

# PARALLEL IMPLEMENTATION OF BELLMAN FORD ALGORITHM

CSE 633 – Parallel Algorithms

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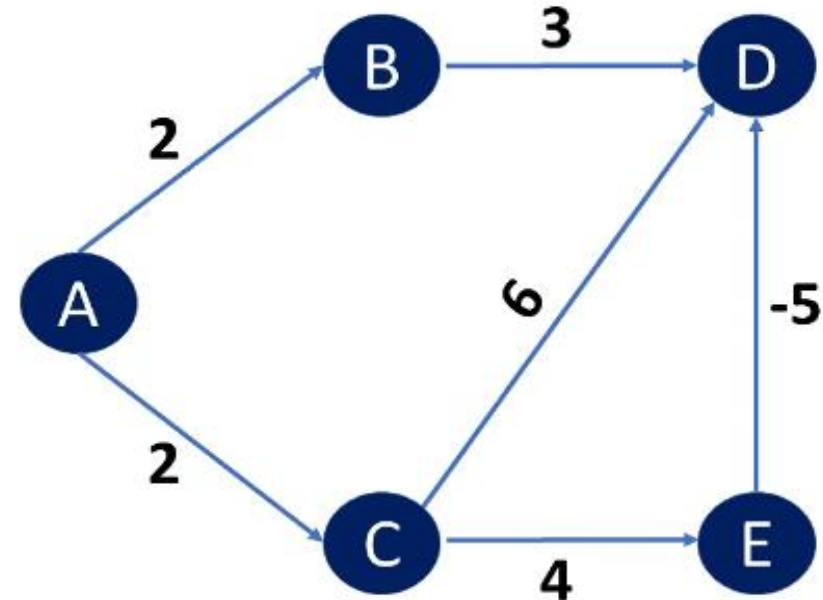
# Outline

- Problem Statement
- Bellman Ford Algorithm
- Example
- Sequential Algorithm
- Approaches to Parallelize it
- Pseudo code for Course grained approach
- To do task status
- Implementation Results
- Future work
- References



# Problem Statement

- Single source shortest path.
- To find shortest path from a given vertex to all other vertices in a weighted directed graph.
- To detect negative cycles in the graph



# Bellman Ford Algorithm

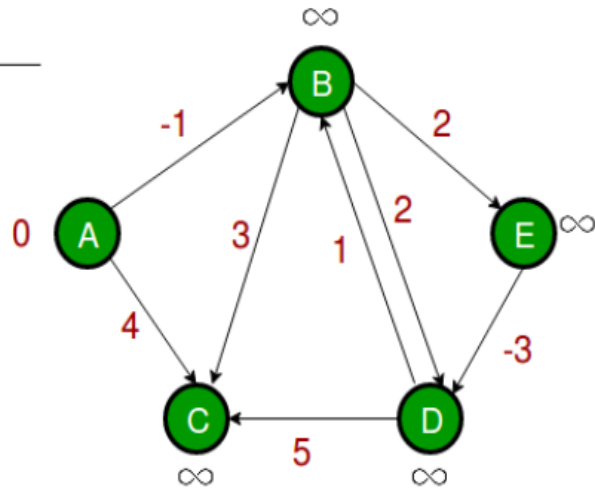
- Computes shortest path from a source to all vertices in a weighted graph.
- Capable of handling graphs with negative edge weights.
- Dijkstra vs Bellman Ford.
- Applications in routing.

How it works?

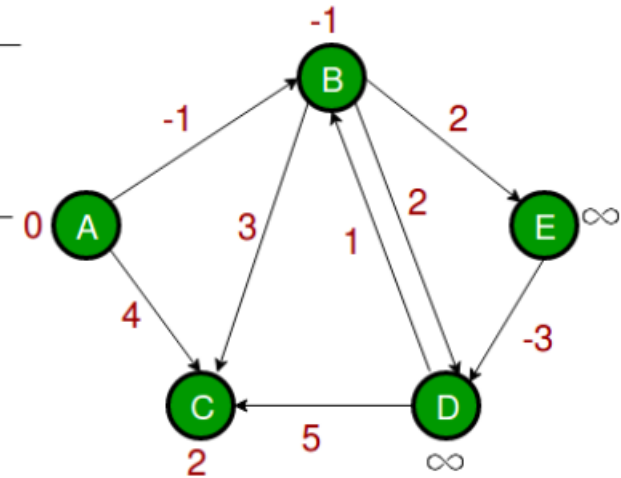
- Relaxes all edges  $|V-1|$  times to approximate distances, where  $|V|$  is the number of vertices in a graph.
- In case of negative cycle, distances are updated even after last iteration.

# Example

A	B	C	D	E
0	$\infty$	$\infty$	$\infty$	$\infty$

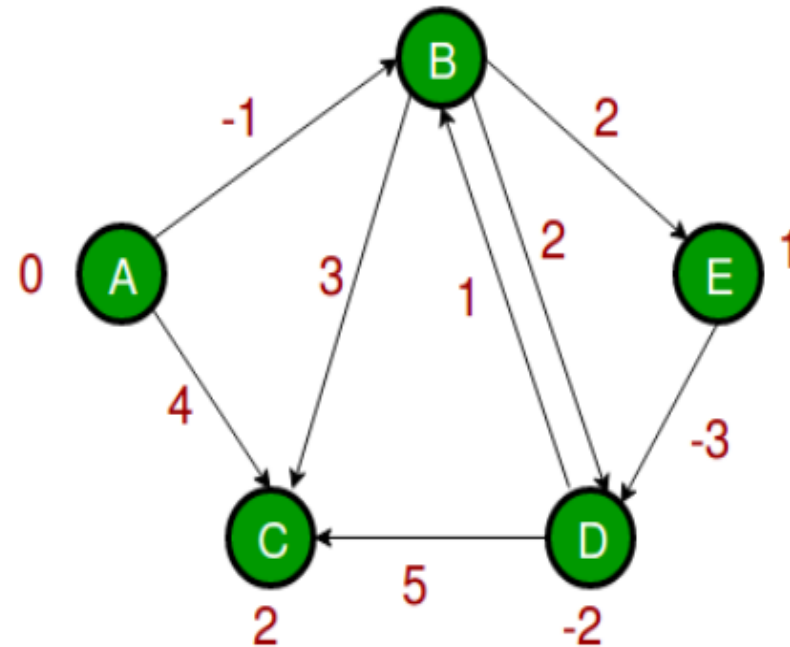


A	B	C	D	E
0	$\infty$	$\infty$	$\infty$	$\infty$
0	-1	$\infty$	$\infty$	$\infty$
0	-1	4	$\infty$	$\infty$
0	-1	2	$\infty$	$\infty$



# Example

	A	B	C	D	E
A	0	$\infty$	$\infty$	$\infty$	$\infty$
B	0	-1	$\infty$	$\infty$	$\infty$
C	0	-1	4	$\infty$	$\infty$
D	0	-1	2	$\infty$	$\infty$
E	0	-1	2	$\infty$	1
A-B	0	-1	2	1	1
A-C	0	-1	2	-2	1



# Sequential Algorithm

```
function bellmanFord(G, S)
  for each vertex V in G
    distance[V] <- infinite
    previous[V] <- NULL
  distance[S] <- 0

  for each vertex V in G
    for each edge (U,V) in G
      tempDistance <- distance[U] + edge_weight(U, V)
      if tempDistance < distance[V]
        distance[V] <- tempDistance
        previous[V] <- U

  for each edge (U,V) in G
    If distance[U] + edge_weight(U, V) < distance[V]
      Error: Negative Cycle Exists

  return distance[], previous[]
```

**TIME COMPLEXITY :  $O(V \cdot E)$**

# Approaches to Parallelize it

## COARSE GRAIN

- Each Processor is assigned a subset of edges in the beginning and assignment never changes.
- Iteratively performs computation and communication phases.
- Each processor relaxes its subset of edges and updated local distances.
- At the end of computation, distance vector equal to the minimum of all labels is updated in all processors.

## FINE GRAIN

- Each Processor maintains a list of vertices ordered by the labels in the distance vector
- During communication phase, each processor selects minimum element on its local distance vector and a vertex which has least distance is selected by all processors.
- Edges from that vertex are relaxed by all processors in its subgraph. Computation phase is same in both approaches.



# Pseudocode for coarse grained Algorithm

```

fg = fl           ∷∷ fl is initially FALSE
fl = FALSE
for each vertex u
    do if  $d(u) > d_{min}(u)$ 
        then  $d(u) \leftarrow d_{min}(u)$ 
             $\pi(v) \leftarrow \infty$ 
            fg = TRUE
            if outdegree(u) > 0
                then mark u
for each vertex u in order
    do if u is marked
        then unmark u
            for each edge (u, v)
                do if  $d(v) < d(u) + w(u, v)$ 
                    then  $d(v) \leftarrow d(u) + w(u, v)$ 
                         $\pi(v) \leftarrow u$ 
                        fl = TRUE
                        if outdegree(v) > 0
                            then mark v

if fg = FALSE
    then terminate
    
```



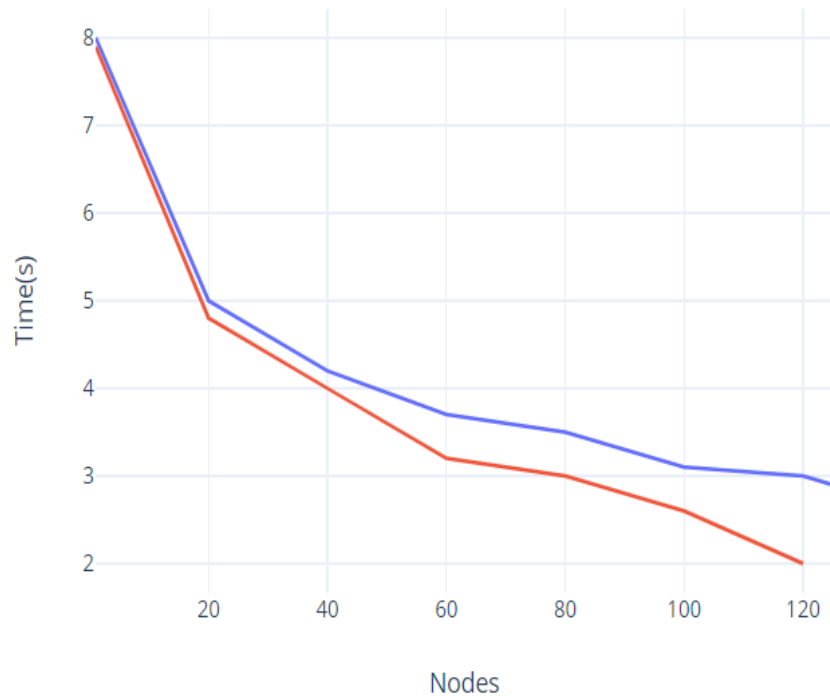
## To do

- Run the algorithm on larger input ✓
- Implement couple of heuristics from research paper ✓
- Fine grained approach ✓
- Comparison of Course grained and Fine grained approach
- Negative cycle detection ✓

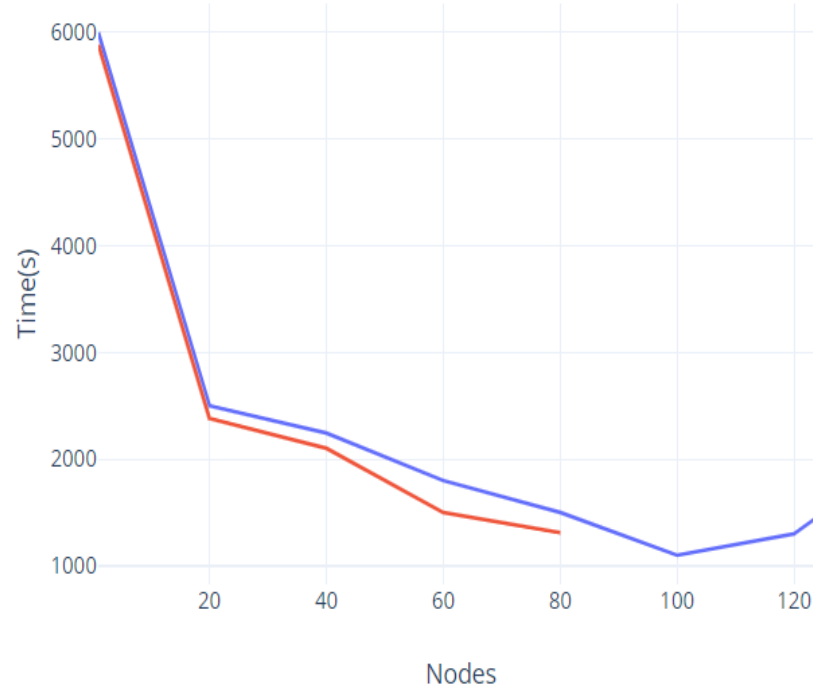


# Implementation Results

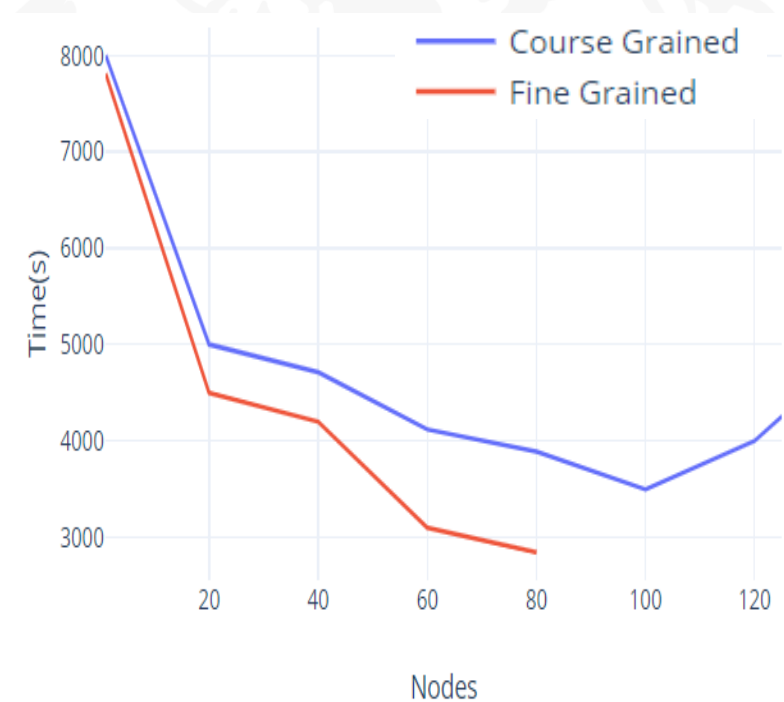
### GRAPH : 1000 VERTICES



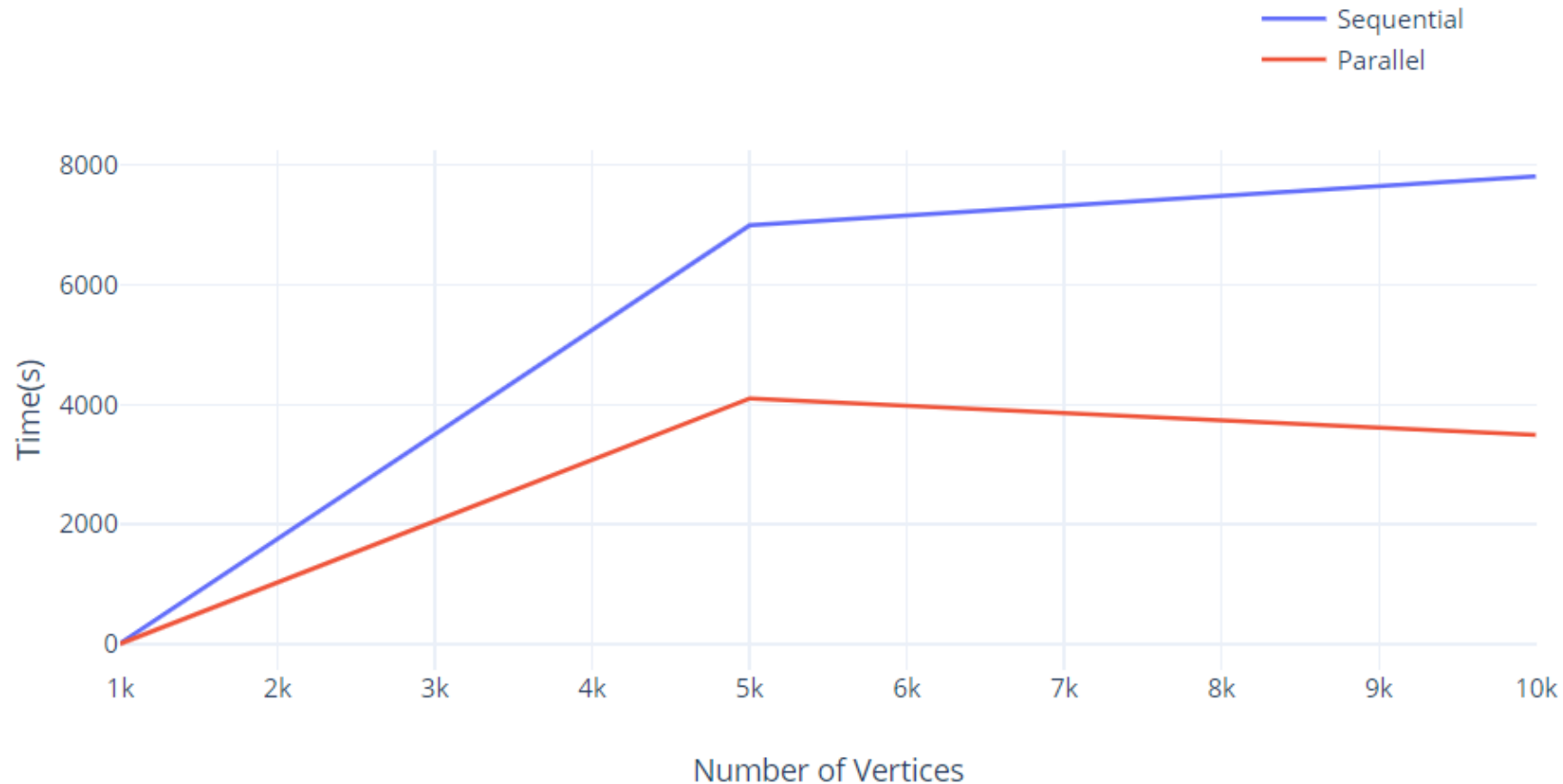
### GRAPH : 5000 VERTICES



### GRAPH : 10000 VERTICES

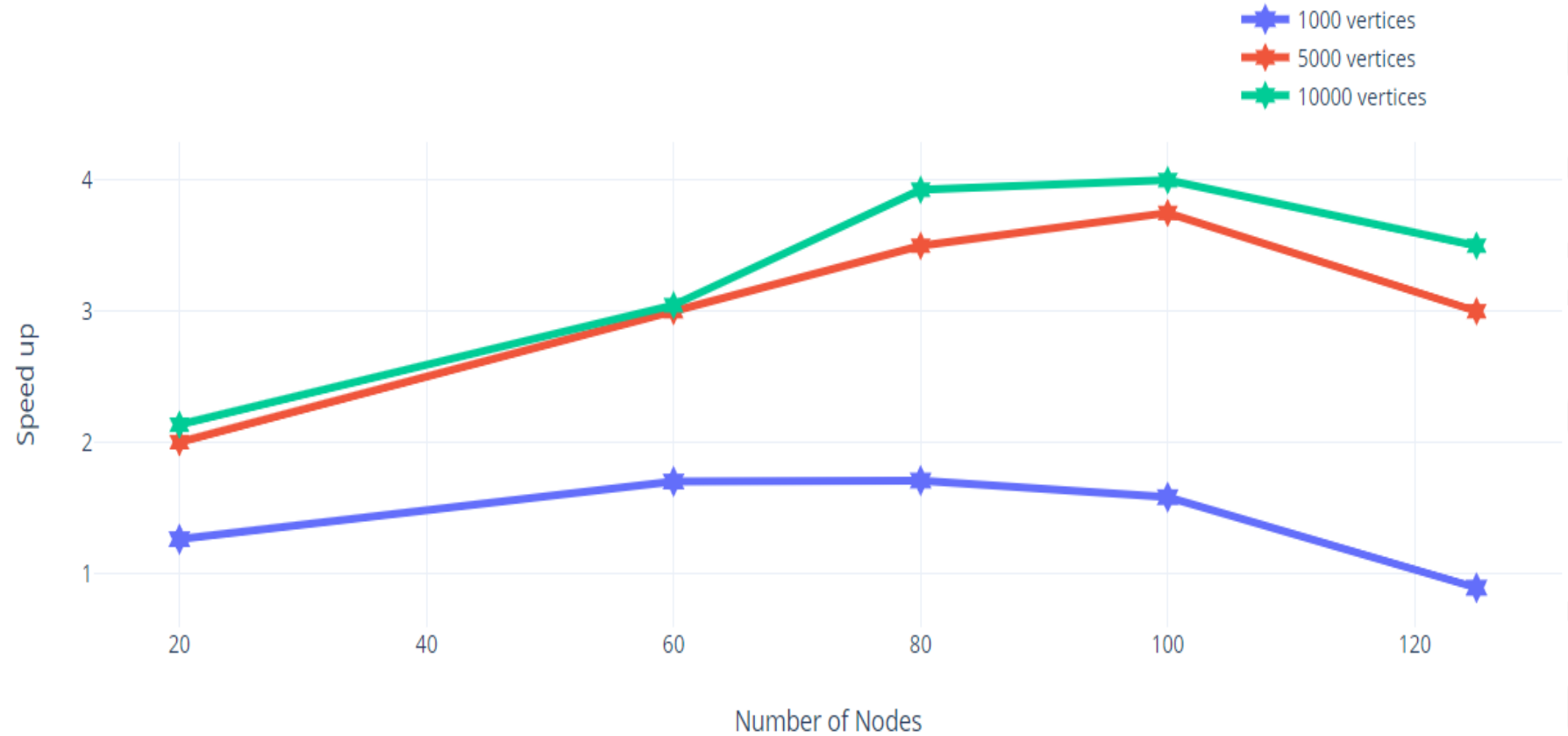


# Sequential vs Parallel



# Speed up

$$\text{Speed Up} = T_{\text{sequential}} / T_{\text{parallel}}$$



# Future Work

- Implementation using CUDA
- Fine grained approach on large number of nodes
- Increase input data up to  $2^{32}$  vertices



# References

- Implementing Parallel Shortest-Paths Algorithms (1994) by Marios Papaefthymiou and Joseph Rodrigue.
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Thank You

