



University of  
Pittsburgh

# Algorithms and Data Structures 2

## CS 1501



Fall 2022

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(Slides are adapted from Dr. Ramirez's and Dr. Farnan's CS1501 slides.)

# Announcements

- Upcoming Deadlines
  - Lab 8: next Monday 11/14 @ 11:59 pm
  - Homework 8: next Monday 11/14 @ 11:59 pm

# Previous lecture

- Minimum Spanning Tree (MST) problem
  - Prim's MST algorithm
    - naive implementation ( $\Theta(v^3)$ )
    - Using Best Edges array

# This Lecture

- Minimum Spanning Tree (MST) problem
  - Prim's MST algorithm
    - running time analysis of the Best Edges implementation
    - an implementation that uses a heap
  - Kruskal's MST algorithm

# Muddiest Points

- How does the summation of  $(i(v - i))$  equal *Theta of (largest term \* number of terms)* instead of  $O$ ?
- $\sum_{i=1}^{v-1} i(v - i)$  is the running time for the naive implementation of Prim's MST algorithm
- Example:  $v = 10$
- $\sum_{i=1}^9 i(10 - i) = 9 + 16 + 21 + 24 + \mathbf{25} + 24 + 21 + 16 + 9$
- $\sum_{i=1}^{v-1} i(v - i) = v \sum_{i=1}^{v-1} i - \sum_{i=1}^{v-1} i^2$
- Although largest term \* number of terms is an upper bound on the sum of an arithmetic series, it is within a constant factor

# Muddiest Points

- **can we see another example of enhanced Prim's?**
- **Sure!**

# Muddiest Points

- **what is the runtime when using best edge?**
- We will see that today.

# Runtime of the Best Edges Implementation

- For every vertex we add to  $T$ , we'll need to check all of its neighbors to update their best edges as needed
  - Let's assume we use an **adjacency matrix**:
    - Takes  $\Theta(v)$  to check the neighbors of a given vertex
    - Time to update parent/best edge arrays?
      - $\Theta(1)$
    - Time to pick next vertex?
      - $\Theta(v)$
    - Total:  $v \cdot 2 \Theta(v) = \Theta(v^2)$



# OK, so what's our runtime?

- For every vertex we add to  $T$ , we'll need to check all of its neighbors to update their best edges as needed
  - Let's assume we use **adjacency lists**
    - Takes  $\Theta(d)$  to check the neighbors of a given vertex
    - Time to update parent/best edge arrays?
      - $\Theta(1)$
    - Time to pick next vertex?
      - $\Theta(v)$
    - Total:  $v * \Theta(v + d) = \Theta(v^2)$

# Prim's MST Algorithm

- seen, parent, and BestEdge are arrays of size  $v$
  - Initialize seen to false, parent to -1, and BestEdge to infinity
  - BestEdge[start] = 0
  - for  $i = 0$  to  $v-1$ 
    - Find a vertex  $w$  with seen[ $w$ ] = false and BestEdge[ $w$ ] is the minimum over all unseen vertices
    - seen[ $w$ ] = 1
    - for each neighbor  $x$  of  $w$ 
      - if(BestEdge[ $x$ ] > edge weight of edge ( $w, x$ )
        - BestEdge[ $x$ ] = edge weight of ( $w, x$ )
        - parent[ $x$ ] =  $w$
- The parent array represents the found MST

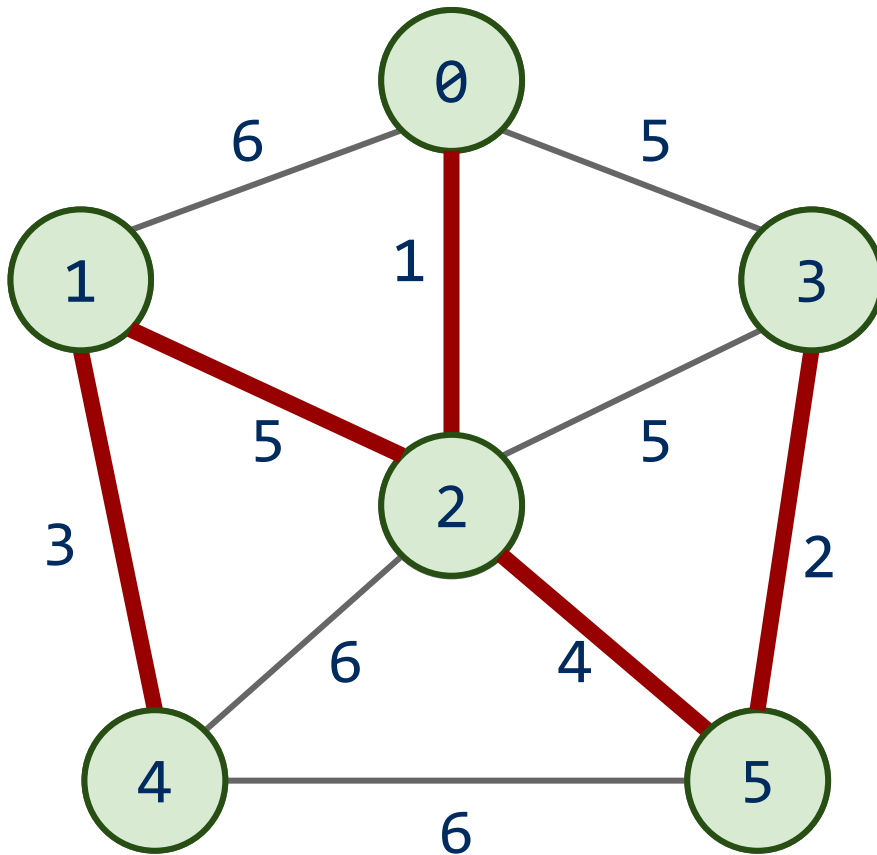
# Prim's MST Algorithm

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# What about a faster way to pick the best edge?

- Sounds like a job for a priority queue!
  - Priority queues can remove the min value stored in them in  $\Theta(\lg n)$ 
    - Also  $\Theta(\lg n)$  to add to the priority queue
- What does our algorithm look like now?
  - Visit a vertex
  - Add edges coming out of it to a PQ
  - While there are unvisited vertices, pop from the PQ for the next vertex to visit and repeat

# Prim's with a priority queue



PQ:

1: (0, 2)

2: (5, 3)

3: (1, 4)

4: (2, 5)

5: (2, 3)

5: (0, 3)

5: (2, 1)

6: (0, 1)

6: (2, 4)

6: (5, 4)

# Runtime using a priority queue

- Have to insert all  $e$  edges into the priority queue
  - In the worst case, we'll also have to remove all  $e$  edges
- So we have:
  - $e * \Theta(\lg e) + e * \Theta(\lg e)$
  - $= \Theta(2 * e \lg e)$
  - $= \Theta(e \lg e)$
- This algorithm is known as *lazy Prim's*

# Do we really need to maintain $e$ items in the PQ?

- I suppose we could not be so lazy
- Just like with the best edge array implementation, we only need the best edge for each vertex
  - PQ will need to be indexable to update the best edge
- This is the idea of *eager Prim's*
  - Runtime is  $\Theta(e \lg v)$

# Eager Prim's Runtime

- $v$  inserts
  - $v \log v$
- $e$  updates
  - $e \log v$
- $v$  removeMin
  - $v \log v$
- Total:  $(e+v) \log v$
- Assuming connected graph
  - $e \geq v - 1$
- $e+v = \Theta(e)$
- Total runtime =  $e \log v$



# Comparison of Prim's implementations

- Parent/Best Edge array Prim's

- Runtime:  $\Theta(v^2)$
- Space:  $\Theta(v)$

- Lazy Prim's

- Runtime:  $\Theta(e \lg e)$
- Space:  $\Theta(e)$
- Requires a PQ

- Eager Prim's

- Runtime:  $\Theta(e \lg v)$
- Space:  $\Theta(v)$
- Requires an indexable PQ

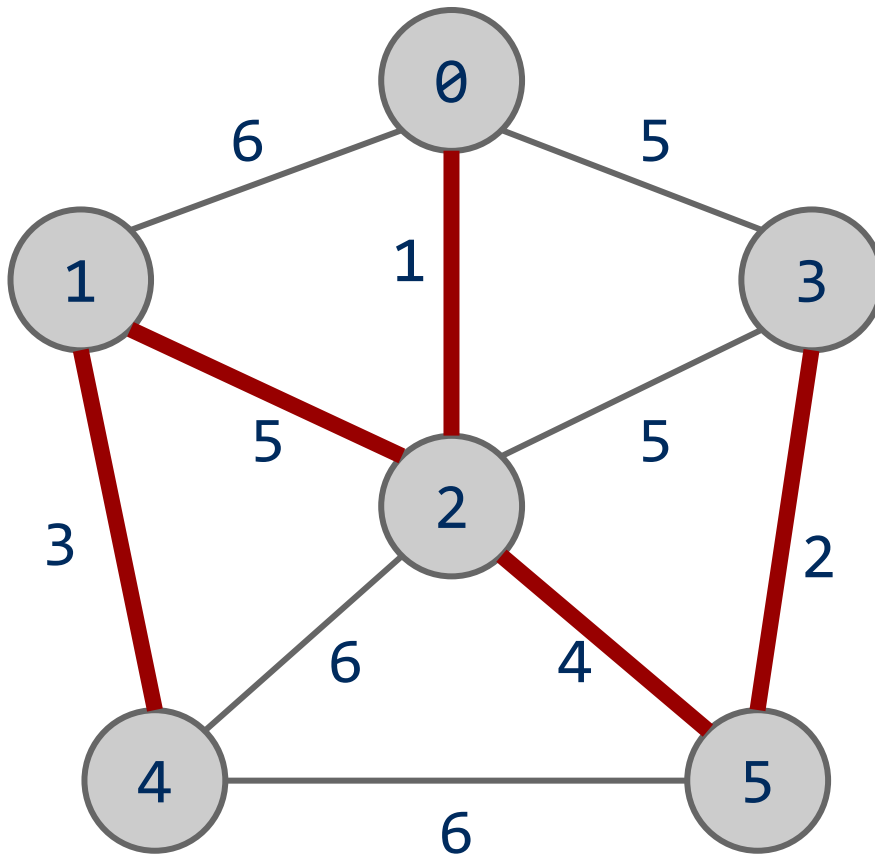
How do these compare?



# Another MST algorithm

- Kruskal's MST:
  - Insert all edges into a PQ
  - Grab the min edge from the PQ that does not create a cycle in the MST
  - Remove it from the PQ and add it to the MST

# Kruskal's example



PQ:

1: (0, 2)

2: (3, 5)

3: (1, 4)

4: (2, 5)

5: (2, 3)

5: (0, 3)

5: (1, 2)

6: (0, 1)

6: (2, 4)

6: (4, 5)

# Kruskal's runtime

- Instead of building up the MST starting from a single vertex, we build it up using edges all over the graph
- How do we efficiently implement cycle detection?
  - BFS/DFS
    - $v + e$
  - Union/Find data structure
    - $\log v$

# Kruskal's Runtime

- $e$  iterations
  - removeMin
    - $\log e$
  - Cycle detection
    - $v + e$  using DFS/BFS
    - $\log v$  using Union/Find
- Total:  $e \log e$
- Assuming connected graph
  - $v - 1 \leq e \leq v^2$
  - $\log v \leq \log e \leq 2 \log v$
  - $\log e = \Theta(\log v)$
- Total runtime:  $e \log v$
- Same as Prim's