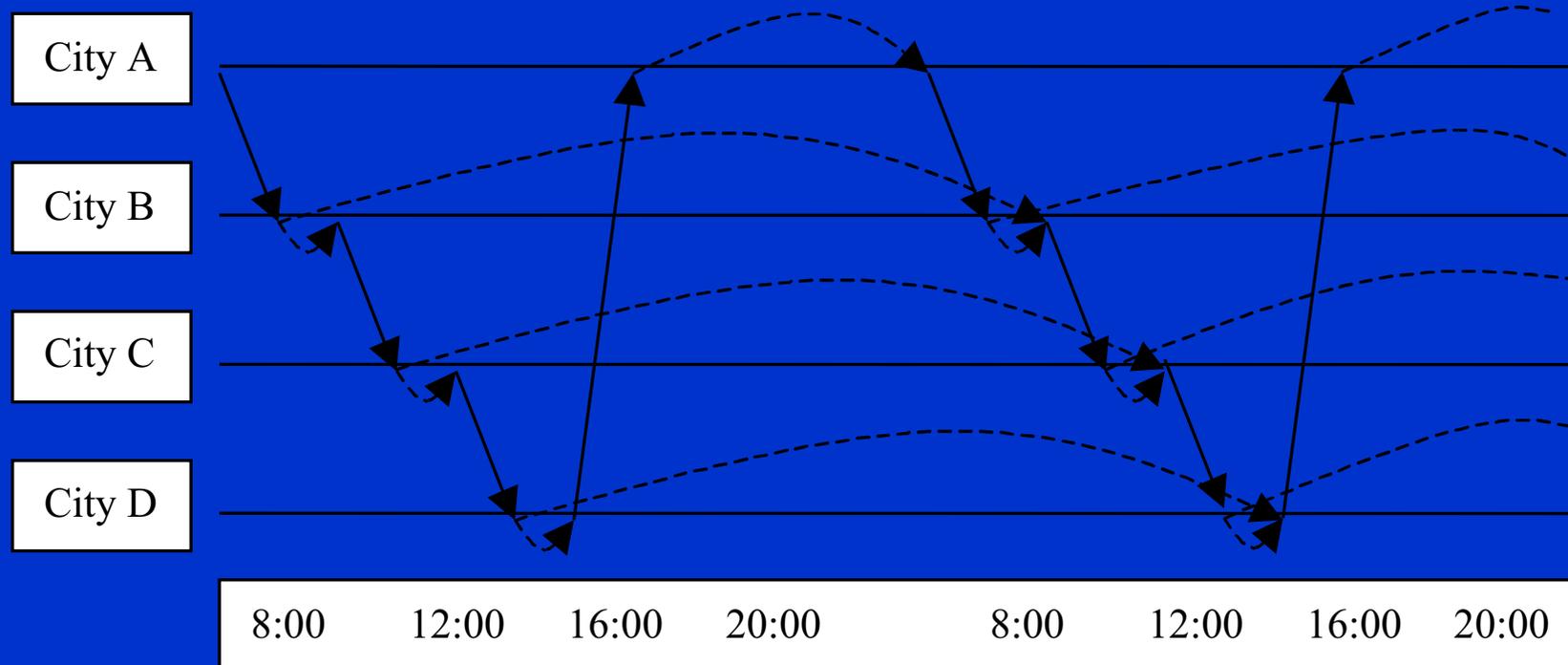
# Time-Line Network

- Ground arcs



# Connection Network

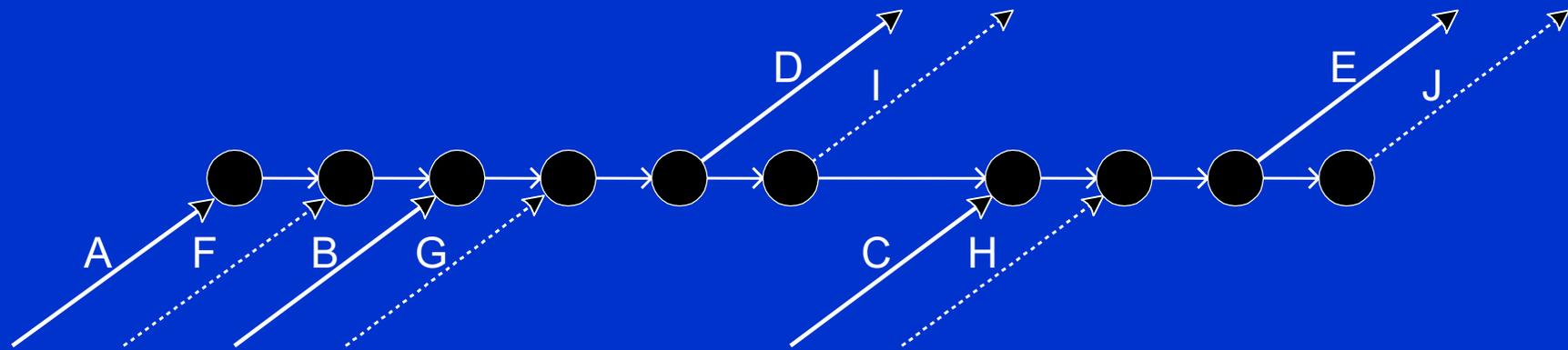
- Connection arcs



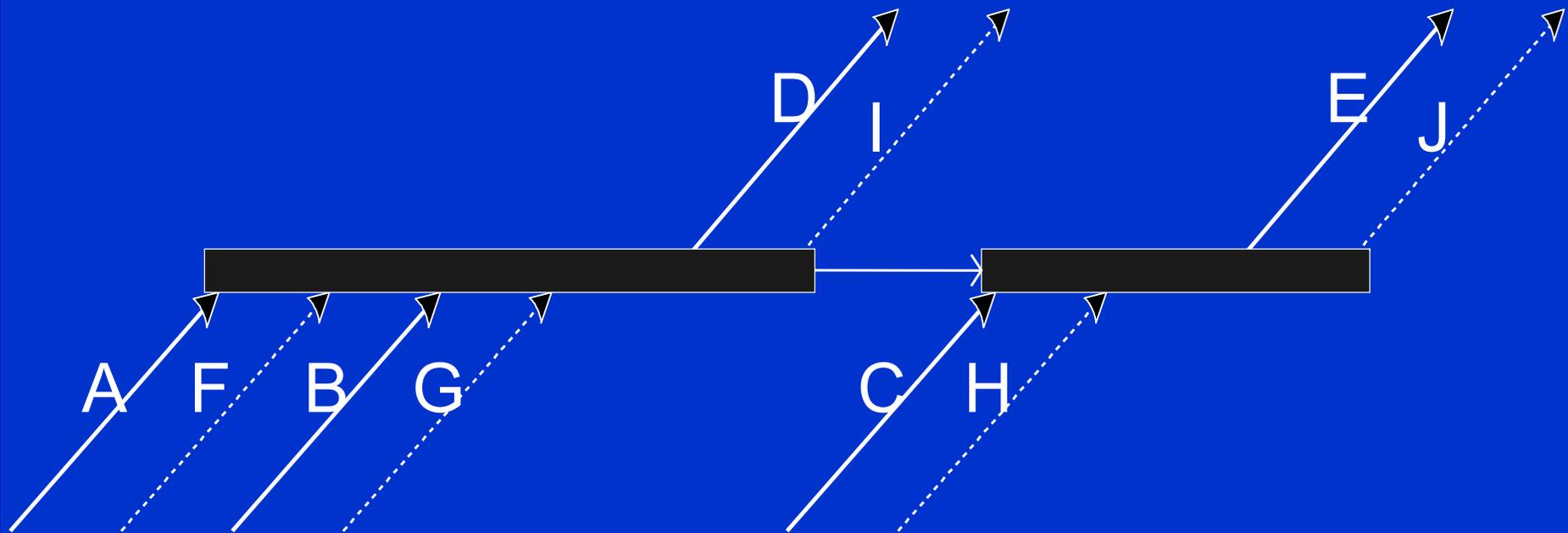
# Time-Line vs. Connection Flight Networks

- For large-scale problems, time-line network has fewer ground arcs than connection arcs in the connection network
  - Further reduction in network size possible through “node consolidation”
- Connection network allows more complex relations among flights
  - Allows a flight to connect with *only a subset* of later flights

# Time-Line Network



# Node Consolidation



# Flight Networks and Shortest Paths

- Shortest paths on flight networks correspond to:
  - Minimum cost itineraries for passengers
  - Maximum profit aircraft routes
  - Minimum cost crew work schedules (on crew-feasible paths only)
- Important to be able to determine shortest paths in flight networks

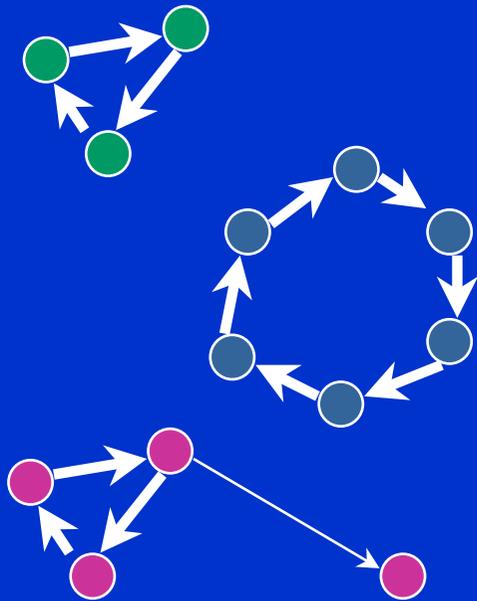
# Shortest Path Challenges in Flight Networks

- Flight networks are large
  - Thousands of flight arcs and ground arcs; thousands of flight arcs and tens of thousands connection arcs
- For many airline optimization problems, **repeatedly** must find shortest paths
- Must consider only “feasible” paths when determining shortest path
  - “Ready time” (not “arrival time”) of flight arrival nodes ensures feasibility of aircraft routes
  - Feasible crew work schedules correspond to a *small* subset of possible network paths
    - Identify the shortest “feasible” paths (i.e., feasible work schedules) using multi-label shortest path algorithms

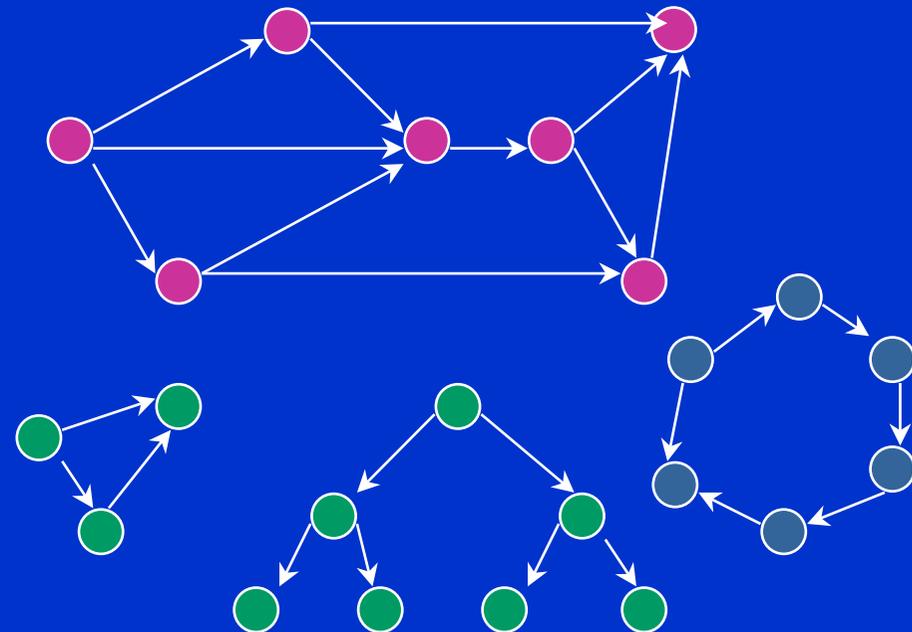
# Acyclic Directed Networks

- Time-line and Connection networks are acyclic directed networks

## Cyclic Networks



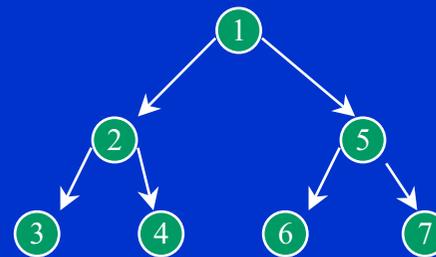
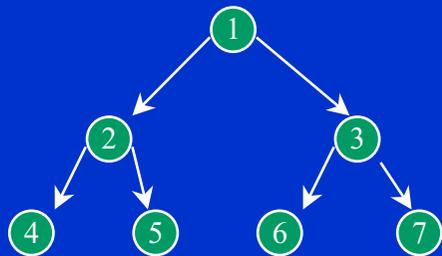
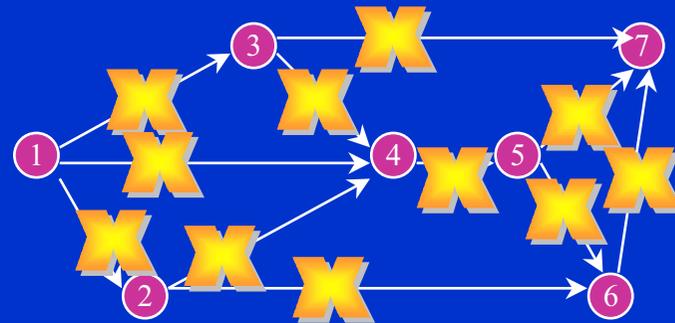
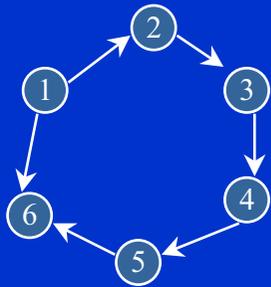
## Acyclic Networks



# Acyclic Networks and Shortest Paths

- Efficient algorithms exist for finding shortest paths on acyclic networks
  - Amount of work is directly proportional to the number of arcs in the network
  - Topological ordering necessary
    - Consider a network node  $j$  and let  $n(j)$  denote its number
    - The nodes of a network  $G$  are topologically ordered if for each arc  $jk$  in  $G$ ,  $n(j) < n(k)$

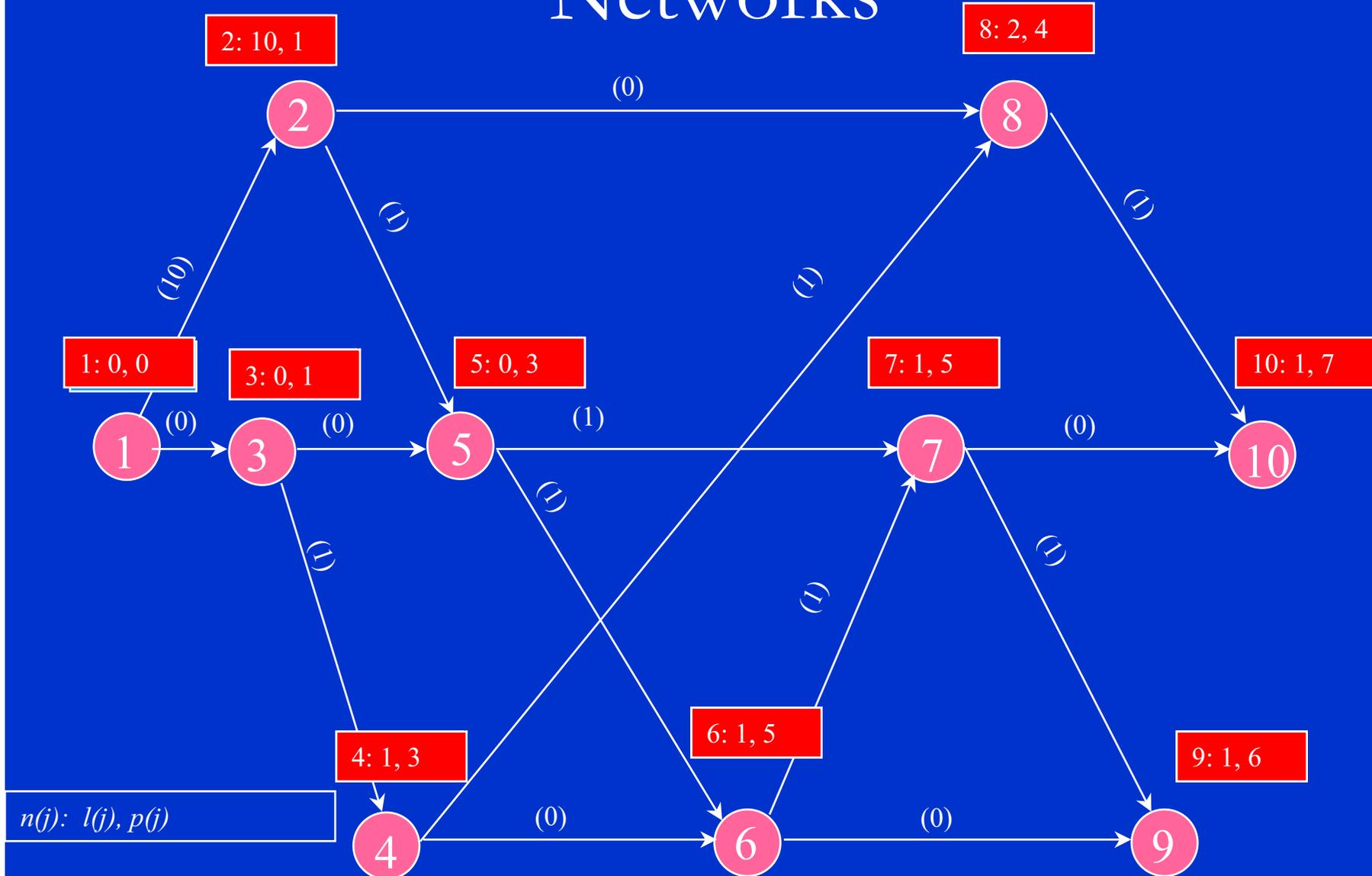
# Topological Orderings



# Topological Ordering Algorithm

- Given an acyclic graph  $G$ , let  $n = 1$  and  $n(j) = 0$  for each node  $j$  in  $G$
- Repeat until  $n = |N| + 1$  (where  $|N|$  is the number of nodes in  $G$ )
  - Select any node  $j$  with no incoming arcs and  $n(j) = 0$ .
  - Let  $n(j) = n$
  - Delete all arcs outgoing from  $j$
  - Let  $n = n + 1$

# Shortest Paths on Acyclic Networks



# Shortest Path Algorithm for Acyclic Networks

- Given acyclic graph  $G$ , let  $l(j)$  denote the length of the shortest path to node  $j$ ,  $p(j)$  denote the predecessor node of  $j$  on the shortest path and  $c(jk)$  the cost of arc  $jk$
- Set  $l(j)=\textit{infinity}$  and  $p(j)= -1$  for each node  $j$  in  $G$ , let  $n=1$ , and set  $l(1)= 0$  and  $p(1)=0$
- For  $n < |N| + 1$ 
  - Select node  $j$  with  $n(j) = n$
  - For each arc  $jk$  let  $l(k)=\textit{min}(l(k), l(j)+c(jk))$ 
    - If  $l(k)=l(j)+c(jk)$ , set  $p(k)=j$
  - Let  $n = n+1$

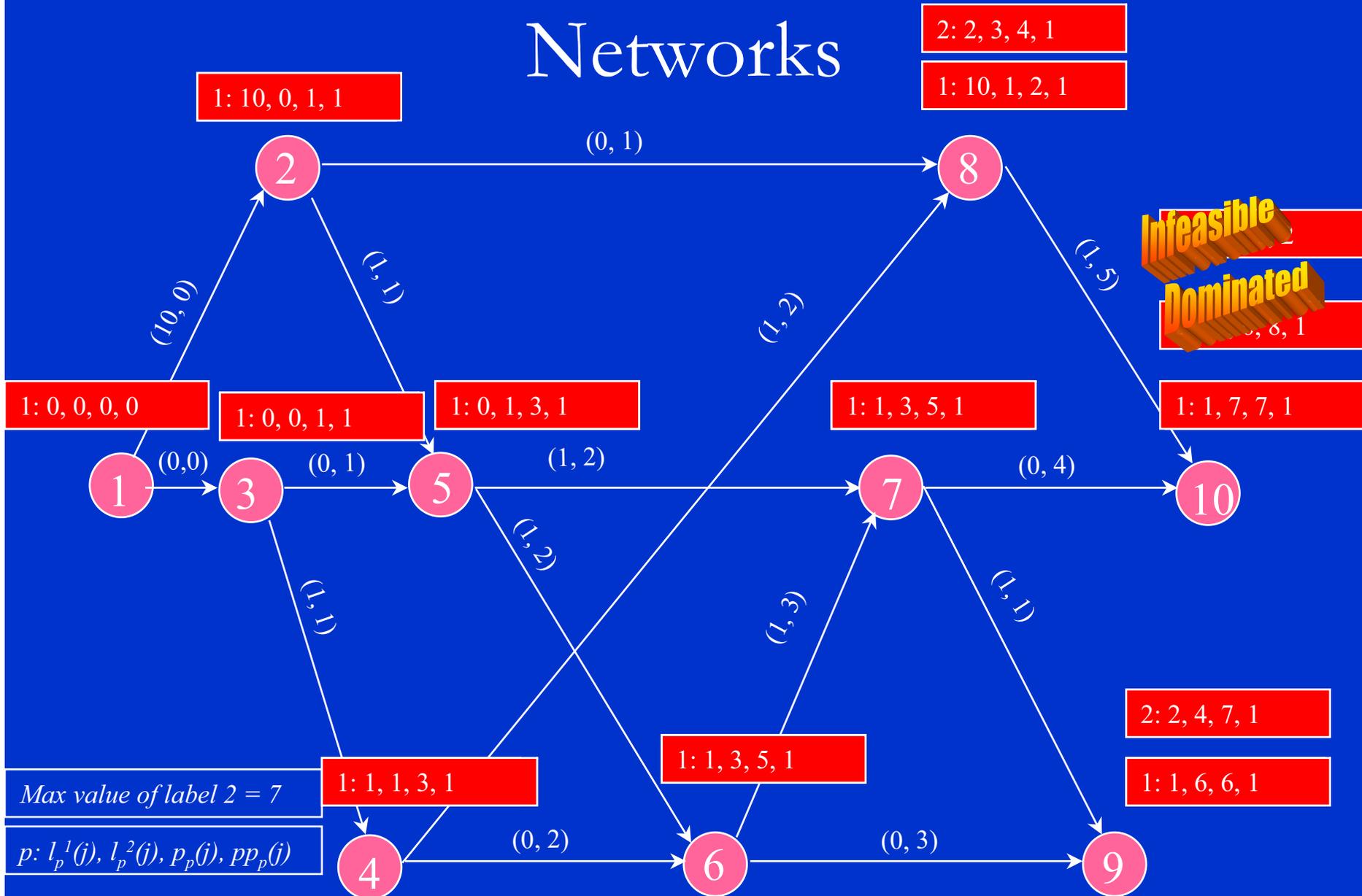
# Multiple Label (Constrained) Shortest Paths on Acyclic Networks

- Consider the objective of finding the minimum cost path with flying time **less than** a specified value  $F$
- Let label  $t_p(j)$  denote the flying time on path  $p$  to node  $j$  and label  $l_p(j)$  denote the cost of path  $p$  to node  $j$ , for any  $j$
- Only paths with  $t_p(j) < F$ , at any node  $j$ , are considered (the rest are excluded)
- A label set must be maintained at node  $j$  for each non-dominated path to  $j$ 
  - A path  $p'$  is dominated by path  $p$  at node  $j$  if  $l_{p'}(j) > l_p(j)$  and  $t_{p'}(j) > t_p(j)$
  - If  $p'$  is not dominated by any path  $p$  at node  $j$ ,  $p'$  is **non-dominated** at  $j$
  - In the worst case, a label set is maintained at each node  $j$  for each path  $p$  into  $j$

# Constrained Shortest Paths and Crew Scheduling

- Label sets are used to ensure that the shortest path is a “feasible” path
  - Labels are used to count the number of work hours in a day, the number of hours a crew is away from their home base, the number of flights in a given day, the number of hours rest in a 24 hour period, etc...
  - In some applications, there are over 2 dozen labels in a label set
- Many paths are **non-dominated**
- Exponential growth in the number of label sets (one set for each non-dominated path) at each node

# Shortest Paths on Acyclic Networks



# Constrained Shortest Path Notation for Acyclic Networks

- Given acyclic graph  $G$ ,
  - $l_p^k(j)$  denotes the value of label  $k$  (e.g., length, flying time, etc.) on label set  $p$  at node  $j$
  - $p_p(j)$  denotes the predecessor node for label set  $p$  at node  $j$
  - $pp_p(j)$  denotes the predecessor label set for label set  $p$  at node  $j$
  - $c(jk)$  denotes the cost of arc  $jk$
  - $m$  denotes the maximum possible number of non-dominated label sets at any node  $j$
  - $np(j)$  denotes the number of non-dominated label sets for node  $j$

# Constrained Shortest Path Algorithm for Acyclic Networks

- For  $p = 1$  to  $m$ , let  $l_p^k(j) = \text{infinity}$  for each  $k$ , and  $np(j) = 0$ ,  $p_p(j) = -1$  and  $pp_p(j) = -1$  for each node  $j$  in  $G$
- Let  $n = 1$  and set  $np(1) = 1$ ,  $l_1^k(1) = 0$  for each  $k$ ,  $p_1(1) = 0$  and  $pp_1(1) = 0$
- For  $n < |N| + 1$ 
  - Select node  $i$  with  $n(i) = n$
  - For each non-dominated  $p$  at node  $i$ 
    - For each arc  $ij$ , let  $np(j) = np(j) + 1$ ,  $p_{np(j)}(j) = i$ ,  $pp_{np(j)}(j) = p$ 
      - For each  $k$ , let  $l_{np(j)}^k(j) = l_p^k(i) + c(ij)$
    - If  $l_{np(j)}^k(j) > l_s^k(j)$  for some  $s = 1, \dots, np(j) - 1$ , then dominated and set  $np(j) = np(j) - 1$
  - Let  $n = n + 1$