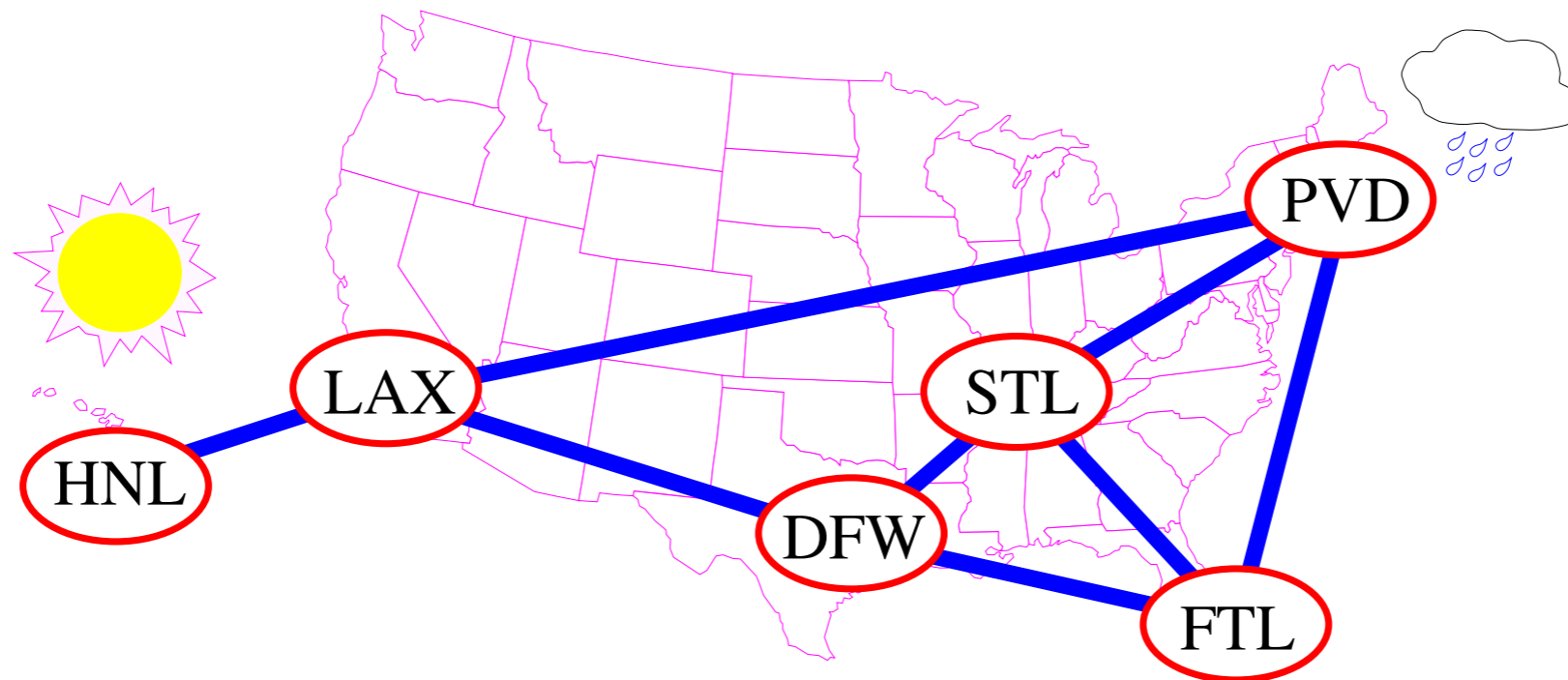


Winter 2016
COMP-250: Introduction
to Computer Science

Lecture 16, March 10, 2016

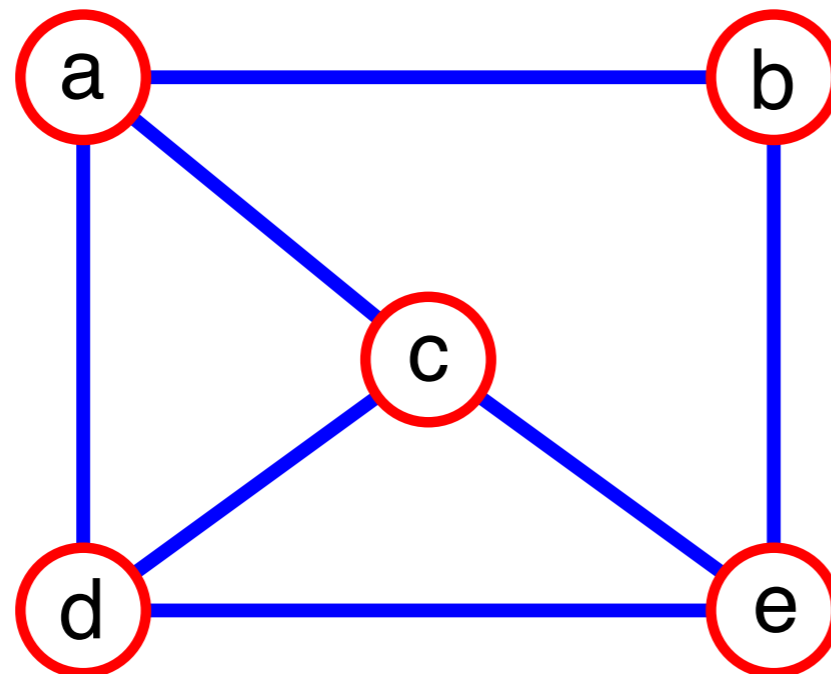
GRAPHS

- Definitions
- Examples
- The Graph ADT



What is a Graph?

- A graph $G = (\mathbf{V}, \mathbf{E})$ is composed of:
 - \mathbf{V} : set of *vertices*
 - \mathbf{E} : set of *edges* connecting the *vertices* in \mathbf{V}
- An **edge** $e = (u, v)$ is a pair of **vertices**
- Example:

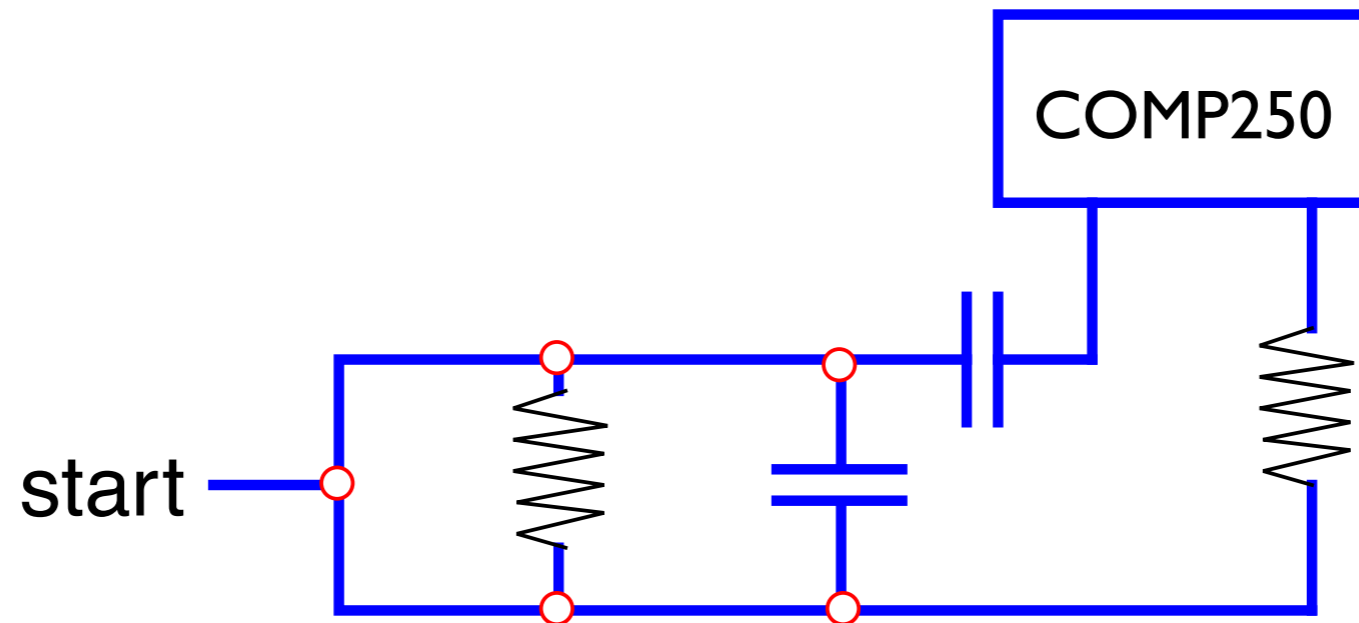


$$\mathbf{V} = \{a, b, c, d, e\}$$

$$\mathbf{E} = \{(a, b), (a, c), (a, d), (b, e), (c, d), (c, e), (d, e)\}$$

Applications

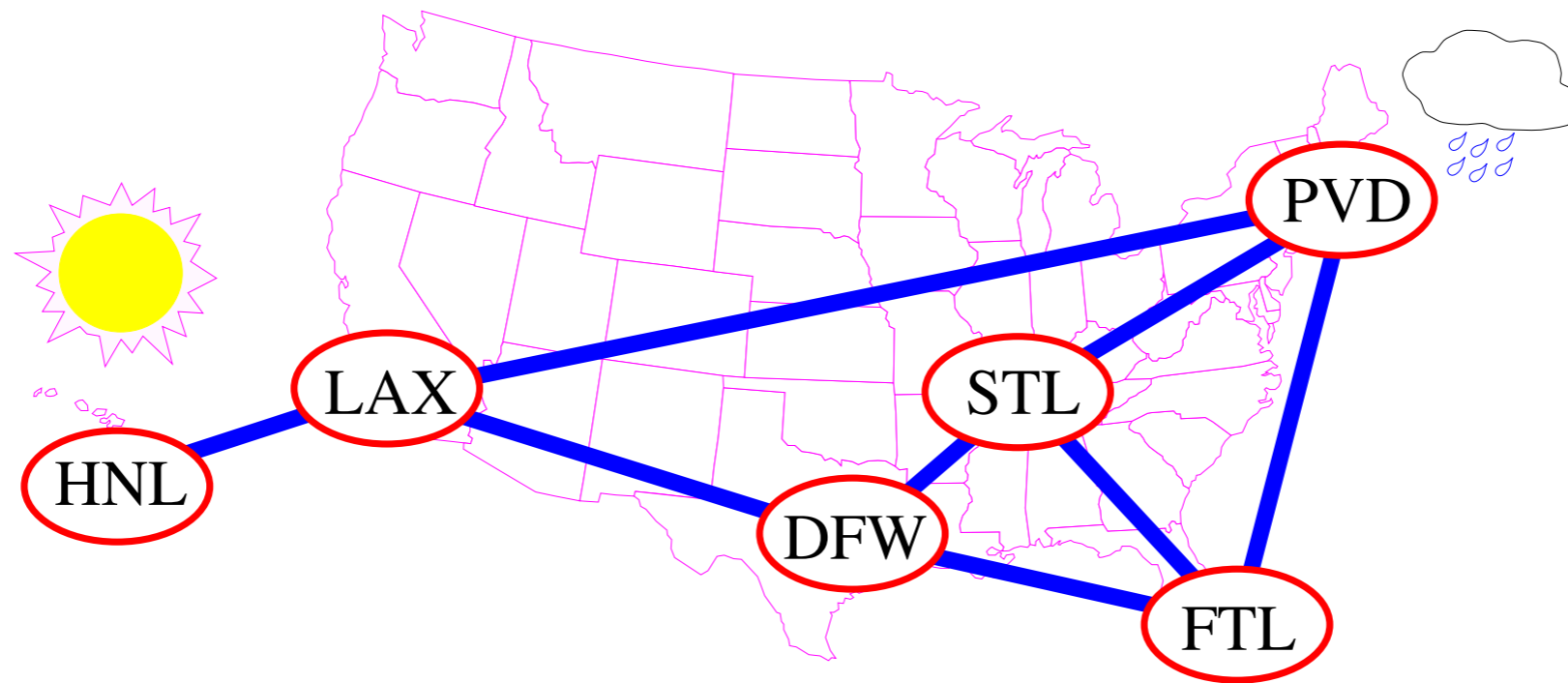
- electronic circuits



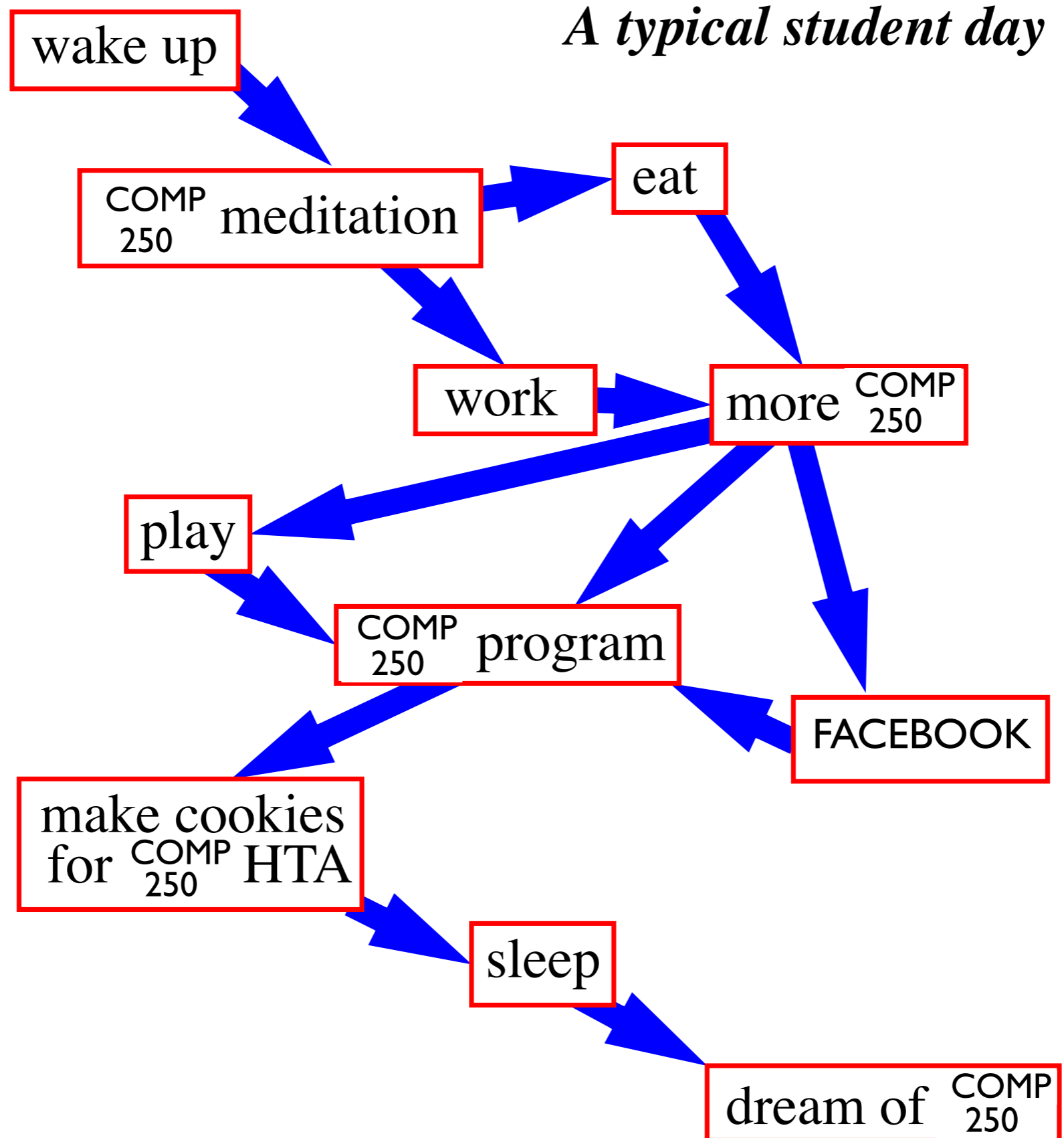
find the path of least resistance to COMP250

Applications

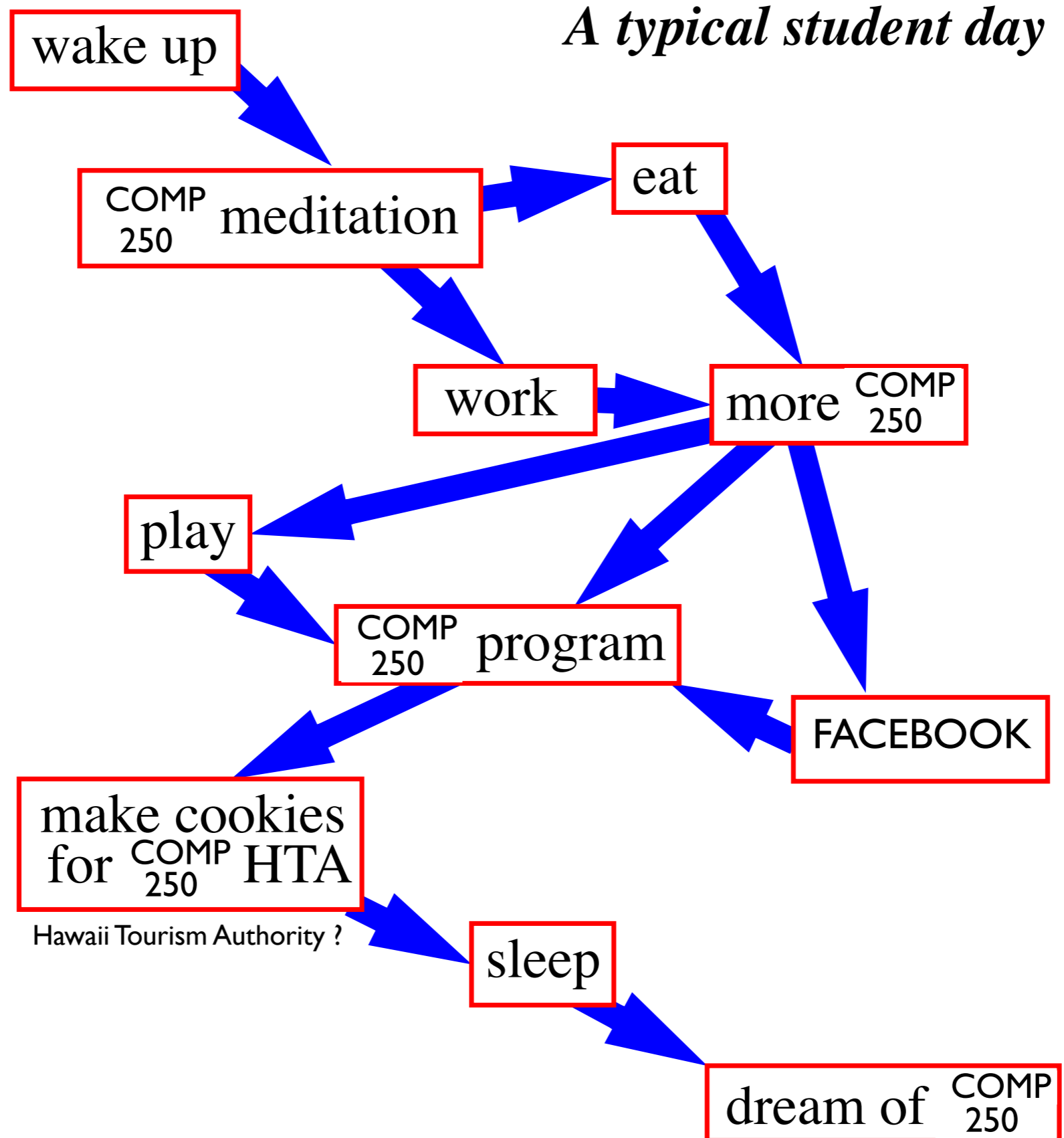
- **networks** (roads, flights, communications)



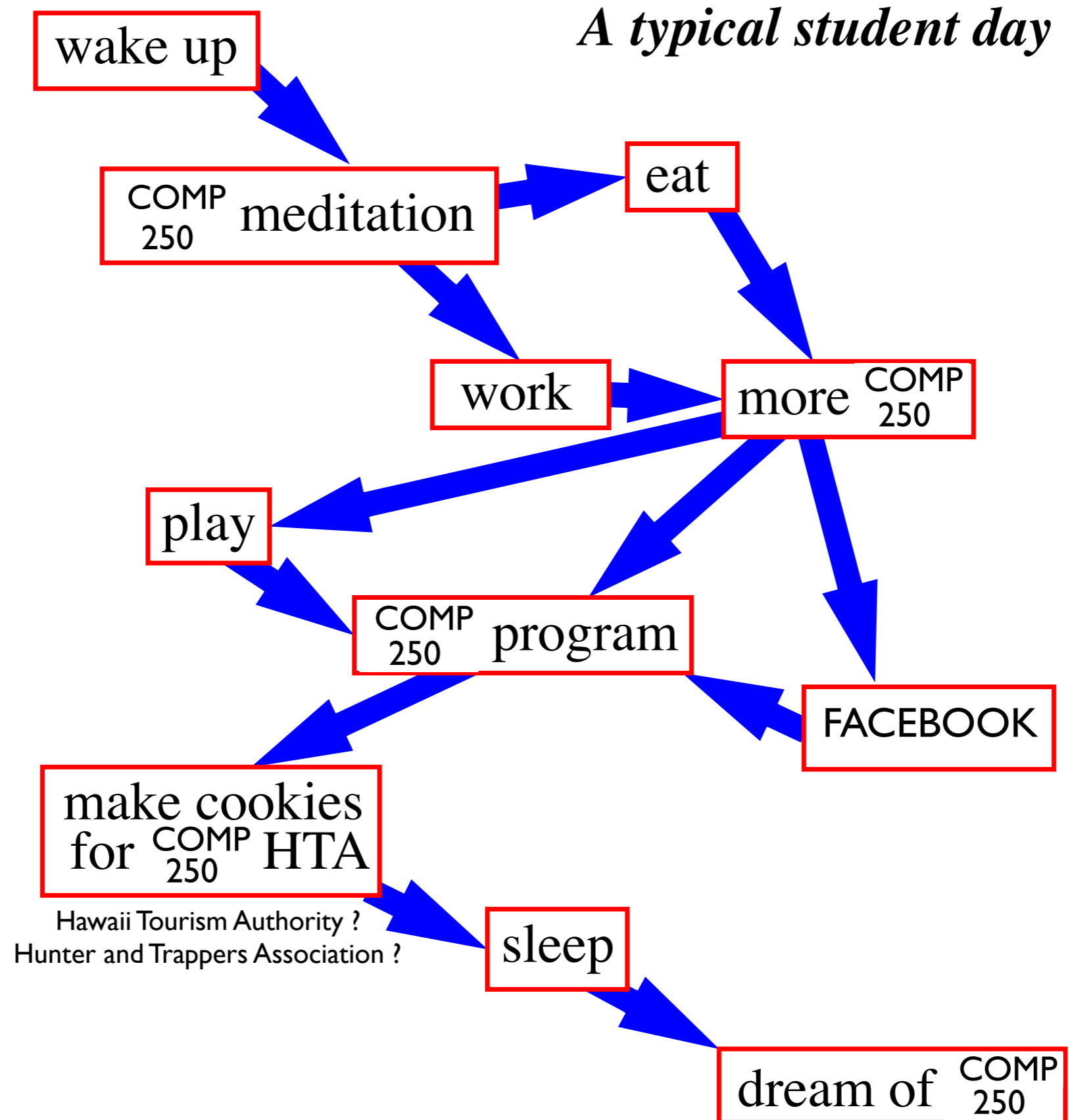
- scheduling (project planning)



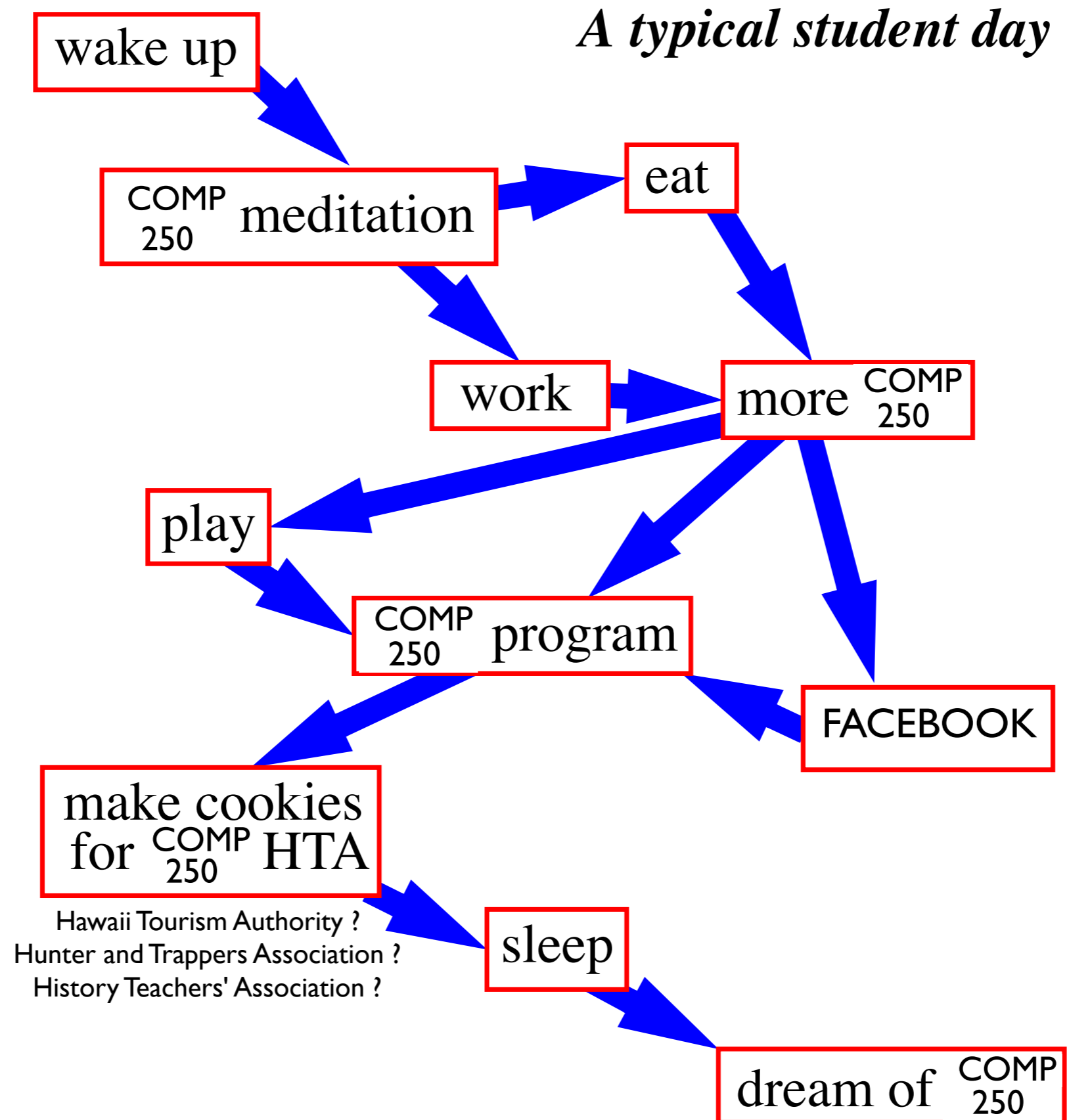
- scheduling (project planning)



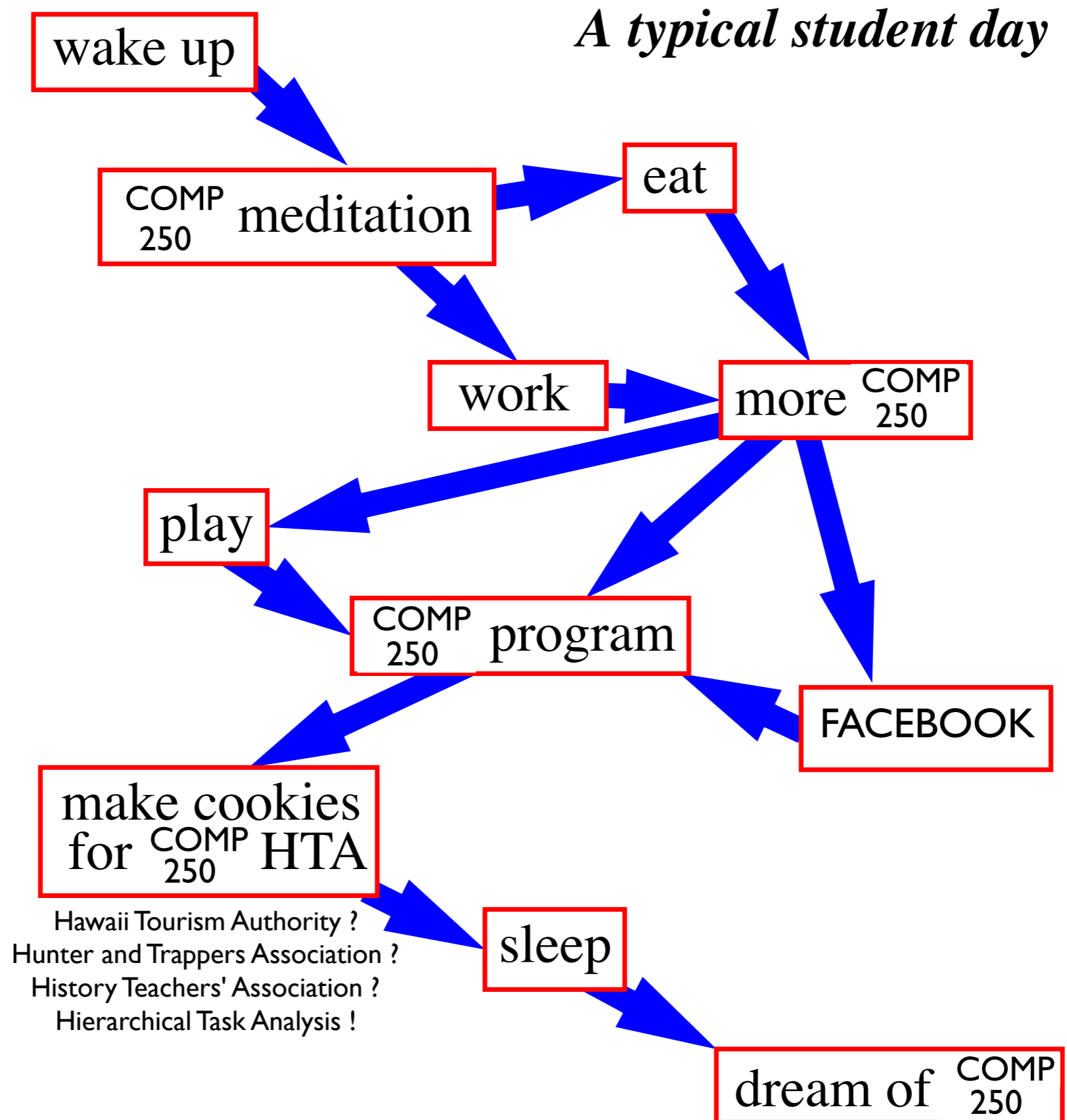
- scheduling (project planning)



- scheduling (project planning)



- scheduling (project planning)

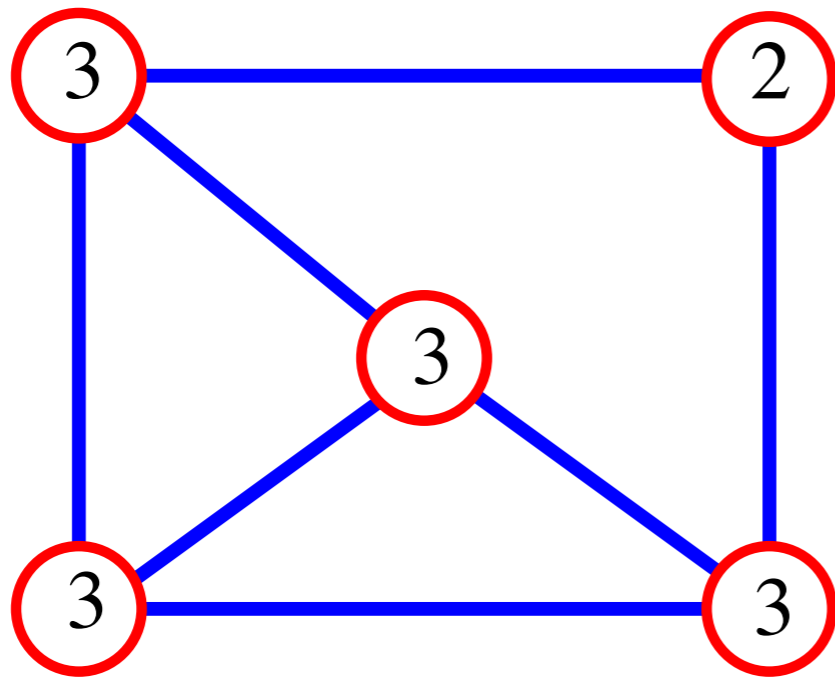


Applications

Graph	Nodes	Edges
transportation	street intersections	highways
communication	computers	fiber optic cables
World Wide Web	web pages	hyperlinks
social	people	relationships
food web	species	predator-prey
software systems	functions	function calls
scheduling	tasks	precedence constraints
circuits	gates	wires

Graph Terminology

- **adjacent vertices**: connected by an edge
- **degree** (of a **vertex**): # of adjacent vertices

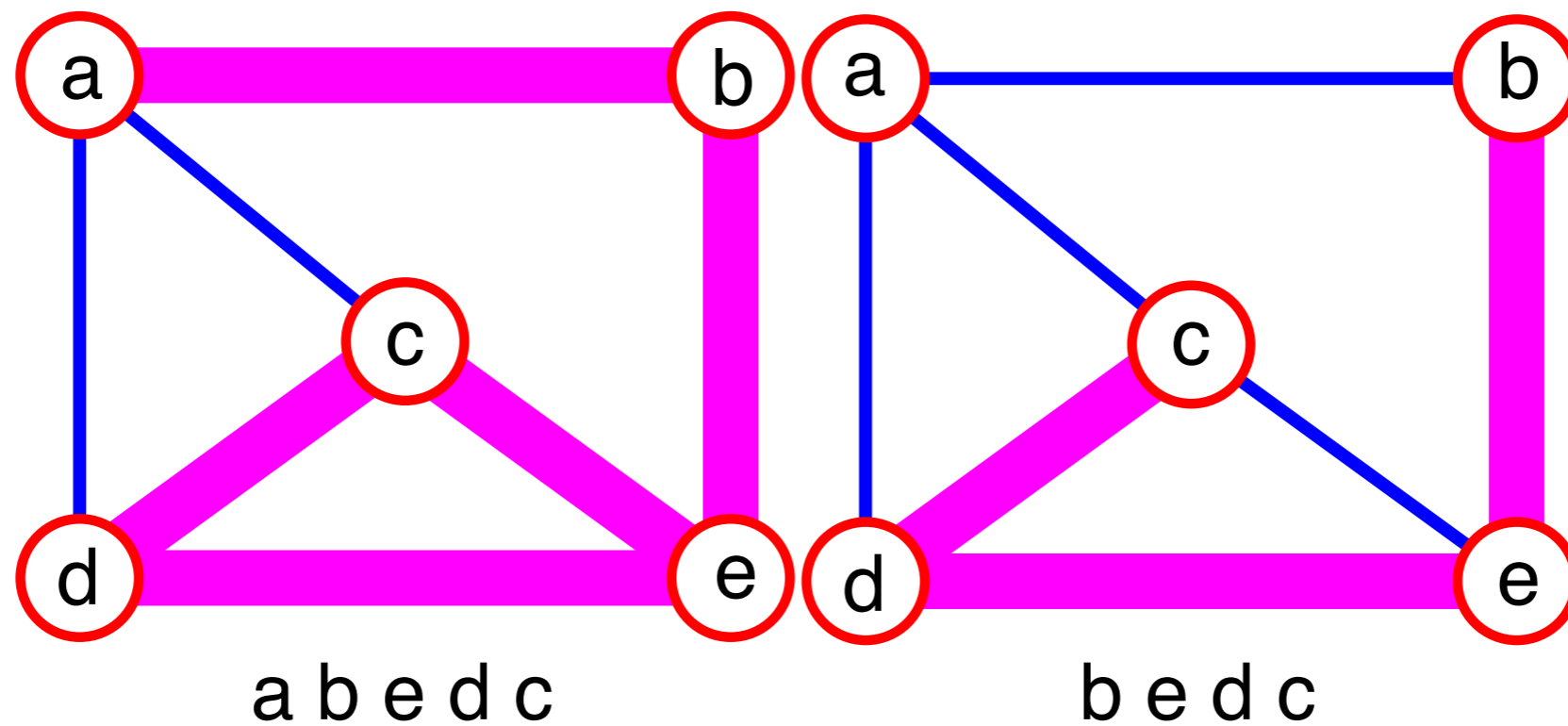


$$\sum_{v \in V} \deg(v) = 2(\# \text{ edges})$$

- Since adjacent vertices each count the adjoining edge, it will be counted twice

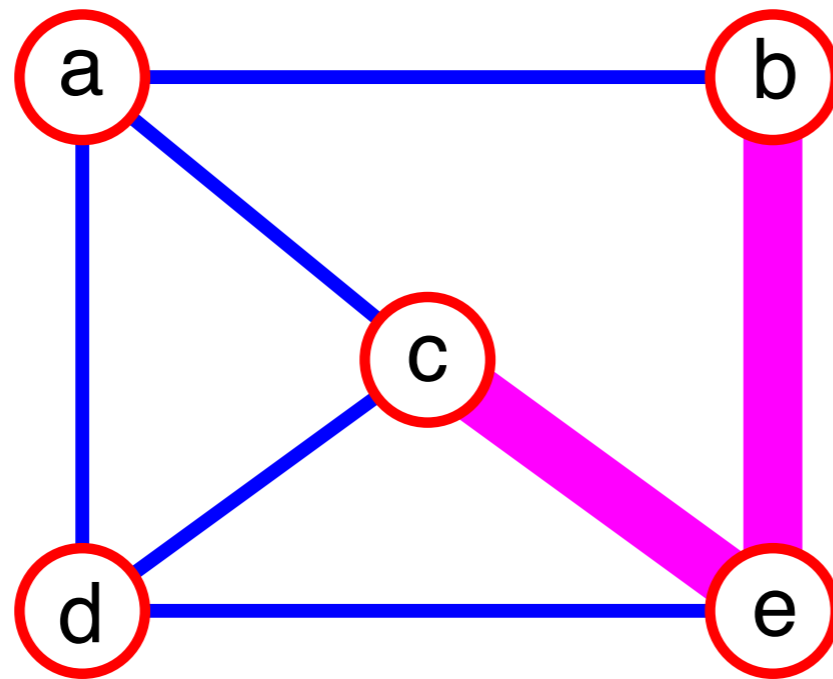
Graph Terminology

path: sequence of vertices v_1, v_2, \dots, v_k such that consecutive vertices v_i and v_{i+1} are adjacent.



More Graph Terminology

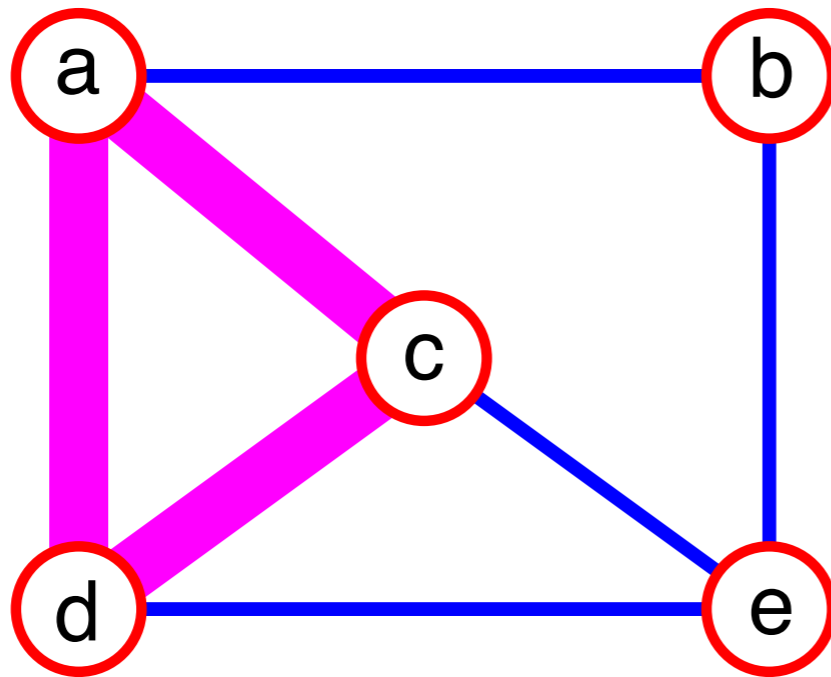
- **simple path**: no repeated vertices



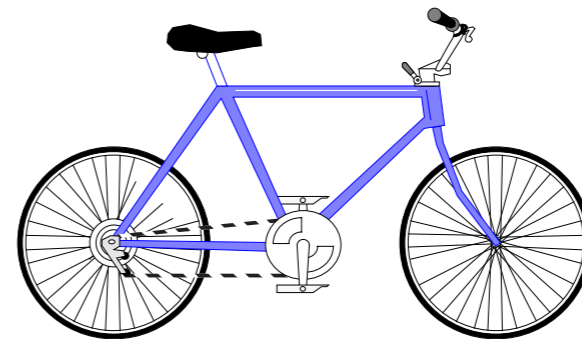
b e c

More Graph Terminology

- **cycle**: simple path, except that the last vertex is the same as the first vertex

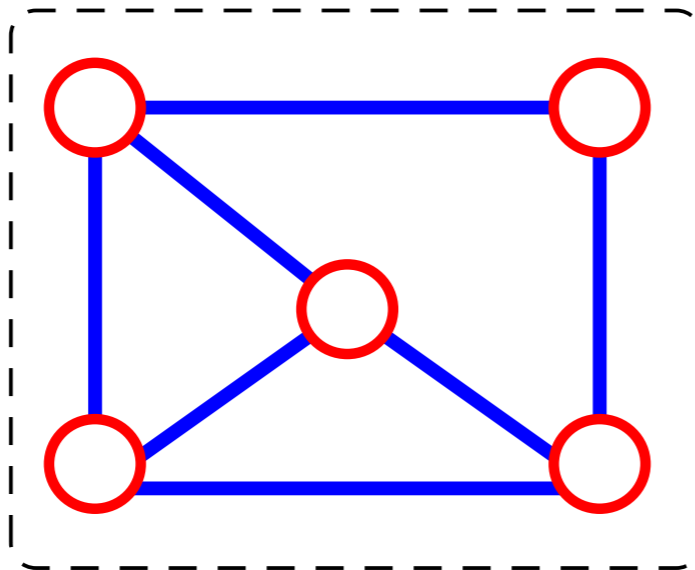


a c d a

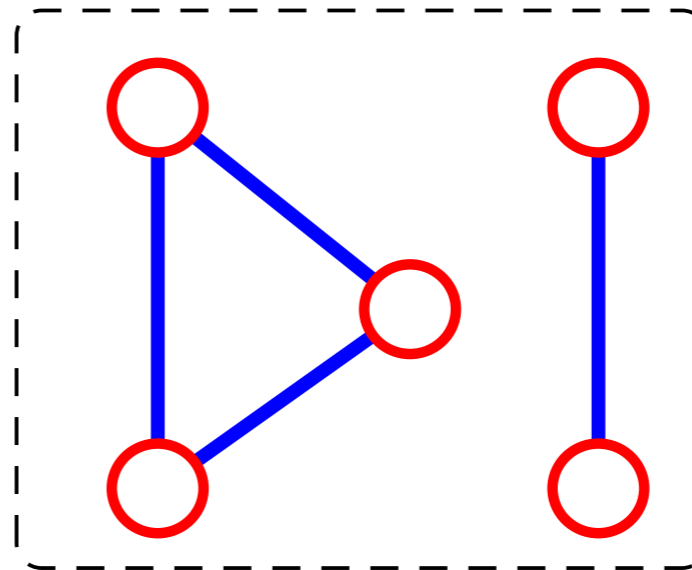


Even More Terminology

- **connected graph**: any two vertices are connected by some path



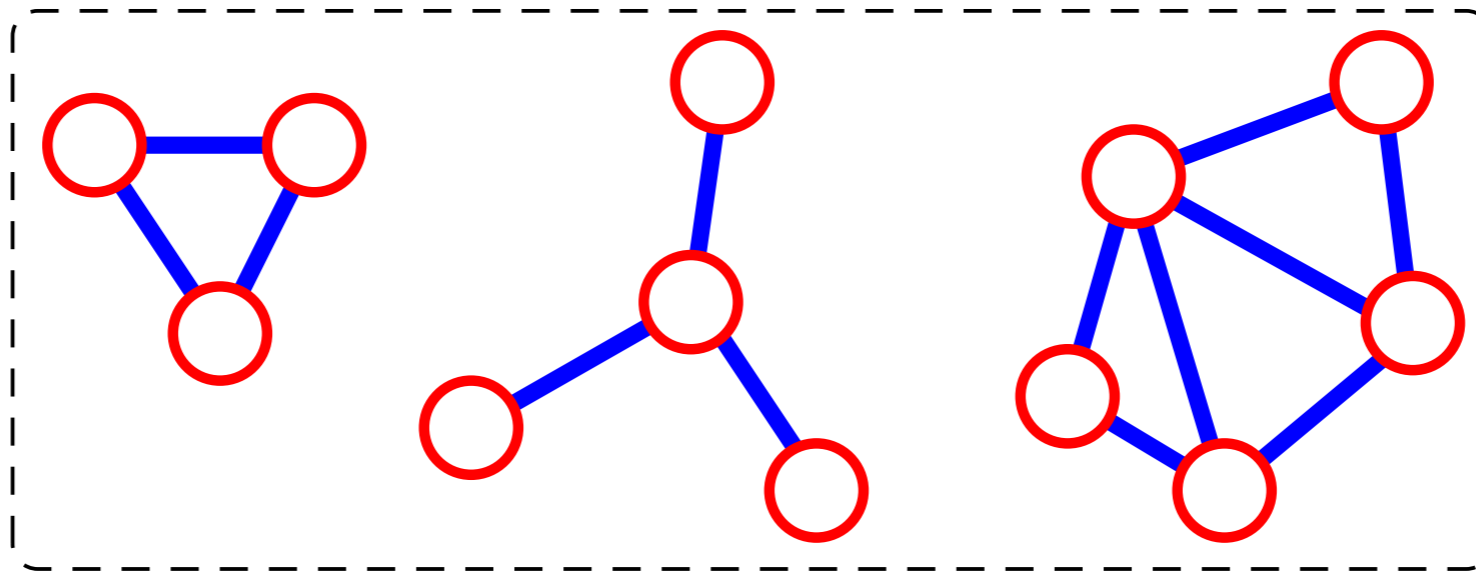
connected



not connected

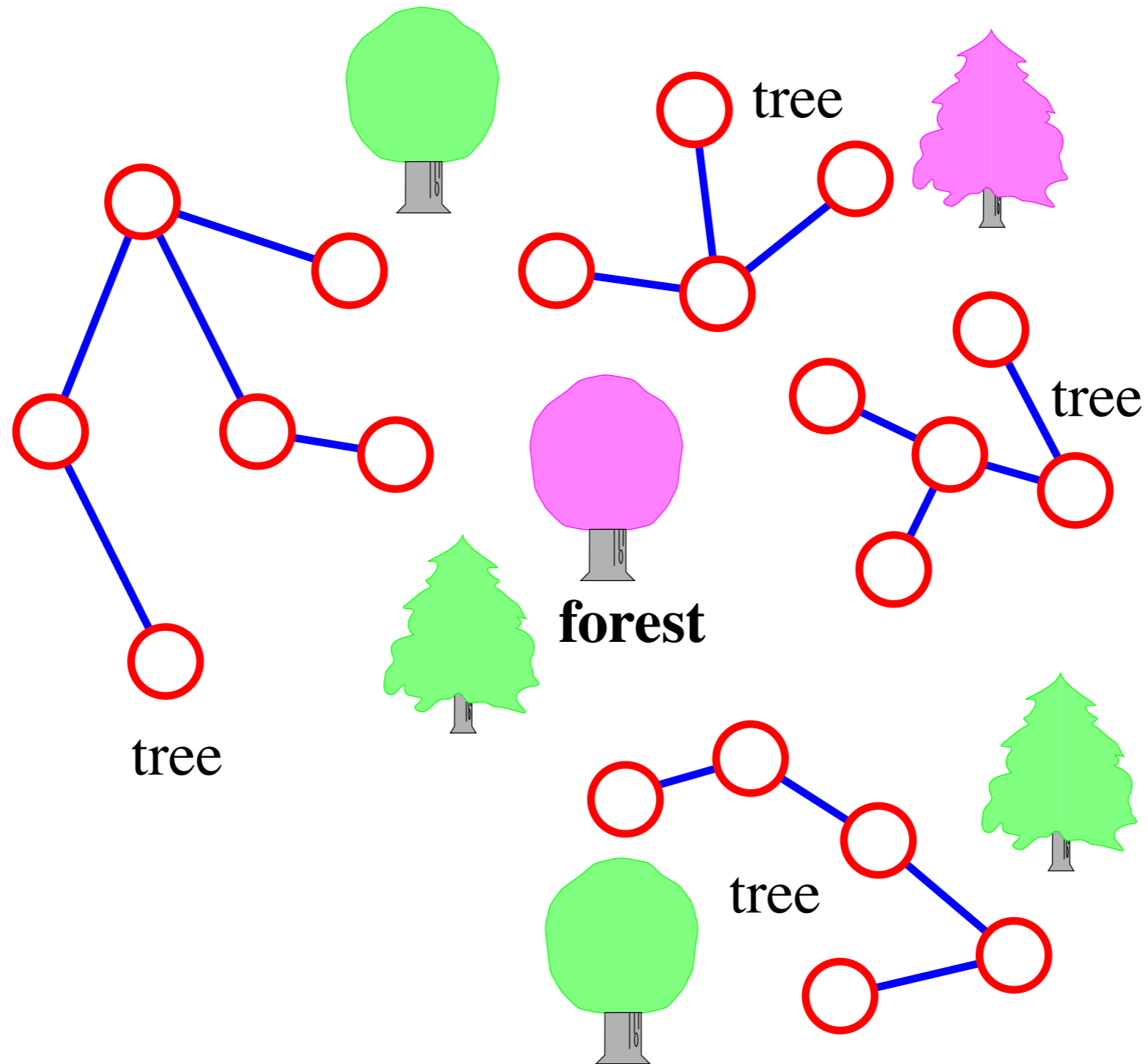
More Graph Terminology

- **subgraph**: subset of vertices and edges forming a graph
- **connected component**: maximal connected subgraph. E.g., the graph below has 3 connected components.



Yet another Terminology Slide!

- (free) tree - connected graph without cycles
- forest - collection of trees



Connectivity

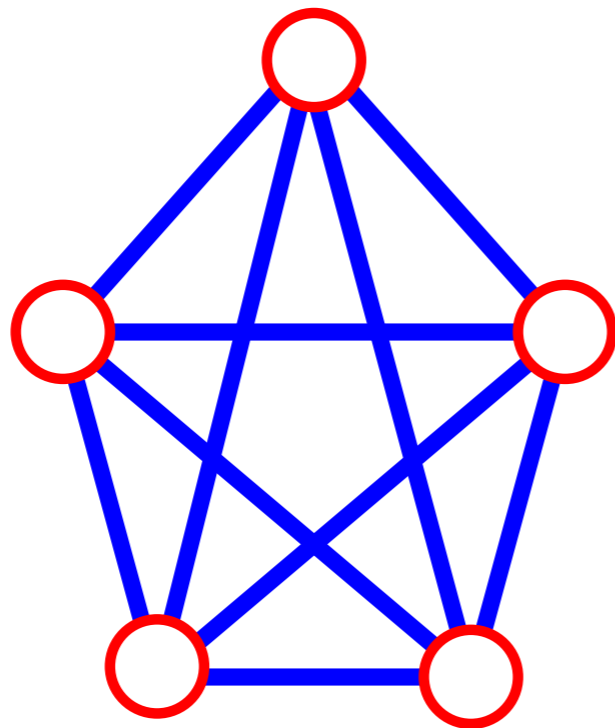
Let n = #vertices

m = #edges

- **complete graph** - all pairs of vertices are adjacent

$$m = (1/2) \sum_{v \in V} \deg(v) = (1/2) \sum_{v \in V} (n - 1) = n(n-1)/2$$

- Each of the n vertices is incident to $n - 1$ edges, however, we would have counted each edge twice!!! Therefore, intuitively, $m = n(n-1)/2$.



$$n = 5$$

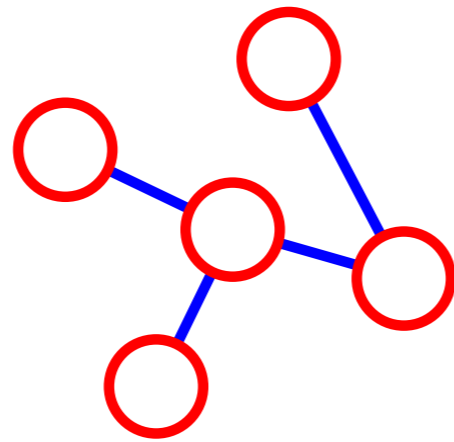
$$m = (5 * 4)/2 = 10$$

More Connectivity

n = #vertices

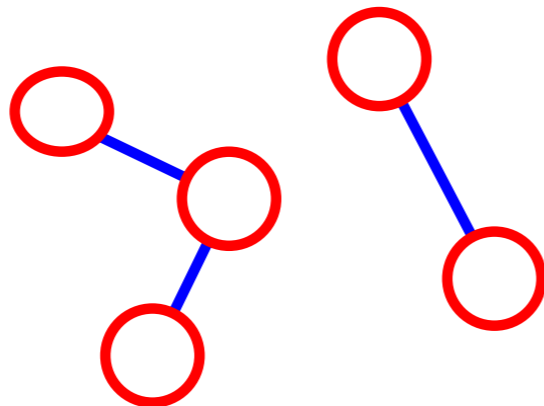
m = #edges

- For a tree **m** = **n** - 1



$$\begin{aligned} \mathbf{n} &= 5 \\ \mathbf{m} &= 4 \end{aligned}$$

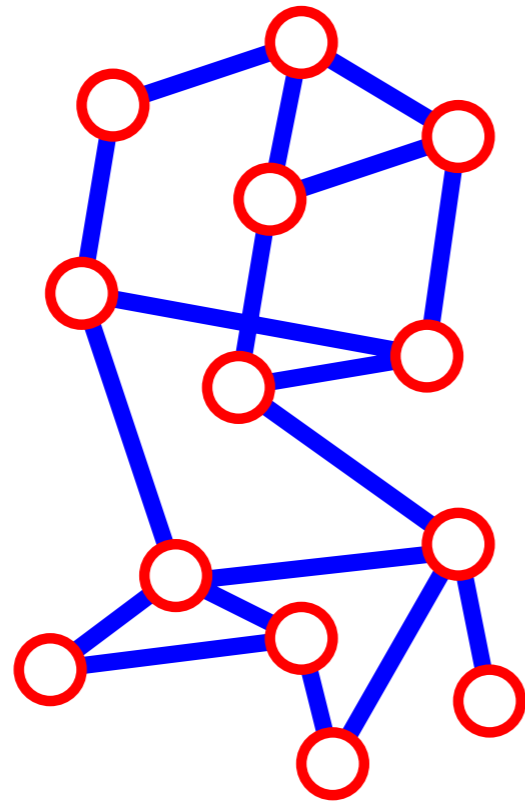
- If **m** < **n** - 1, G is not connected



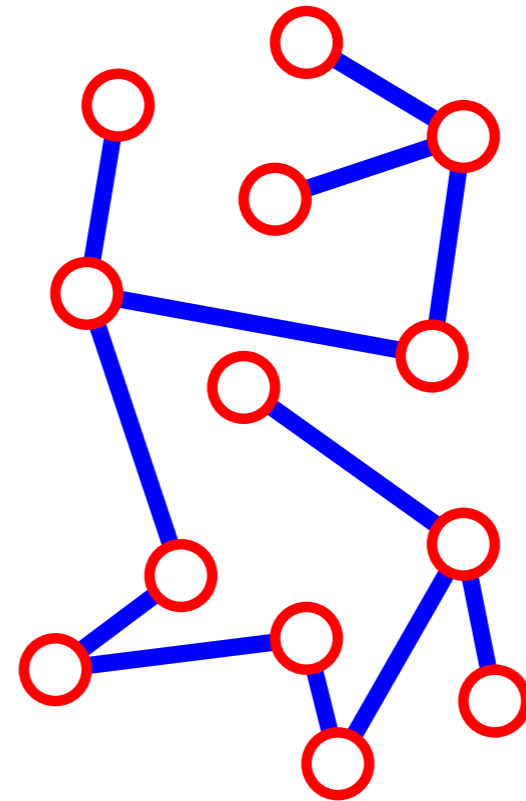
$$\begin{aligned} \mathbf{n} &= 5 \\ \mathbf{m} &= 3 \end{aligned}$$

Spanning Tree

- A **spanning tree** of G is a subgraph which
 - is a tree
 - contains all vertices of G



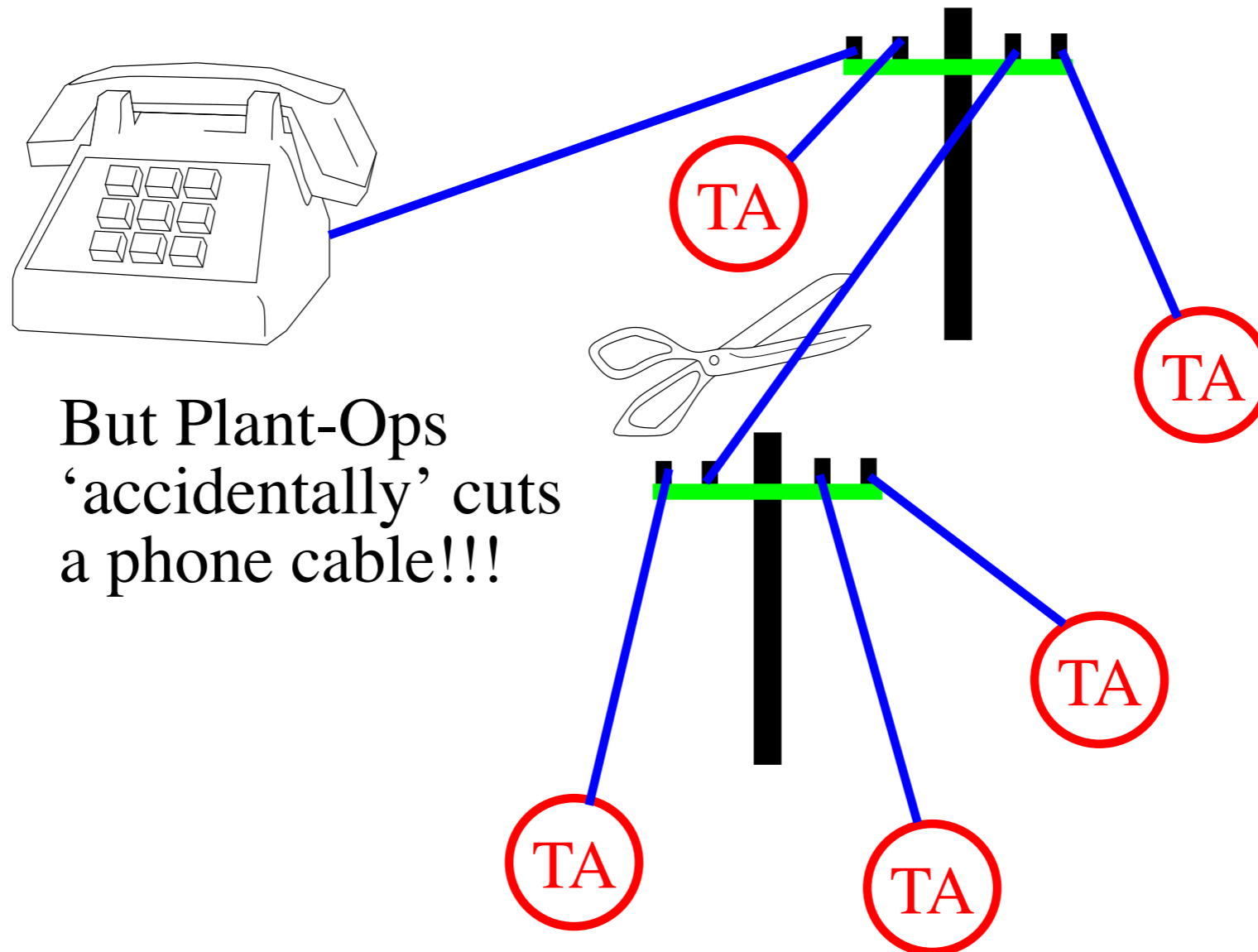
G



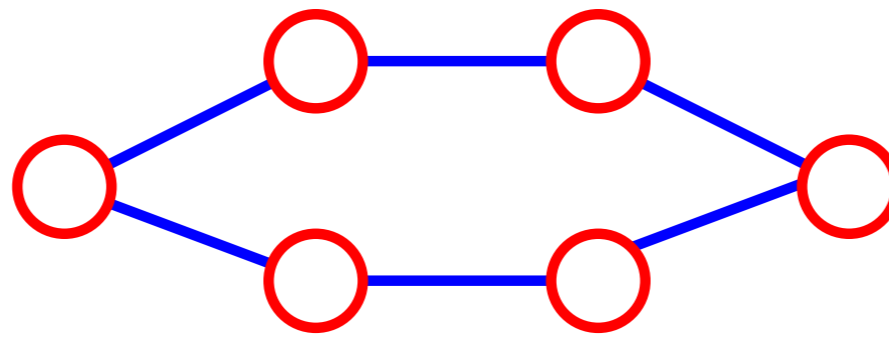
spanning tree of G

- Failure on any edge disconnects system (least fault tolerant)

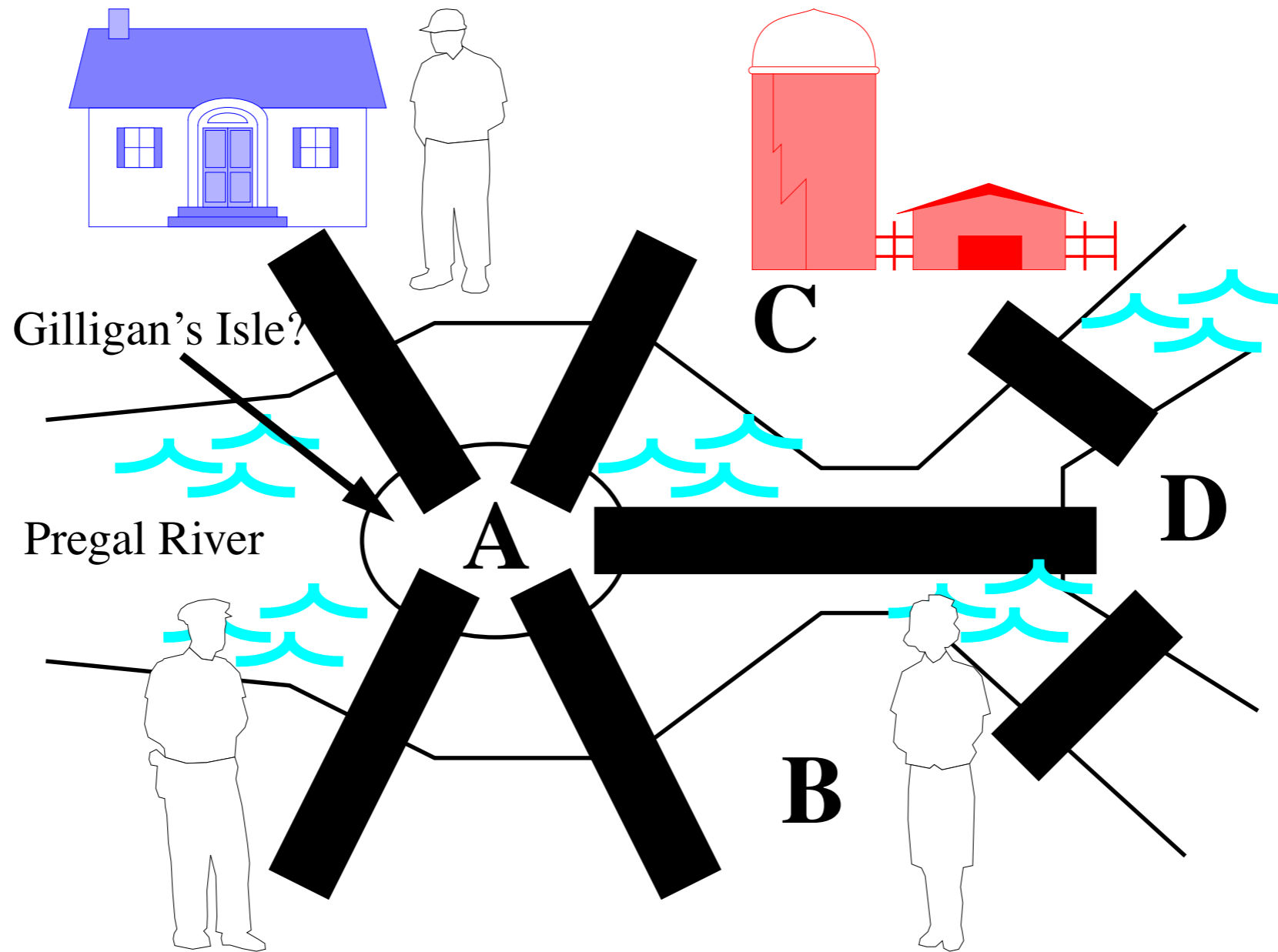
- Roberto wants to call the TA's to suggest an extension for the next program...



- One fault will disconnect part of graph!!
- A cycle would be more fault tolerant and only requires **n** edges



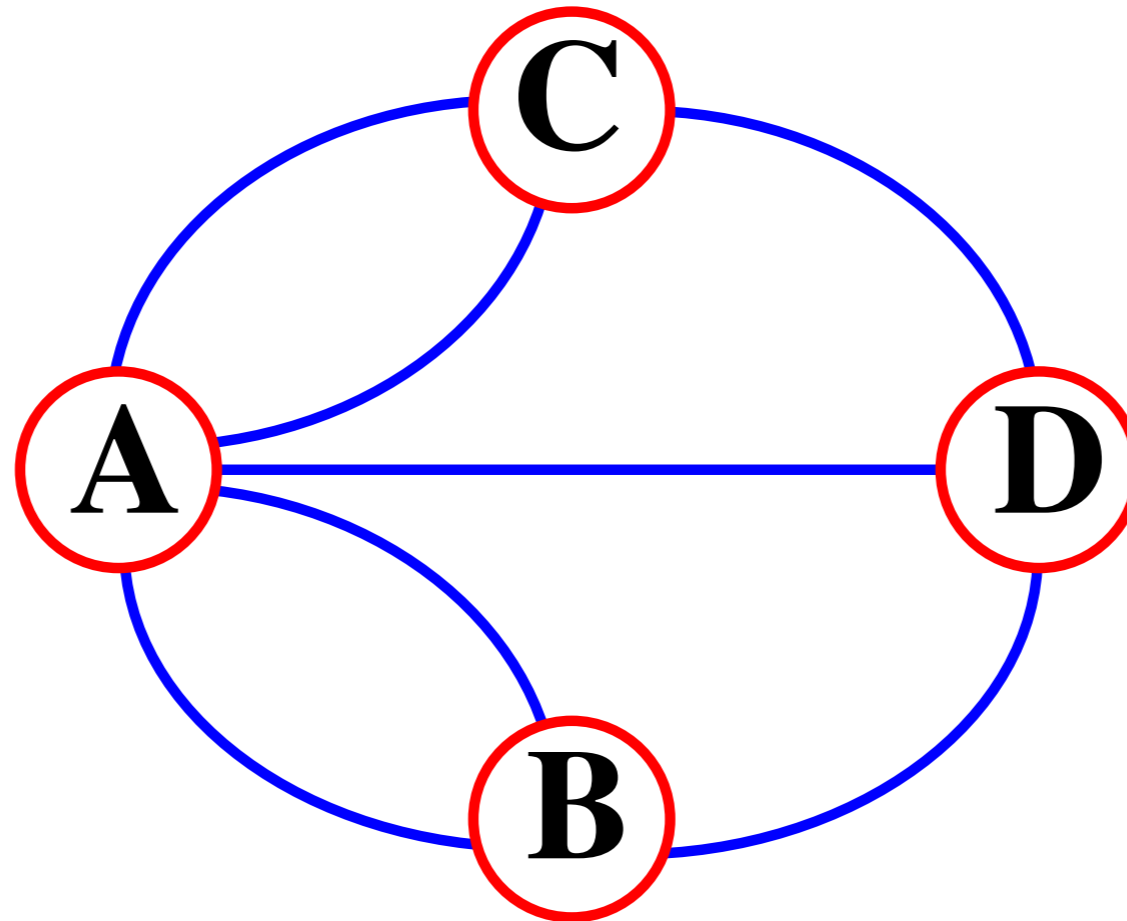
Koenigsberg



Can one walk across each bridge exactly once and return at the starting point?

- Consider if you were a UPS driver, and you didn't want to retrace your steps.
- In 1736, Euler proved that this is not possible

Graph Model(with parallel edges)



- **Eulerian Tour:** path that traverses every edge exactly once and returns to the first vertex
- **Euler's Theorem:** A graph has a Eulerian Tour if and only if all vertices have even degree

The Graph ADT

- The **Graph ADT** is a **positional container** whose positions are the vertices and the edges of the graph.
 - `size()` Return the number of vertices plus the number of edges of G .
 - `isEmpty()`
 - `elements()`
 - `positions()`
 - `swap()`
 - `replaceElement()`

The Graph ADT (contd.)

Notation: Graph G ; Vertices v, w ; Edge e ; Object o

- numVertices()
Return the number of vertices of G .
- numEdges()
Return the number of edges of G .
- vertices() Return an enumeration of the vertices of G .
- edges() Return an enumeration of the edges of G .

The Graph ADT (contd.)

- `directedEdges()`
Return an enumeration of all directed edges in G .
- `undirectedEdges()`
Return an enumeration of all undirected edges in G .
- `incidentEdges(v)`
Return an enumeration of all edges incident on v .
- `inIncidentEdges(v)`
Return an enumeration of all the incoming edges to v .
- `outIncidentEdges(v)`
Return an enumeration of all the outgoing edges from v .

The Graph ADT (contd.)

- `opposite(v , e)`
Return an endpoint of e distinct from v
- `degree(v)`
Return the degree of v .
- `inDegree(v)`
Return the in-degree of v .
- `outDegree(v)`
Return the out-degree of v .

More Methods ...

- `adjacentVertices(v)`
Return an enumeration of the vertices adjacent to v .
- `inAdjacentVertices(v)`
Return an enumeration of the vertices adjacent to v along incoming edges.
- `outAdjacentVertices(v)`
Return an enumeration of the vertices adjacent to v along outgoing edges.
- `areAdjacent(v,w)`
Return whether vertices v and w are adjacent.

More Methods ...

- `endVertices(e)`
Return an array of size 2 storing the end vertices of *e*.
- `origin(e)`
Return the end vertex from which *e* leaves.
- `destination(e)`
Return the end vertex at which *e* arrives.
- `isDirected(e)`
Return true iff *e* is directed.

Update Methods

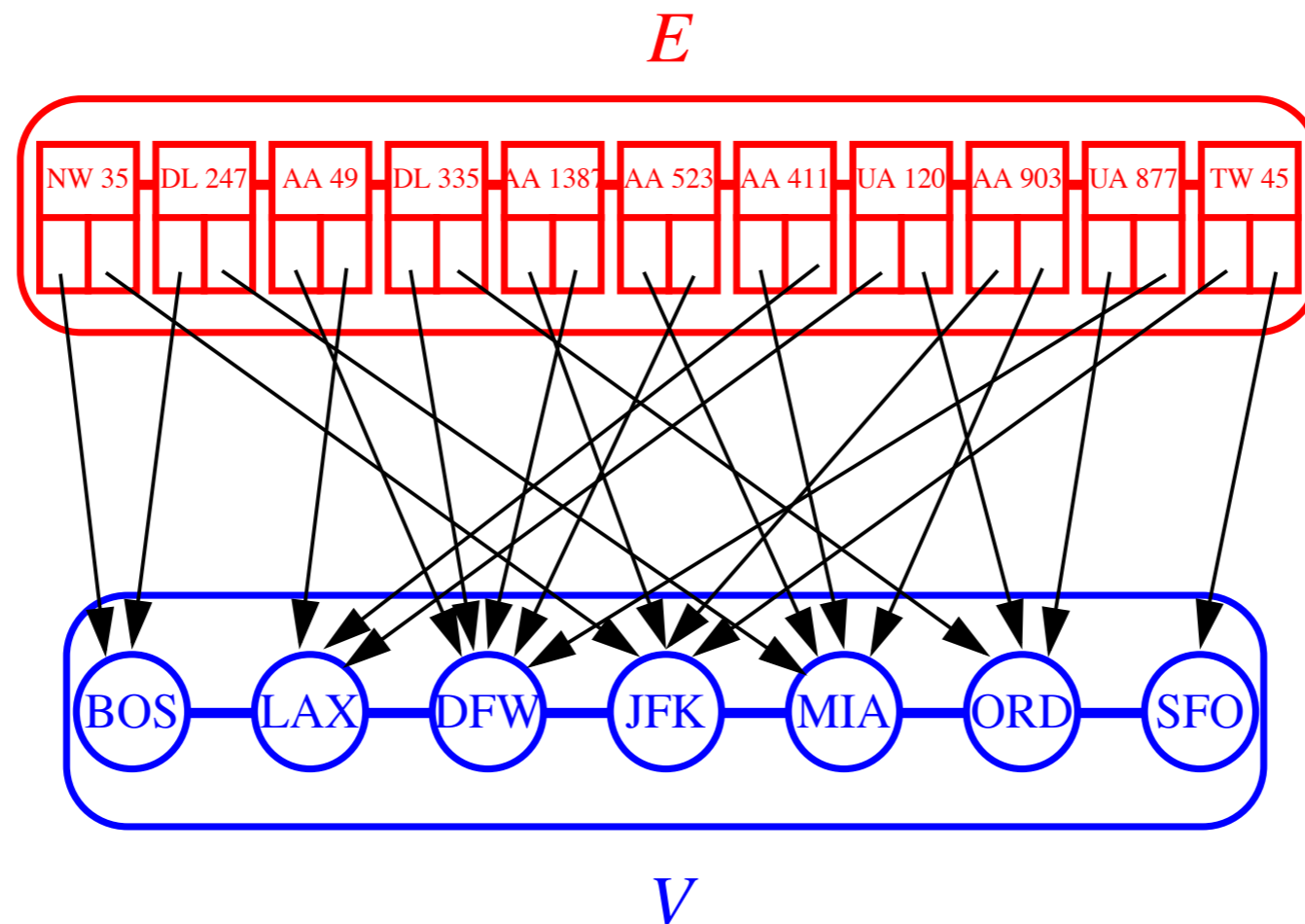
- `makeUndirected(e)`
Set e to be an undirected edge.
- `reverseDirection(e)`
Switch the origin and destination vertices of e .
- `setDirectionFrom(e, v)`
Sets the direction of e away from v , one of its end vertices.
- `setDirectionTo(e, v)`
Sets the direction of e toward v , one of its end vertices.

Update Methods

- `insertEdge(v , w , o)`
Insert and return an undirected edge between v and w , storing o at this position.
- `insertDirectedEdge(v , w , o)`
Insert and return a directed edge between v and w , storing o at this position.
- `insertVertex(o)`
Insert and return a new (isolated) vertex storing o at this position.
- `removeEdge(e)`
Remove edge e .

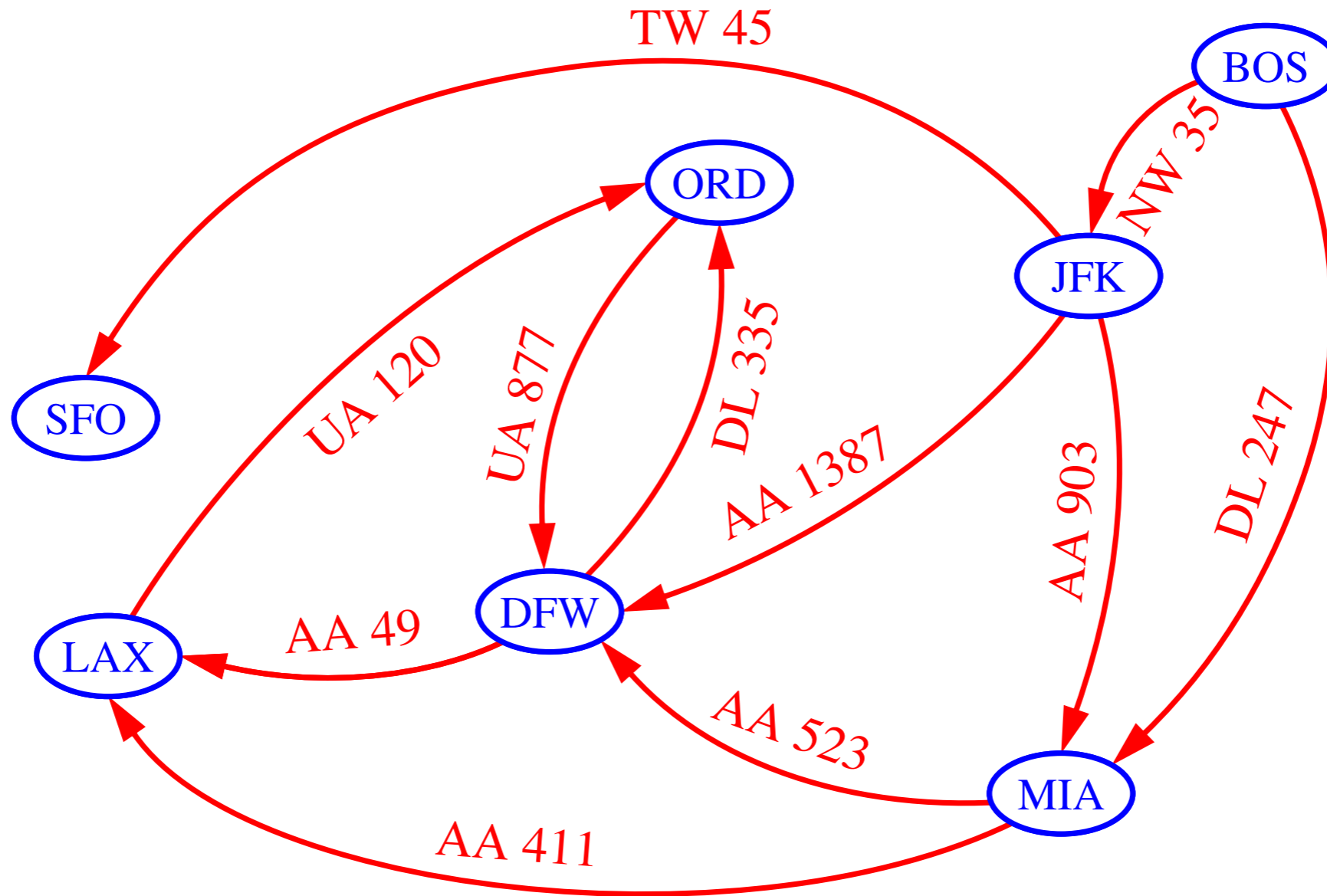
DATA STRUCTURES FOR GRAPHS

- Edge list
- Adjacency lists
- Adjacency matrix



Data Structures for Graphs

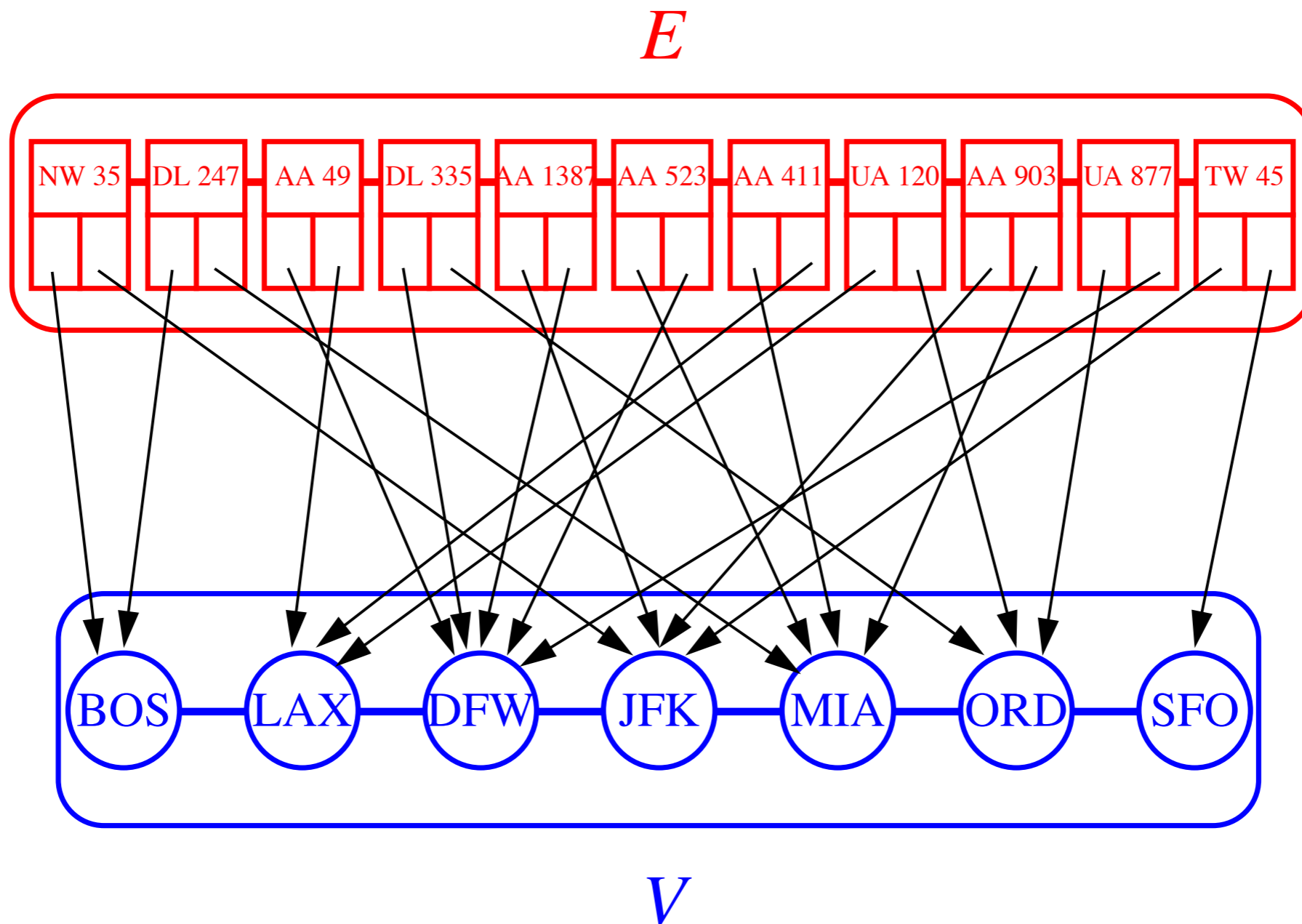
- To start with, we store the **vertices** and the **edges** into two containers, and each edge object has references to the vertices it connects.



- Additional structures can be used to perform efficiently the methods of the Graph ADT

Edge List

- The **edge list** structure simply stores the vertices and the edges into unsorted sequences.
- Easy to implement.
- Finding the edges incident on a given vertex is inefficient since it requires examining the entire edge sequence

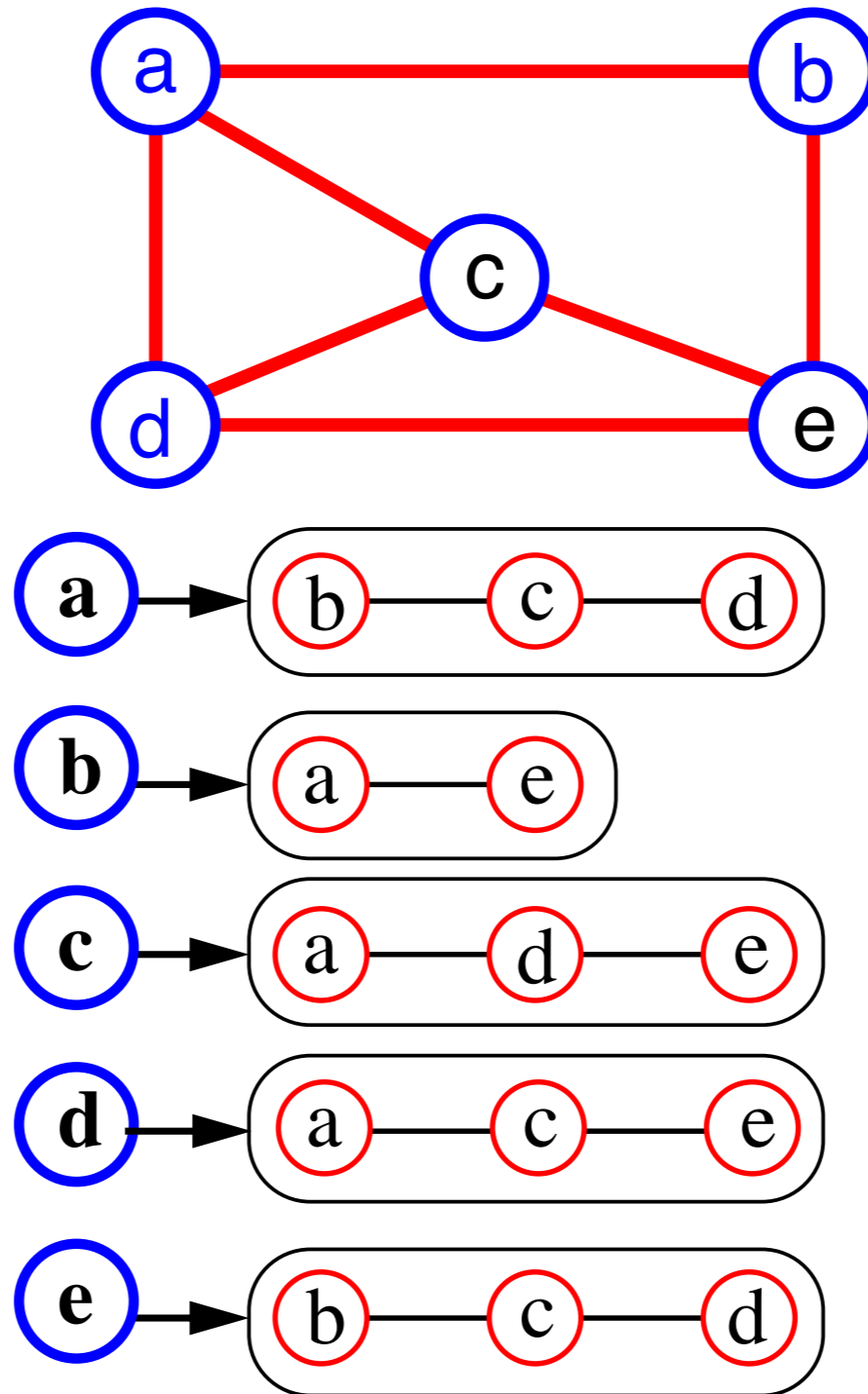


Performance of the Edge List Structure

Operation	Time
size, isEmpty, replaceElement, swap	$O(1)$
numVertices, numEdges	$O(1)$
vertices	$O(n)$
edges, directedEdges, undirectedEdges	$O(m)$
elements, positions	$O(n+m)$
endVertices, opposite, origin, destination, isDirected	$O(1)$
incidentEdges, inIncidentEdges, outIncidentEdges, adjacentVertices, inAdjacentVertices, outAdjacentVertices, areAdjacent, degree, inDegree, outDegree	$O(m)$
insertVertex, insertEdge, insertDirectedEdge, removeEdge, makeUndirected, reverseDirection, setDirectionFrom, setDirectionTo	$O(1)$
removeVertex	$O(m)$

Adjacency List (traditional)

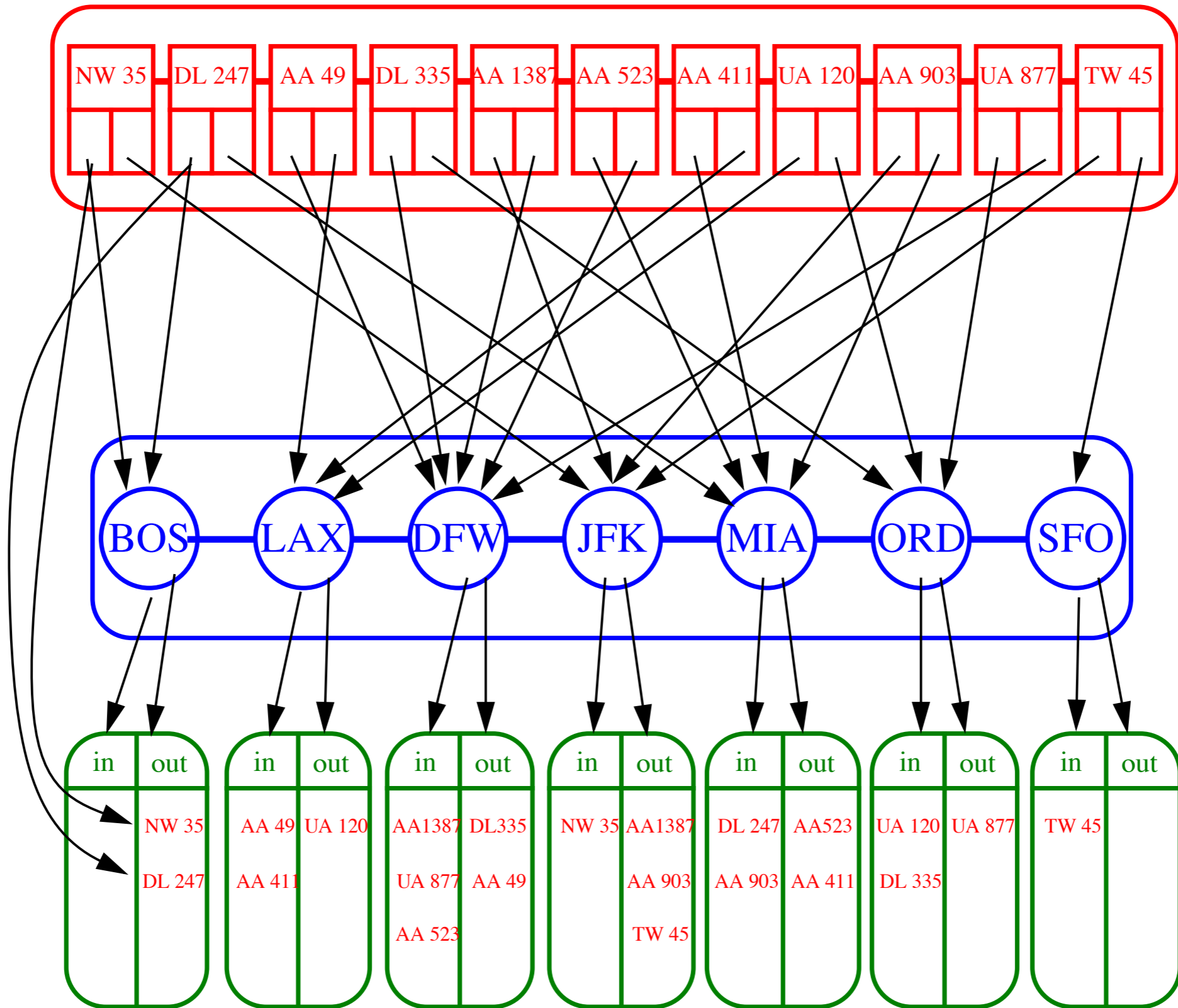
- **adjacency list of a vertex v** :
sequence of vertices adjacent to v
- represent the graph by the adjacency lists of all the vertices



- Space = $\Theta(N + \sum \text{deg}(v)) = \Theta(N + M)$

Adjacency List (modern)

- The **adjacency list** structure extends the edge list structure by adding **incidence containers** to each vertex.

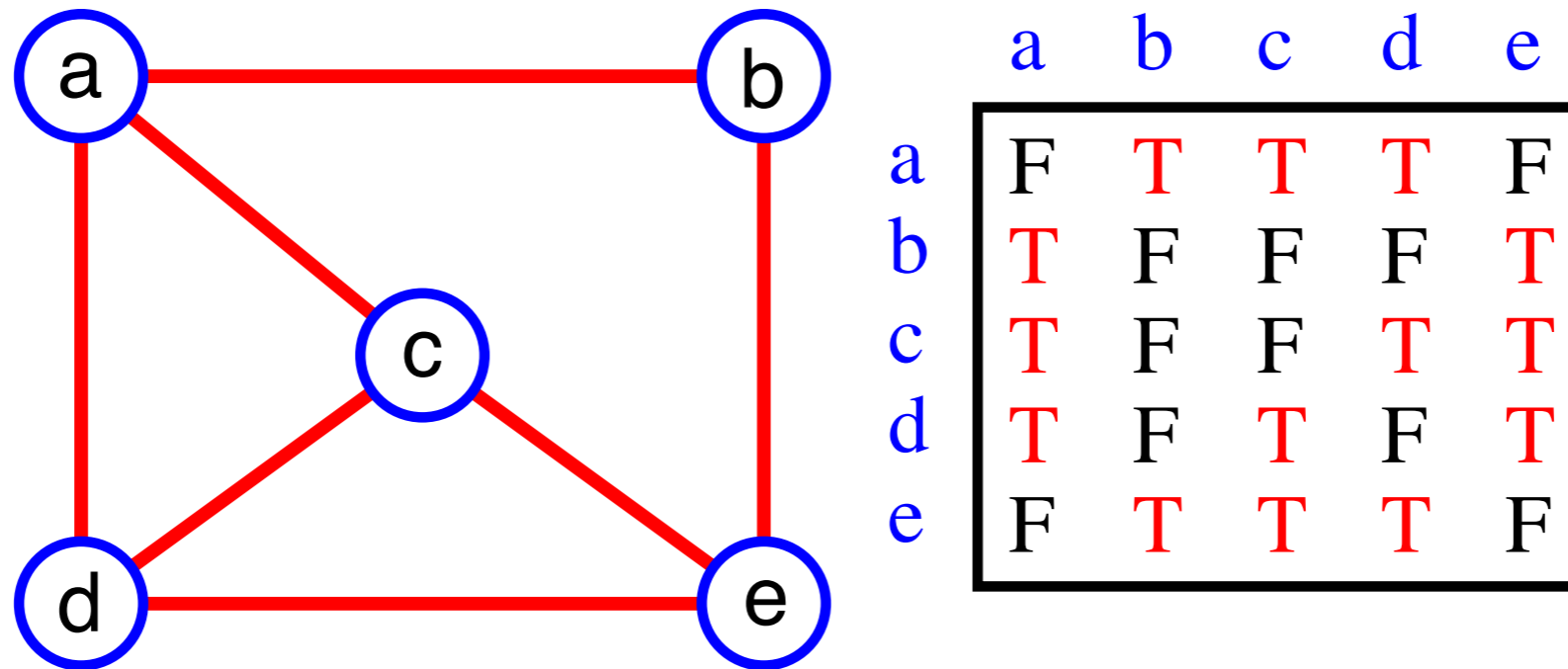


- The space requirement is $O(n + m)$.

Performance of the Adjacency List Structure

Operation	Time
size, isEmpty, replaceElement, swap	$O(1)$
numVertices, numEdges	$O(1)$
vertices	$O(n)$
edges, directedEdges, undirectedEdges	$O(m)$
elements, positions	$O(n+m)$
endVertices, opposite, origin, destination, isDirected, degree, inDegree, outDegree	$O(1)$
incidentEdges(v), inIncidentEdges(v), outIncidentEdges(v), adjacentVertices(v), inAdjacentVertices(v), outAdjacentVertices(v)	$O(\text{deg}(v))$
areAdjacent(u, v)	$O(\min(\text{deg}(u), \text{deg}(v)))$
insertVertex, insertEdge, insertDirectedEdge, removeEdge, makeUndirected, reverseDirection,	$O(1)$
removeVertex(v)	$O(\text{deg}(v))$

Adjacency Matrix (traditional)



- matrix M with entries for all pairs of vertices
- $M[i,j] = \text{true}$ means that there is an edge (i,j) in the graph.
- $M[i,j] = \text{false}$ means that there is no edge (i,j) in the graph.
- There is an entry for every possible edge, therefore:
Space = $\Theta(N^2)$

Adjacency Matrix (modern)

- The adjacency matrix structures augments the edge list structure with a matrix where each row and column corresponds to a vertex.

	0	1	2	3	4	5	6
0	∅	∅	NW 35	∅	DL 247	∅	∅
1	∅	∅	∅	AA 49	∅	DL 335	∅
2	∅	AA 1387	∅	∅	AA 903	∅	TW 45
3	∅	∅	∅	∅	∅	UA 120	∅
4	∅	AA 523	∅	AA 411	∅	∅	∅
5	∅	UA 877	∅	∅	∅	∅	∅
6	∅	∅	∅	∅	∅	∅	∅

BOS DFW JFK LAX MIA ORD SFO
 0 1 2 3 4 5 6

- The space requirement is $O(n^2 + m)$

Performance of the Adjacency Matrix Structure

Operation	Time
size, isEmpty, replaceElement, swap	O(1)
numVertices, numEdges	O(1)
vertices	O(n)
edges, directedEdges, undirectedEdges	O(m)
elements, positions	O(n+m)
endVertices, opposite, origin, destination, isDirected, degree, inDegree, outDegree	O(1)
incidentEdges, inIncidentEdges, outIncidentEdges, adjacentVertices, inAdjacentVertices, outAdjacentVertices,	O(n)
areAdjacent	O(1)
insertEdge, insertDirectedEdge, removeEdge, makeUndirected, reverseDirection, setDirectionFrom, setDirectionTo	O(1)
insertVertex, removeVertex	O(n ²)

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