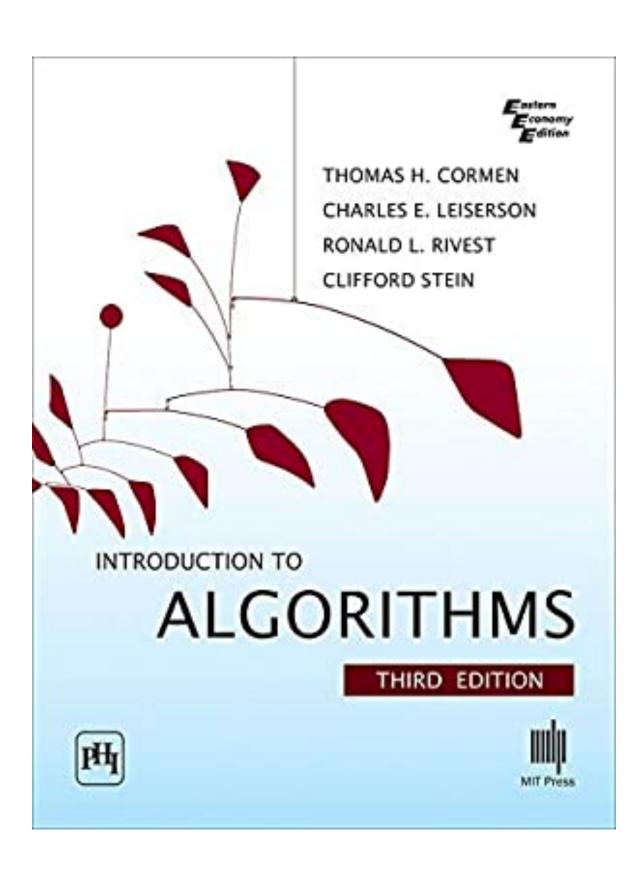
# Lecture 5: Bellman-Ford

# Overview

- Review: Notation
- Generic S.P. Algorithm
- Bellman-Ford Algorithm: Analysis & Correctness

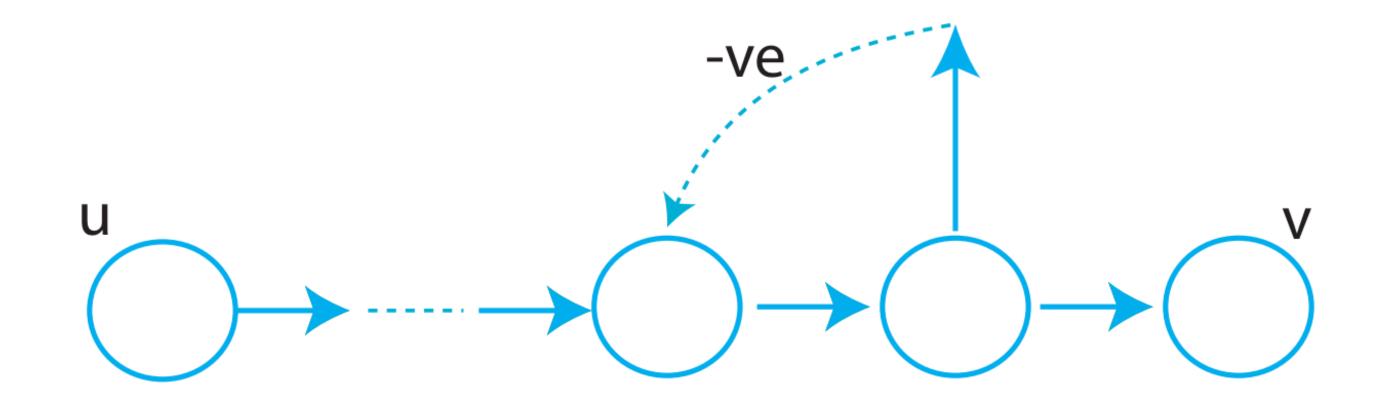
# Readings



CLRS, Section 24

#### Review: Notation

path 
$$p = \langle v_0, v_1, \dots v_k \rangle$$
  
 $(v_i, v_{i+1}) \in E \text{ for } 0 \le i < k$   
 $w(p) = \sum_{i=0}^{k-1} w(v_i, v_{i+1})$ 



#### General structure of S.P. Algorithms

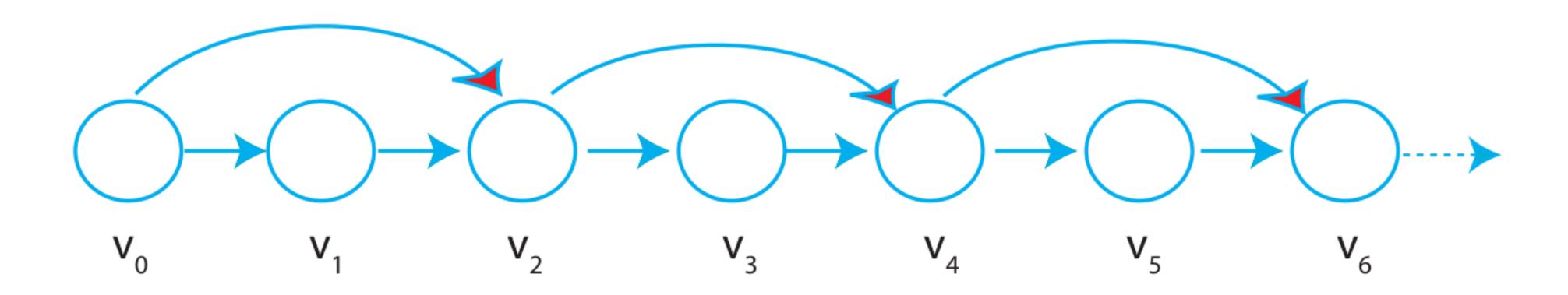
### Approach Problems

*First:* Time complexity could be exponential. How can we reduce it?

**Second:** What if we have negative cycles? How to terminate in this case? How can we approach graphs with negative cycles?

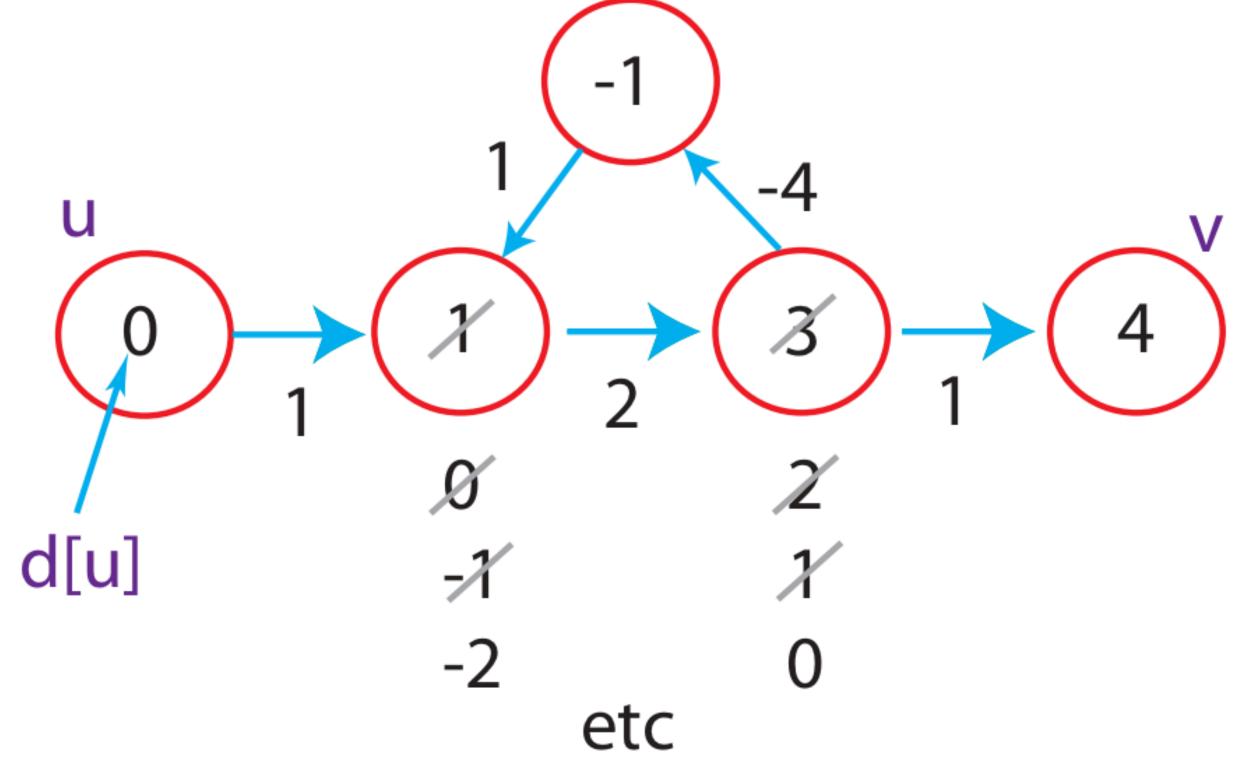
### Approach Problems

*First:* Time complexity could be exponential. How can we reduce it?



### Approach Problems

**Second:** What if we have negative cycles? How to terminate in this case? How can we approach graphs with negative cycles?



### Bellman-Ford(G,W,s)

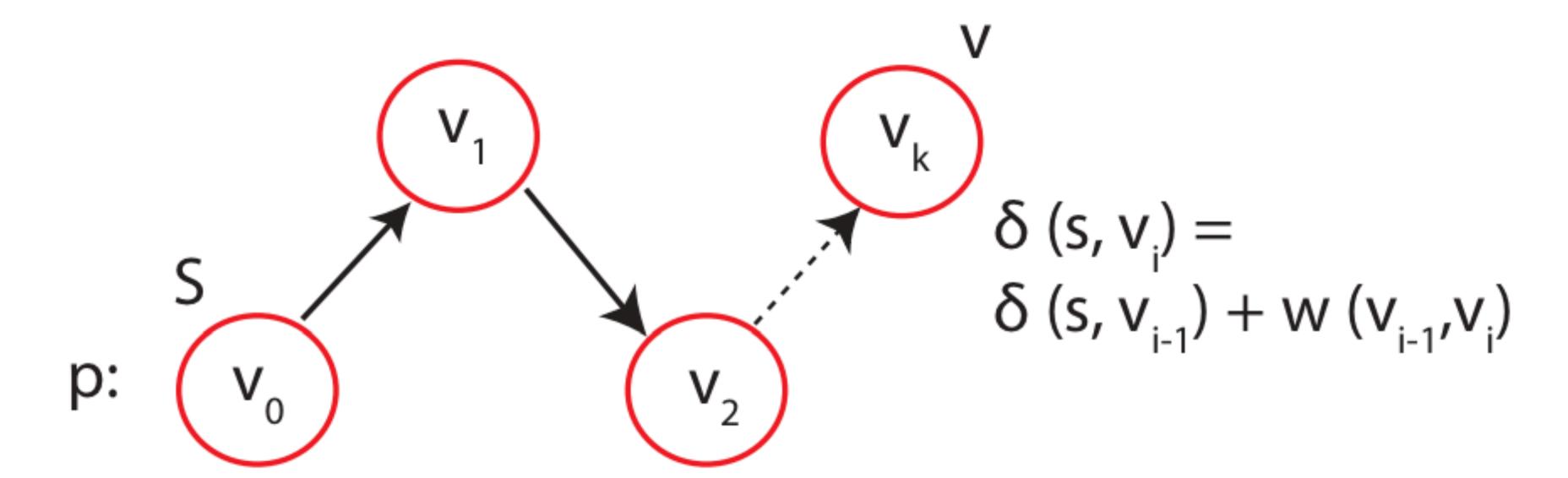
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Initialize ()  \begin{aligned} &\text{for } i=1 \text{ to } |V|-1 \\ &\text{for each edge } (u,v) \in E \\ &\text{Relax}(u,v) \end{aligned} \end{aligned}  for each edge (u,v) \in E  \\ &\text{do if } d[v] > d[u] + w(u,v) \\ &\text{then report a negative-weight cycle exists}
```

### Correctness

**Theorem**: If G = (V, E) contains no negative weight cycles, then after Bellman-Ford executes  $d[v] = \delta(s, v)$  for all  $v \in V$ .

**Proof:** Let  $v \in V$  be any vertex. Consider path  $p = v_0, v_1, ..., v_k$  from  $v_0 = s$  to  $v_k = v$  that is a shortest path with minimum number of edges.

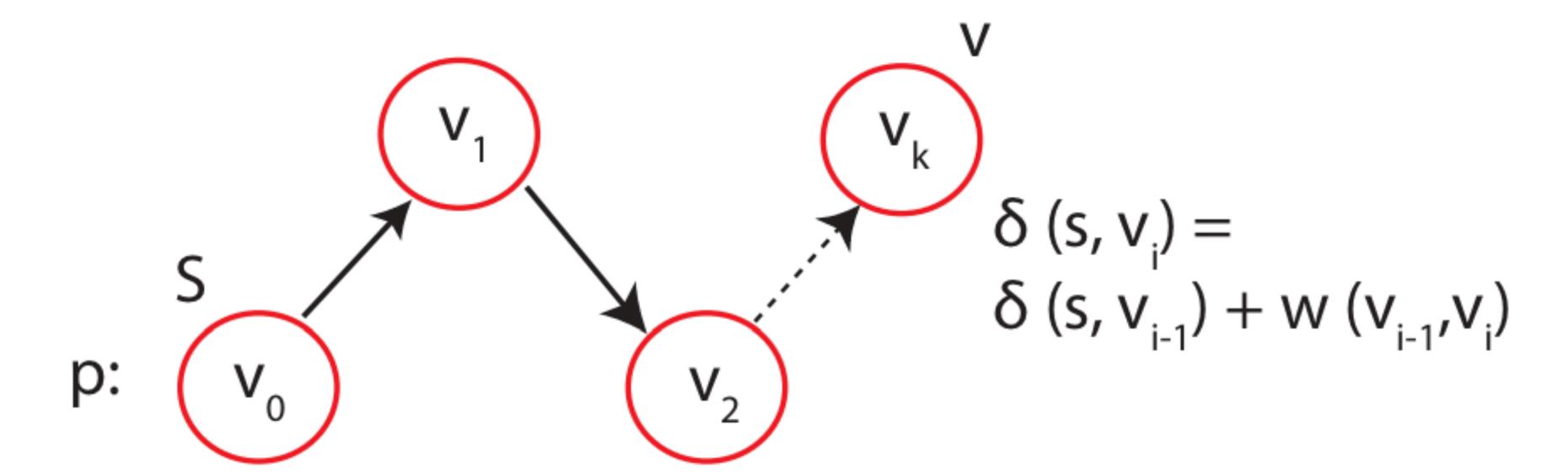
No negative weight cycles  $\Rightarrow$  p is simple  $\Rightarrow$  k  $\leq$  |V|-1



### Correctness

**Theorem**: If G = (V, E) contains no negative weight cycles, then after Bellman-Ford executes  $d[v] = \delta(s, v)$  for all  $v \in V$ .

**Proof:** After 1 pass through E, we have  $d[v1] = \delta(s, v1)$ , because we will relax the edge (v0, v1) in the pass, and we can't find a shorter path than this shortest path. After i passes through E, we have  $d[vi] = \delta(s, vi)$ . etc.

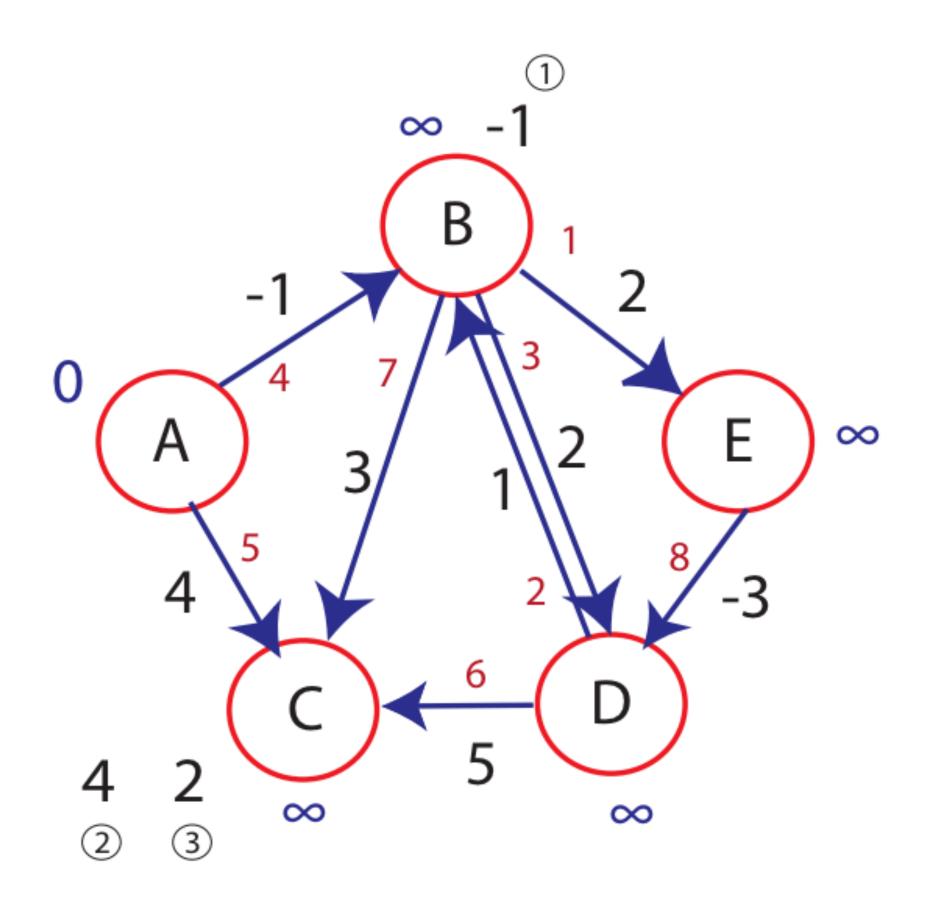


### Corollary

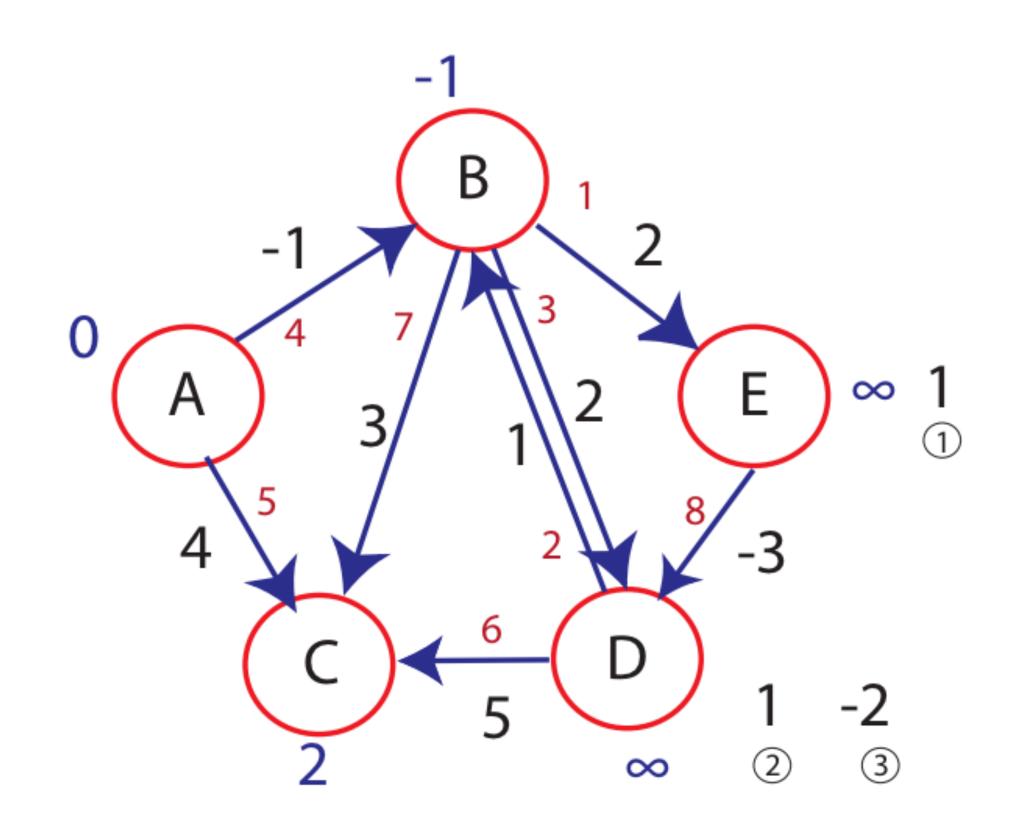
**Theorem**: If a value d[v] fails to converge after |V|-1 passes, there exists a negative-weight cycle reachable from s

**Proof:** After |V|-1 passes, if we find an edge that can be relaxed, it means that the current shortest path from s to some vertex is not simple and vertices are repeated. Since this cyclic path has less weight than any simple path the cycle has to be a negative-weight cycle.

# Example



End of pass 1



End of pass 2 (and 3 and 4)