

# GRAPHS

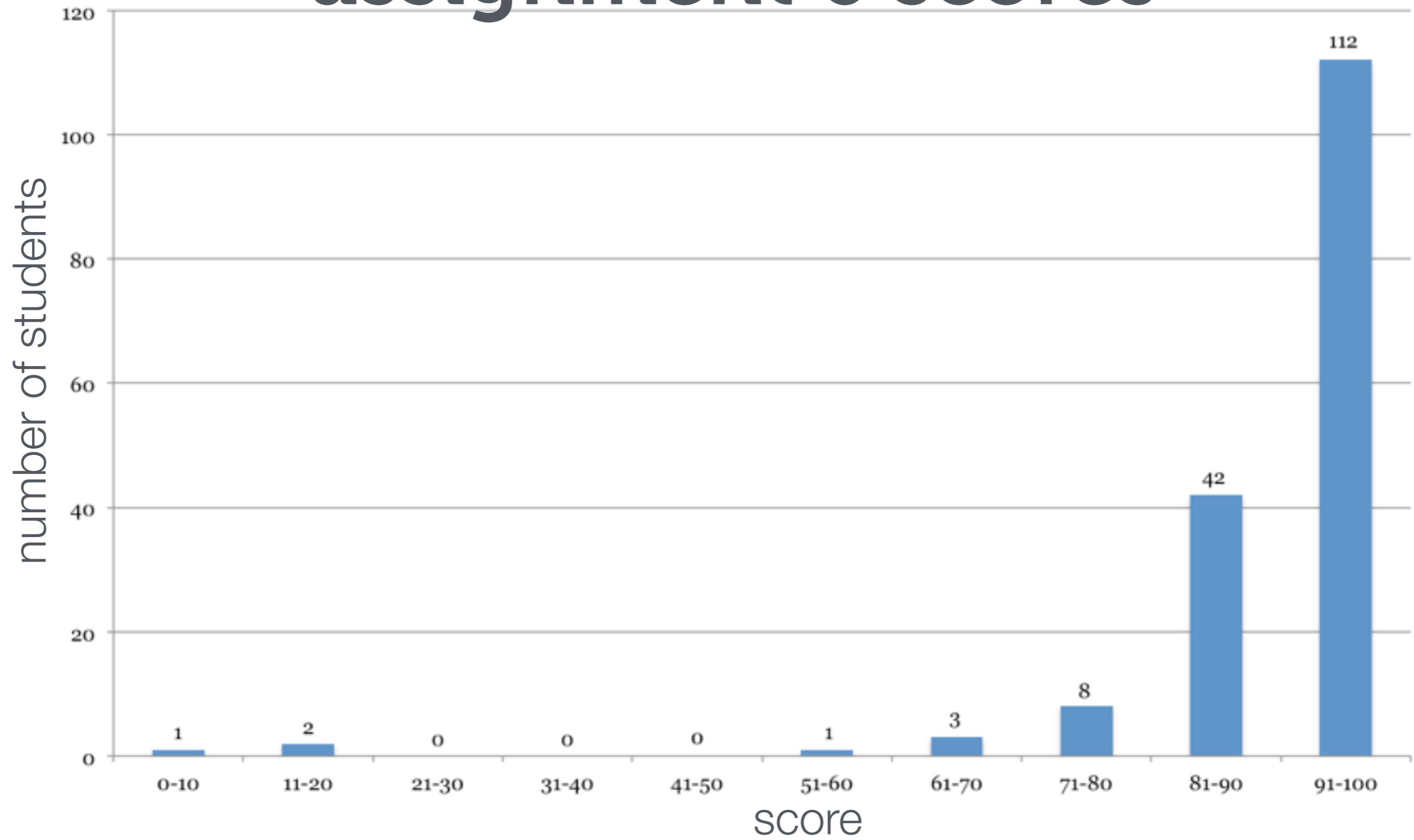
cs2420 | Introduction to Algorithms and Data Structures | Spring 2015

**administrivia...**

-assignment 8 due Thursday

-assignment 9 out tomorrow... due in 2.5 weeks

# assignment 6 scores



**last time...**

# **binary search trees (BSTs)**

-a **binary search tree** is a binary tree with a restriction on the ordering of nodes

-all items in the **left** subtree of a node are *less than* the item in the node

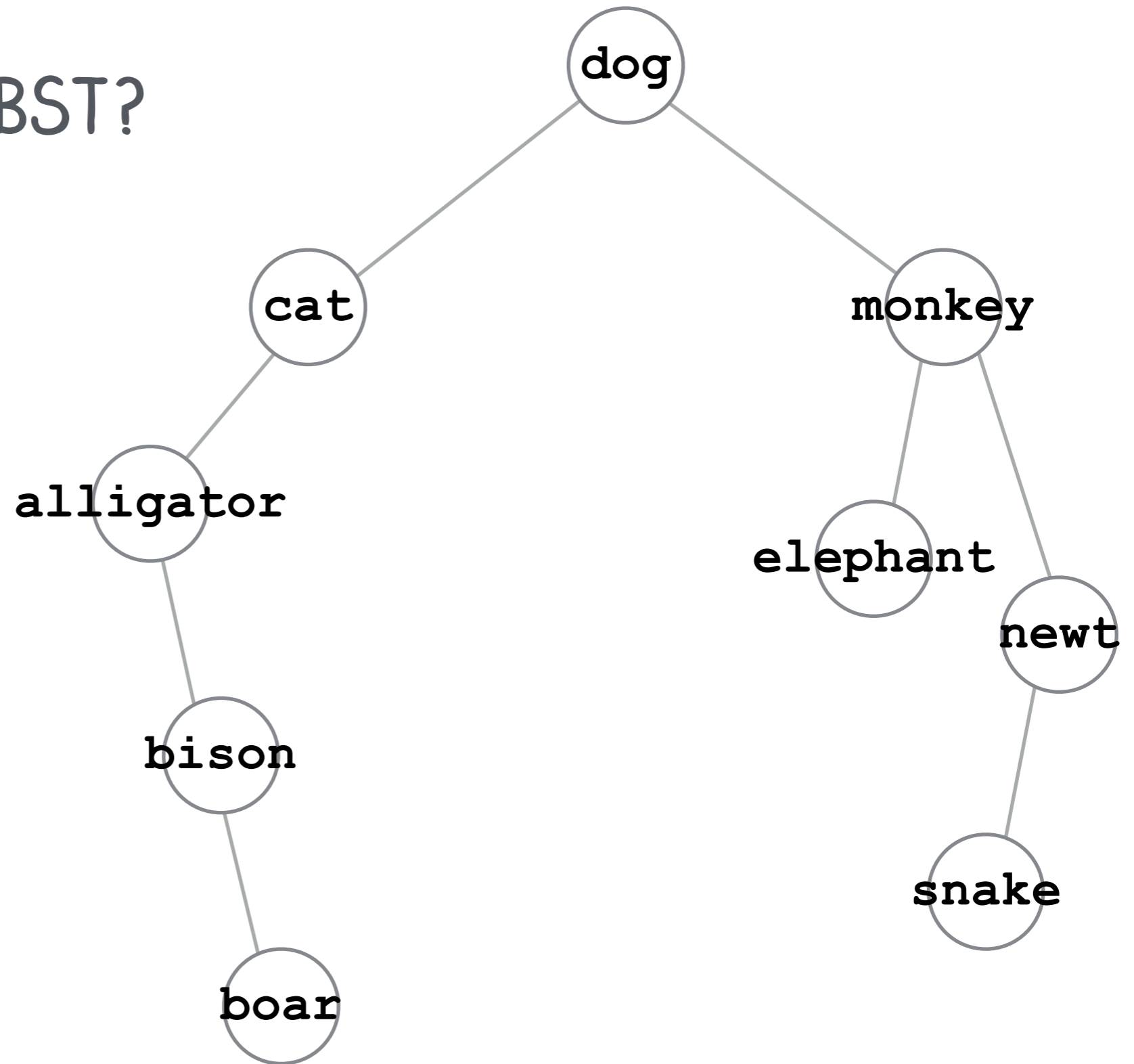
-all items in the **right** subtree of a node are *greater than or equal to* the item in the node

-BSTs allow for fast searching of nodes

IS THIS A BST?

A) **yes**

B) **no**





**insertion**

# insertion & searching

-average case:  $O(\log N)$

-inserted in random order

-worst case:  $O(N)$

-inserted in ascending or descending order

-best case:  $O(\log N)$

-how does this compare to a sorted array?

**deletion**

-since we must maintain the properties of a tree structure, deletion is more complicated than with an array or linked-list

-there are three different cases:

1. deleting a leaf node

2. deleting a node with one child subtree

3. deleting a node with two children subtrees

-first step of deletion is to find the node to delete

-just a regular BST search

-BUT, stop at the *parent* of the node to be deleted

# deletion performance

WHAT IS THE COST OF DELETING A NODE FROM A BST?

-first, find the node we want to delete:  **$O(\log N)$**

-cost of:

-case 1 (delete leaf):

SET A SINGLE REFERENCE TO NULL:  **$O(1)$**

-case 2 (delete node with 1 child):

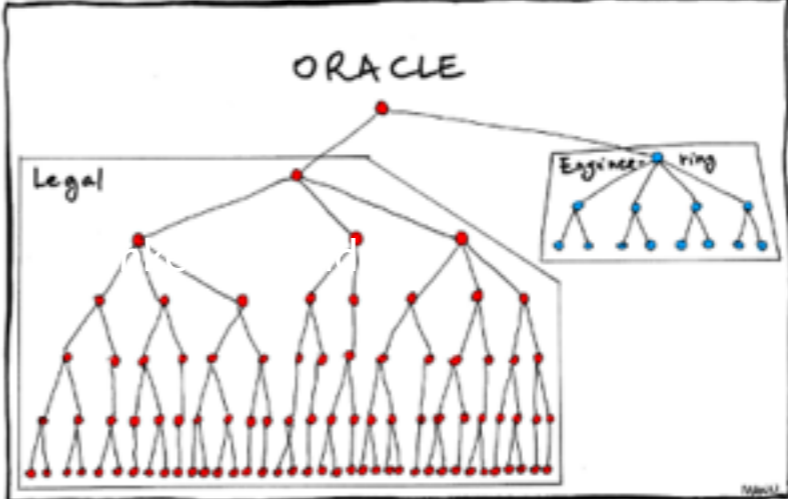
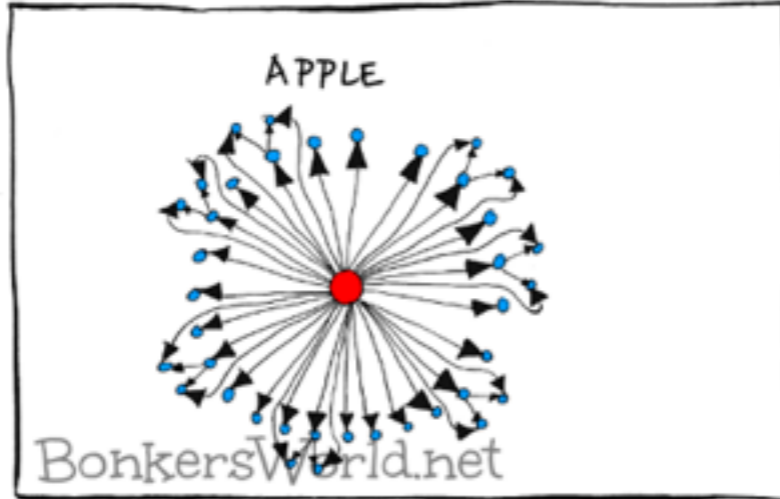
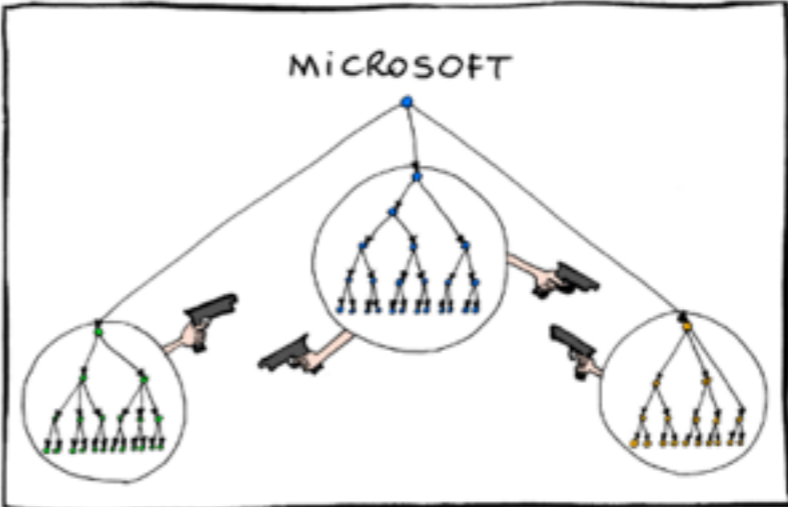
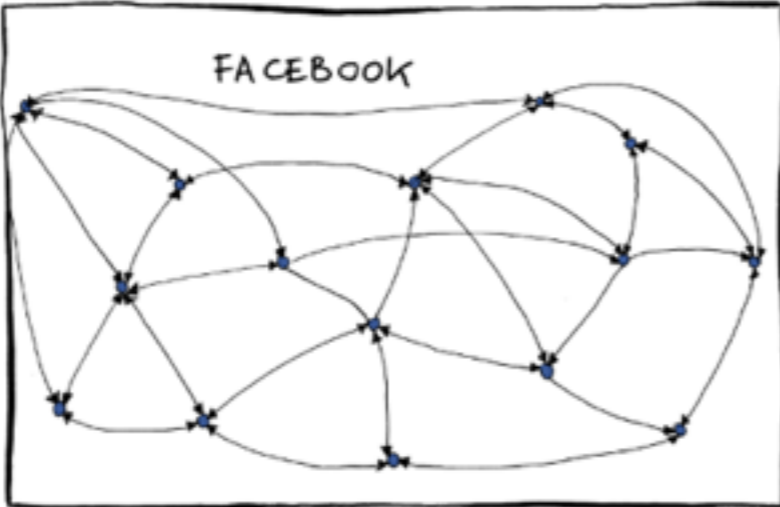
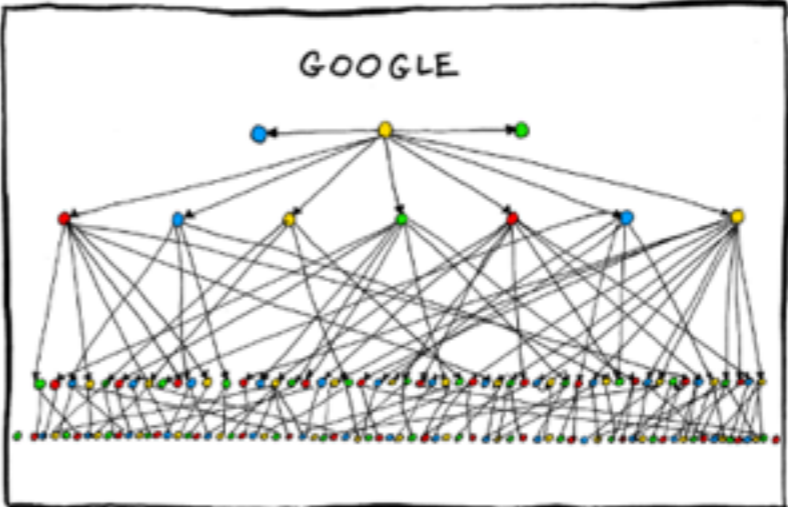
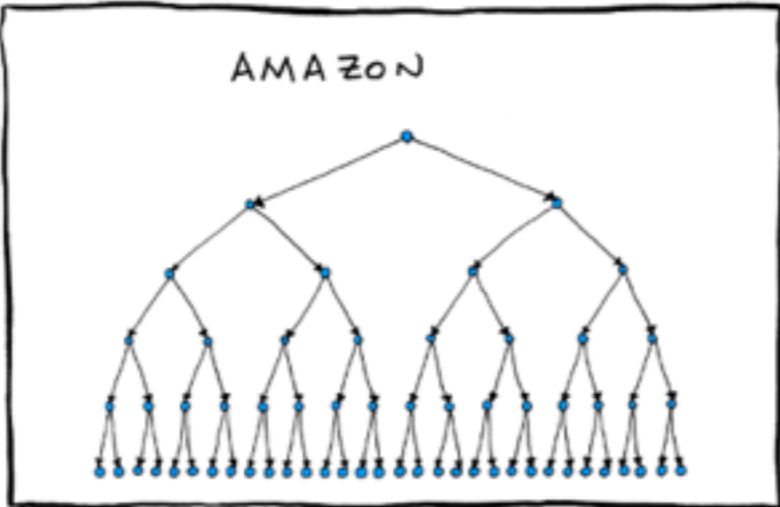
BYPASS A REFERENCE:  **$O(1)$**

-case 3 (delete node with 2 children):

FIND THE SUCCESSOR:  **$O(\log N)$**

DELETE THE DUPLICATE SUCCESSOR:  **$O(1)$**

**today...**







**facebook**





December 2010

Paul Butler



-graphs

-paths

-depth-first search

-breadth-first search

**graphs**

- trees are a *subset* of graphs
- a **graph** is a set of *nodes* connected by **edges**
  - an edge is just a link between two nodes
  - nodes don't have a parent-child relationship
  - links can be bi-directional
- graphs are used **EXTENSIVELY** throughout CS

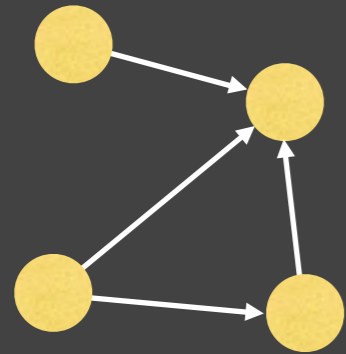




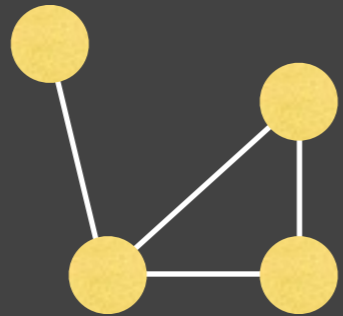
NODES ARE CITIES, EDGES ARE FLIGHTS



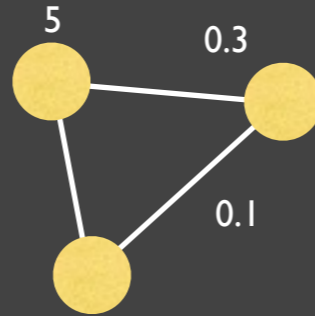
# some definitions



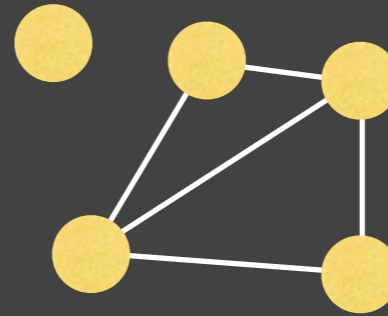
A directed graph



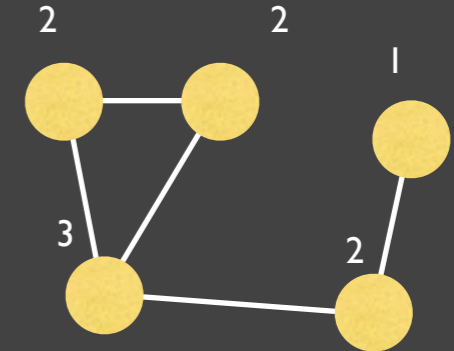
An undirected graph



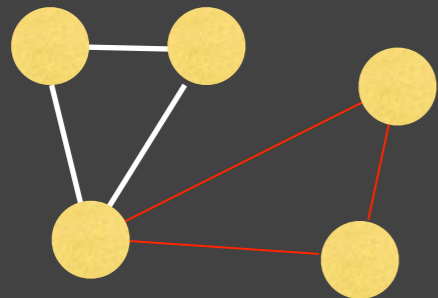
Weighted



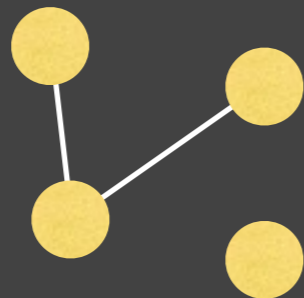
Unconnected



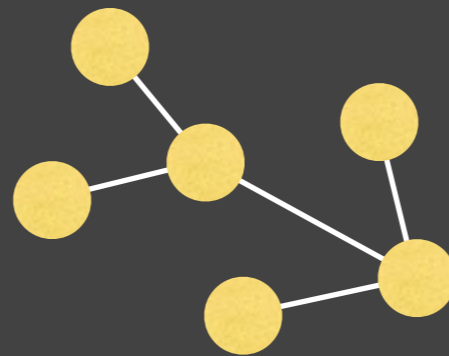
Node degrees



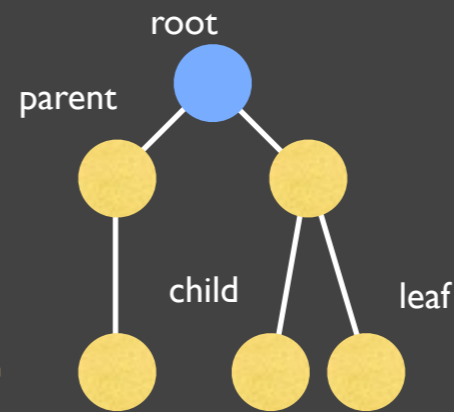
A cycle



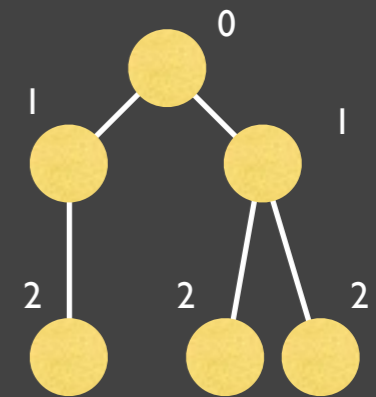
An acyclic graph



A connected acyclic graph,  
a.k.a. a tree

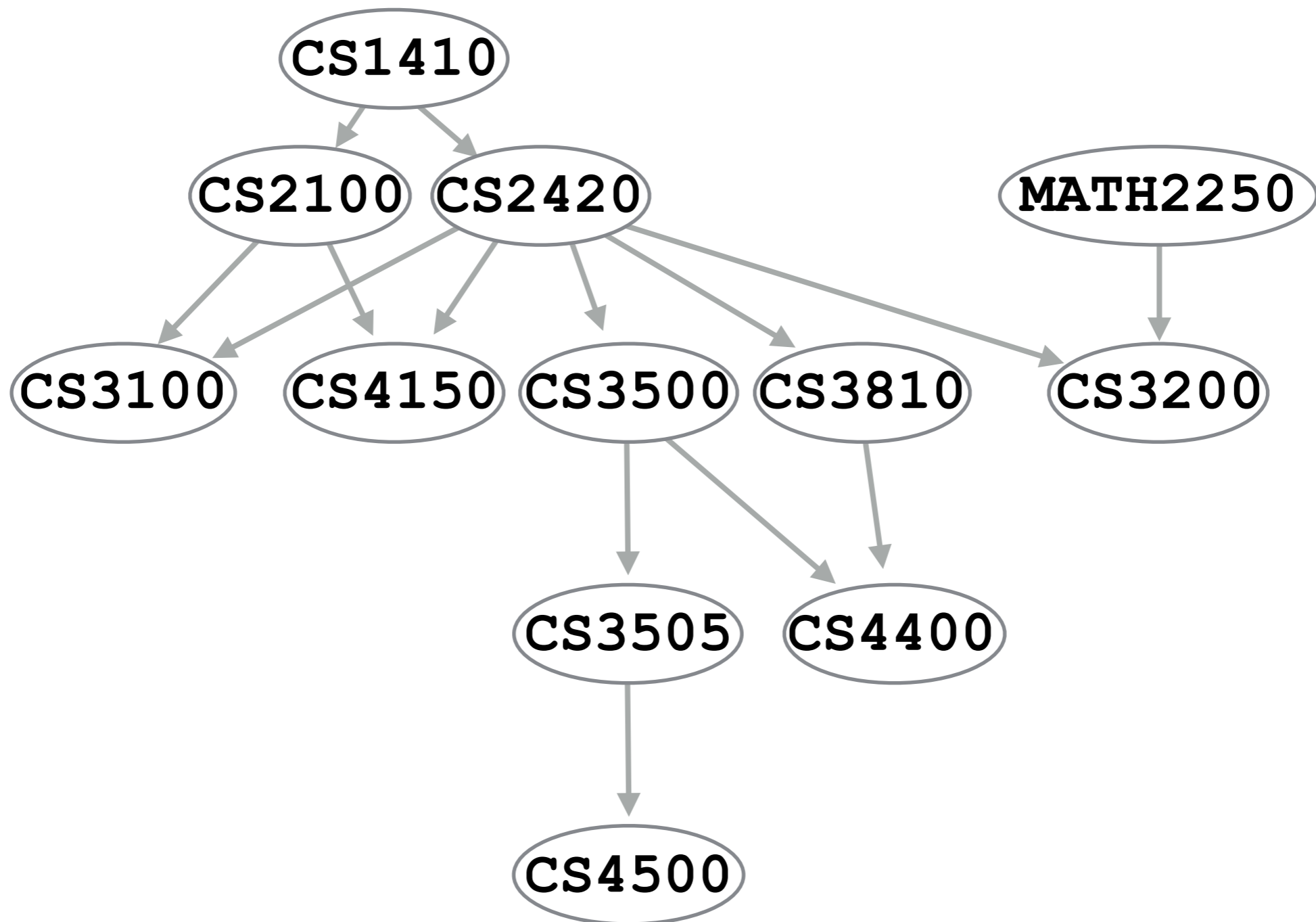


A rooted tree  
or hierarchy



Node depths

WHAT MAKES THIS A GRAPH AND NOT A TREE?



-graphs have no root; must store all nodes

```
class Graph<E> {  
    List<Node> nodes;  
    ...  
}
```

-implementation is more general than a tree

```
class Node{  
    E Data;  
    List<Node> neighbors;  
    ...  
}
```

-the order in which neighbors appear in the list is unspecified  
-a different order still make the same graph!



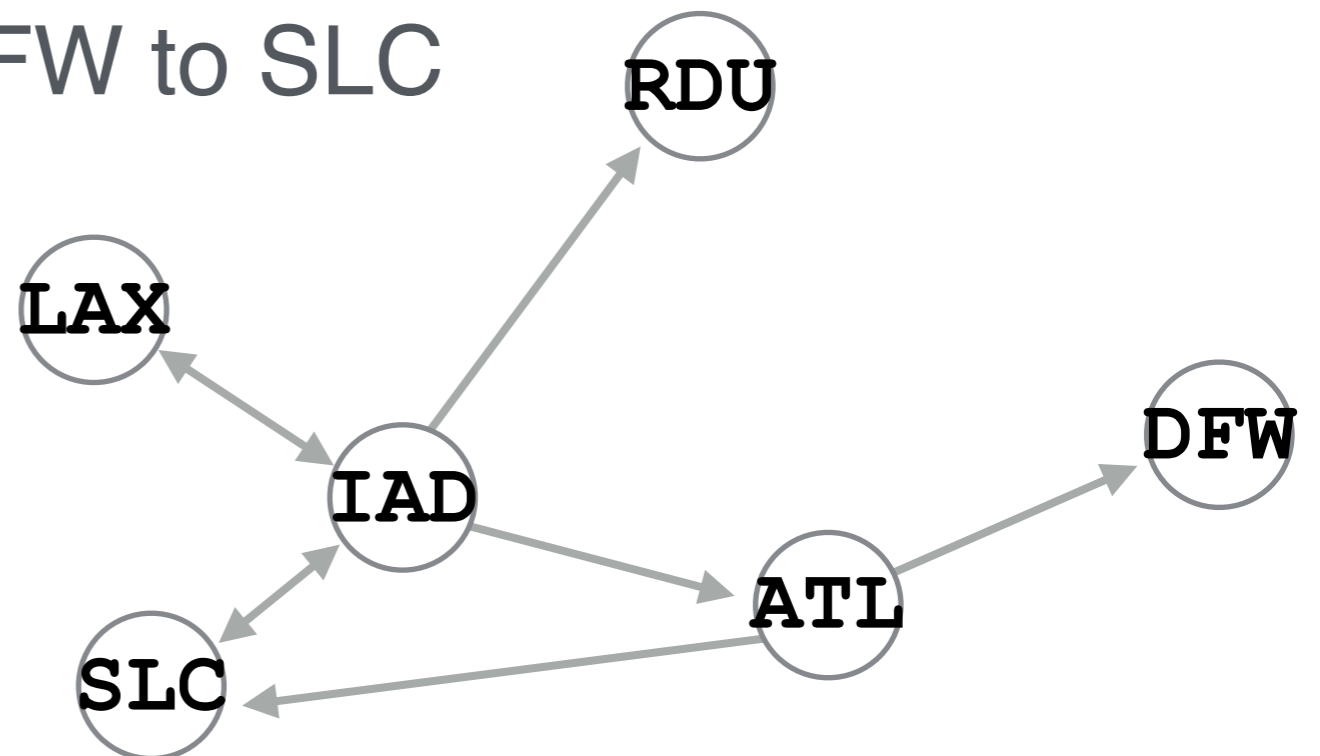
**paths**

-a **path** is a sequence of nodes with a start-point and an end-point such that the end-point can be reached through a series of nodes from the start-point

-in this example, there is a path from SLC to DFW

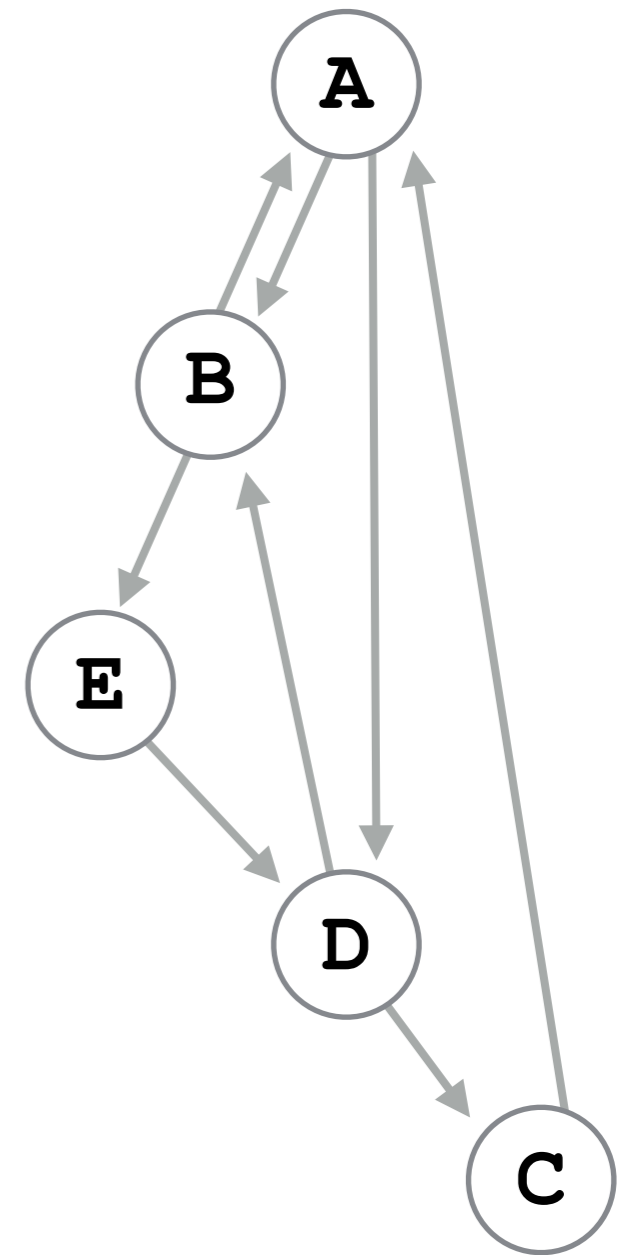
-SLC — IAD — ATL — DFW

-there is *not* a path from DFW to SLC



# pathfinding

- there may be more than one path from one node to another
- we are often interested in the *path length*
- finding the shortest (or cheapest) path between two nodes is a common graph operation



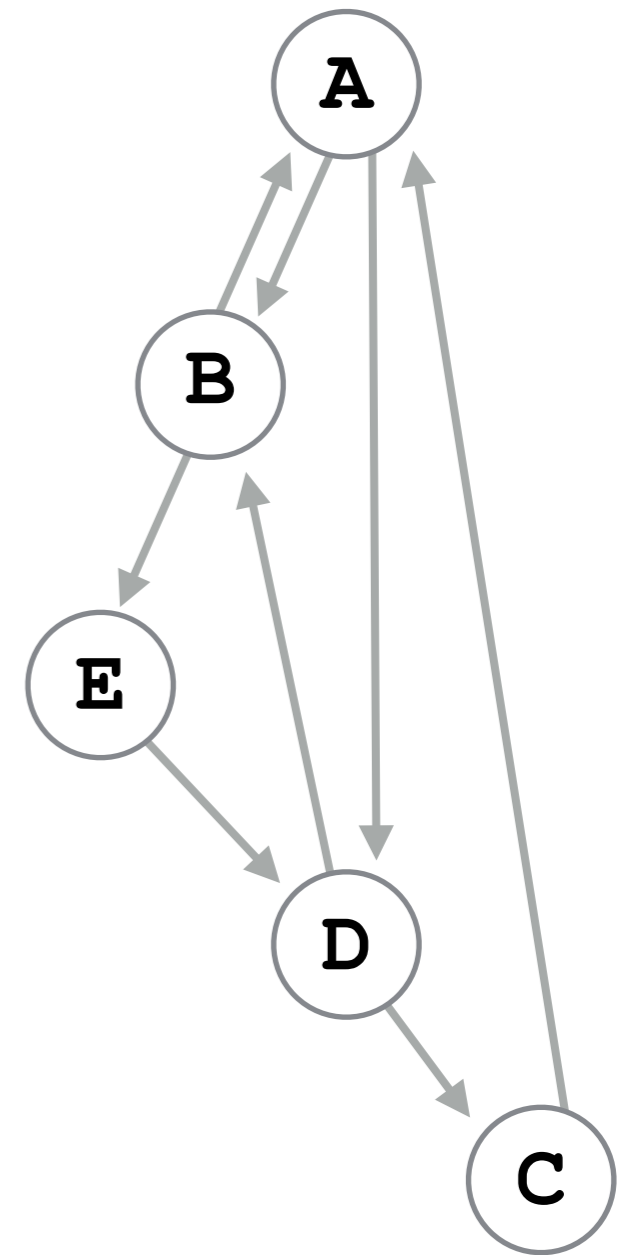
# cycles

-a cycle in a graph is a path from a node back to itself

-B — E — D — B

-while traversing a graph, special care must be taken to avoid cycles, otherwise what?

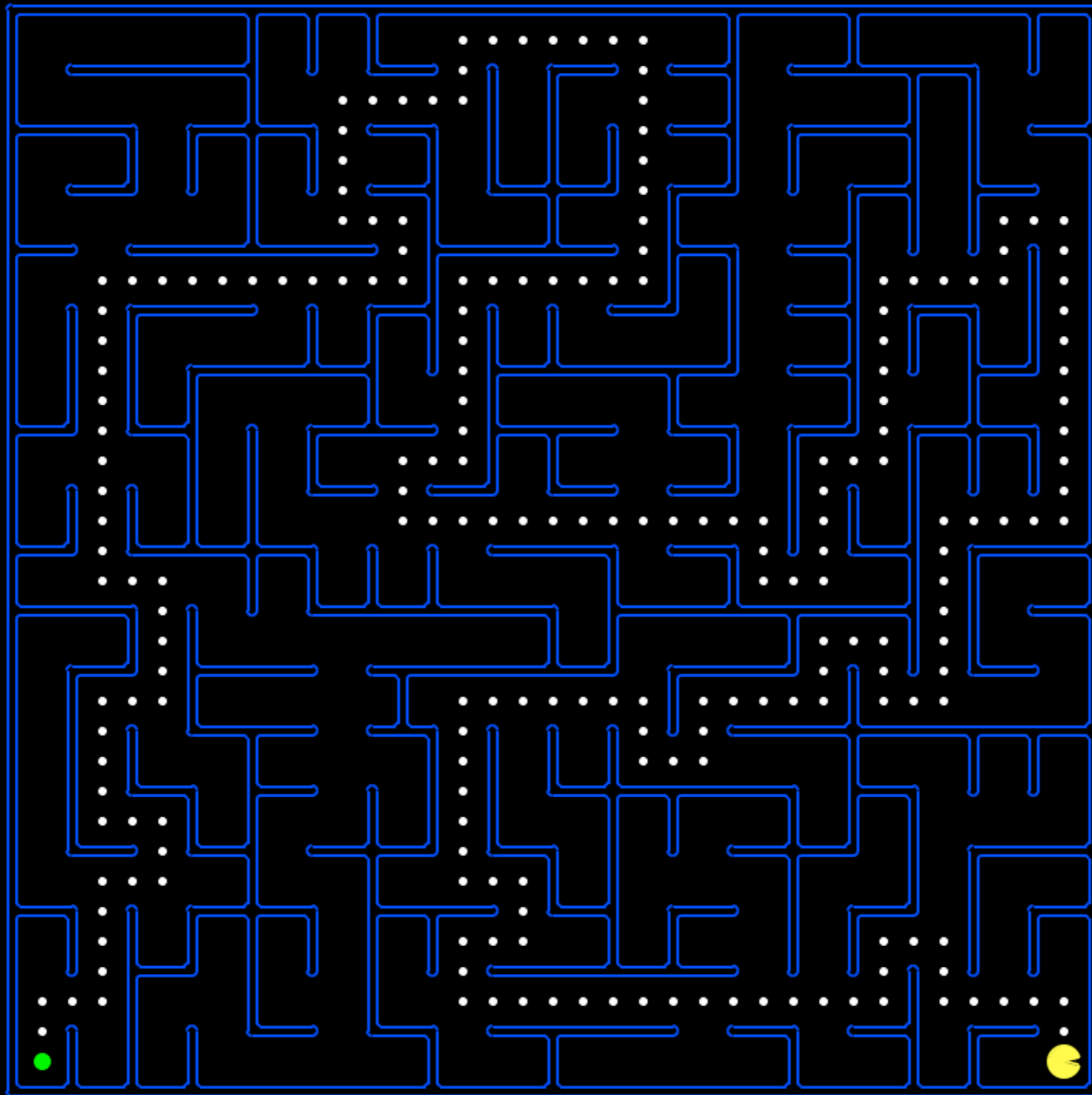
-can trees have cycles?



- any problem with a starting state, a goal state, and options as to which direction to take for each step can be represented with a graph
- and solved with pathfinding!

# example

- in games, moving a character around a space
- character finds the shortest path from its current location to the destination
  - not always a straight line
- terrain is represented as a graph
  - every non-obstacle spot on the terrain is a node
  - nodes are connected to adjacent nodes
- navigating a maze...



-depth-first search (just like a tree) — DFS

-breadth-first search — BFS

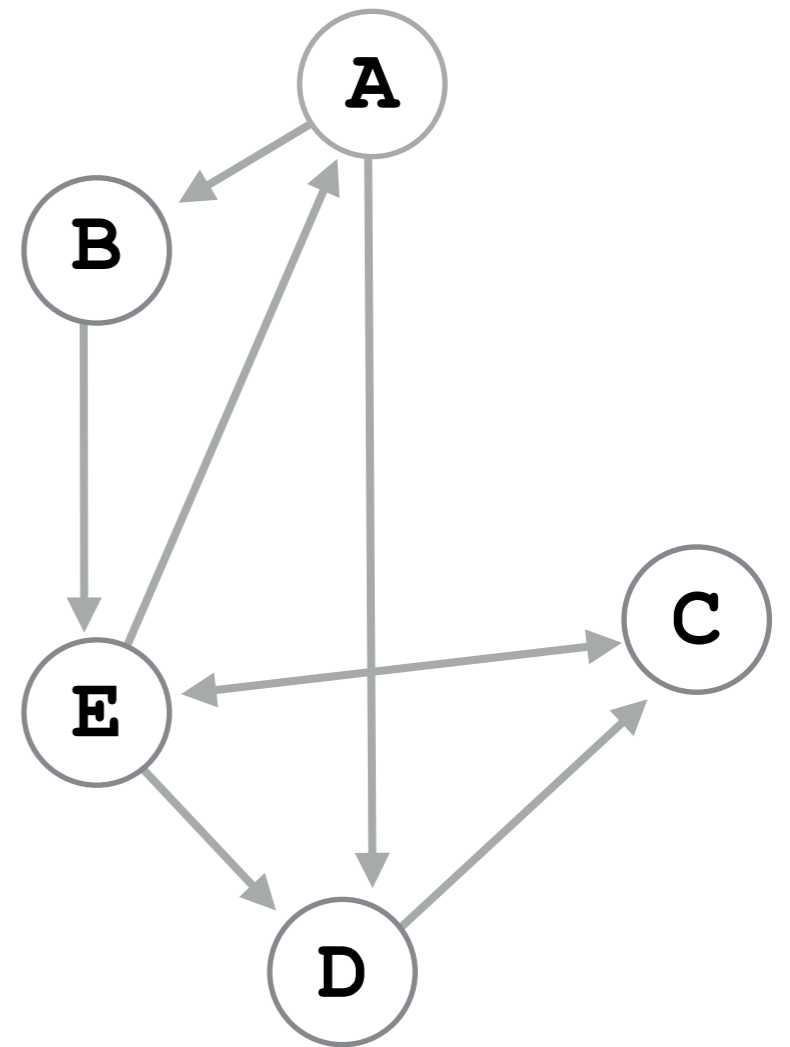
-if there exists a path from one node to another these algorithms will find it

-the nodes on this path are the steps to take to get from point A to point B

-if multiple such paths exist, the algorithms may find different ones



WE WANT TO FIND A PATH FROM **A** TO **C**



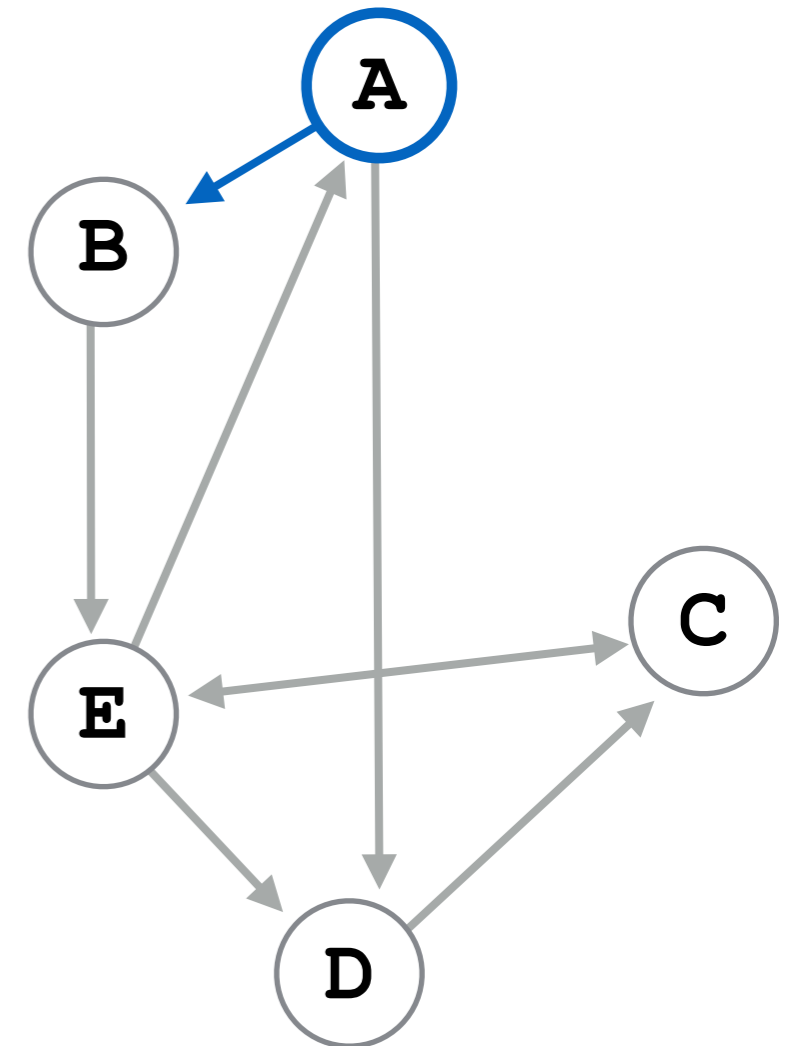
# depth-first search

- look at the first edge going out of the start node
  - recursively search from the new node
  - upon returning, take the next edge
  - if no more edges, return
- 
- when visiting a node, mark it as visited so we don't get stuck in a cycle
    - skip already visited nodes during traversal
- 
- for each node visited, save a reference to the node where we came from to reconstruct the path

WE WANT TO FIND A PATH FROM **A** TO **C**

SO... START FROM **A**, TRAVERSE ITS FIRST EDGE, SAVE WHERE WE CAME FROM, AND RECURSE

```
A.visited = true  
B.cameFrom = A
```

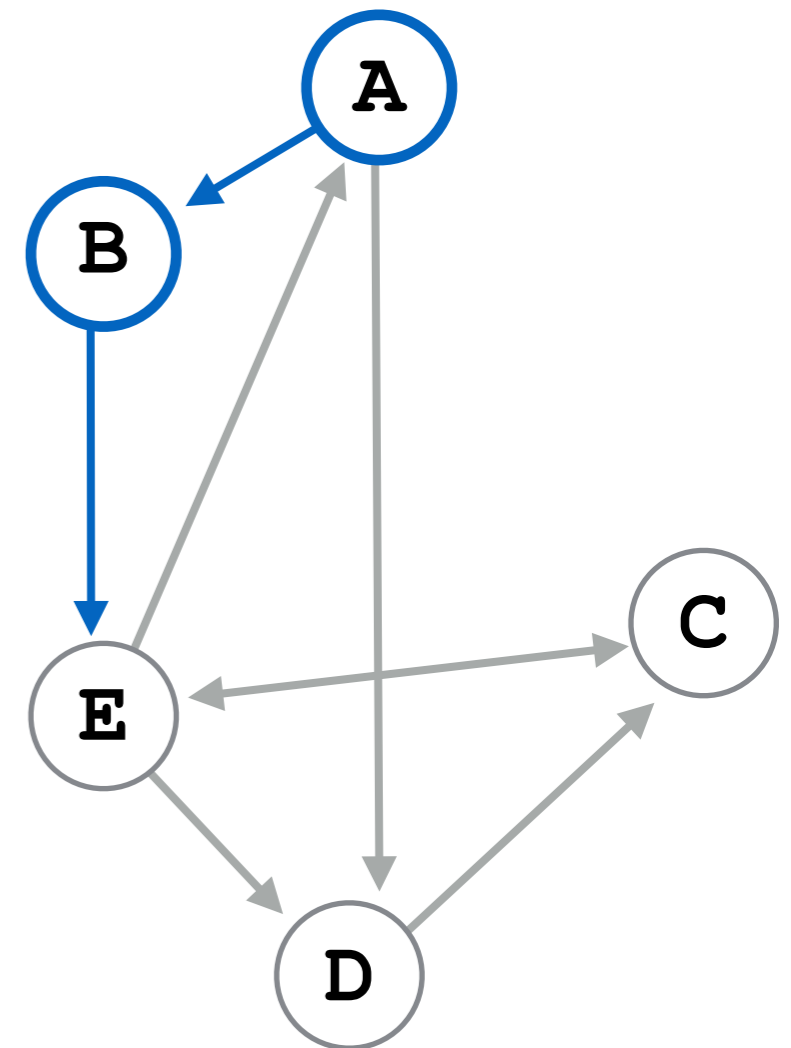


VISITED 

UNVISITED 

TRAVERSE THE FIRST UNVISITED NODE  
IN THE EDGE LIST RECURSIVELY, SAVE  
WHERE WE CAME FROM

```
B.visited = true  
E.cameFrom = B
```



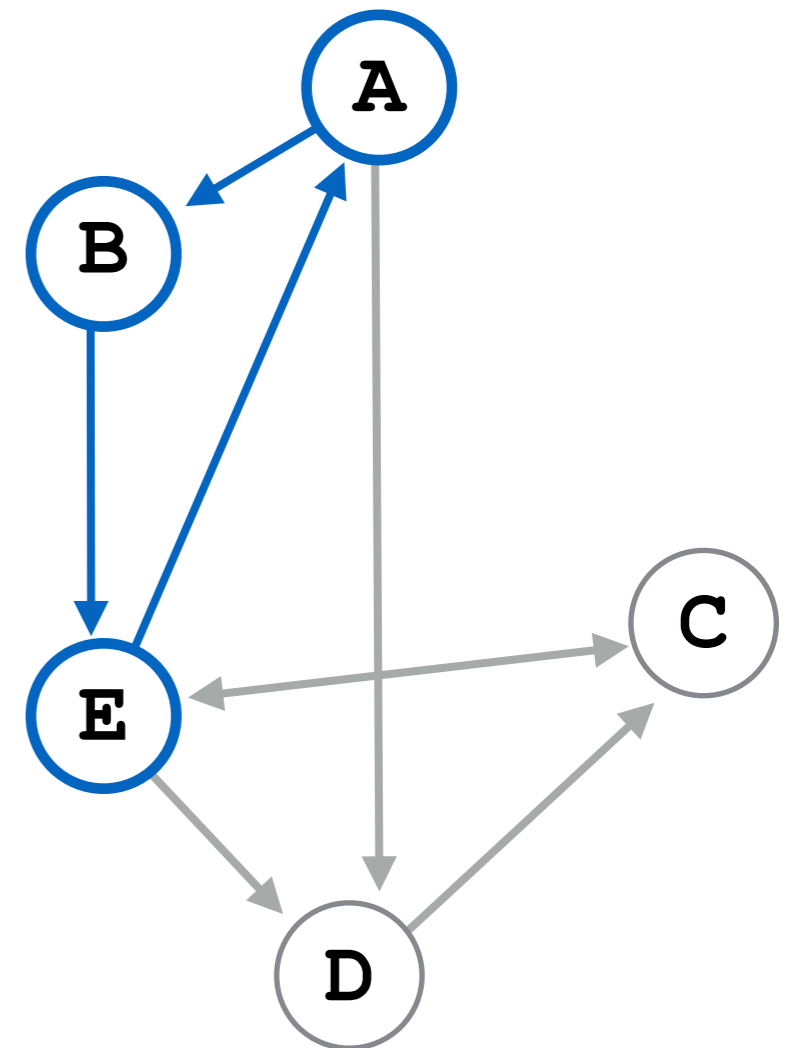
VISITED 

UNVISITED 

TRAVERSE THE FIRST UNVISITED NODE  
IN THE EDGE LIST RECURSIVELY, SAVE  
WHERE WE CAME FROM

`E.visited = true`

LOOK AT THE FIRST EDGE; NODE **A** HAS  
ALREADY BEEN VISITED, SO SKIP



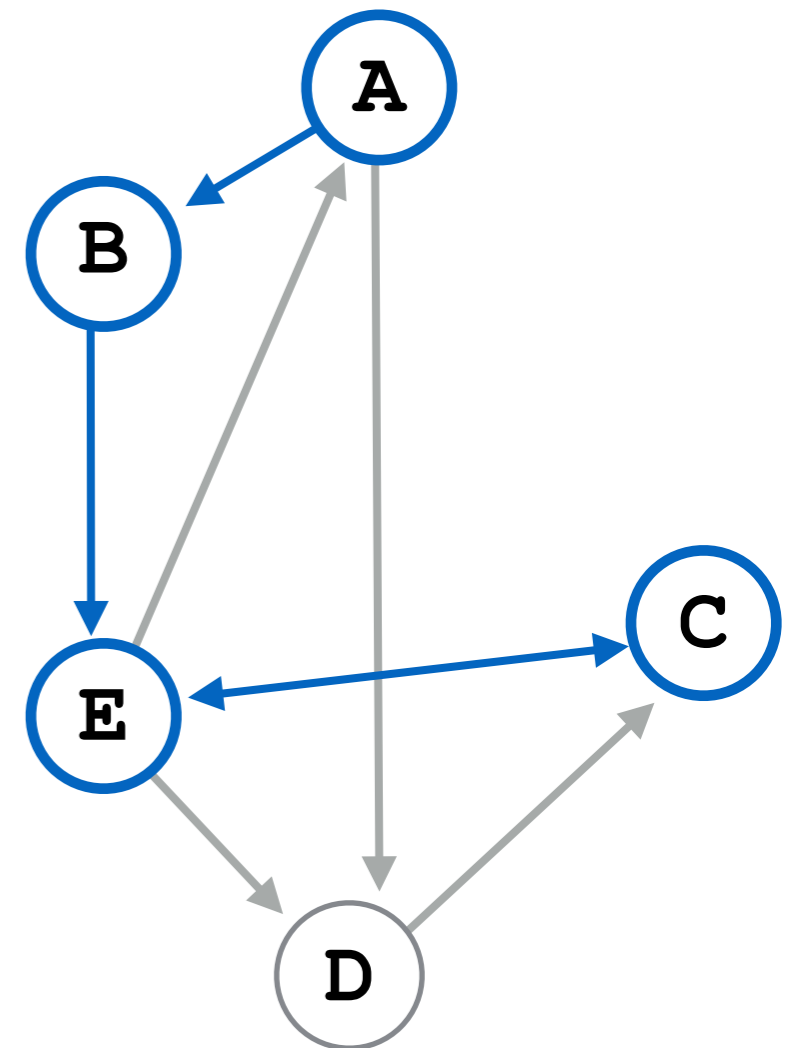
VISITED 

UNVISITED 



LOOK AT NEXT EDGE; **C** HAS NOT BEEN VISITED YET

`C.cameFrom = E`



VISITED 

UNVISITED 

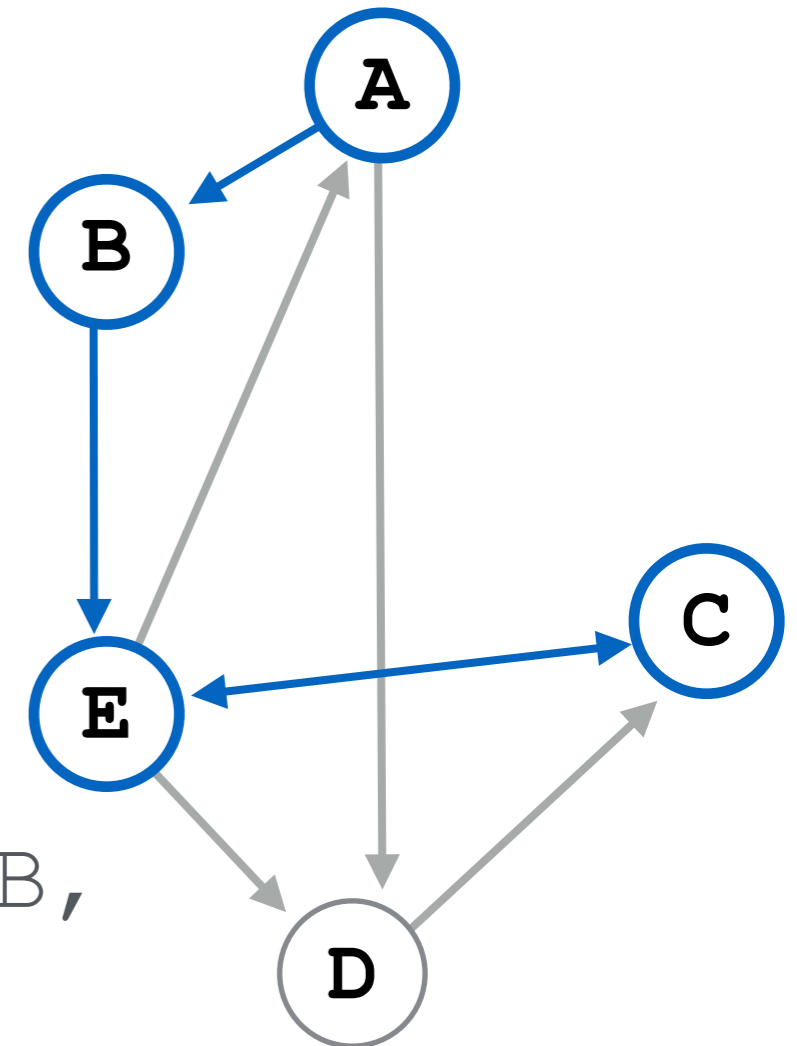
NODE **C** IS OUR GOAL. WE ARE DONE!

```
C.visited = true
```

FOLLOW EACH NODE'S **cameFrom**  
TO RECONSTRUCT THE PATH

```
C.cameFrom = E, E.cameFrom = B,  
B.cameFrom = A
```

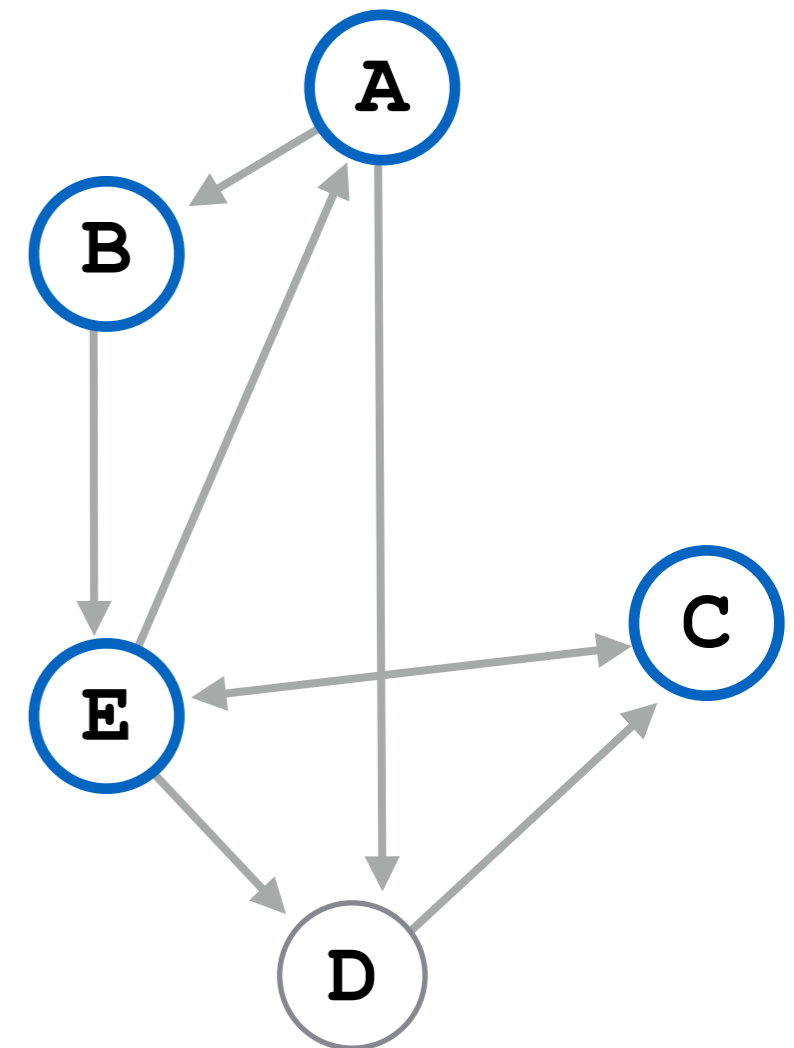
PATH: **A - B - E - C**



IS THERE A BETTER (SHORTER) PATH FROM **A** TO **C**?

WHAT DETERMINES WHICH PATH DFS FINDS?

DFS IS NOT GUARANTEED TO FIND THE SHORTEST PATH, JUST A PATH.



VISITED ○

UNVISITED ○

```
DFS (Node curr, Node goal)
{
    curr.visited = true

    if (curr.equals (goal))
        return

    for (Node next : curr.neighbors)
        if (!next.visited)
        {
            next.cameFrom = curr
            DFS (next, goal)
        }
}
// path is now saved in nodes' .cameFrom
```

# breadth-first search

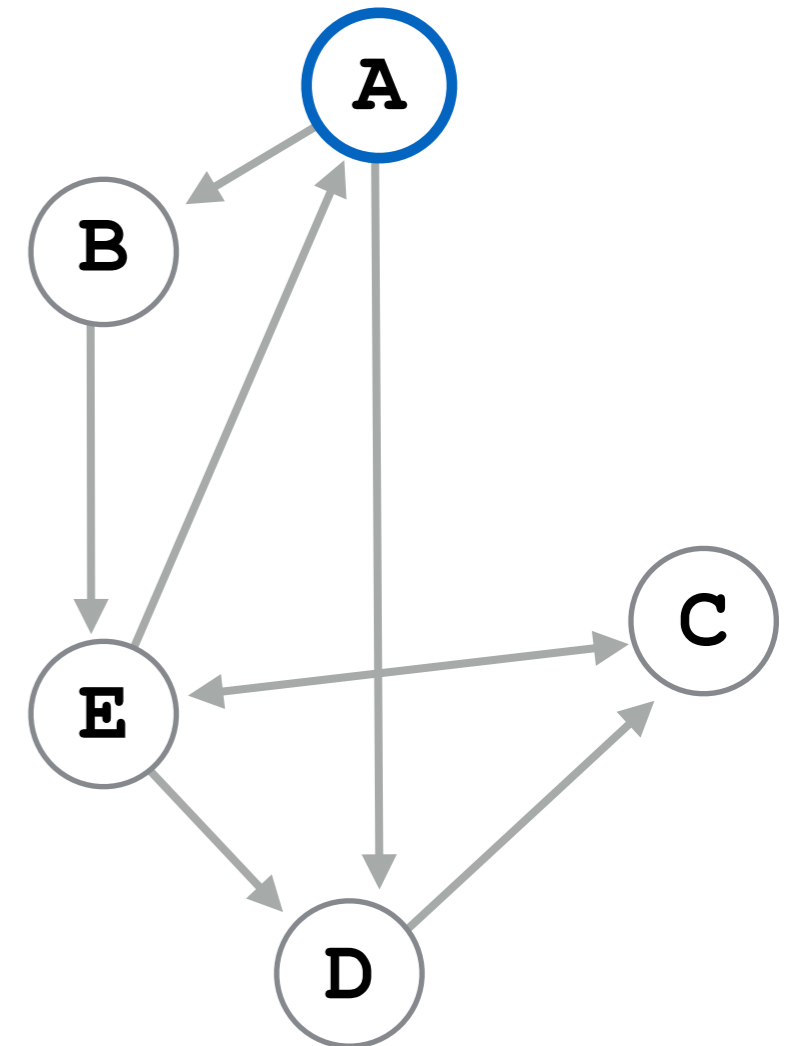
- instead of visiting deeper nodes first, visit shallower nodes first
  - visit nodes closest to the start point first, gradually get further away
- create an empty queue
- put the starting node in the queue
- while the queue is not empty
  - dequeue the current node
  - for each unvisited neighbor of the the current node
    - mark the neighbor as visited*
    - put the neighbor into the queue*
- notice it is not recursive... it just runs until the queue is empty!



WE WANT TO FIND A PATH FROM **A** TO **C**

MARK AND ENQUEUE THE START NODE **A**

A.visited = true



queue : 

<b>A</b>					
----------	--	--	--	--	--

VISITED

UNVISITED

DEQUEUE THE FIRST NODE IN THE QUEUE (**A**)

MARK AND ENQUEUE **A**'S UNVISITED  
NEIGHBORS

B.cameFrom = A

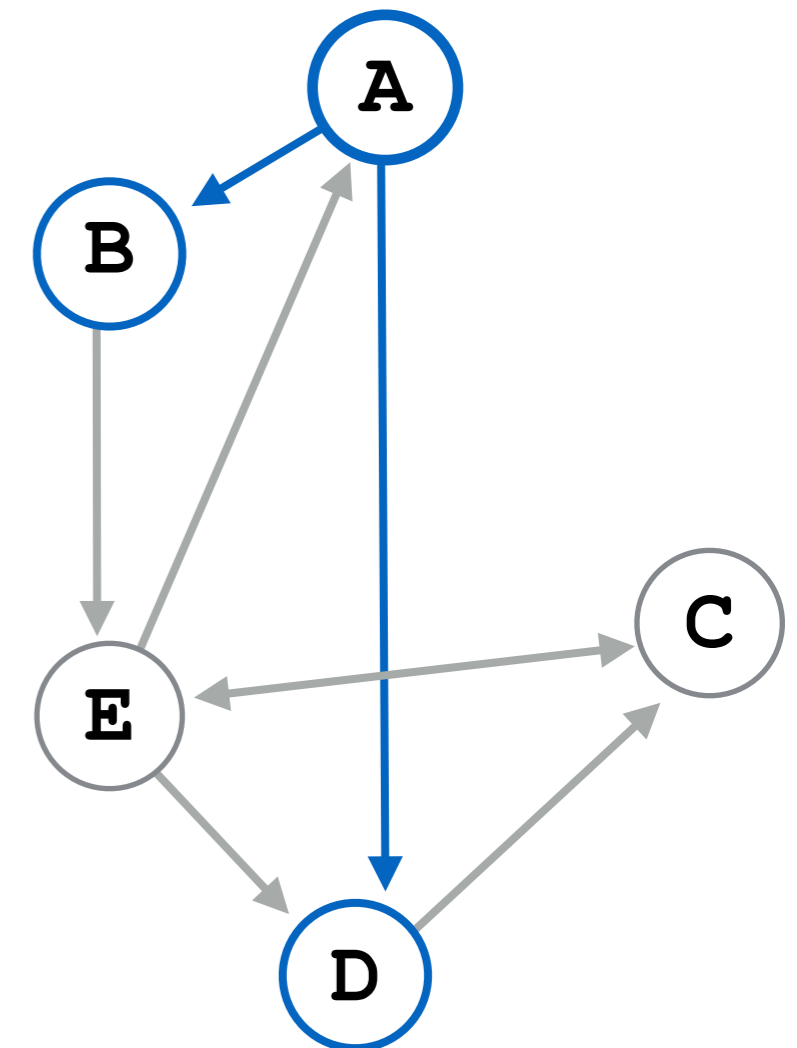
D.cameFrom = A

B.visited = true

D.visited = true

queue : 

<b>B</b>	<b>D</b>				
----------	----------	--	--	--	--



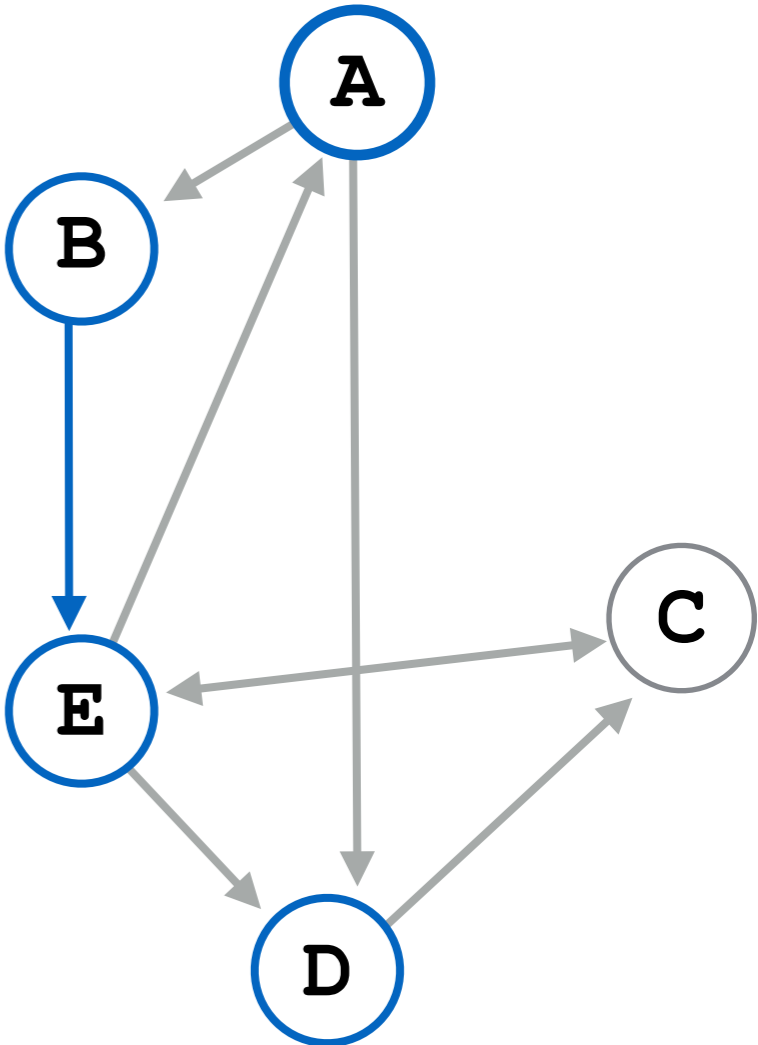
VISITED 

UNVISITED 

DEQUEUE THE FIRST NODE IN THE QUEUE (**B**)

MARK AND ENQUEUE **B**'S UNVISITED NEIGHBORS

```
E.cameFrom = B  
E.visited = true
```



queue : 

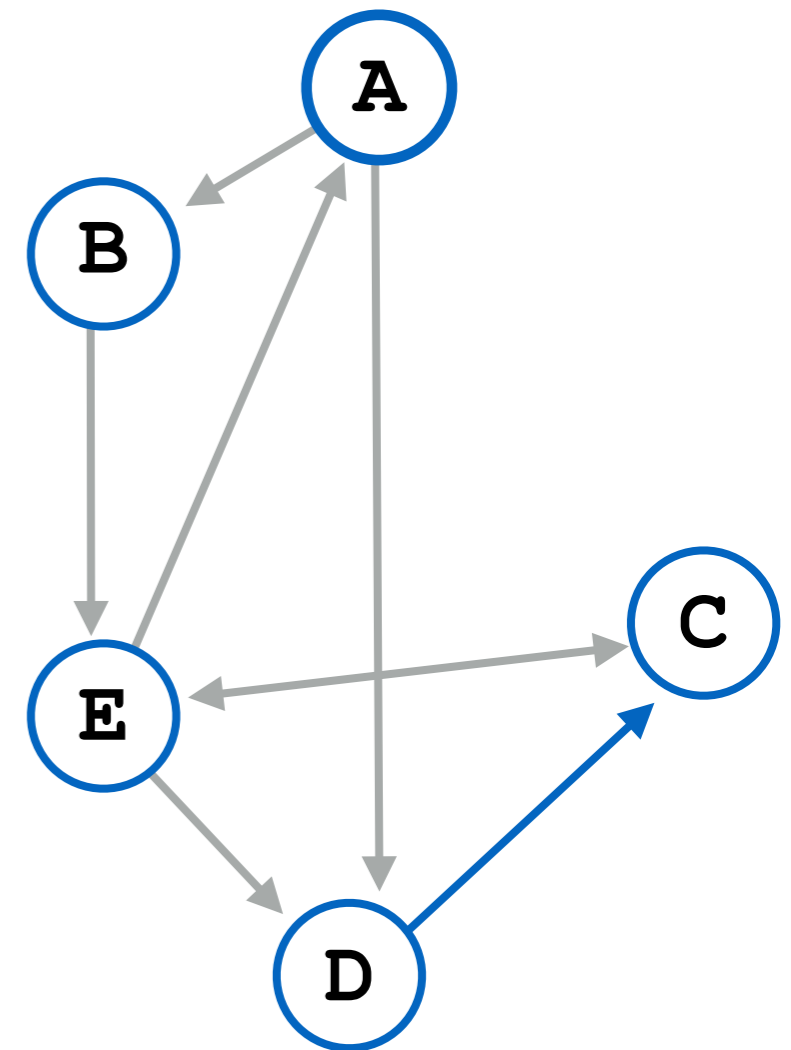
<b>D</b>	<b>E</b>				
----------	----------	--	--	--	--

VISITED   
UNVISITED 

DEQUEUE THE FIRST NODE IN THE QUEUE (**D**)

MARK AND ENQUEUE **D**'S UNVISITED NEIGHBORS

`C.cameFrom = D`  
`C.visited = true`



queue : 

<b>E</b>	<b>C</b>				
----------	----------	--	--	--	--

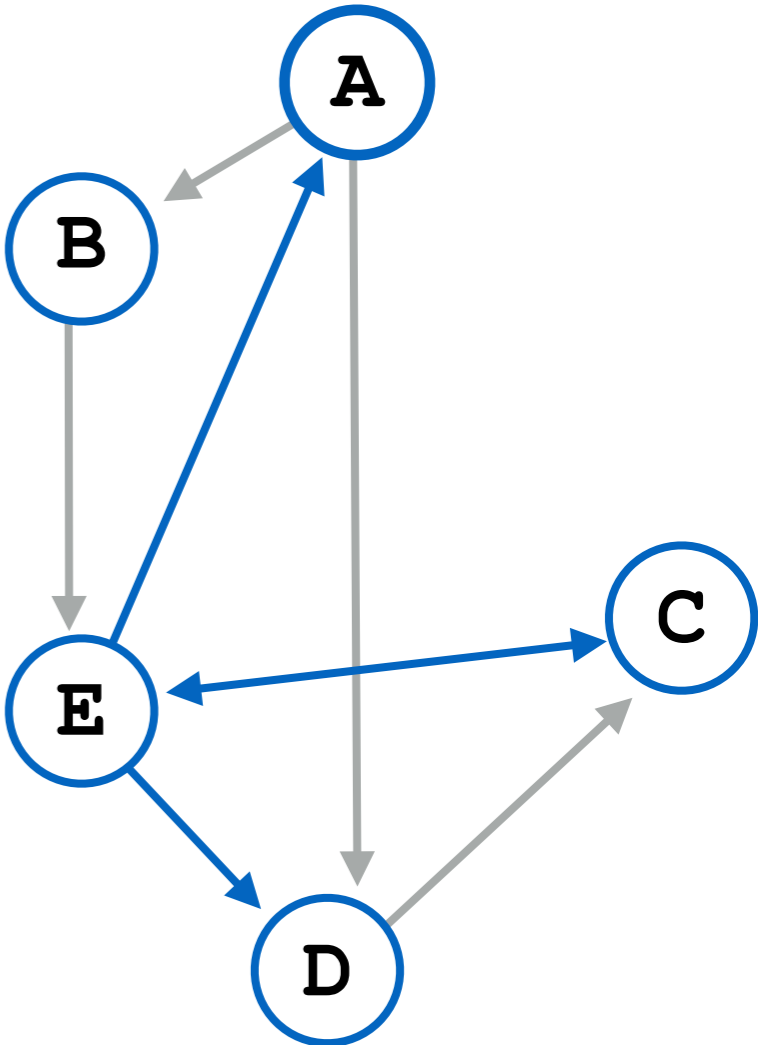
VISITED 

UNVISITED 

DEQUEUE THE FIRST NODE IN THE QUEUE (**E**)

MARK AND ENQUEUE **E**'S UNVISITED NEIGHBORS

(NO UNVISITED NEIGHBORS!)



queue : 

<b>C</b>					
----------	--	--	--	--	--

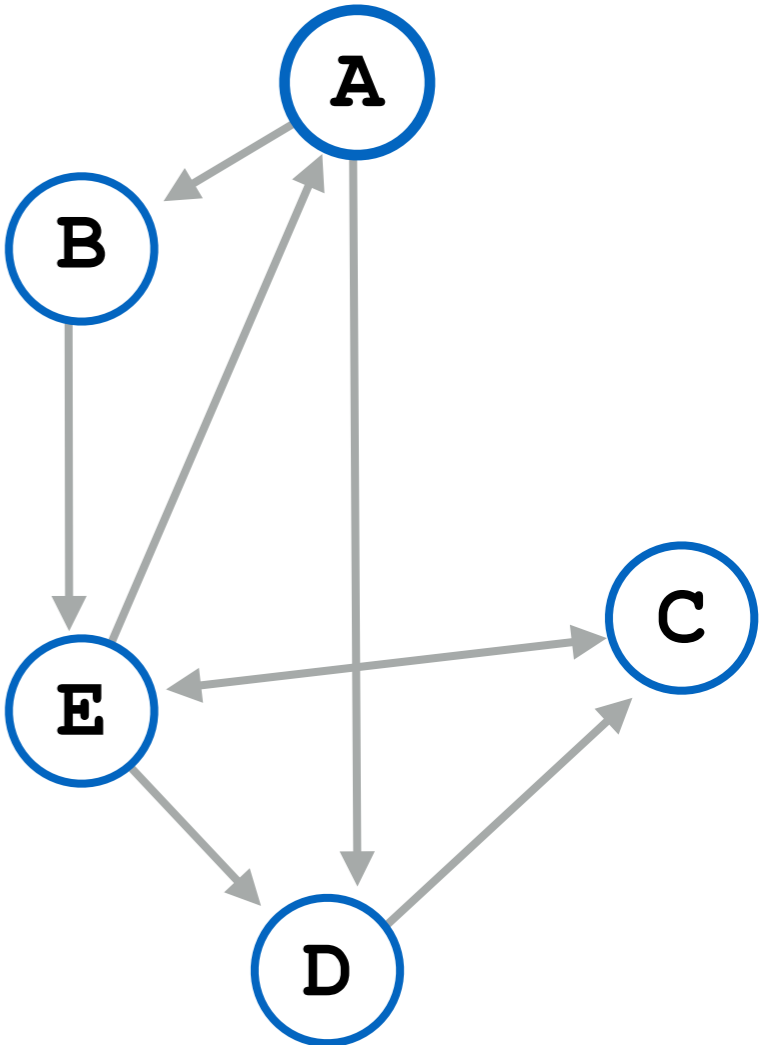
VISITED   
UNVISITED 

DEQUEUE THE FIRST NODE IN THE QUEUE (**C**)

**C** IS THE GOAL! RECONSTRUCT THE PATH WITH **cameFrom** REFERENCES

C.cameFrom = D,  
D.cameFrom = A

PATH: **A - D - C**

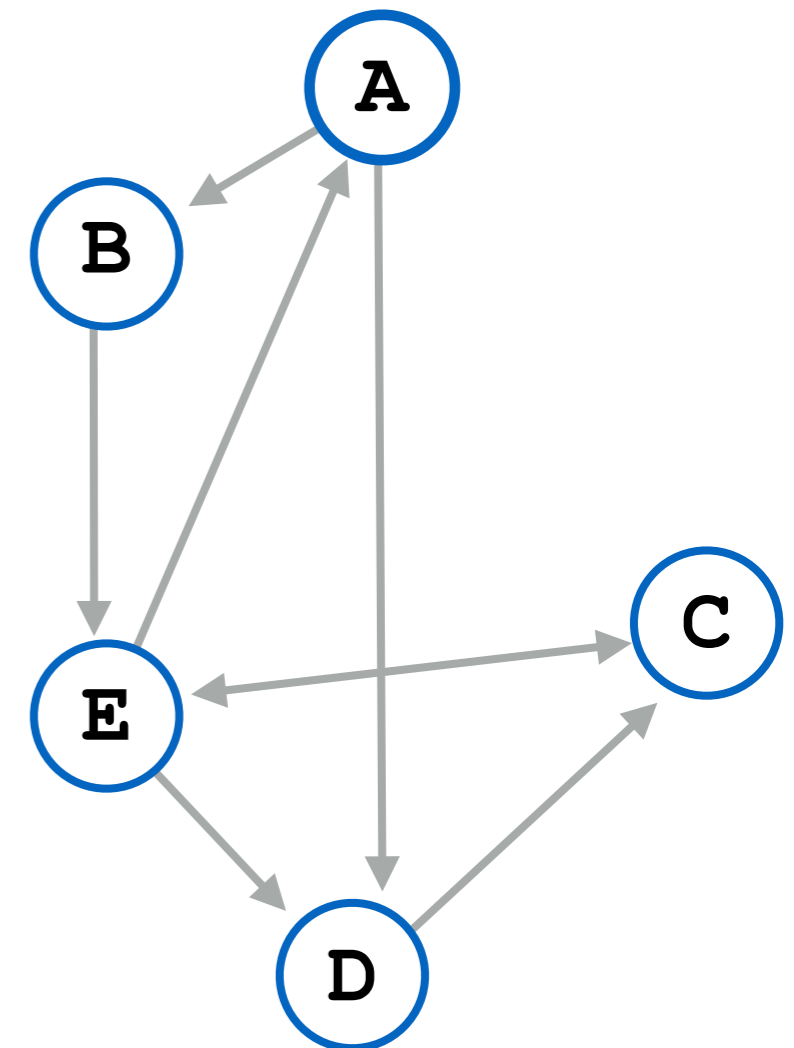


IS THIS THE SHORTEST PATH?

PATH: **A - D - C**

BFS VISITS NODES CLOSEST TO THE START-POINT FIRST

THEREFORE, THE FIRST PATH FOUND IS THE SHORTEST PATH (CLOSEST TO THE START NODE)



queue : 

--	--	--	--	--	--

VISITED

UNVISITED



```

BFS (Node start, Node goal)
{
    start.visited = true
    Q.enqueue (start)

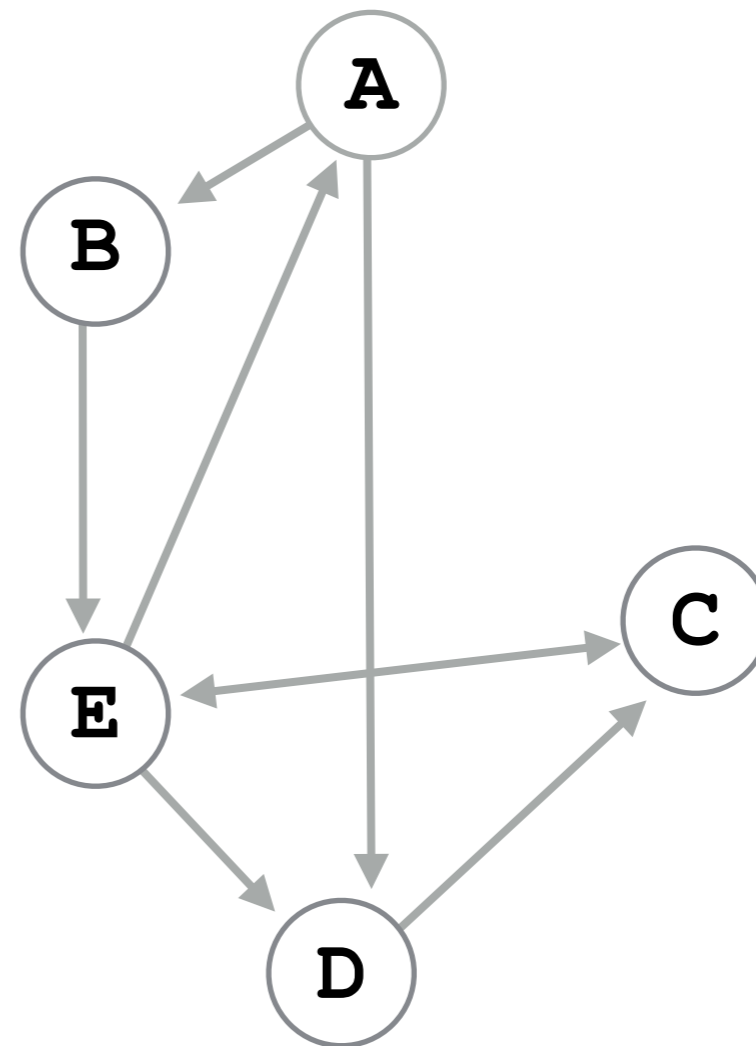
    while (!Q.empty ())
    {
        Node curr = Q.dequeue ()
        if (curr.equals (goal))
            return

        for (Node next : curr.neighbors)
            if (!next.visited)
            {
                next.visited = true
                next.cameFrom = curr
                Q.enqueue (next)
            }
    }
}

```

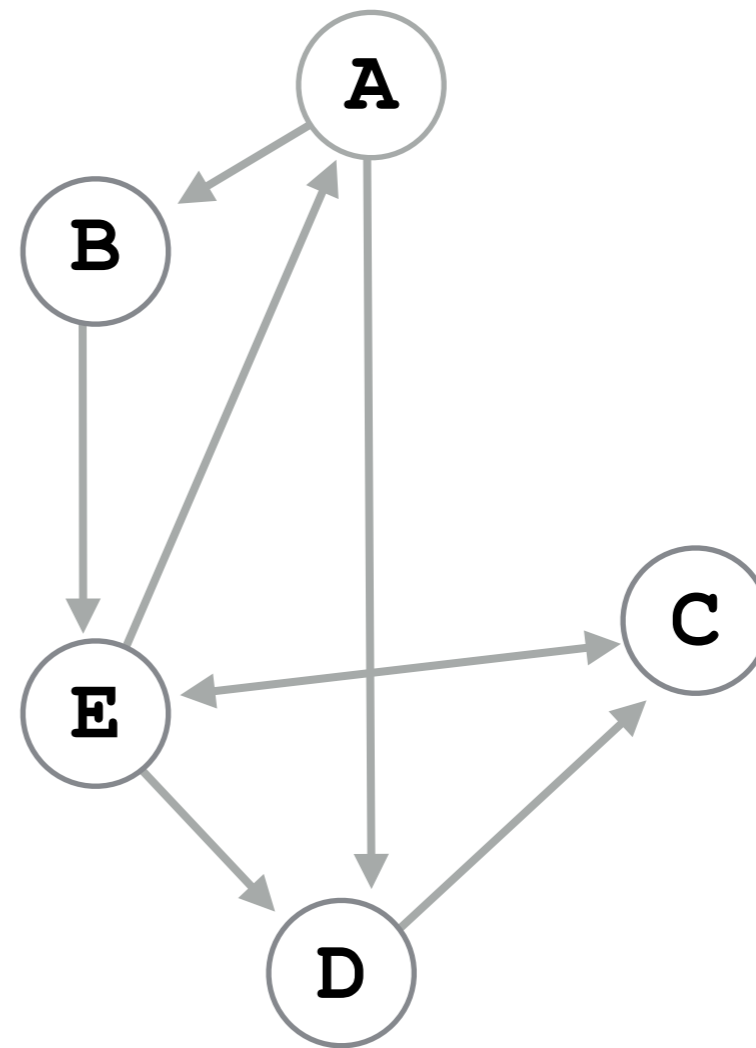
WHAT PATH WILL BFS FIND FROM B TO C?

- A) **B E C**
- B) **B E A D C**
- C) **B E D C**
- D) **none**



WHAT PATH WILL DFS FIND FROM **A** TO **D**?

- A) **A B E D**
- B) **A D**
- C) **none**
- D) **this is a trick question**



WHAT IS TRUE OF DFS, SEARCHING FROM A START NODE TO A GOAL NODE?

- A) **if a path exists, it will find it**
- B) **it is guaranteed to find the shortest path**
- C) **it is guaranteed to not find the shortest path**
- D) **it must be careful about cycles**
- E) **a, b, and d**
- F) **a, c, and d**
- G) **a and d**

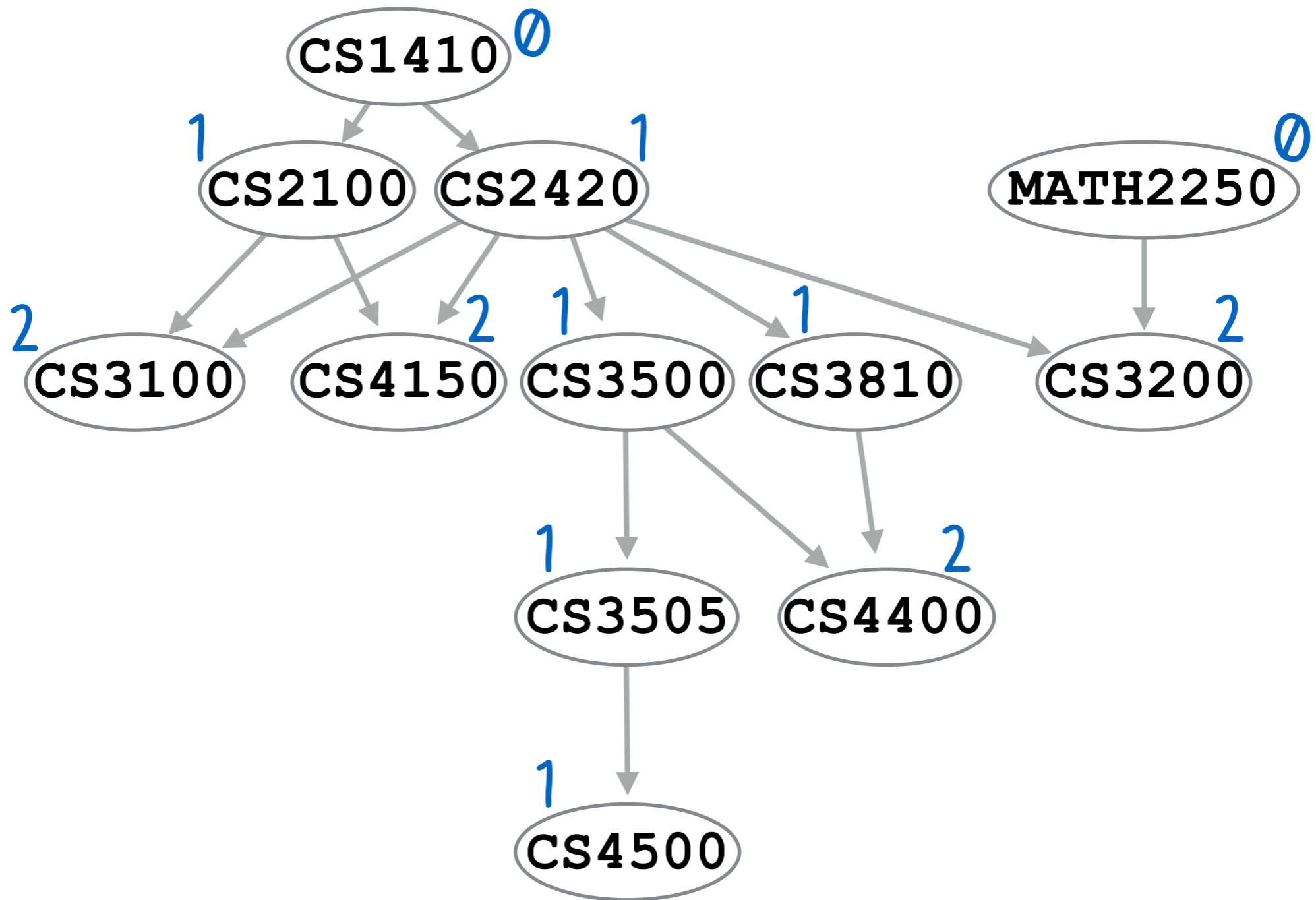
WHAT IS TRUE OF BFS, SEARCHING FROM A START NODE TO A GOAL NODE?

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- E) **a, b, and d**
- F) **a, c, and d**
- G) **a and d**

# topological sort

- the **indegree** of a node is the number of edges it has incoming
- this can be saved as part of the `Node` class, and can be easily computed as the graph is constructed
- any time a node adds another node as a neighbor, increase the neighbor's indegree





# topological sort

- consider a graph with no cycles
- a topological sort orders nodes such that...
  - if there is a path from node A to node B, then A appears before B in the sorted order
- example: scheduling tasks
  - represent the tasks in a graph
  - if task A must be completed before task B, then A has an edge to B

1. step through each node in the graph

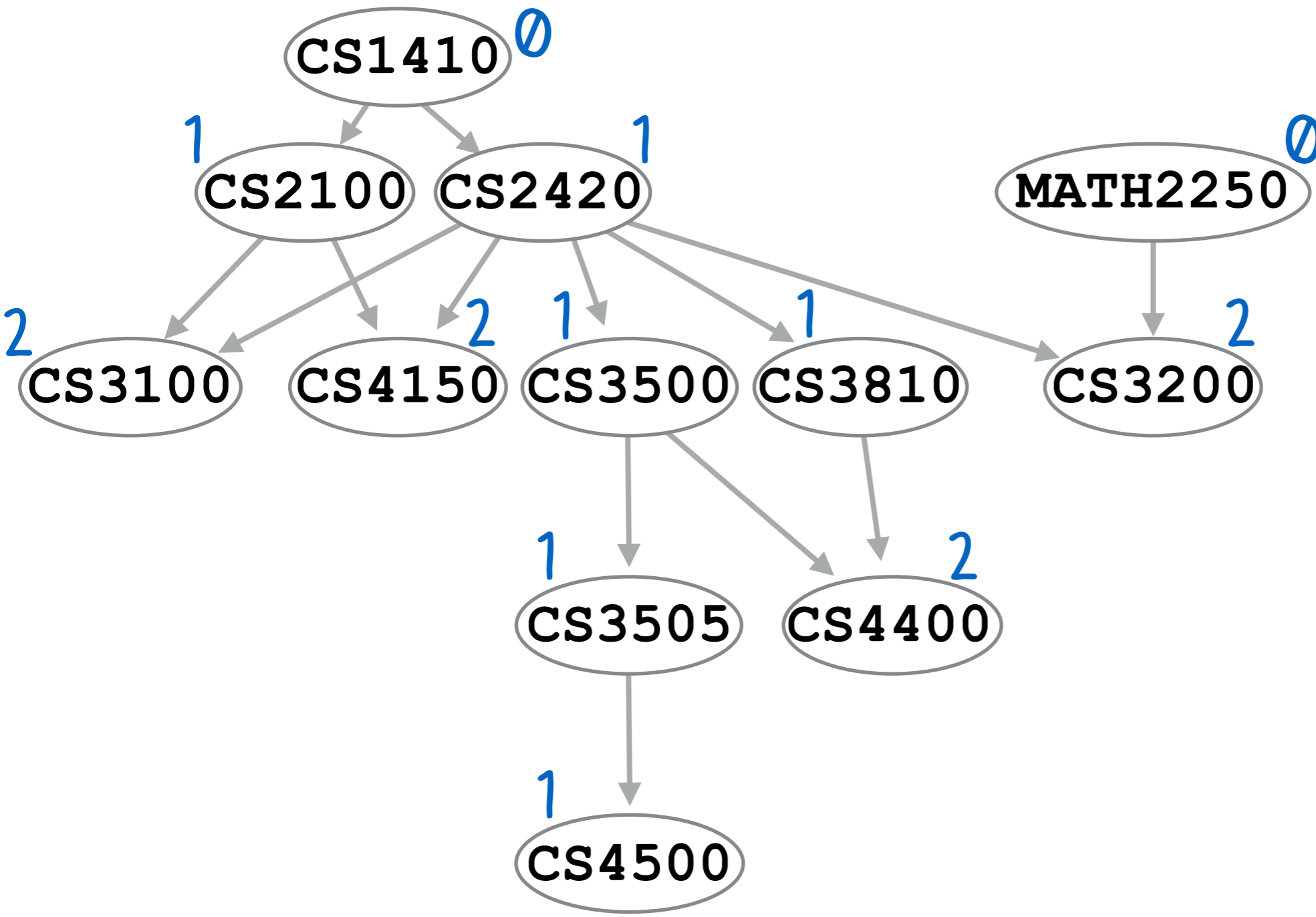
-if any node has indegree 0, add it to a queue

2. while the queue is not empty

-dequeue the first node in the queue and add to the sorted list

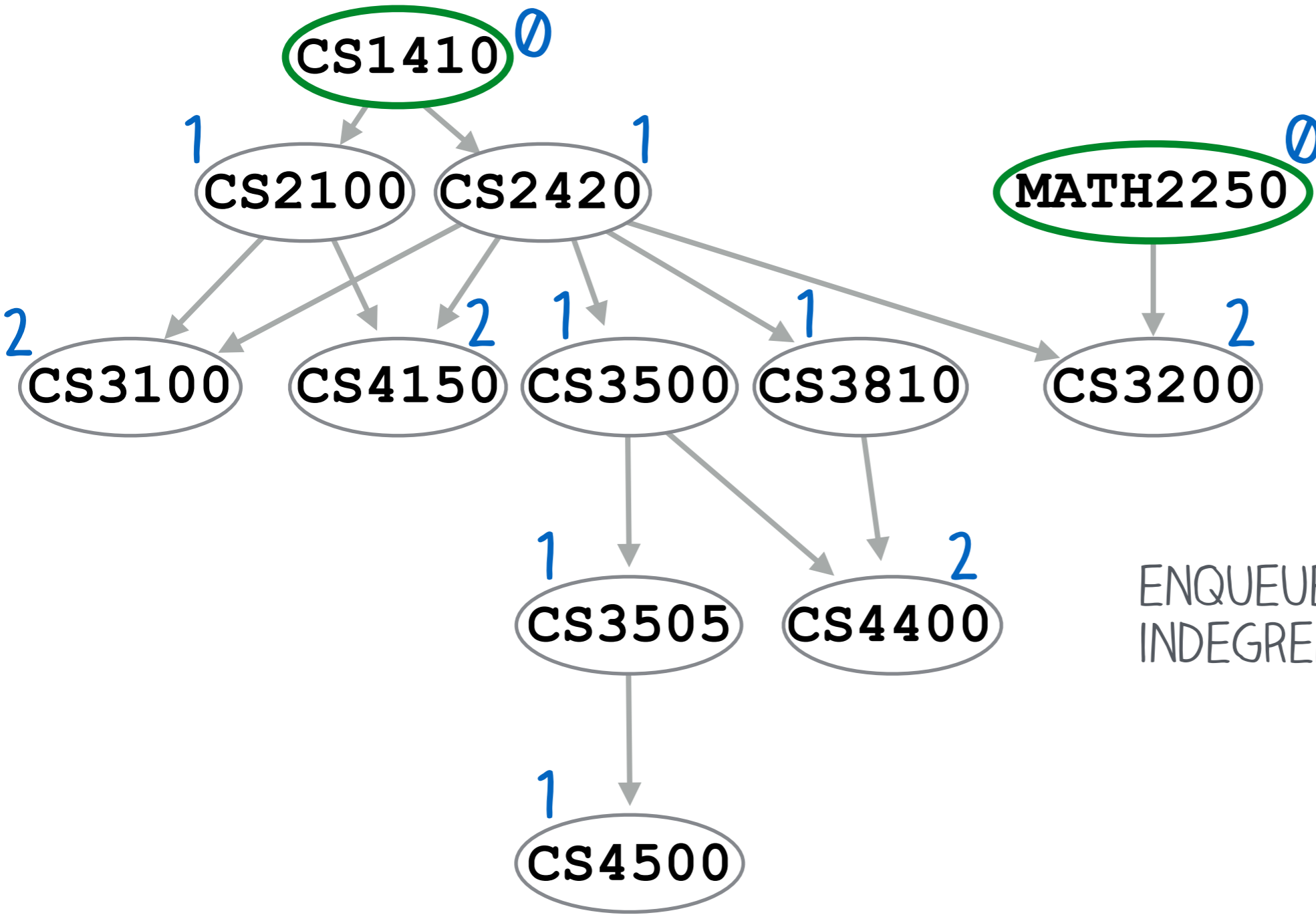
-visit that node's neighbors and decrease their indegree by 1

-if a neighbor's new indegree is 0, add it to the queue



queue :

sorted list:

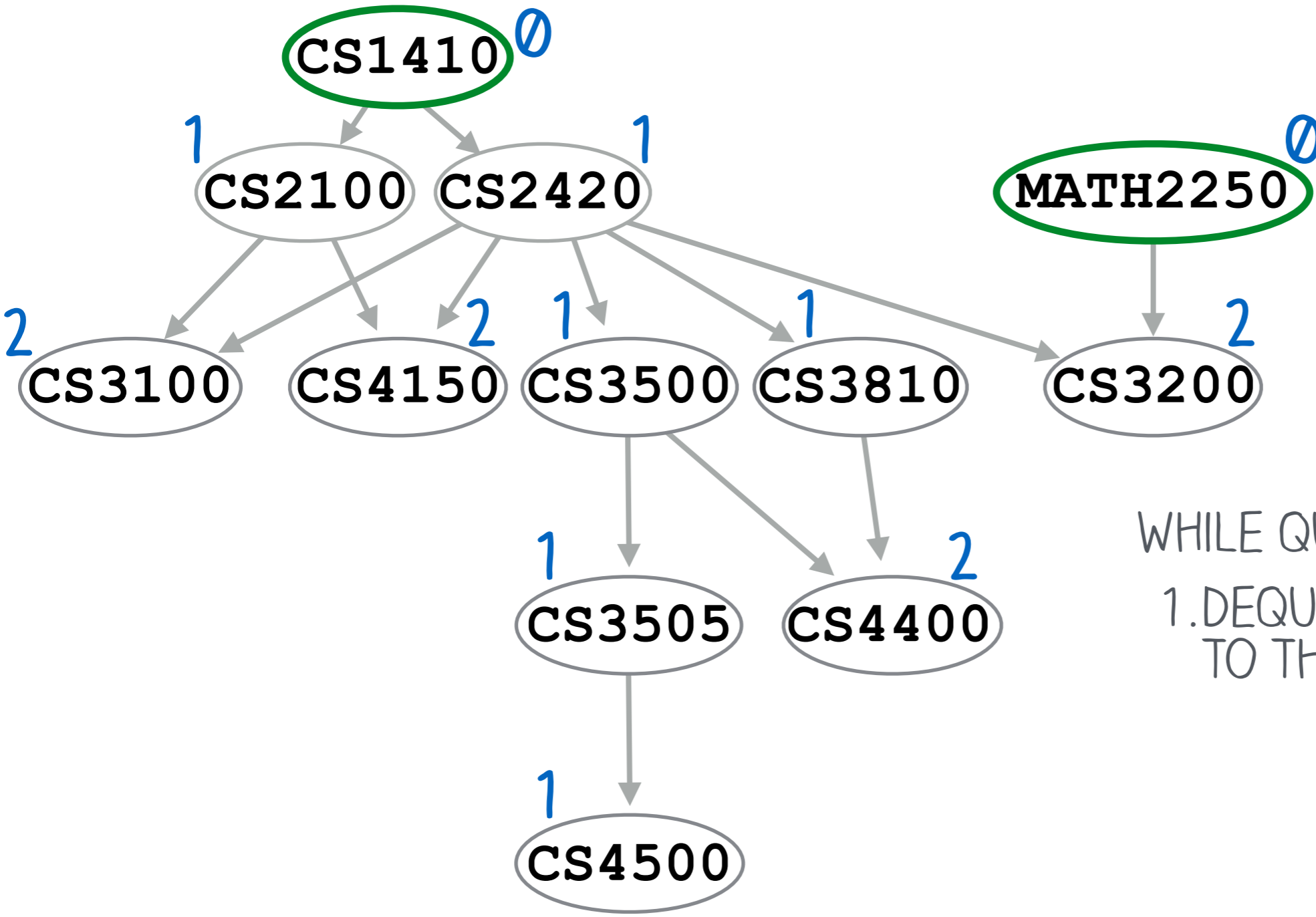


ENQUEUE ANY NODES WITH INDEGREE 0

queue: 

CS1410	MATH2250
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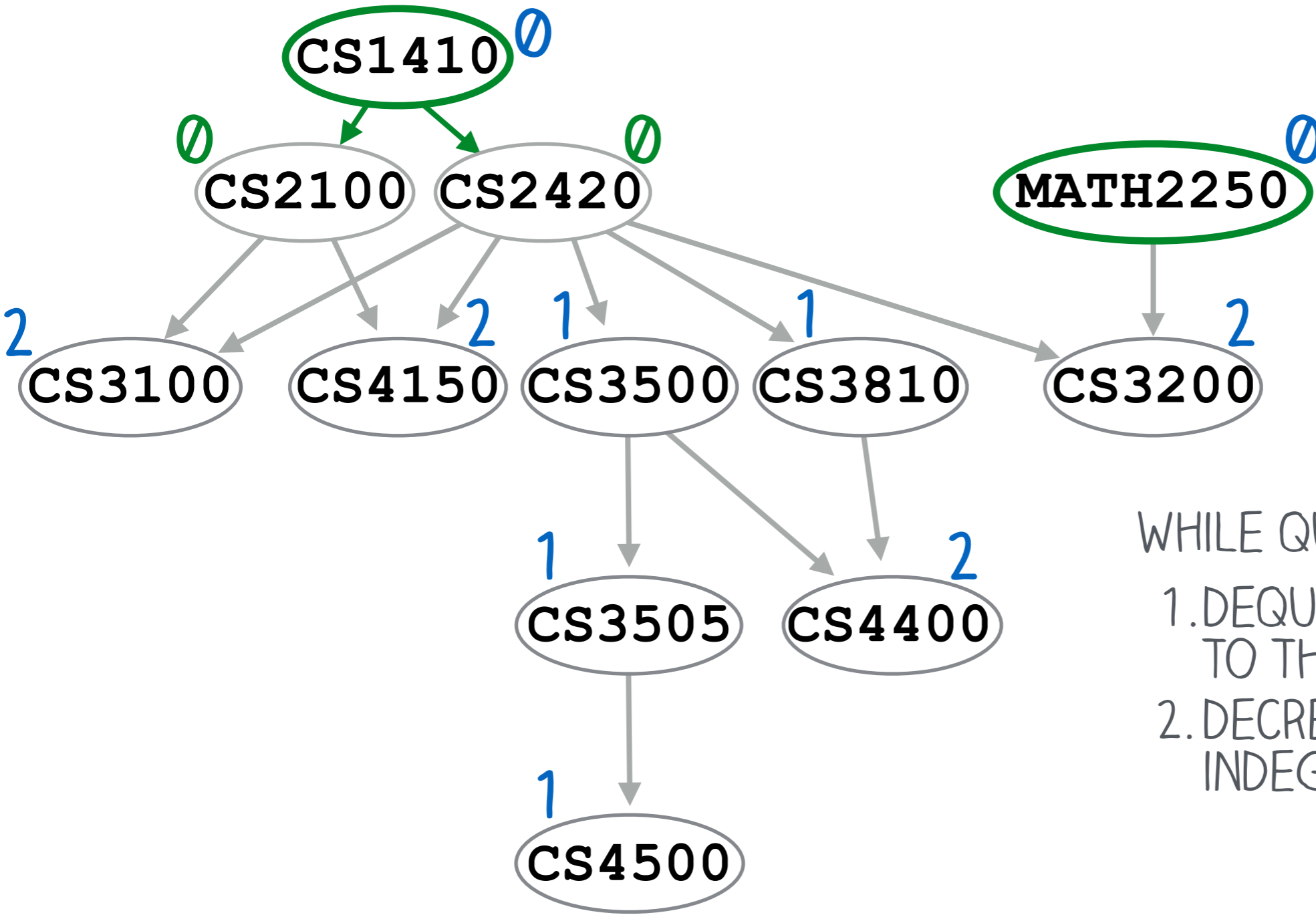
sorted list:



WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT  
 TO THE SORTED LIST

queue: MATH2250

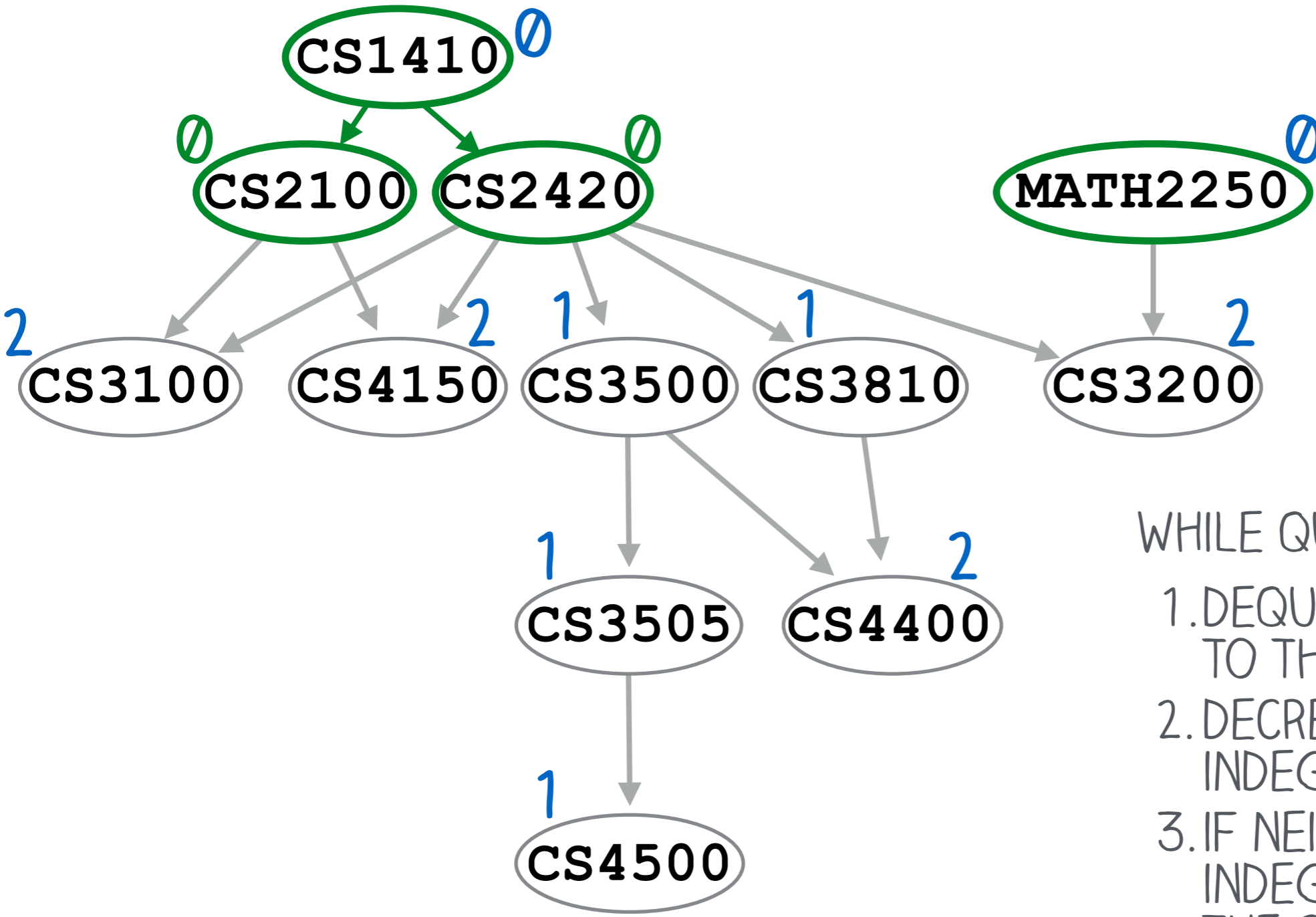
sorted list: CS1410



WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
 2. DECREASE NEIGHBORS' INDEGREE

queue: MATH2250

sorted list: CS1410



WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
 2. DECREASE NEIGHBORS' INDEGREE  
 3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

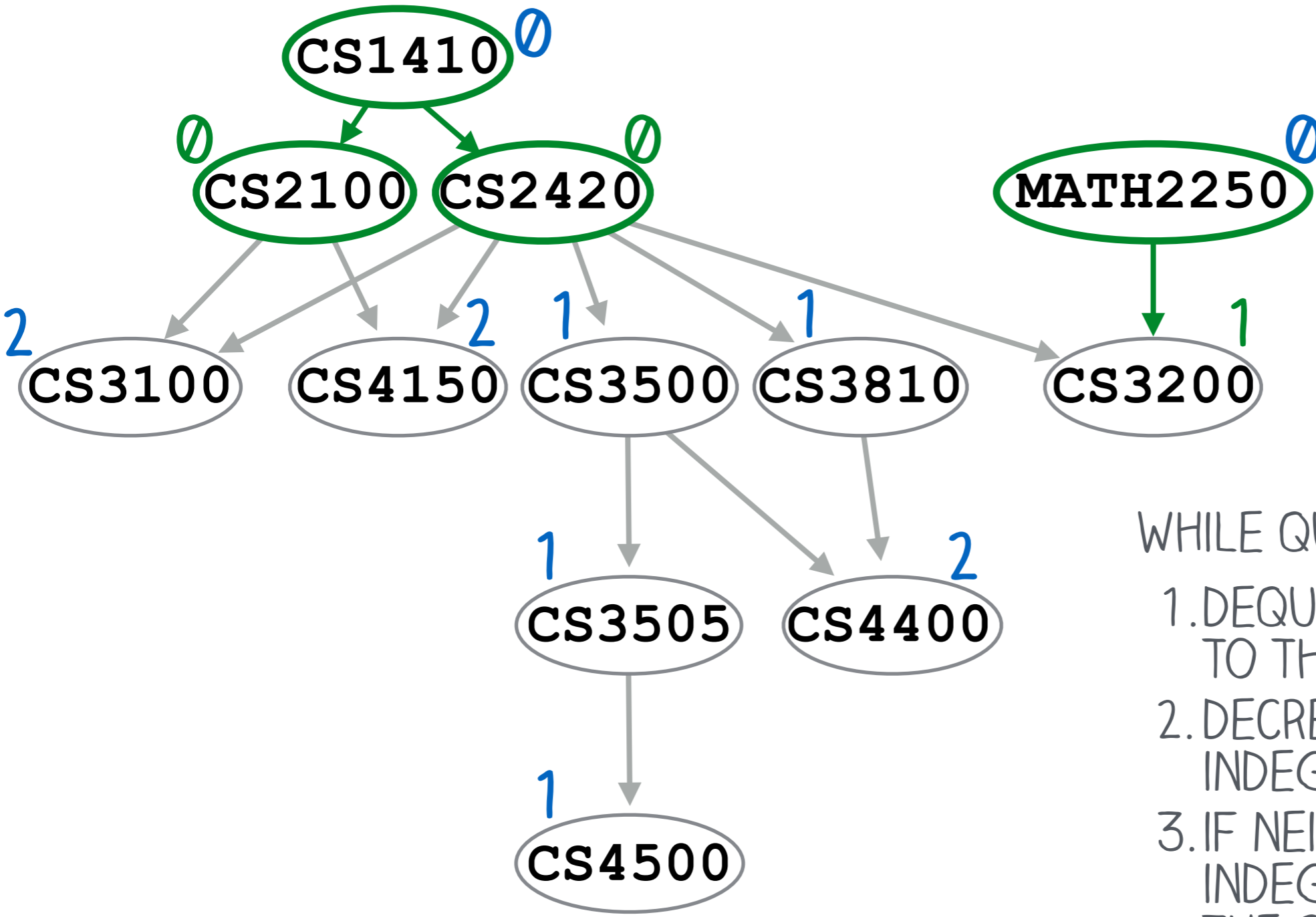
queue : 

MATH2250	CS2100	CS2420
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sorted list: 

CS1410
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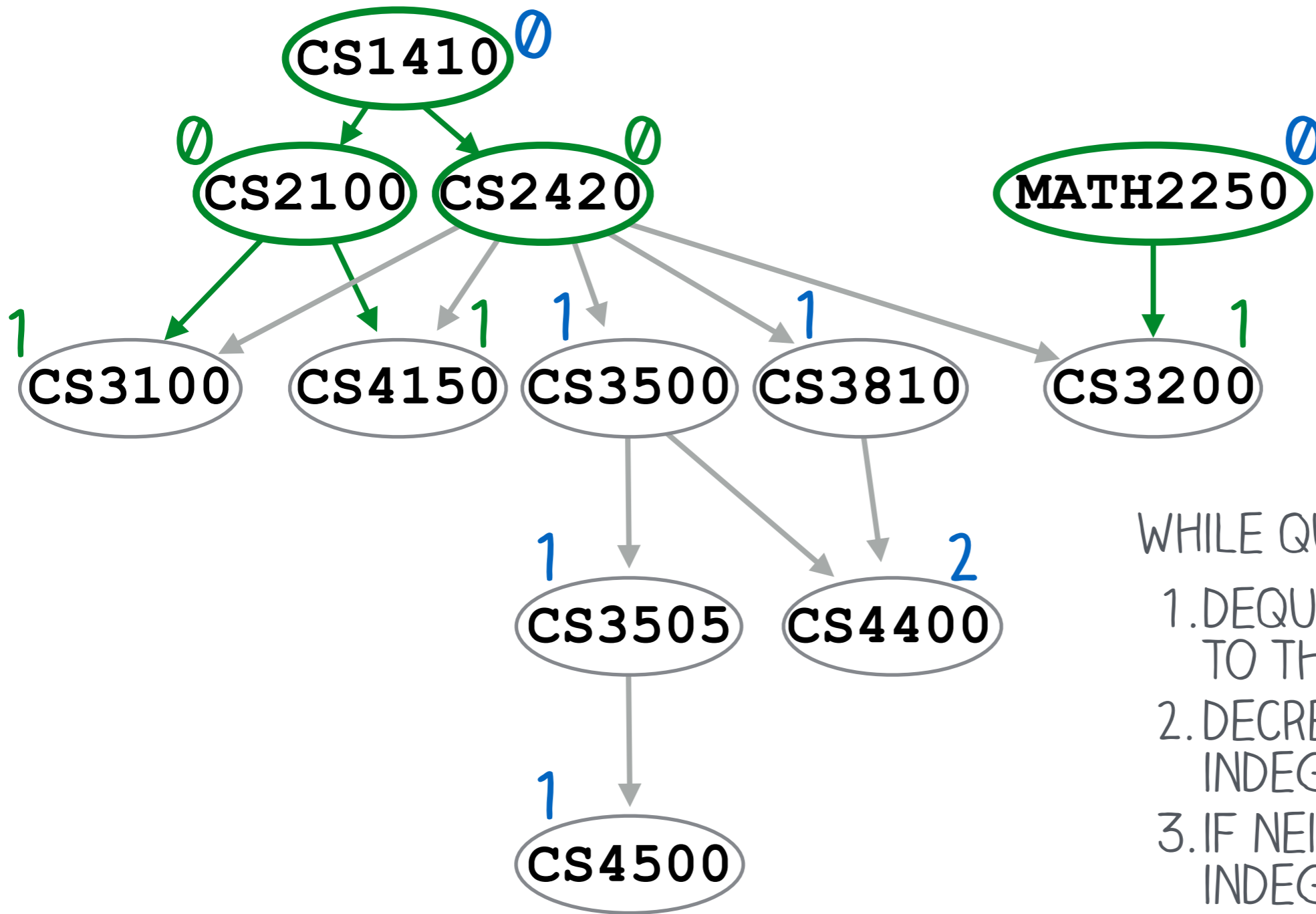
WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
 2. DECREASE NEIGHBORS' INDEGREE  
 3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue : 

CS2100	CS2420
--------	--------

sorted list: 

CS1410	MATH2250
--------	----------

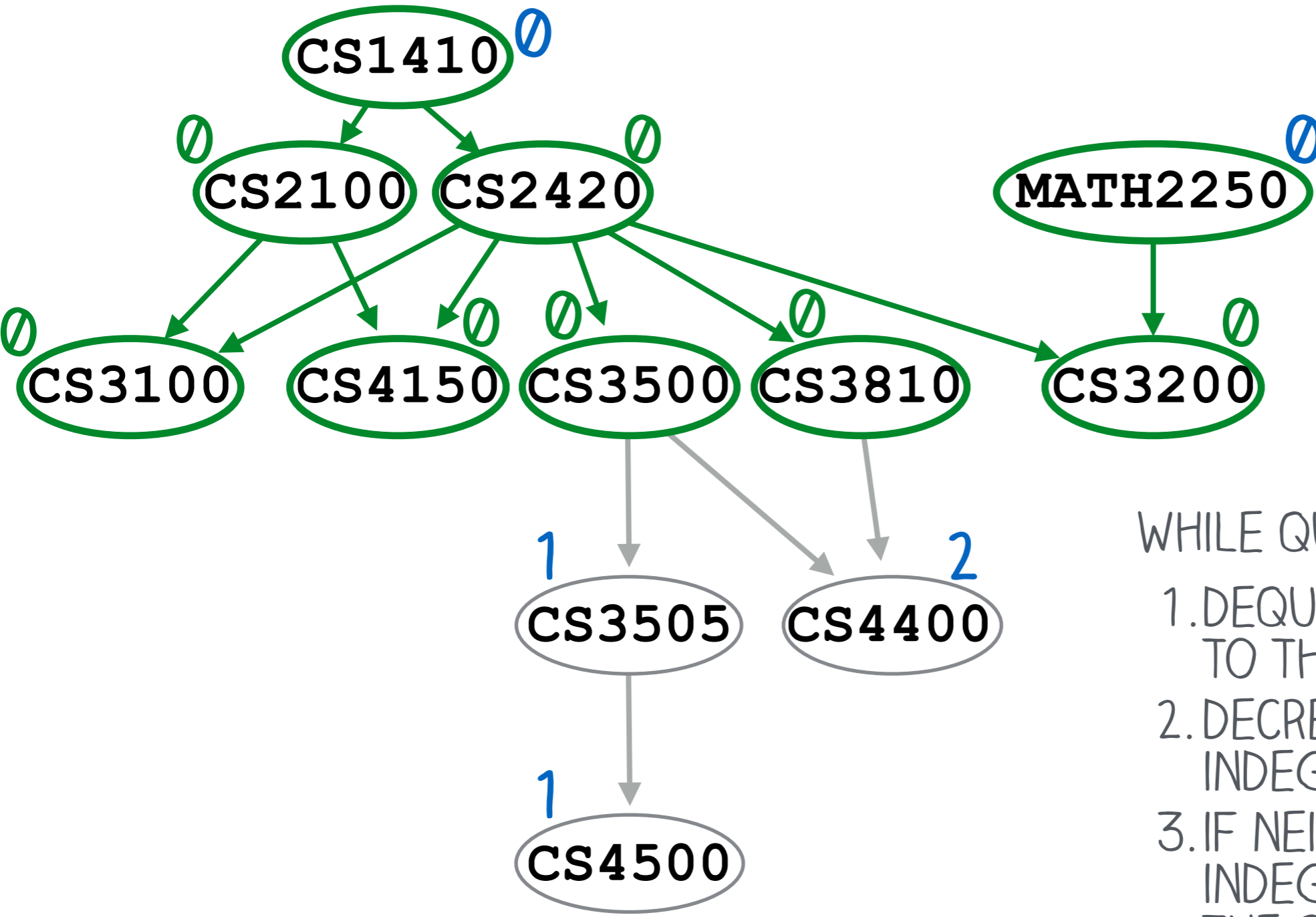


WHILE QUEUE NOT EMPTY:

1. DEQUEUE NODE, ADD IT TO THE SORTED LIST
2. DECREASE NEIGHBORS' INDEGREE
3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue: CS2420

sorted list: CS1410 MATH2250 CS2100



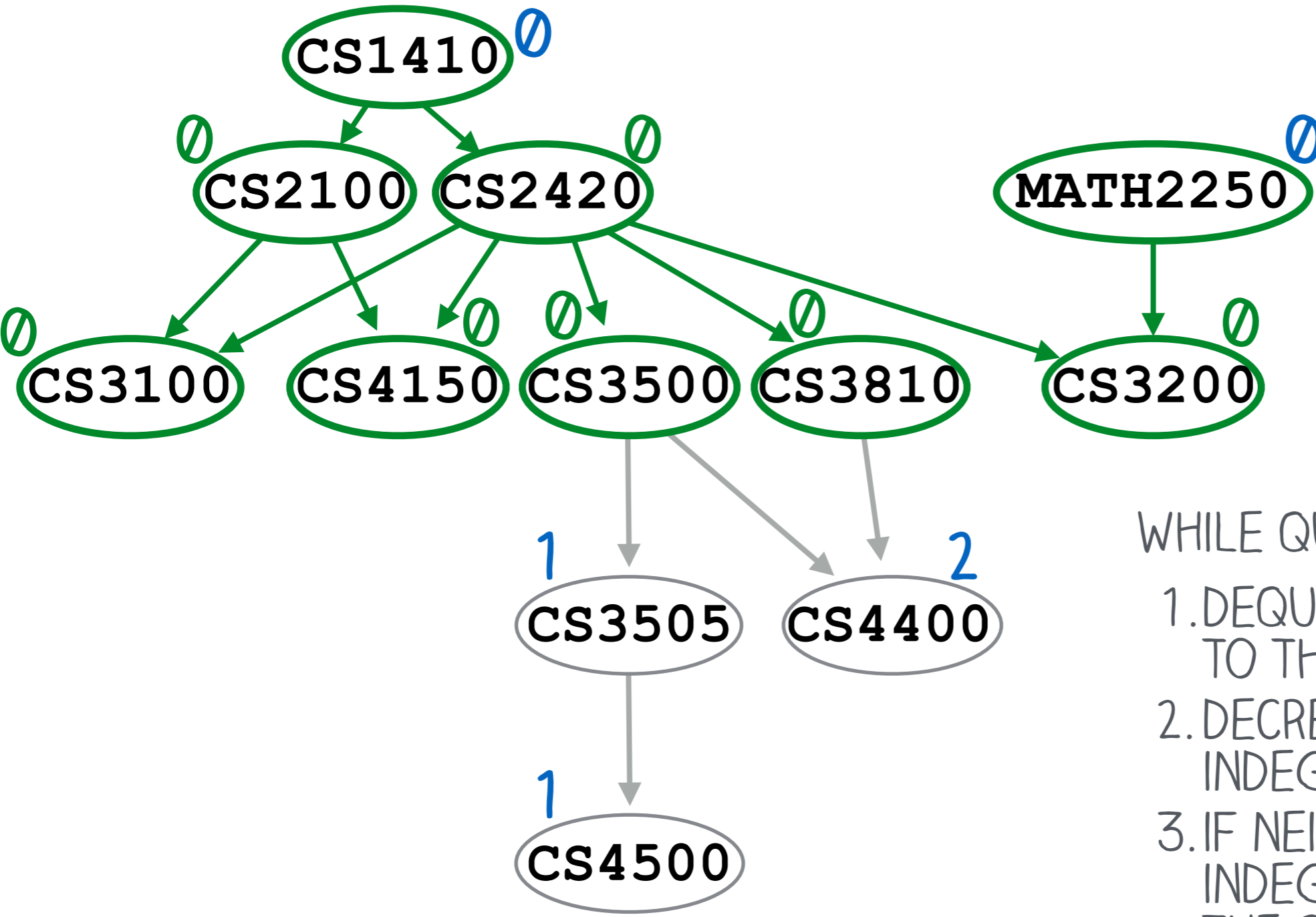
WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
 2. DECREASE NEIGHBORS' INDEGREE  
 3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue: 

CS3100	CS4150	CS3500	CS3810	CS3200
--------	--------	--------	--------	--------

sorted list: 

CS1410	MATH2250	CS2100	CS2420
--------	----------	--------	--------



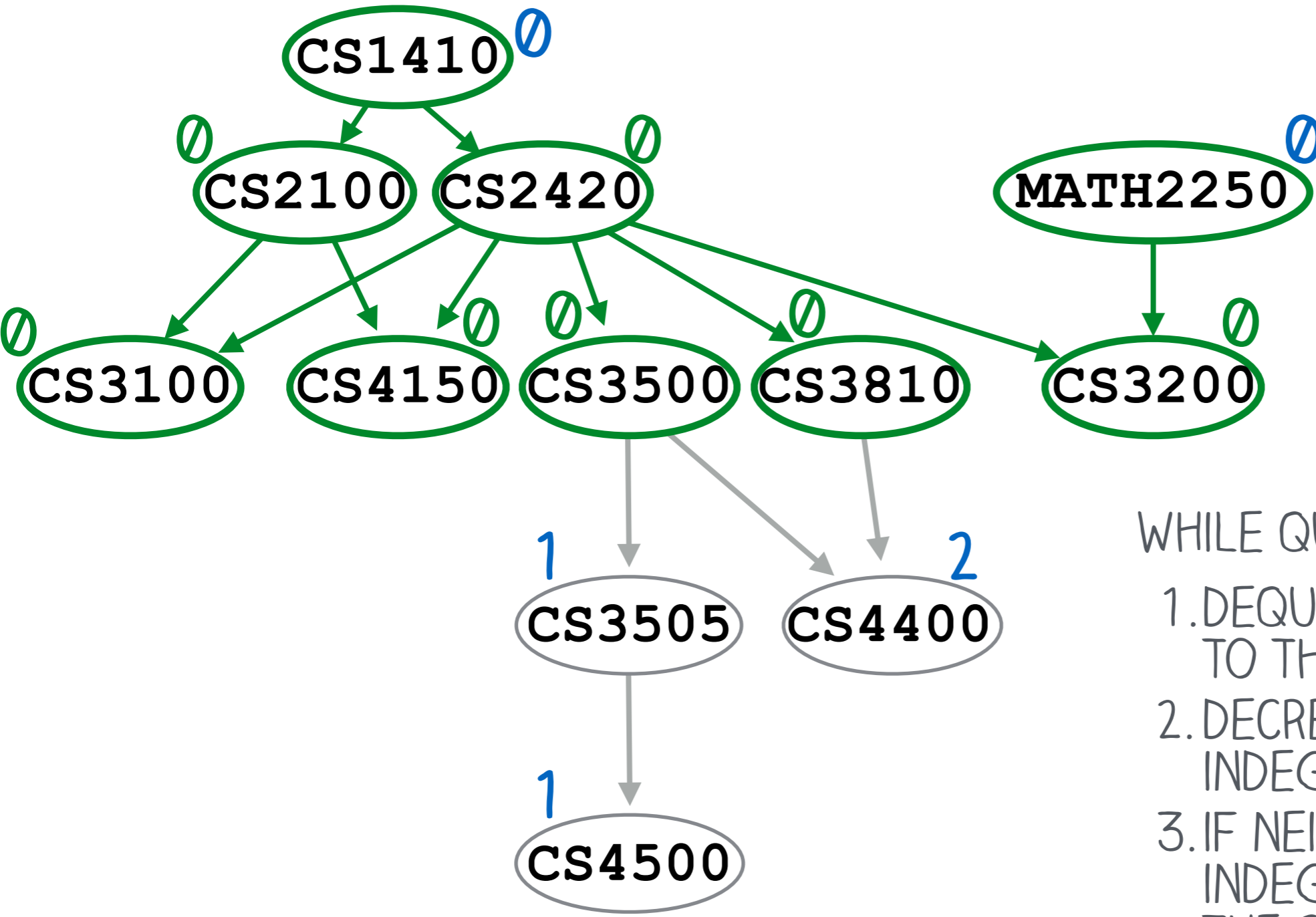
WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
 2. DECREASE NEIGHBORS' INDEGREE  
 3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue: 

CS4150	CS3500	CS3810	CS3200
--------	--------	--------	--------

sorted list: 

CS1410	MATH2250	CS2100	CS2420	CS3100
--------	----------	--------	--------	--------



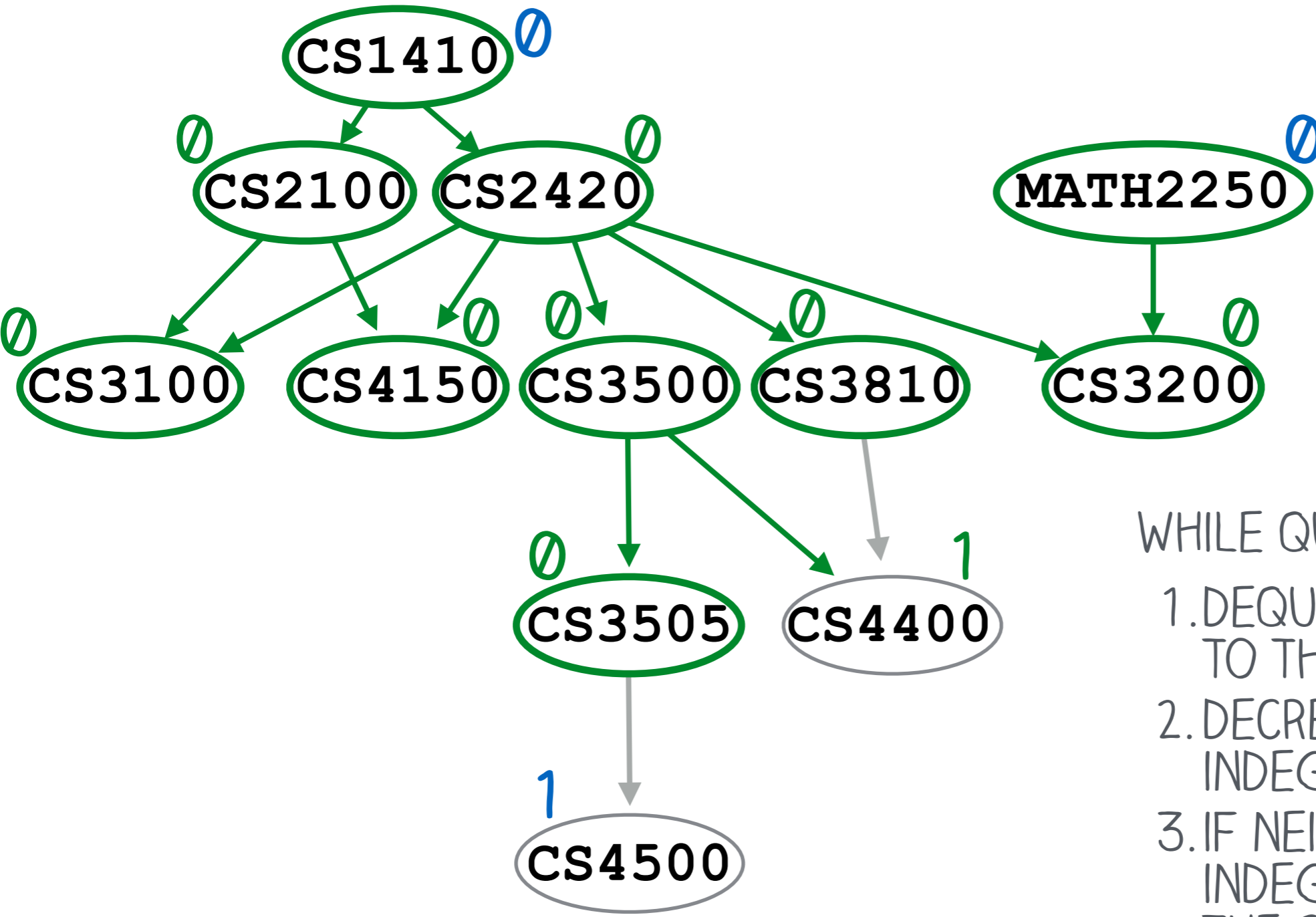
WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
 2. DECREASE NEIGHBORS' INDEGREE  
 3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue : 

CS3500	CS3810	CS3200
--------	--------	--------

sorted list: 

CS1410	MATH2250	CS2100	CS2420	CS3100	CS4150
--------	----------	--------	--------	--------	--------



WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
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 3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue : 

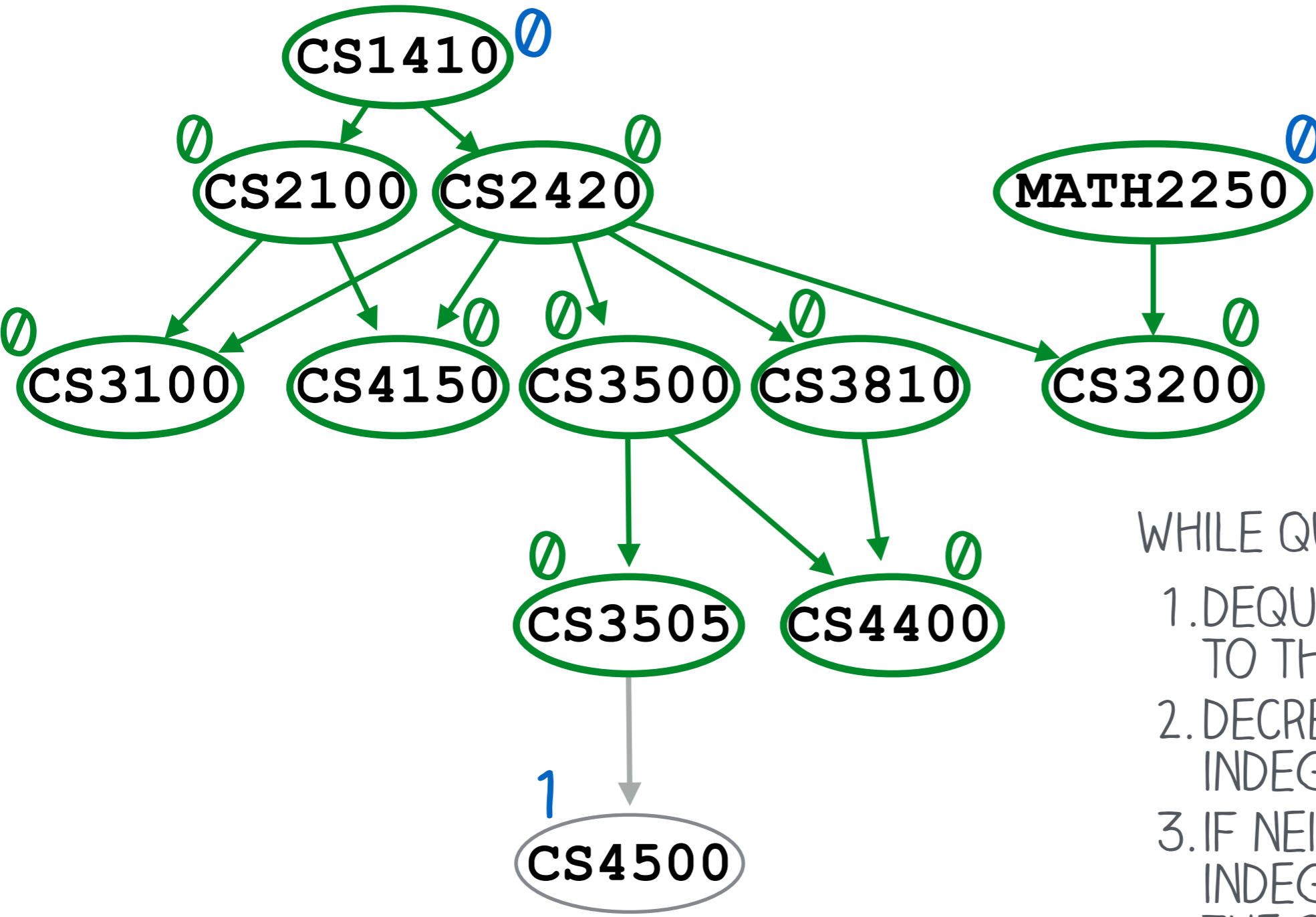
CS3810	CS3200	CS3505
--------	--------	--------

sorted list: 

CS1410
--------

 ... 

CS4150	CS3500
--------	--------



WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
 2. DECREASE NEIGHBORS' INDEGREE  
 3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue : 

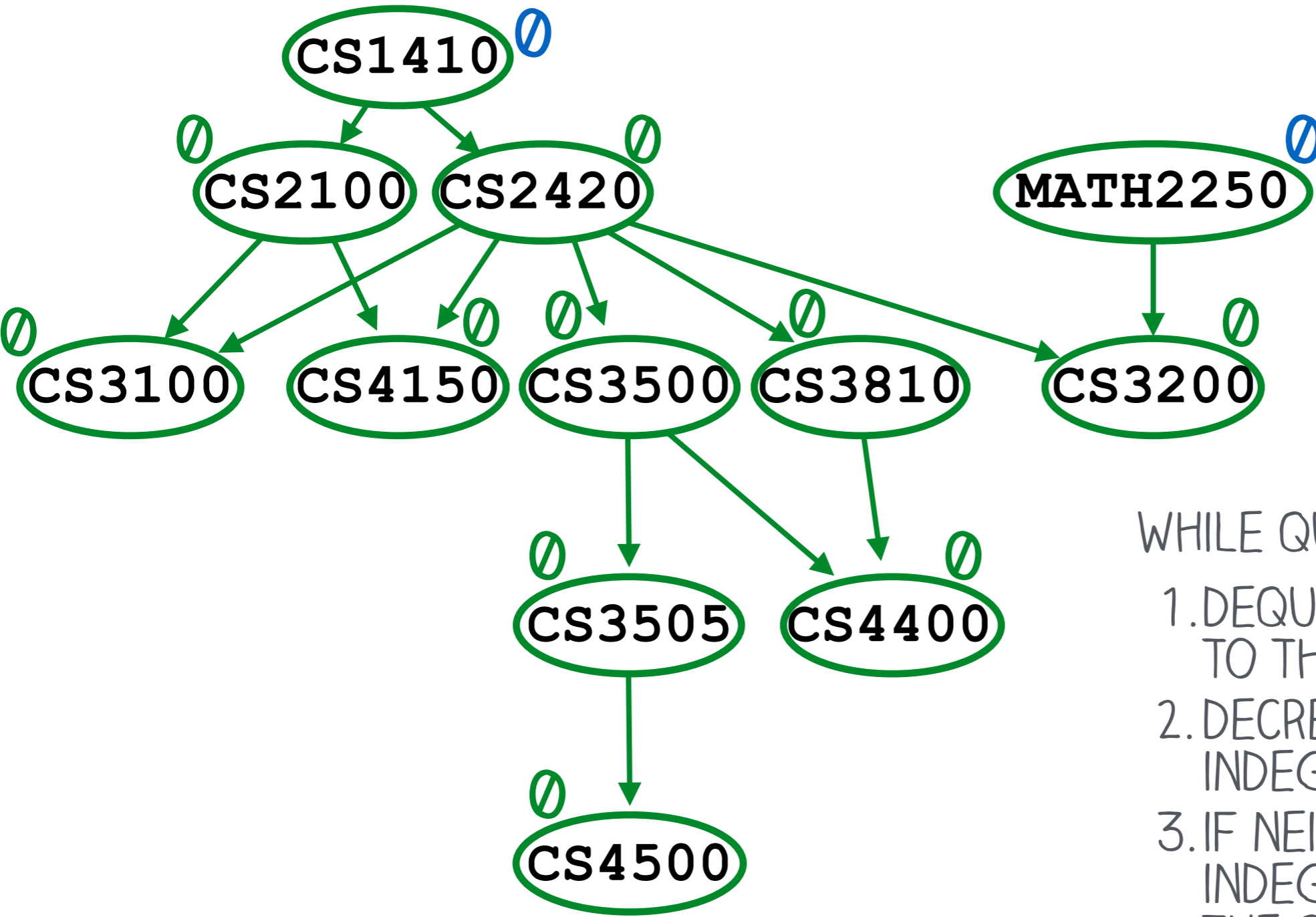
CS3505	CS4400
--------	--------

sorted list: 

CS1410
--------

 ... 

CS4150	CS3500	CS3810	CS3200
--------	--------	--------	--------



WHILE QUEUE NOT EMPTY:

1. DEQUEUE NODE, ADD IT TO THE SORTED LIST
2. DECREASE NEIGHBORS' INDEGREE
3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

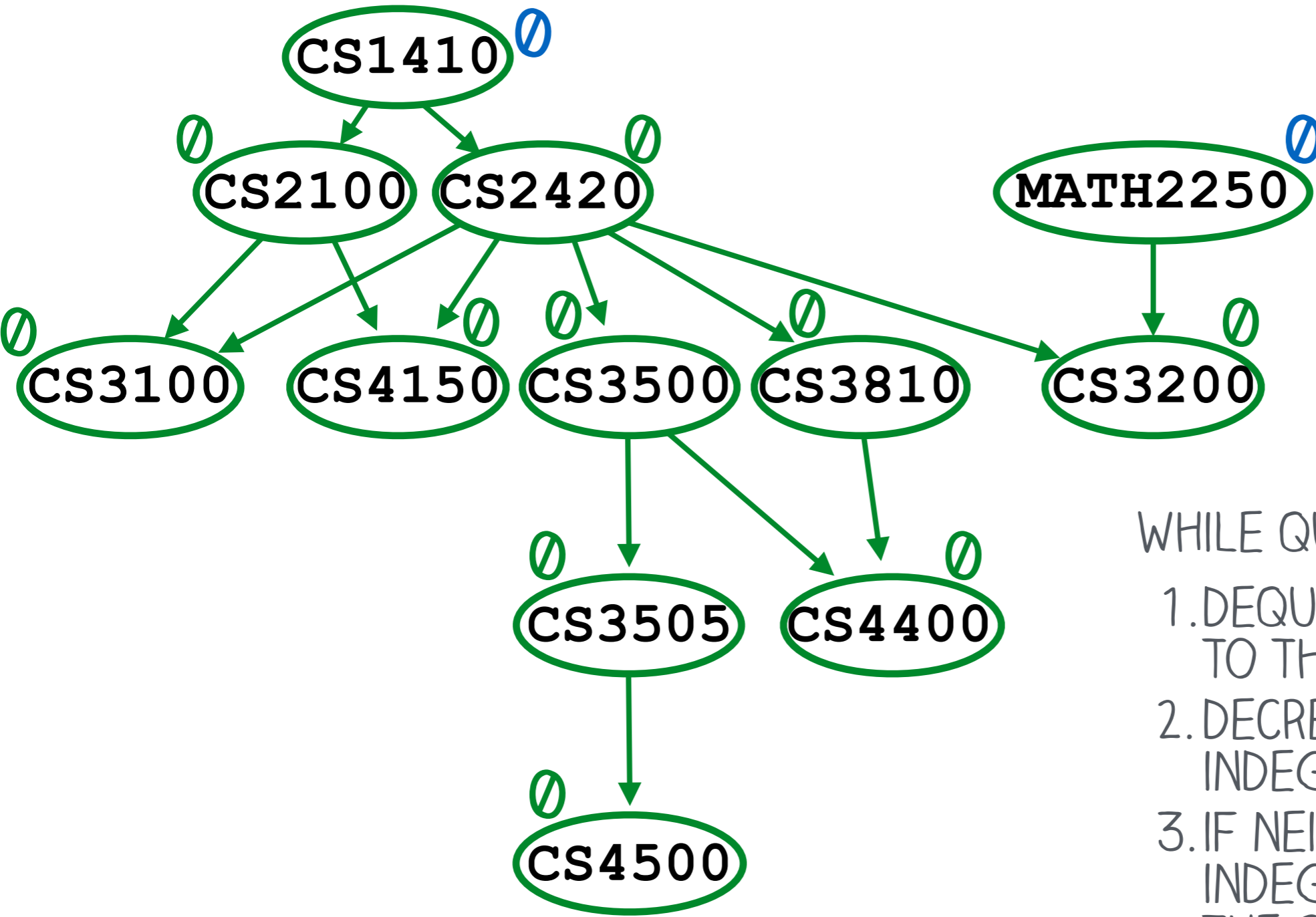
queue : 

CS4400	CS4500
--------	--------

sorted list: 

CS1410	...	CS4150	CS3500	CS3810	CS3200	CS3505
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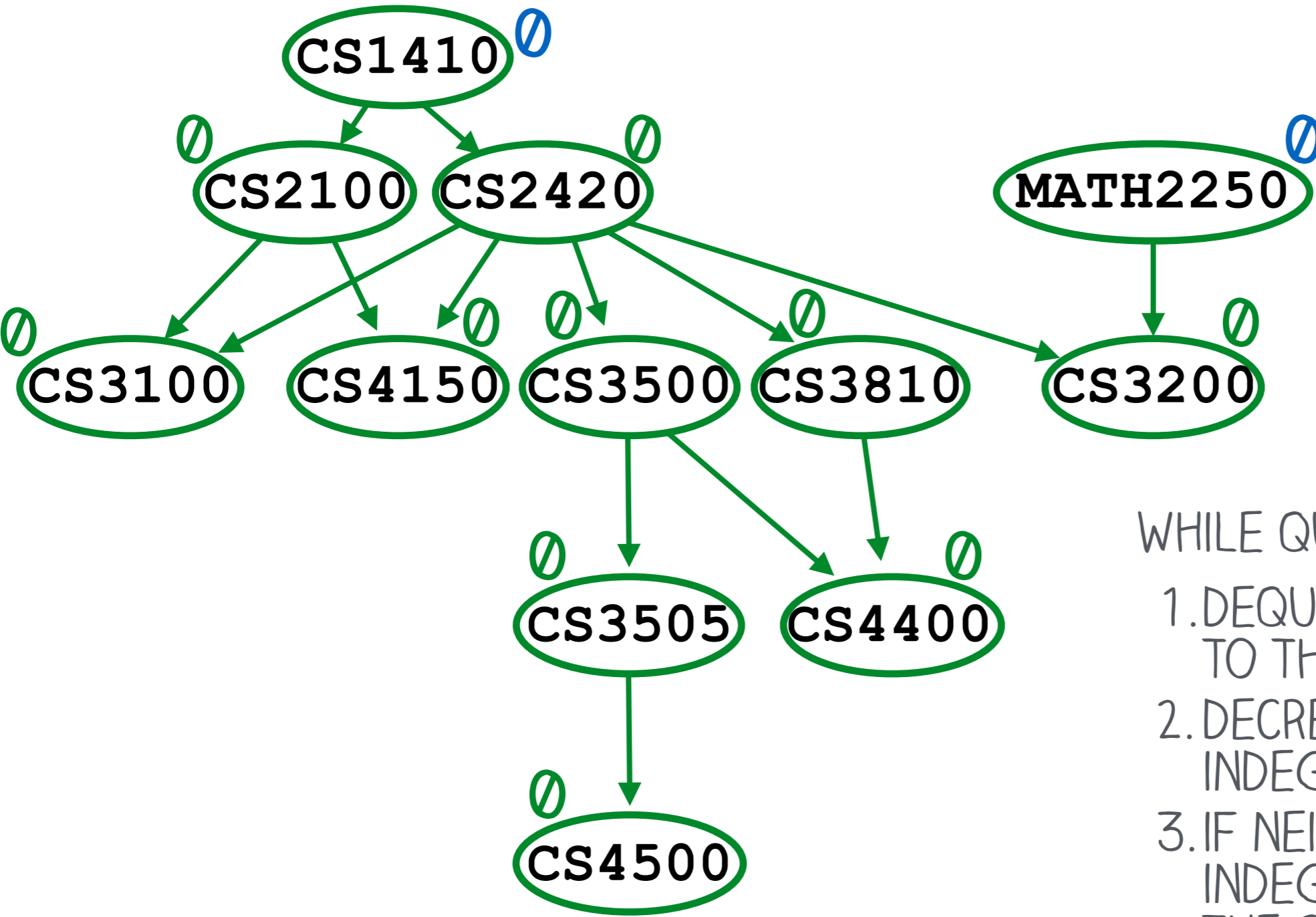




WHILE QUEUE NOT EMPTY:  
 1. DEQUEUE NODE, ADD IT TO THE SORTED LIST  
 2. DECREASE NEIGHBORS' INDEGREE  
 3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue: CS4500

sorted list: CS1410 ... CS3810 CS3200 CS3505 CS4400

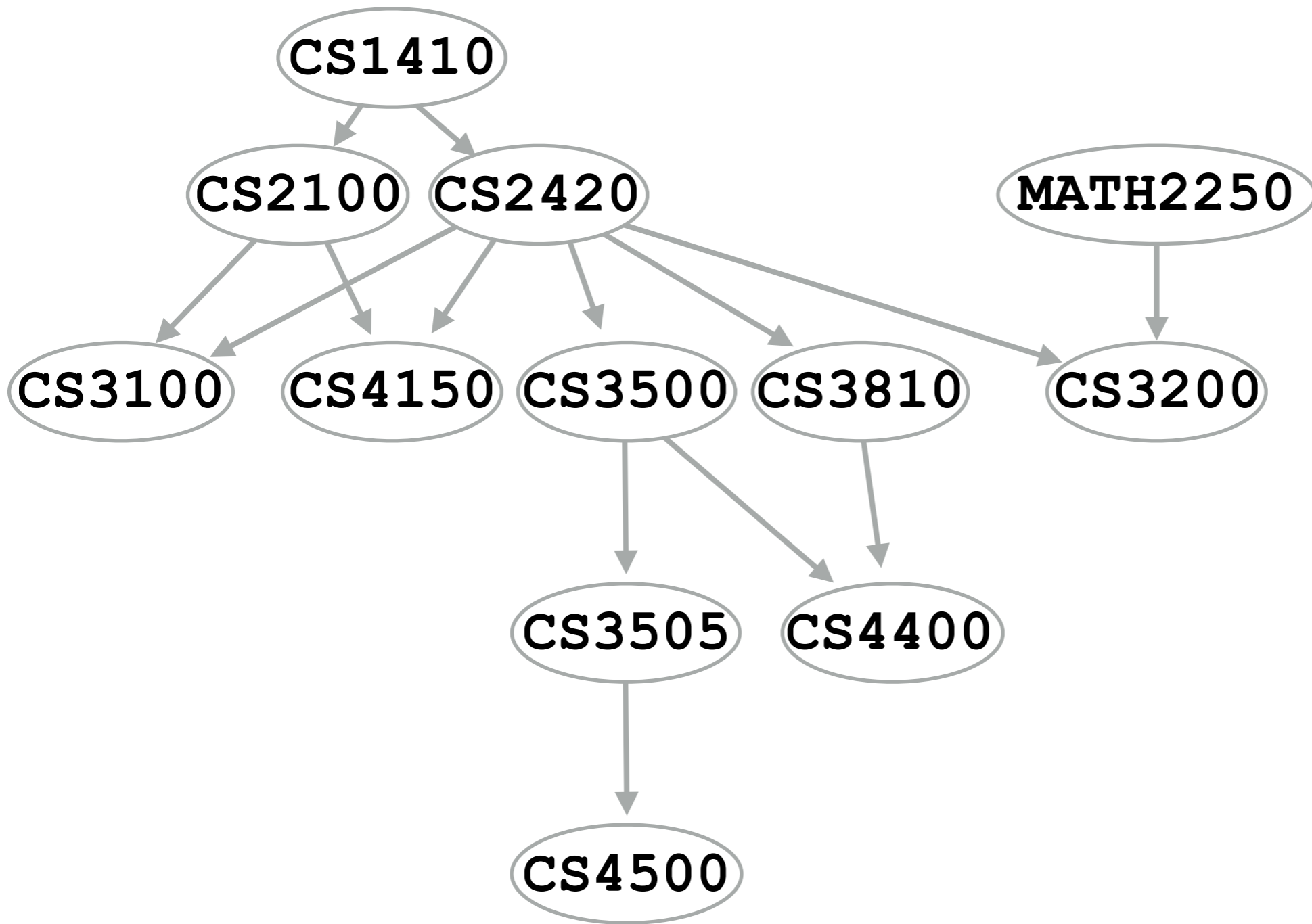


WHILE QUEUE NOT EMPTY:

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2. DECREASE NEIGHBORS' INDEGREE
3. IF NEIGHBORS' NEW INDEGREE IS 0, ADD IT TO THE QUEUE

queue :

sorted list: CS1410 ... CS3810 CS3200 CS3505 CS4400 CS4500



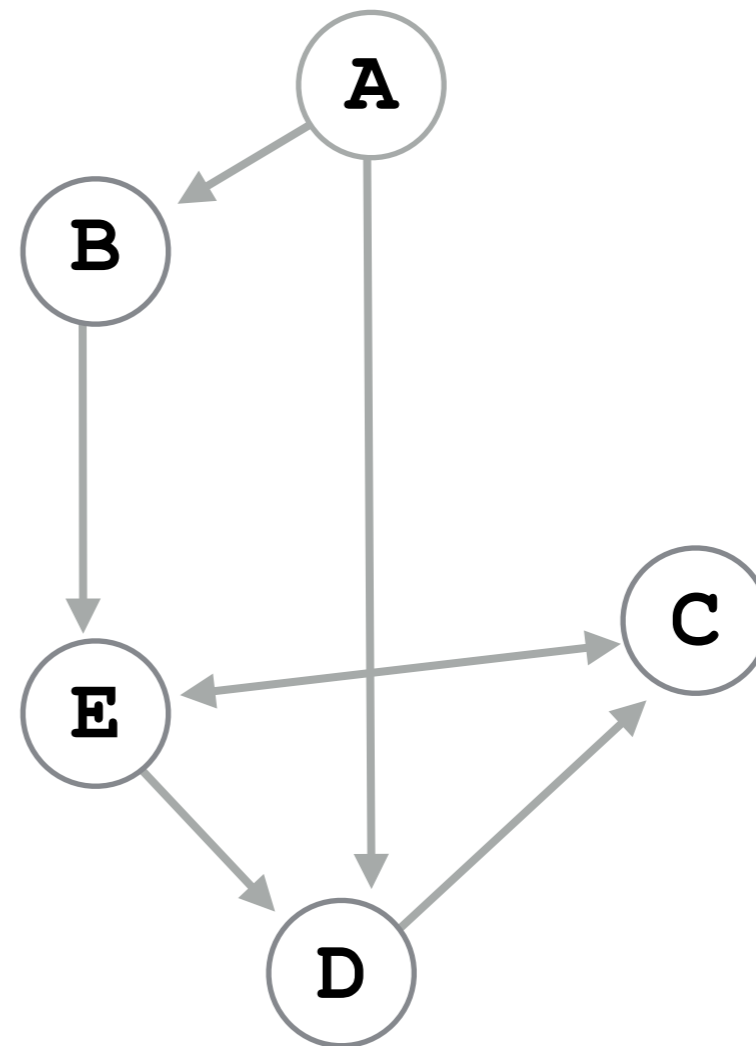
sorted list:

CS1410	MATH2250	CS2100	CS2420	CS3100	CS4150
--------	----------	--------	--------	--------	--------

CS3500	CS3810	CS3200	CS3505	CS4400	CS4500
--------	--------	--------	--------	--------	--------

WHICH OF THE FOLLOWING IS A VALID TOPOLOGICAL ORDERING?

- A) **A D C E B**
- B) **C D E B A**
- C) **A B E D C**
- D) **A B C D E**



**next time...**

## -reading

- chapter 14 in book

## -homework

- assignment 8 due Thursday

- assignment 9 out tomorrow