

# Topological Sort; Reductions

## CSE 373 Winter 2020

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# Poll Everywhere

[pollev.com/uwcse373](https://pollev.com/uwcse373)

- ❖ Approximately how long did Homework 6 (A\* Search) take?
  - A. 0-3 hours
  - B. 4-7 hours
  - C. 8-11 hours
  - D. 12-15 hours
  - E. 16-19 hours
  - F. 19+ hours
  - G. I don't want to say ...

# Announcements

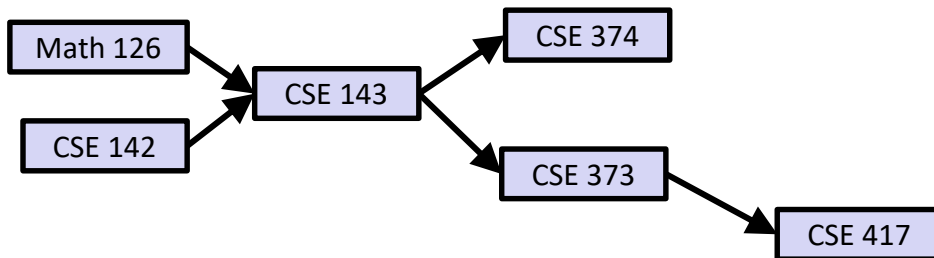
- ❖ We are converting Friday's Workshop (12:30-1:20 @ CSE 203) into DIT
- ❖ My DIT on Friday is in CSE 303 (not my office)
- ❖ Extra time for today's reading quiz due to a broken link

# Lecture Outline

- ❖ **Topological Sorting**
- ❖ General Technique: Reductions
  - Reducing Shortest Path in a negative DAG to TopoSort
  - Reducing Seam Carving to A\* Search

# Sorting Dependencies

- Given a set of courses and their prerequisites, find an order to take the courses in, assuming you can only take one course per quarter



# Topological Sort (aka Topological Ordering)

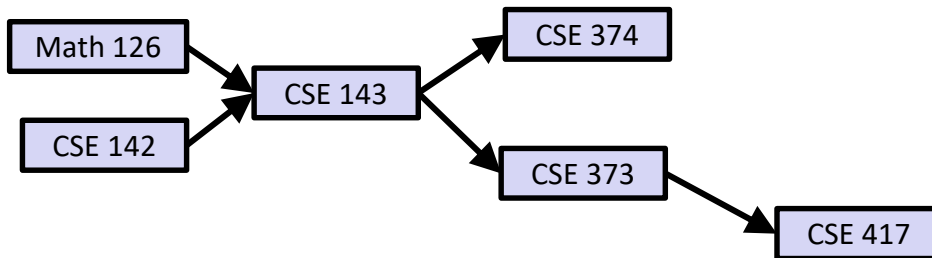
- ❖ Example: dependency graphs
  - An edge  $(u, v)$  means  $u$  must happen before  $v$
  - A topological sort of a dependency graph gives an ordering that **respects dependencies**
- ❖ Applications:
  - Graduating
  - Compiling multiple Java files
  - Multi-job Workflows

## Topological Sort

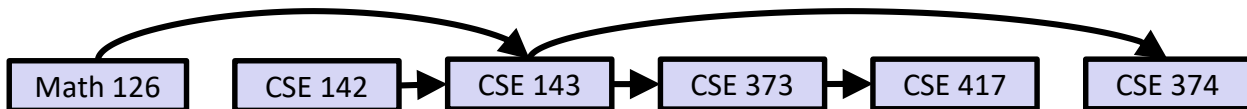
- Given a directed graph  $G$
- Find an ordering of the vertices so all edges go from “left to right”

# Sorting Dependencies

- ❖ Our course prerequisite chart:



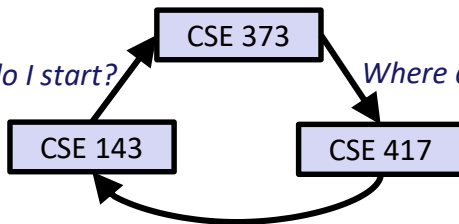
- ❖ Possible ordering:



# Can We Always TopoSort a Graph?

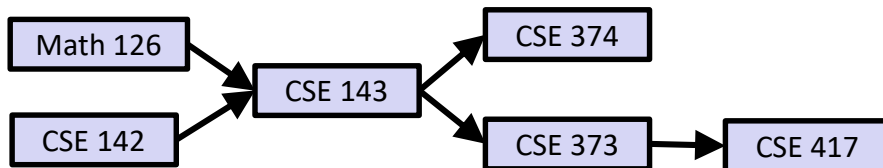
- ❖ Can you topologically sort this graph?

🤔 Where do I start?      Where do I end? 🤔



No 🤔

- ❖ What's the difference between this graph and our first graph?



## Directed Acyclic Graph

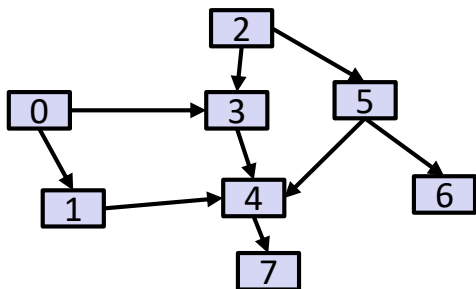
- ❖ A graph has a topological ordering iff it is a DAG
  - But a DAG can have multiple orderings

- A directed graph without any cycles
- Edges may or may not be weighted



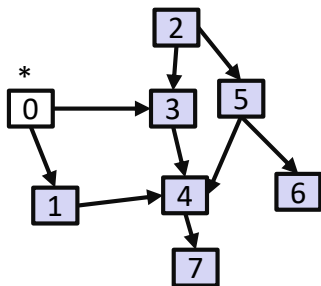
# Sorting a DAG

- ❖ Does this graph have a topological ordering? If so find one

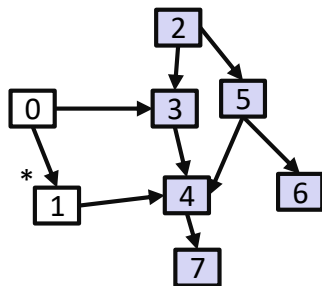


- ❖ Algorithm (from reading):
  - Perform DFS post-order traversal(s) from every vertex with in-degree 0, remembering marked vertices between traversals

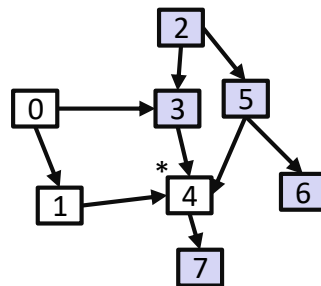
# Sorting a DAG



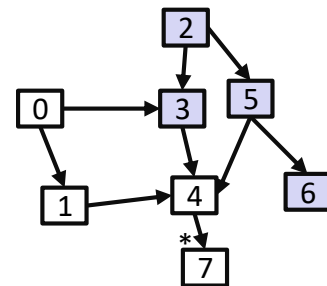
Post-order: []



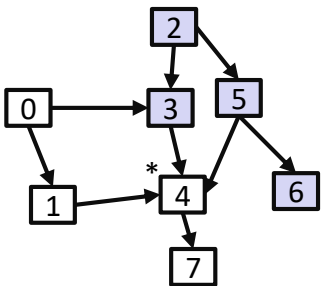
Post-order: []



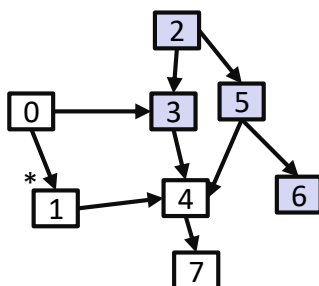
Post-order: []



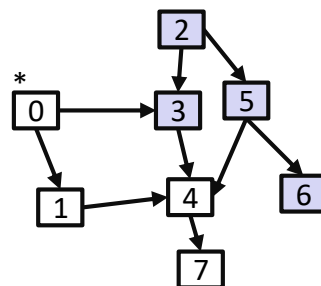
Post-order: [7]



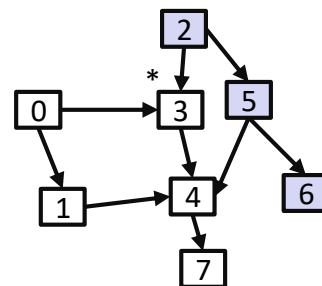
Post-order: [7, 4]



Post-order: [7, 4, 1]



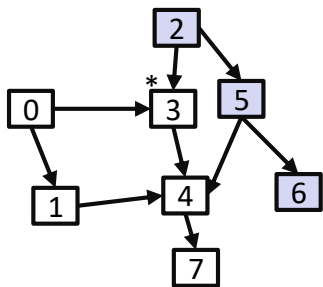
Post-order: [7, 4, 1]



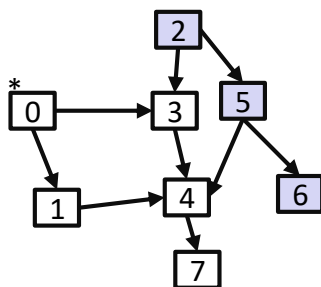
Post-order: [7, 4, 1, 3]

# Sorting a DAG

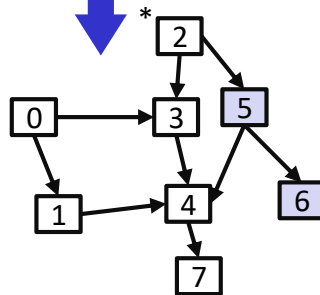
At this step, we've visited everything reachable from node 0 and are starting a new DFS at a node with an in-degree of 0



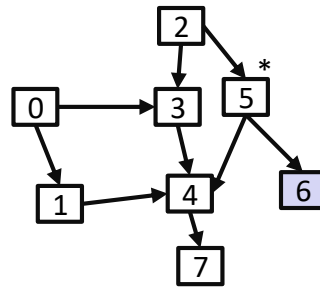
Post-order: [7, 4, 1, 3]



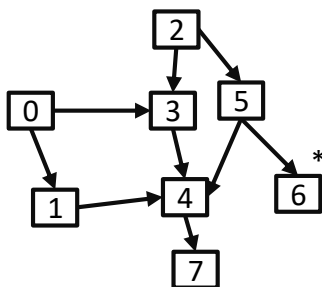
Post-order: [7, 4, 1, 3, 0]



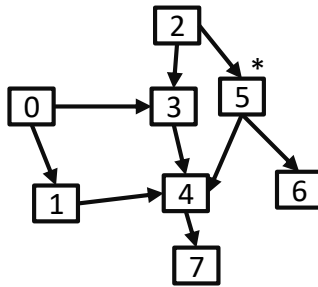
Post-order: [7, 4, 1, 3, 0]



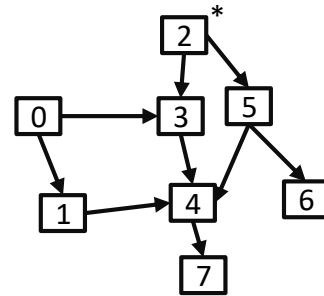
Post-order: [7, 4, 1, 3, 0]



Post-order: [7, 4, 1, 3, 0, 6]



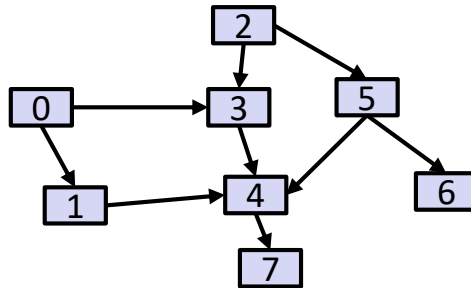
Post-order: [7, 4, 1, 3, 0, 6, 5]



Post-order: [7, 4, 1, 3, 0, 6, 5, 2]

# How Did We Find a Topological Sort?

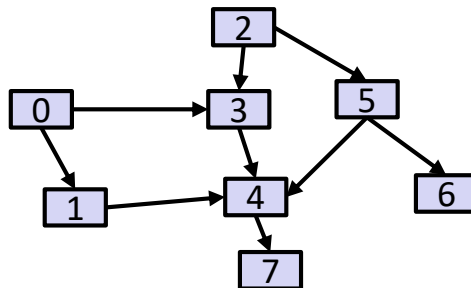
- ❖ Does this graph have a topological ordering? If so find one



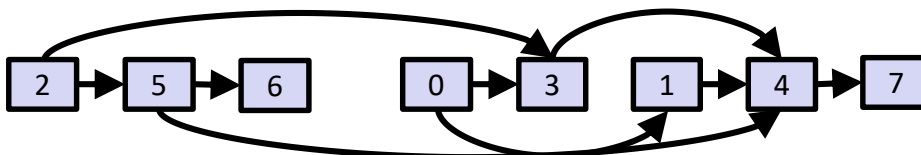
- ❖ Algorithm (from reading):
  - Perform DFS post-order traversal(s) from every vertex with in-degree 0, *remembering marked vertices between traversals*
- ❖ Topological Sort is given by reverse of the DFS post-order list
  - Post-order list: [7, 4, 1, 3, 0, 6, 5, 2]
  - Reversed: [2, 5, 6, 0, 3, 1, 4, 7]

# How Did We Find a Topological Sort?

- ❖ Does this graph have a topological ordering? If so find one



- ❖ Topological Sort is given by reverse of the DFS post-order list
  - Post-order list: [7, 4, 1, 3, 0, 6, 5, 2]
  - Reversed: [2, 5, 6, 0, 3, 1, 4, 7]
- ❖ Our "topological sort":



# Lecture Outline

- ❖ Topological Sorting
- ❖ **General Technique: Reductions**
  - Reducing Shortest Path in a negative DAG to TopoSort
  - Reducing Seam Carving to A\* Search

# Decomposition vs Reduction

- ❖ **Decomposition**: Taking a complex task and breaking it into smaller parts
  - This is the heart of computer science and programming
  - We might use “canned solutions” for solving these smaller parts
- ❖ **Reduction**: Using an algorithm for Problem Q to solve a different Problem P
  - We do not modify the algorithm for Problem Q; we only modify the inputs/outputs
  - “Problem P reduces to Q”
  - Hopefully problem Q is easier than problem P!

# Decomposition

- ❖ **Decomposition**: Taking a complex task and breaking it into smaller parts
  
- ❖ Examples:
  - Decomposing HuskyMaps to:
    - Autocomplete (search bar prefix queries)
    - Heap (priority queue for route-finding)
    - A\* search (route-finding)
    - k-d tree (nearest neighbors to find start and goal vertices)
    - Rasterer (map tile display)
  - Recognizing that “finding the next trie node” meant using a Map ADT



# Reduction

- ❖ **Reduction**: Using an algorithm for Problem Q to solve a different Problem P
- ❖ Examples and Non-examples:
  - A\* does not reduce to Dijkstra's
    - We *modified* Dijkstra's by adding a heuristic
  - "Climbing a hill" reduces to:
    - "Riding a ski lift"
    - "Being shot out of a cannon"
    - "Riding a bike"
  - Shortest path in a negative DAG reduces to Topological Sort
  - ... does Topological Sort reduce to DFS?

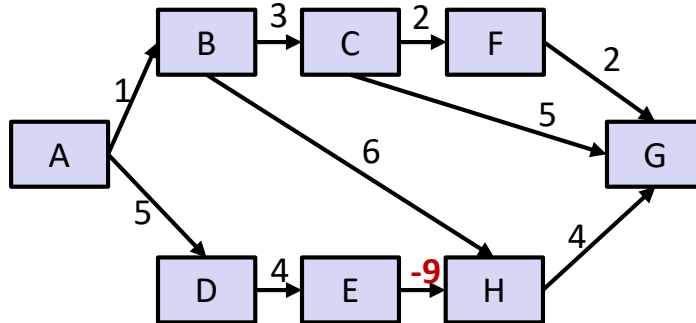
Yes!

# Lecture Outline

- ❖ Topological Sorting
- ❖ General Technique: Reductions
  - **Reducing Shortest Path in a negative DAG to TopoSort**
  - Reducing Seam Carving to A\* Search

# Shortest Path in a Negative DAG

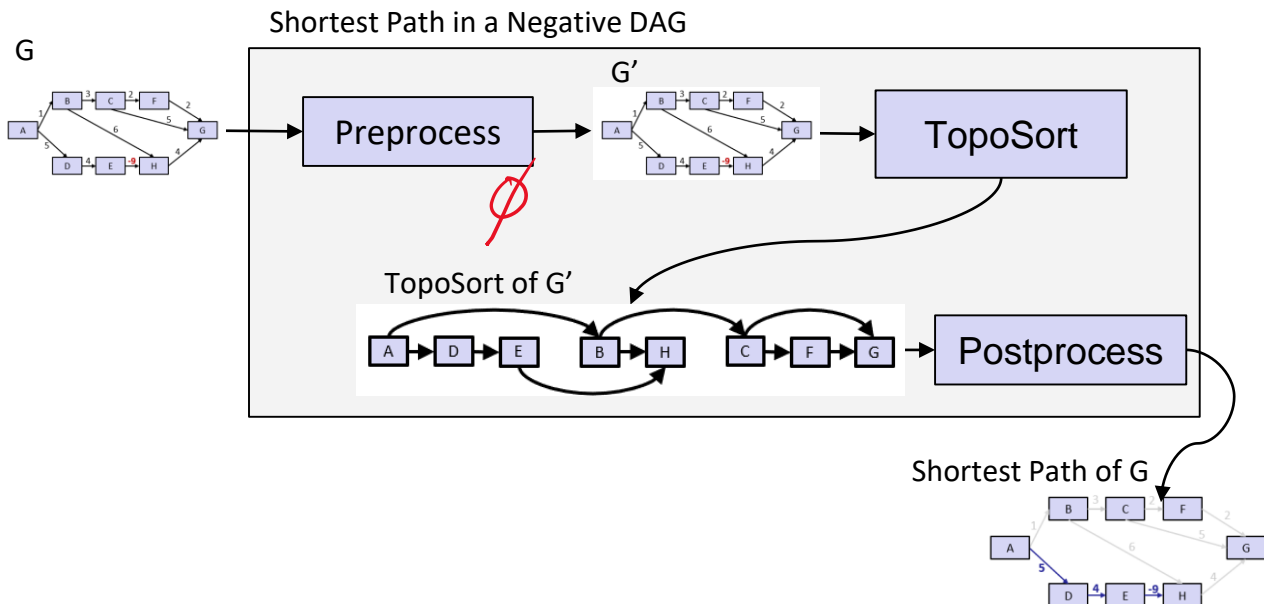
- ❖ Recall this graph from our reading:



- ❖ We can reduce this problem to TopoSort!

# Reductions in 3 Easy Steps!

1. Transform the input so that it can be solved by the standard algorithm
2. Run the standard algorithm as-is on the transformed input
3. Transform the output of the algorithm to solve the original problem



# Lecture Outline

- ❖ Topological Sorting
- ❖ General Technique: Reductions
  - Reducing Shortest Path in a negative DAG to TopoSort
  - **Reducing Seam Carving to A\* Search**

# Content-Aware Image Resizing

*Seam carving*: A distortion-free technique for resizing an image by removing “unimportant seams”



Original Photo



Horizontally-Scaled  
(castle and person  
are distorted)



Seam-Carved  
(castle and person are undistorted;  
“unimportant” sky removed instead)

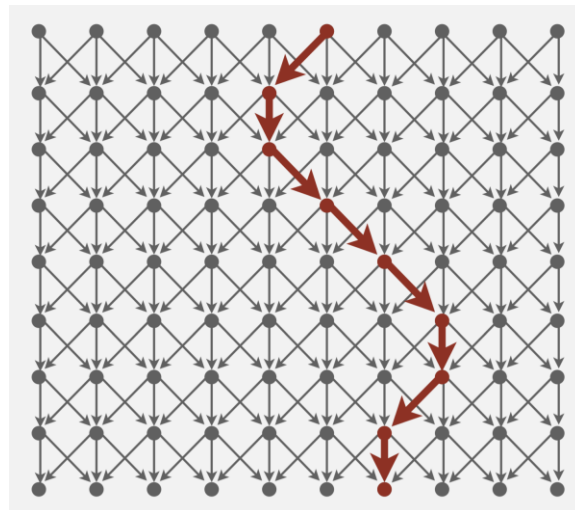
Seam carving for content-aware image resizing (Avidan, Shamir/ACM); Broadway Tower (Newton2, Yummifruitbat/Wikimedia)



Demo: <https://www.youtube.com/watch?v=vIFCV2spKtg>

# Seam Carving Reduces to A\* Search

1. *Transform the input so that it can be solved by the standard algorithm*
  - Formulate the image as a graph
    - **Vertices**: pixel in the image
    - **Edges**: connects a pixel to its 3 downward neighbors
    - **Edge Weights**: the “energy” (visual difference) between adjacent pixels
2. *Run the standard algorithm as-is on the transformed input*
  - Run A\* Search to find the shortest path (sum of weights) from top row to bottom row
3. *Transform the output of the algorithm to solve the original problem*
  - Interpret the path as a removable “seam” of unimportant pixels

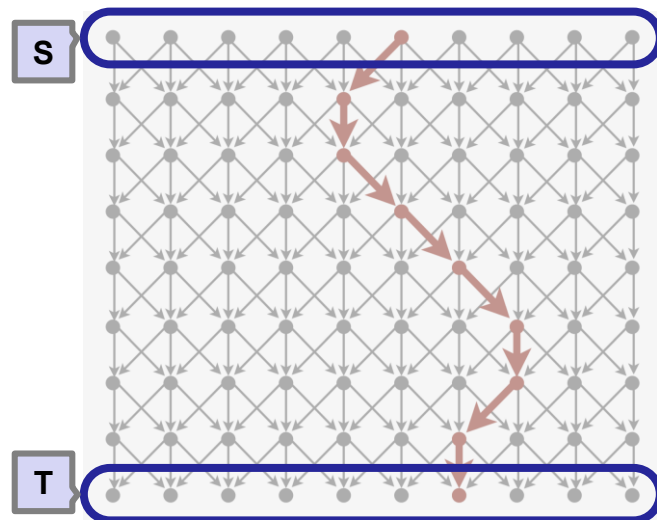


Shortest Paths (Robert Sedgewick, Kevin Wayne/Princeton)



# Formal Problem Statement

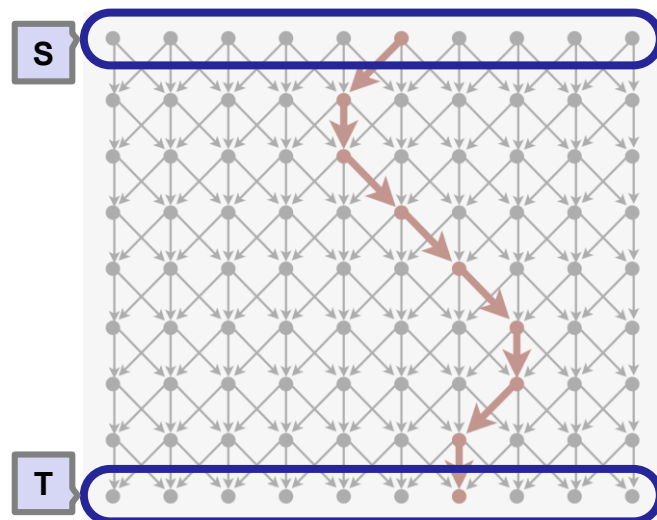
- ❖ Using AStarSolver, find the seam from any top vertex to any bottom vertex
- ❖ Given a digraph with positive edge weights and two distinguished subsets of vertices  $S$  and  $T$ , find a shortest path from any vertex in  $S$  to any vertex in  $T$
- ❖ Your algorithm should run in time proportional to  $E \log V$  in the worst case



Shortest Paths (Robert Sedgewick, Kevin Wayne/Princeton)

# An Incomplete Reduction

- ❖ A\* Search starts with a single vertex  $S$  and ends with a single vertex  $T$ 
  - This problem specifies *sets of vertices* for the start and end
- ❖ **Your turn:** brainstorm how to transform this graph into something A\* Search knows how to operate on



Shortest Paths (Robert Sedgwick, Kevin Wayne/Princeton)

# tl;dr

- ❖ TopoSort is widely applicable; many problems can be *decomposed* into a dependency graph
- ❖ But problems can also be *reduced* to TopoSort!
- ❖ Reductions are a powerful tool in theoretical computer science
  - You won't have to do a reduction on the final, but you should be aware of the general principles