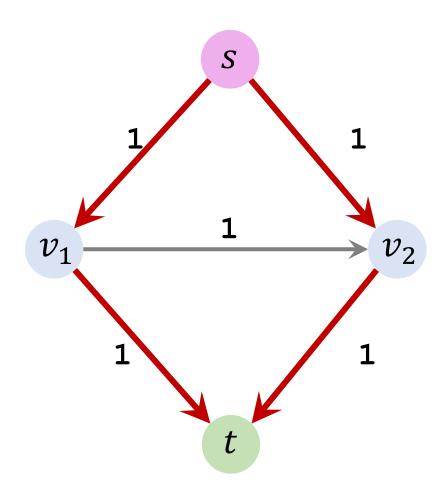
# Ford-Fulkerson Algorithm

**Shusen Wang** 

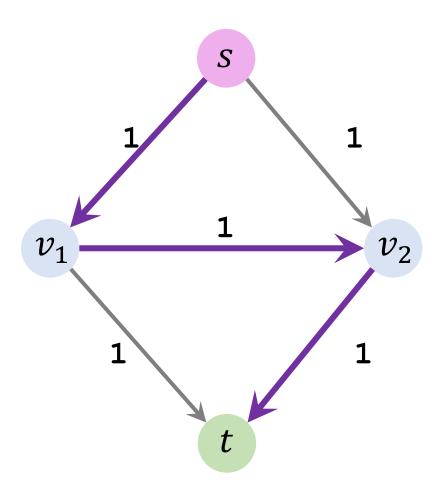
### Problem with the naïve algorithm



- A selected path can be bad.
  - The maximum flow is 2.

**Maximum Flow** 

#### Problem with the naïve algorithm



- A selected path can be bad.
  - The maximum flow is 2.
  - A blocking flow can be 1.

• Once a bad path is selected, the naïve algorithm cannot make corrections.

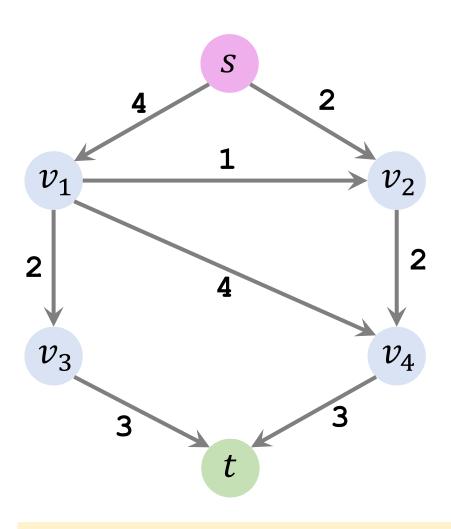
Not Maximum Flow

#### Ford-Fulkerson Algorithm

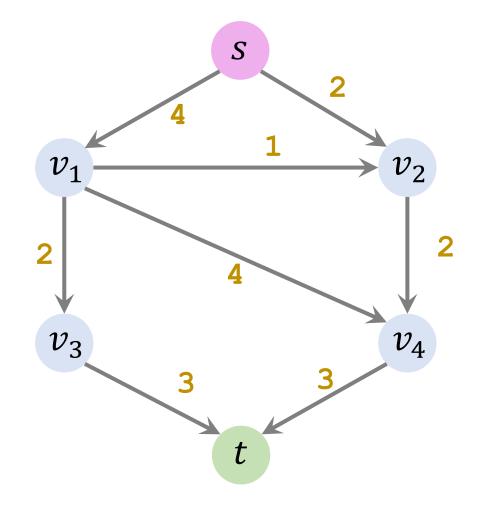
#### Reference

• L. R. Ford and D. R. Fulkerson. Maximal flow through a network. Canadian Journal of Mathematics, 8: 399–404, 1956.

#### **Initialization**

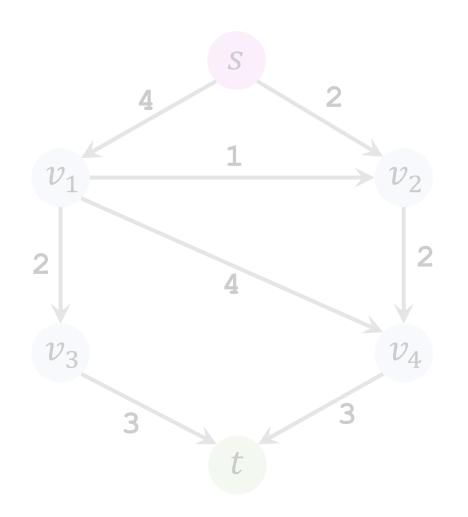


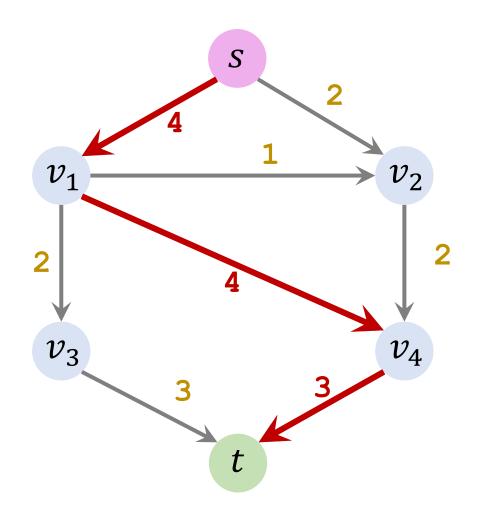
Original Graph



Residual Graph

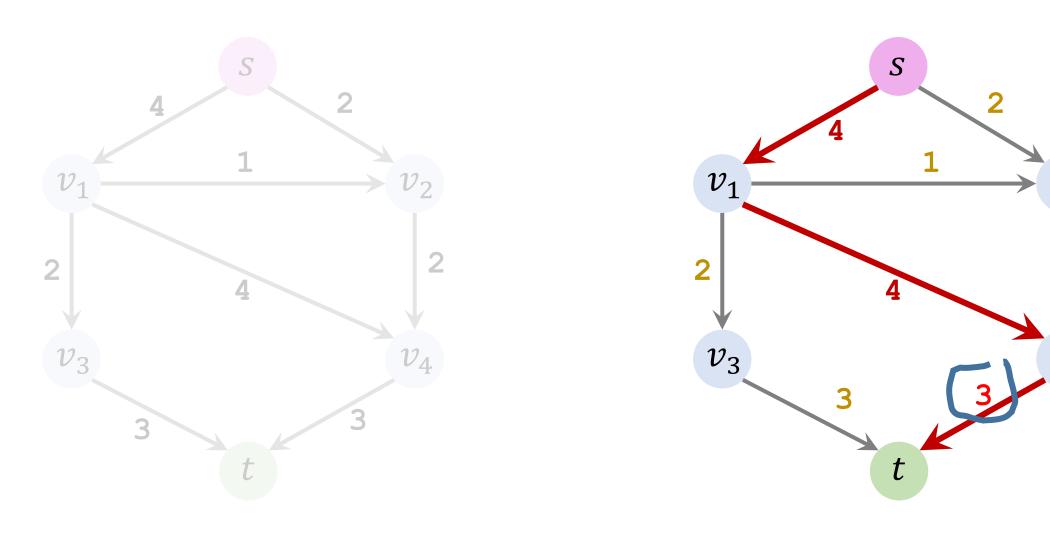
# Iteration 1: Find an augmenting path





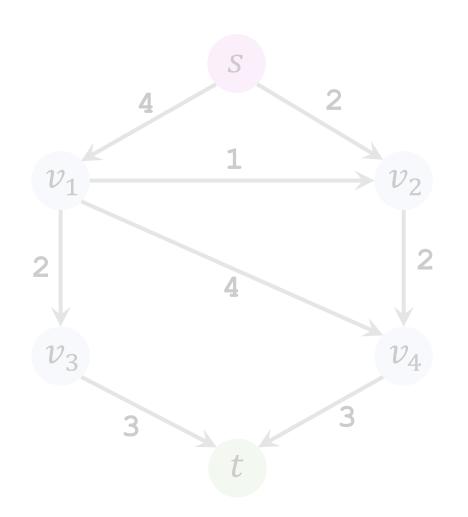
Found path  $s \rightarrow v_1 \rightarrow v_4 \rightarrow t$ .

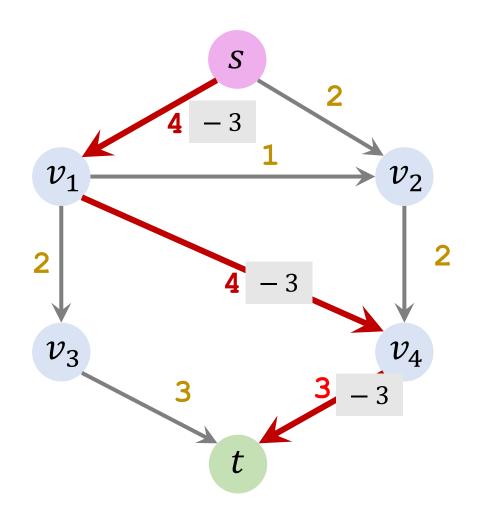
# Iteration 1: Find an augmenting path



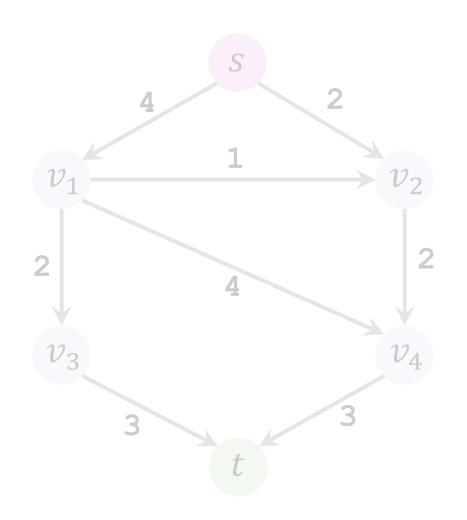
Found path  $s \to v_1 \to v_4 \to t$ . (Bottleneck capacity = 3.)

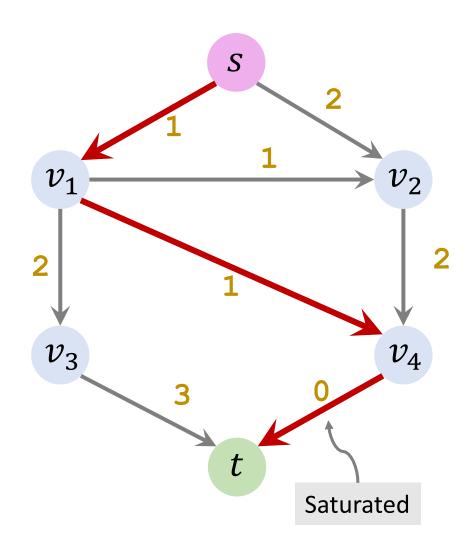
# Iteration 1: Update residuals



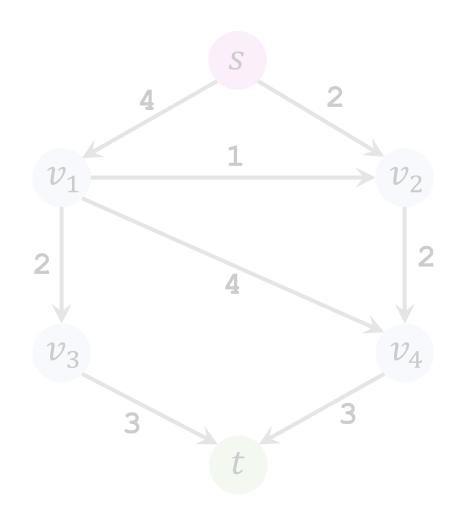


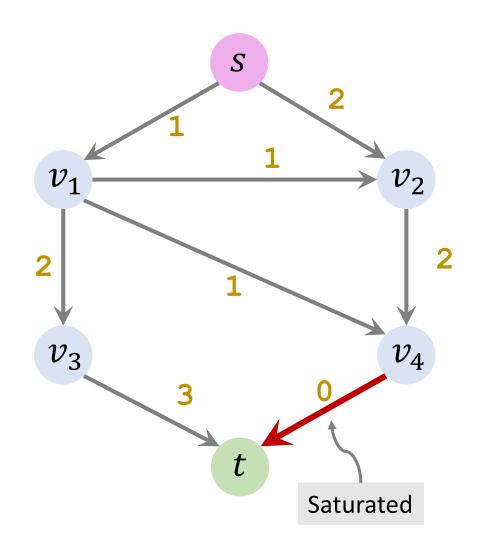
### Iteration 1: Update residuals



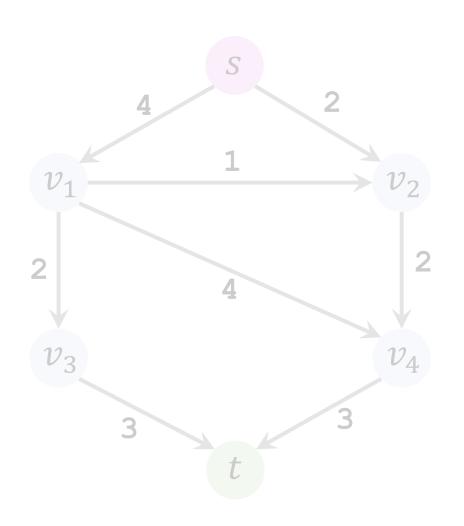


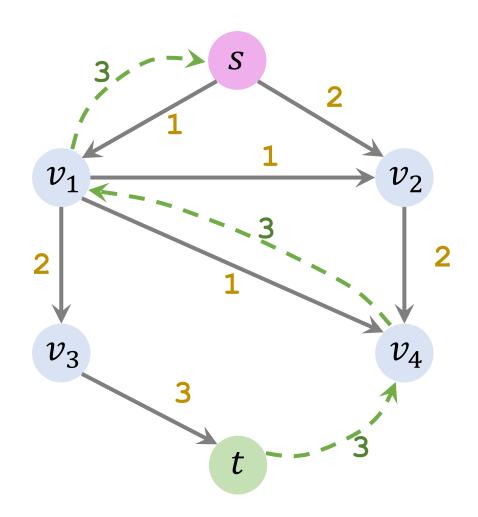
# Iteration 1: Remove saturated edges





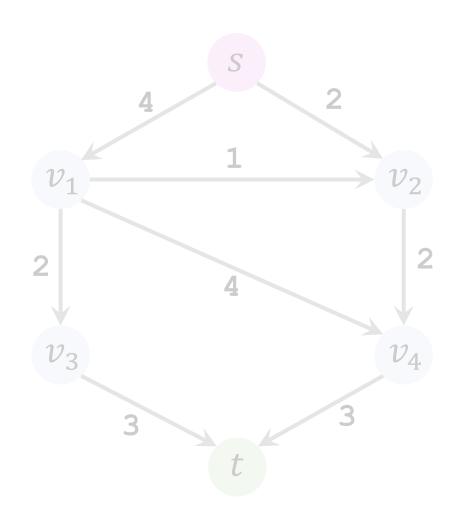
#### Iteration 1: Add a backward path

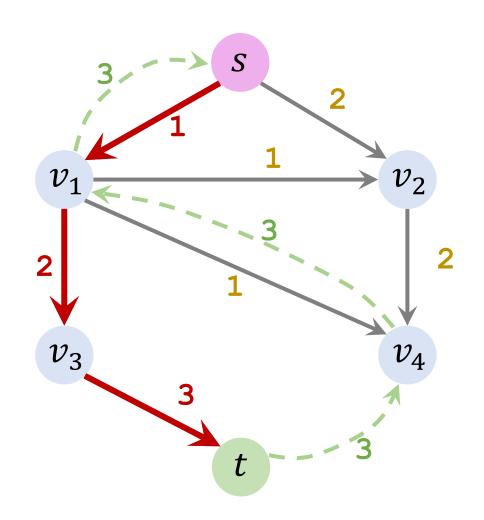




Add path  $t \to v_4 \to v_1 \to s$  with capacity = 3. (Allow "undoing".)

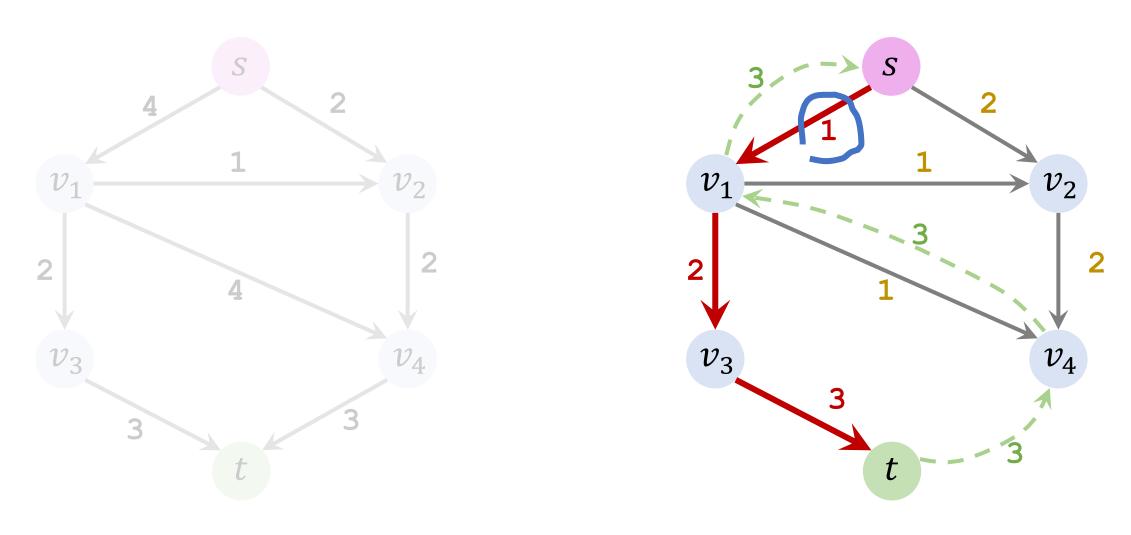
# Iteration 2: Find an augmenting path





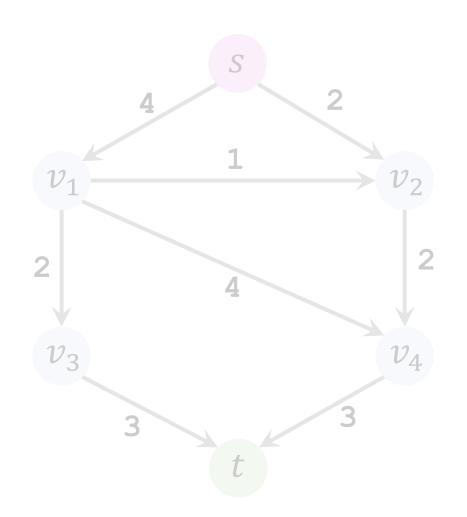
Found path  $s \rightarrow v_1 \rightarrow v_3 \rightarrow t$ .

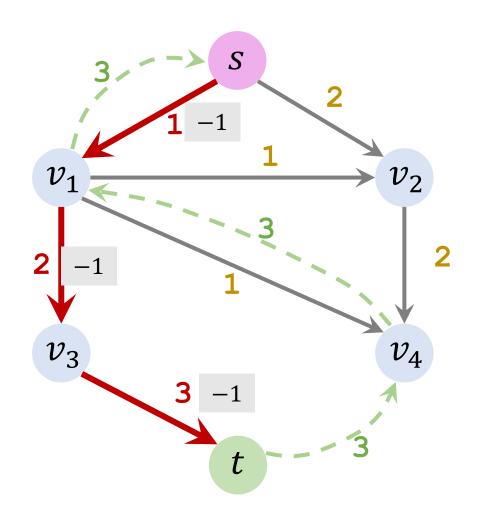
# Iteration 2: Find an augmenting path



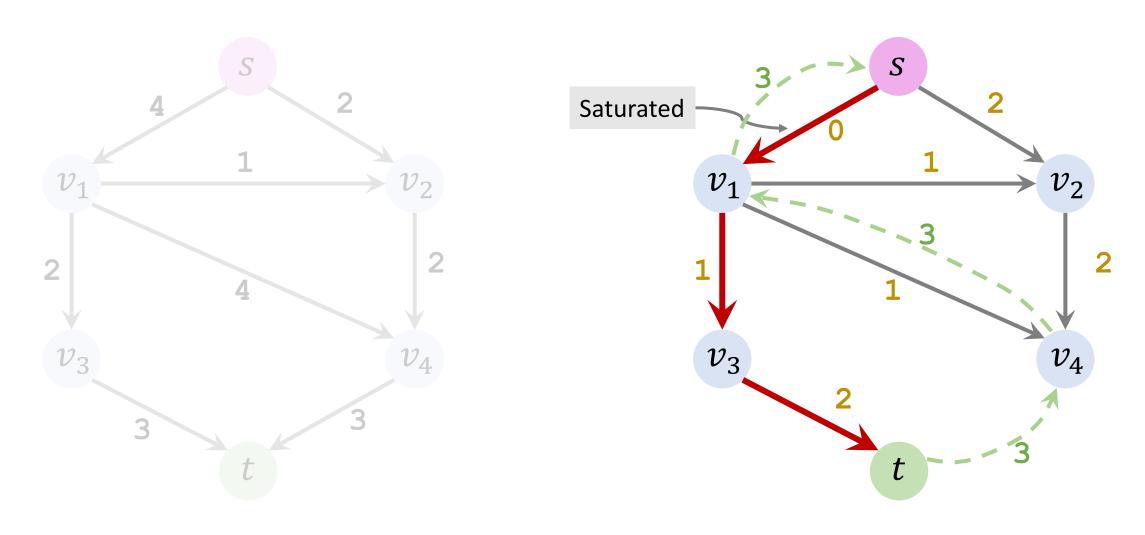
Found path  $s \to v_1 \to v_3 \to t$ . (Bottleneck capacity = 1.)

# Iteration 2: Update residuals



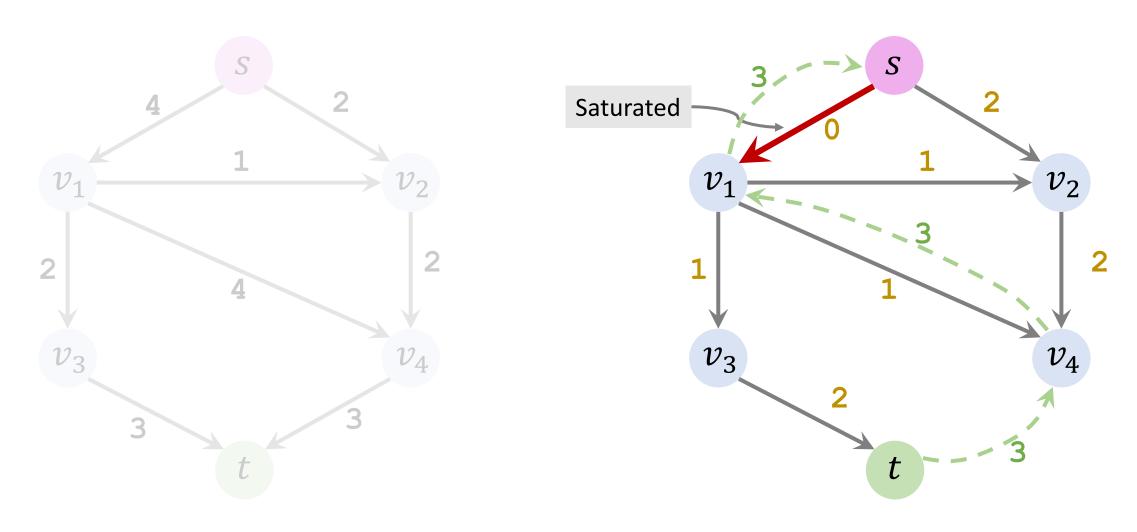


### Iteration 2: Update residuals

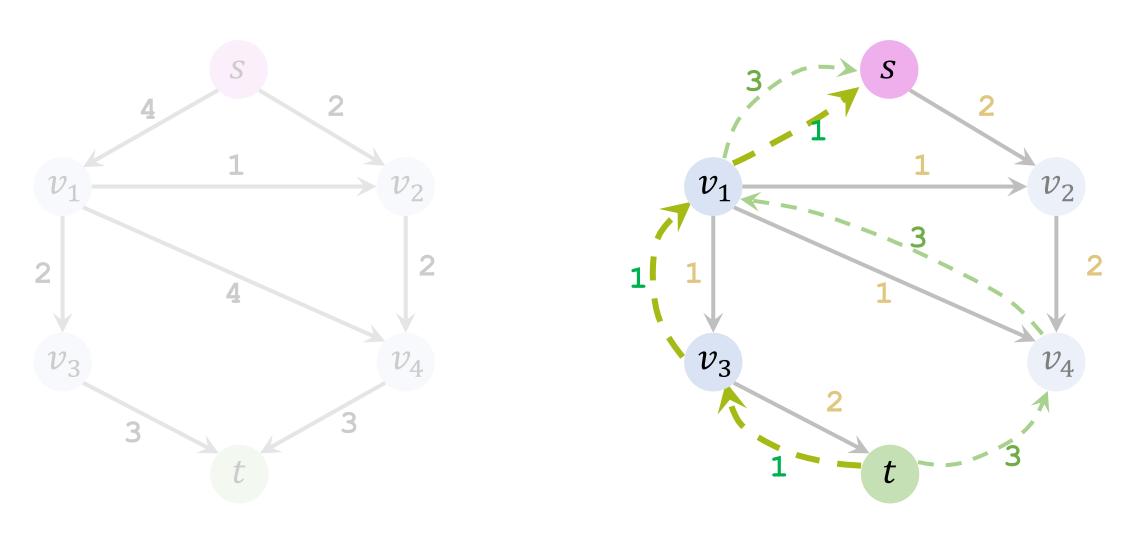


Found path  $s \rightarrow v_1 \rightarrow v_3 \rightarrow t$ . (Bottleneck capacity = 1.)

### Iteration 2: Remove saturated edges

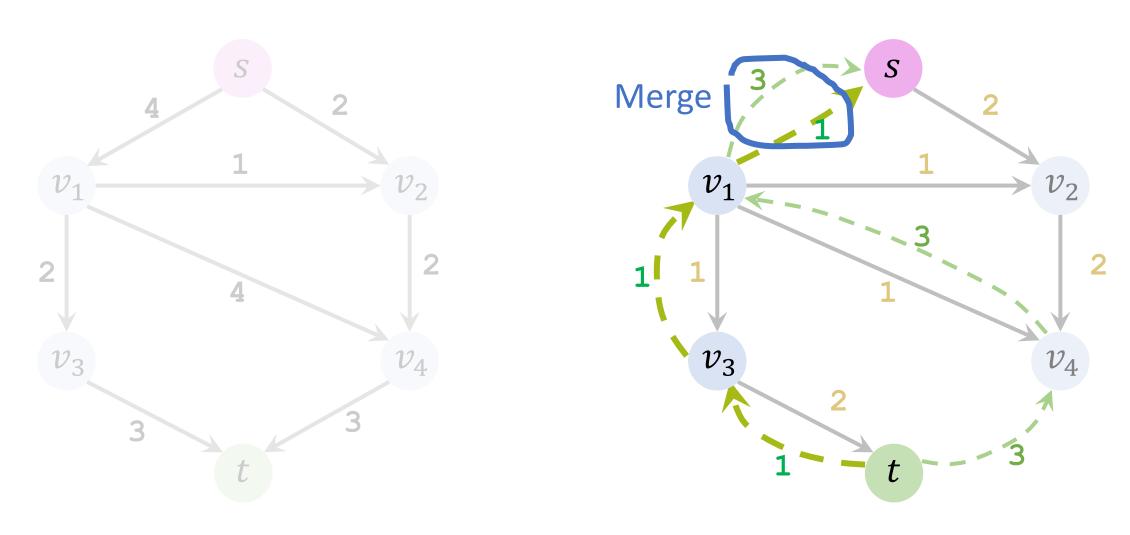


### Iteration 2: Add a backward path



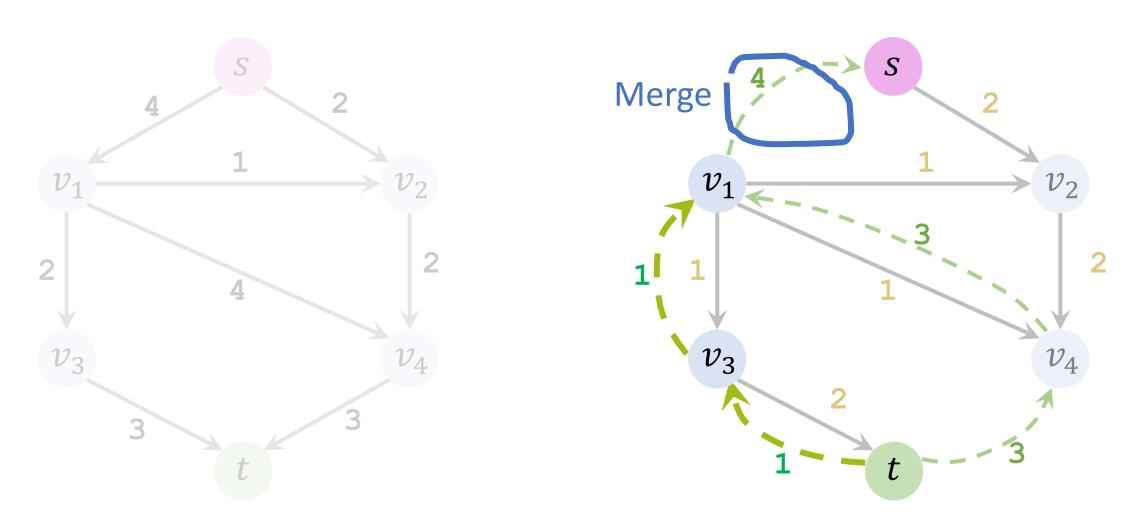
Add path  $t \rightarrow v_3 \rightarrow v_1 \rightarrow s$  with capacity = 1.

### Iteration 2: Add a backward path



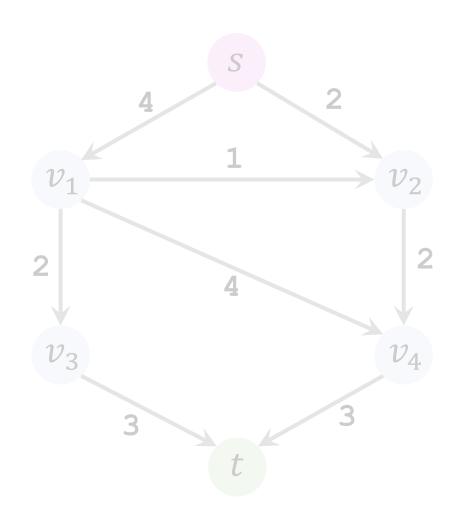
Add path  $t \rightarrow v_3 \rightarrow v_1 \rightarrow s$  with capacity = 1.

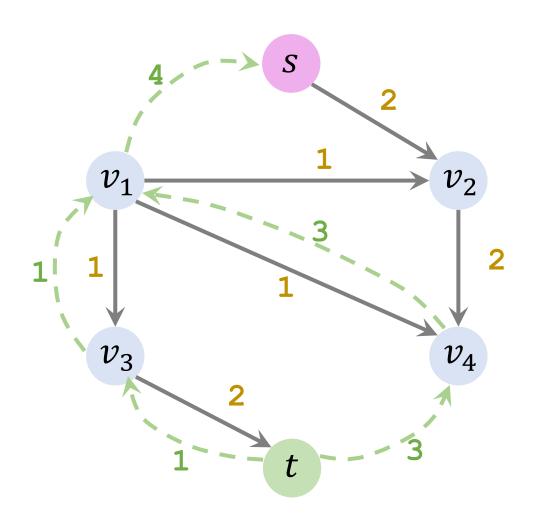
### Iteration 2: Add a backward path



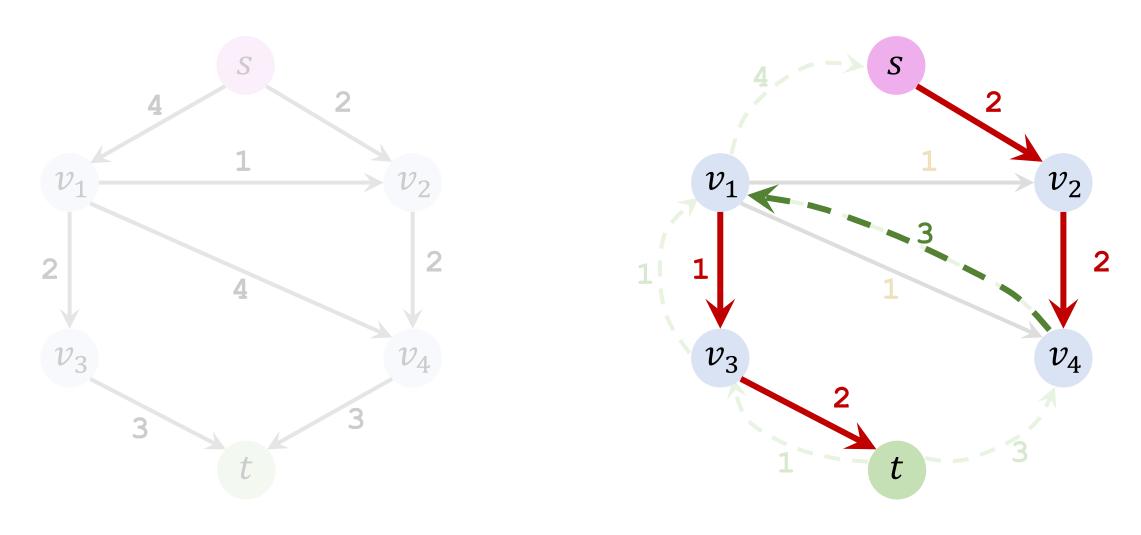
Add path  $t \rightarrow v_3 \rightarrow v_1 \rightarrow s$  with capacity = 1.

# Iteration 3: Find an augmenting path



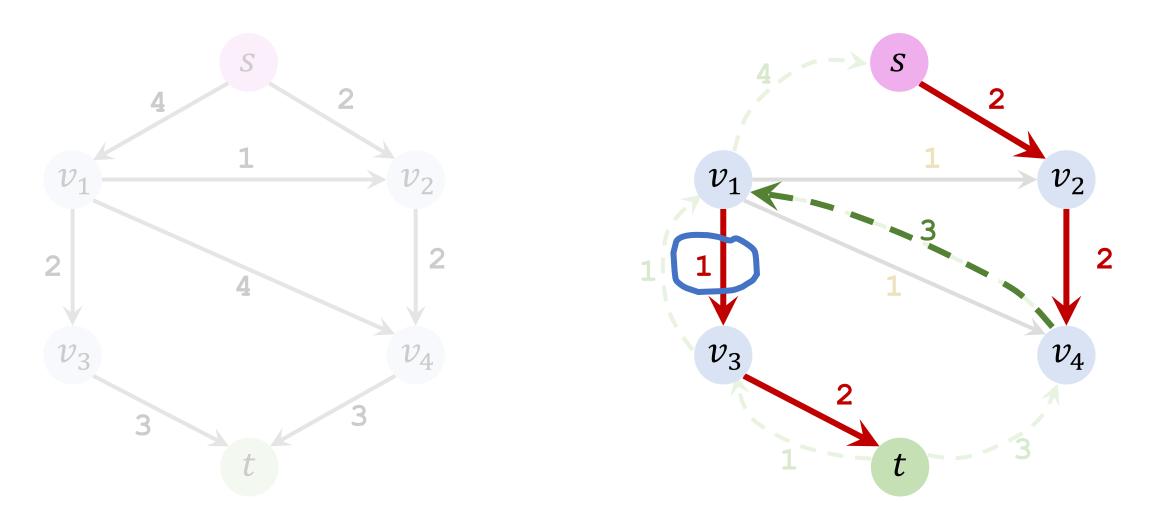


# Iteration 3: Find an augmenting path



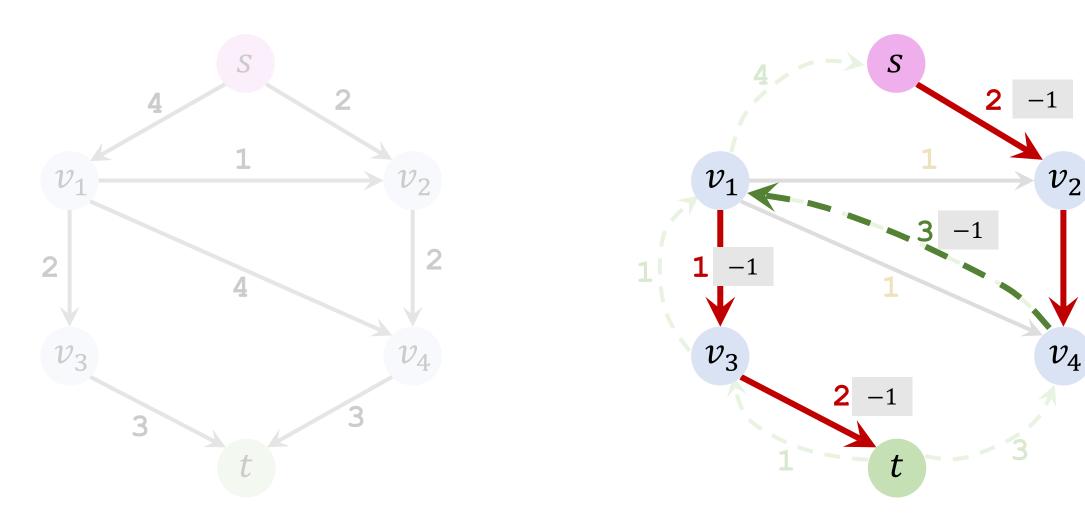
Found path  $s \rightarrow v_2 \rightarrow v_4 \rightarrow v_1 \rightarrow v_3 \rightarrow t$ .

# Iteration 3: Find an augmenting path

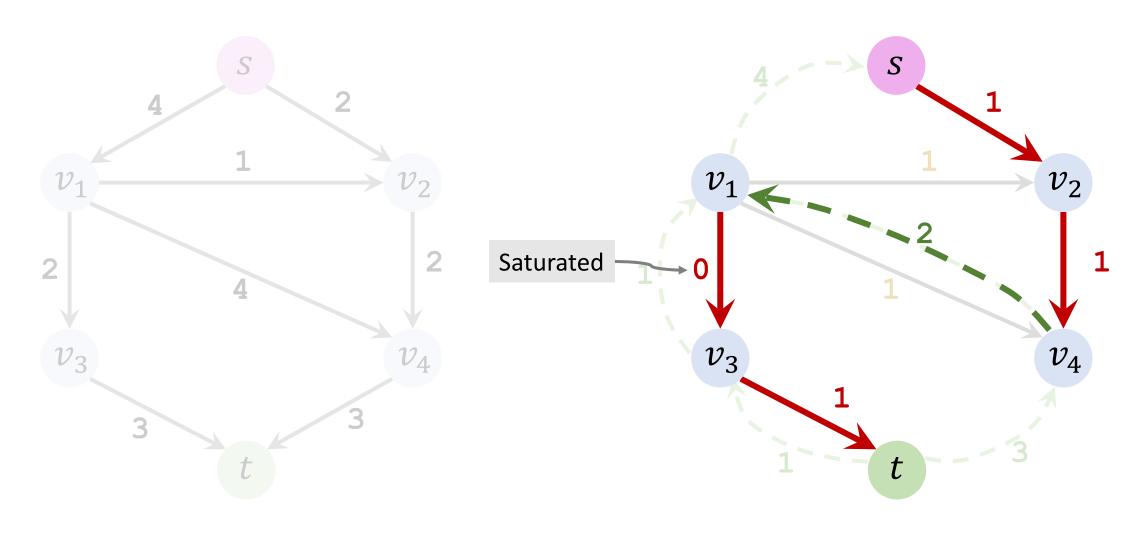


Found path  $s \to v_2 \to v_4 \to v_1 \to v_3 \to t$ . (Bottleneck capacity = 1.)

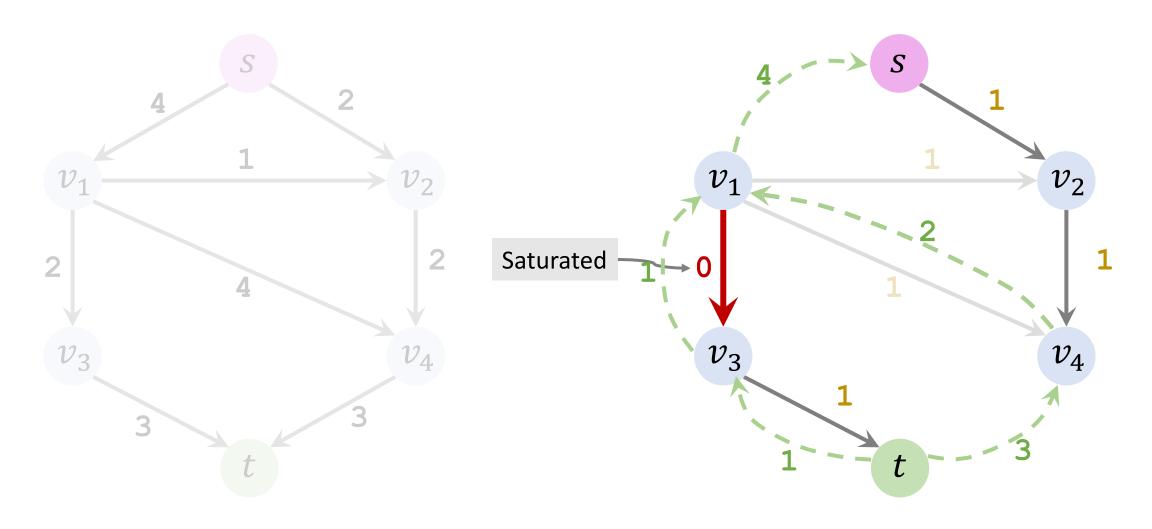
# Iteration 3: Update residuals



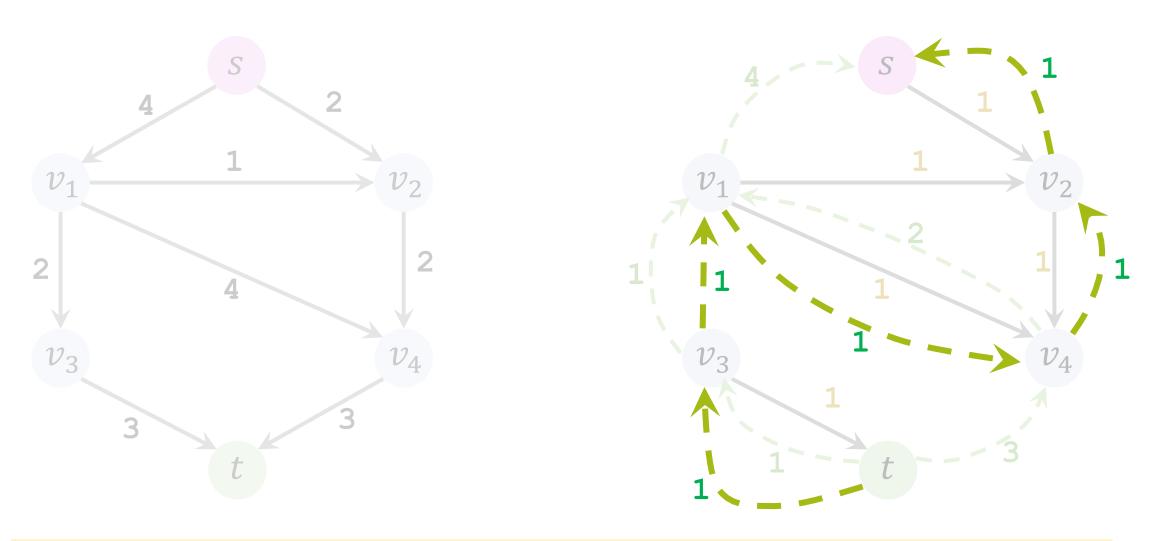
# Iteration 3: Update residuals



### Iteration 3: Remove saturated edges

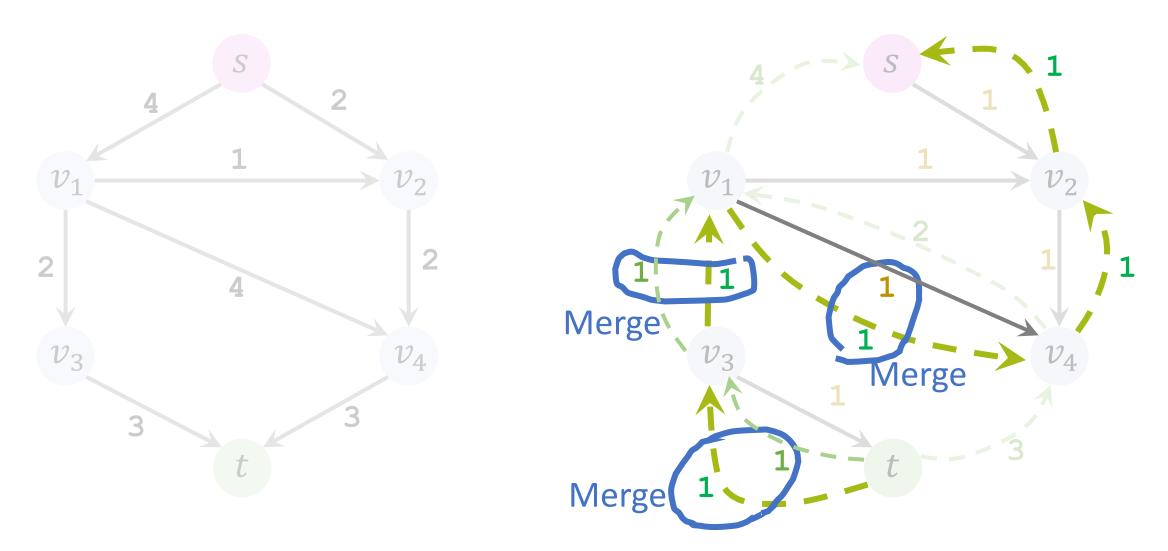


#### Iteration 3: Add a backward path

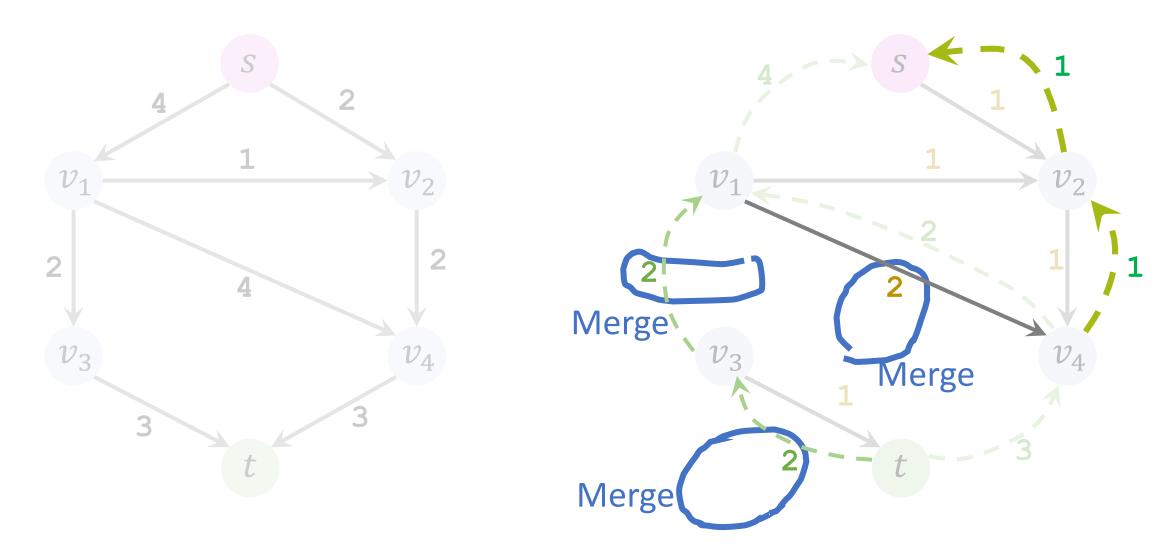


Add backward path  $t \rightarrow v_3 \rightarrow v_1 \rightarrow v_4 \rightarrow v_2 \rightarrow s$  with capacity = 1.

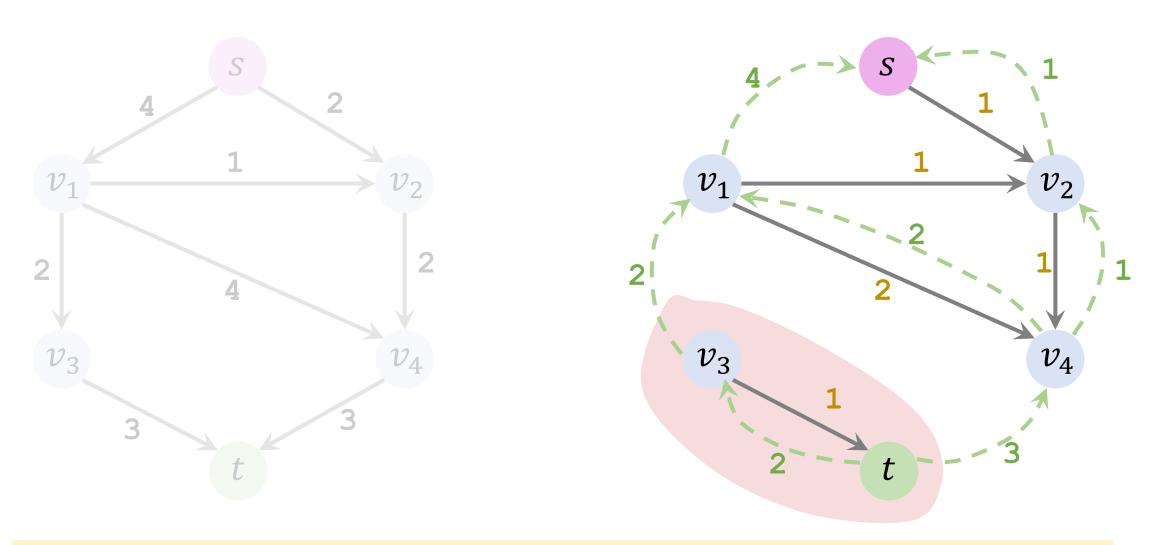
### Iteration 3: Add a backward path



### Iteration 3: Add a backward path

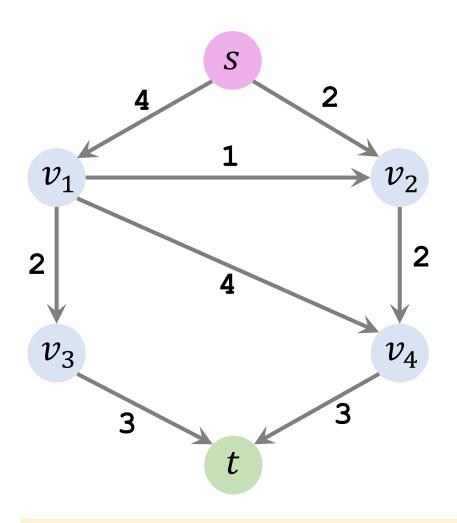


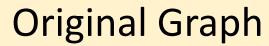
# Iteration 4: Find an augmenting path

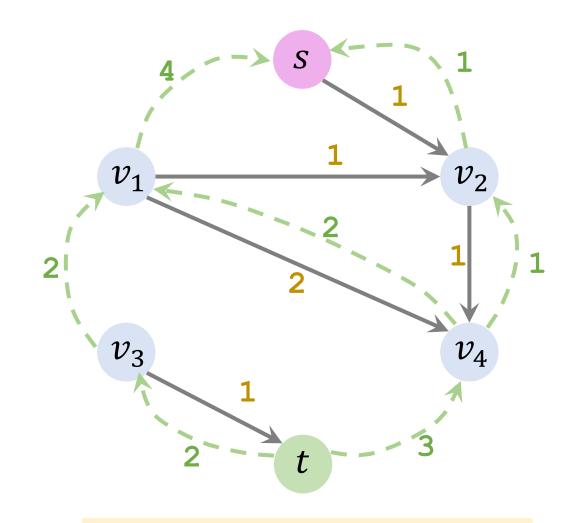


Cannot find any path from source to sink.

#### **End of Procedure**

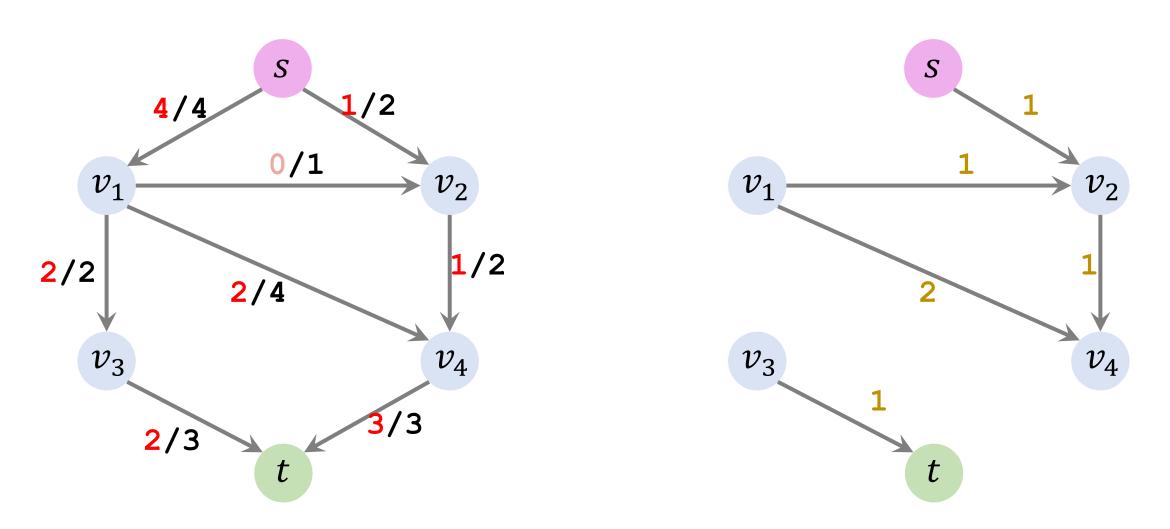






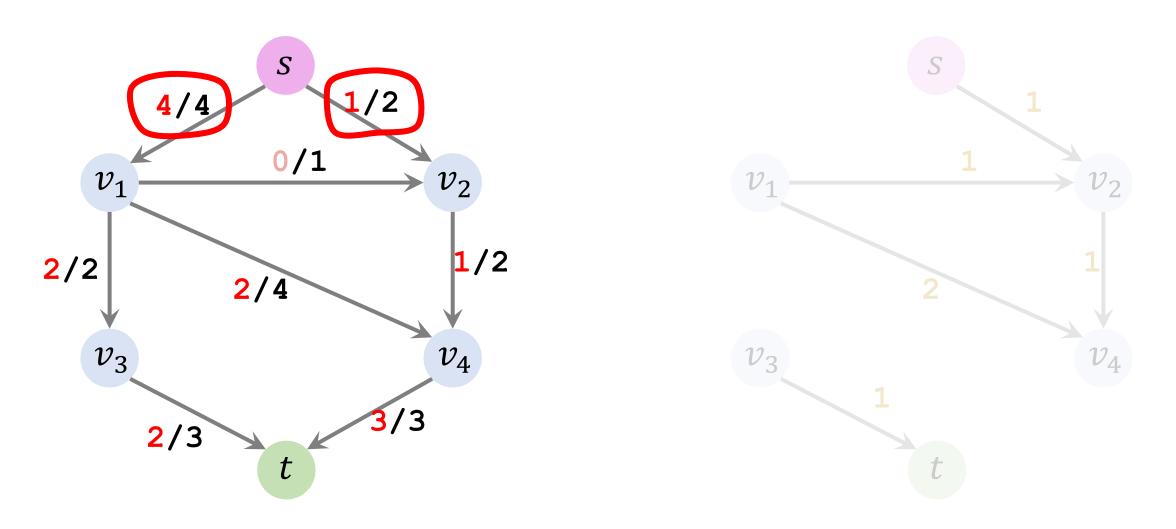
Residual Graph

#### **End of Procedure**



Flow = Capacity - Residual.

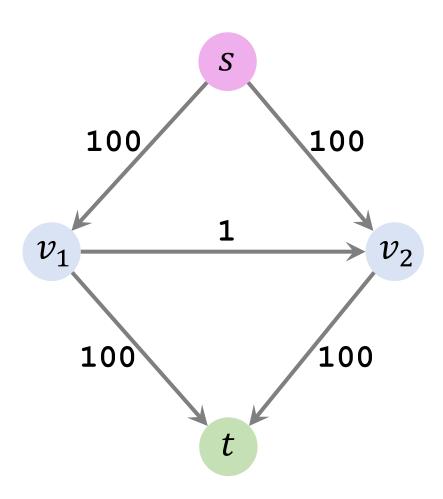
#### **End of Procedure**



Max Flow = 5. (Why? The flow leaving the source sum to 5.)

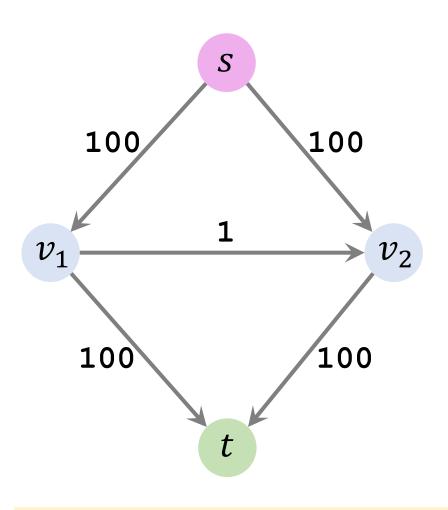
# **Worst-Case Time Complexity**

#### A bad case for Ford-Fulkerson algorithm

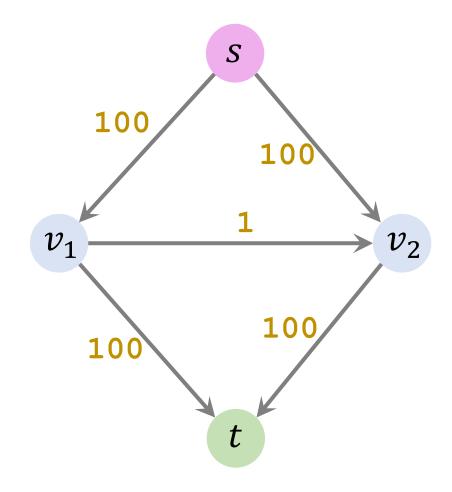


- Obviously, the maximum flow is 200.
- However, it takes Ford-Fulkerson algorithm a long time to find the right answer.

#### **Initialization**

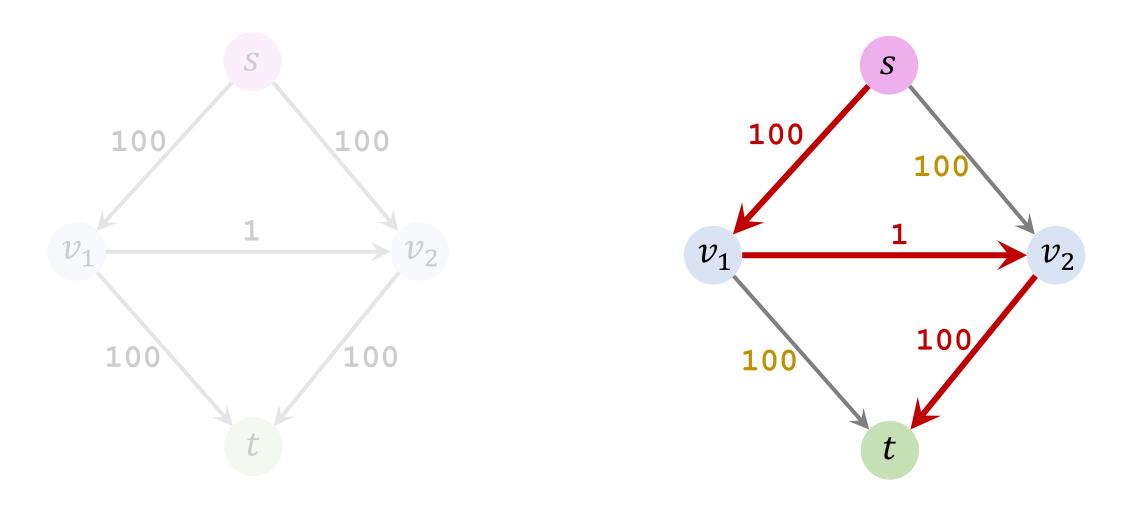


Original Graph



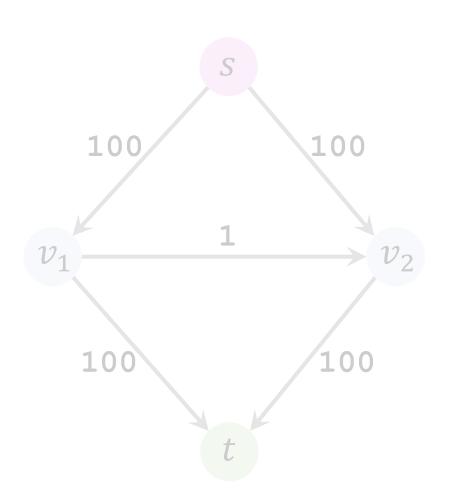
Residual Graph

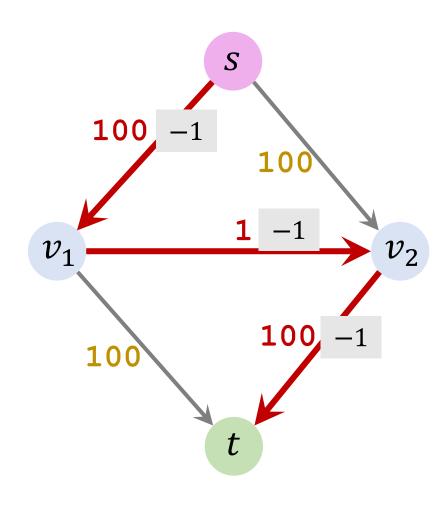
### Iteration 1: Find an augmenting path



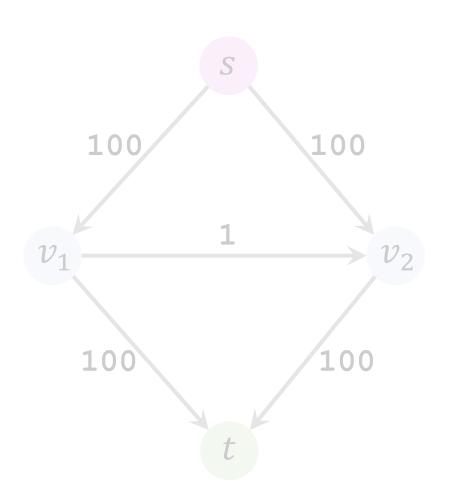
Found path  $s \rightarrow v_1 \rightarrow v_2 \rightarrow t$ . (Bottleneck capacity = 1.)

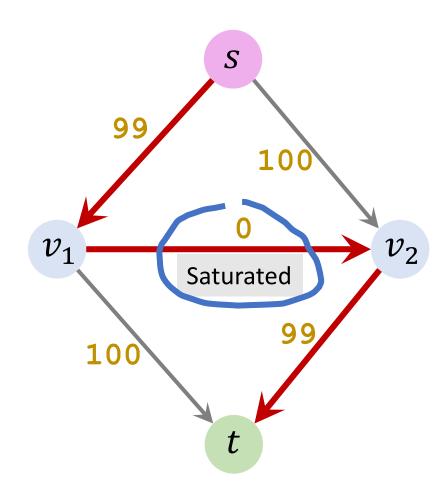
## Iteration 1: Update residuals



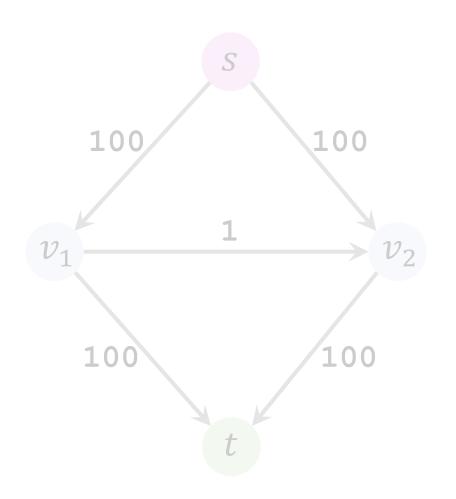


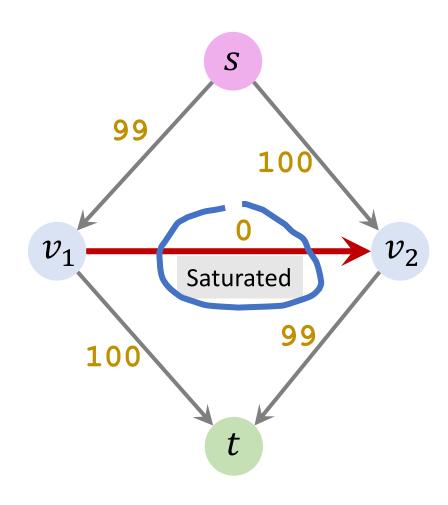
## Iteration 1: Update residuals



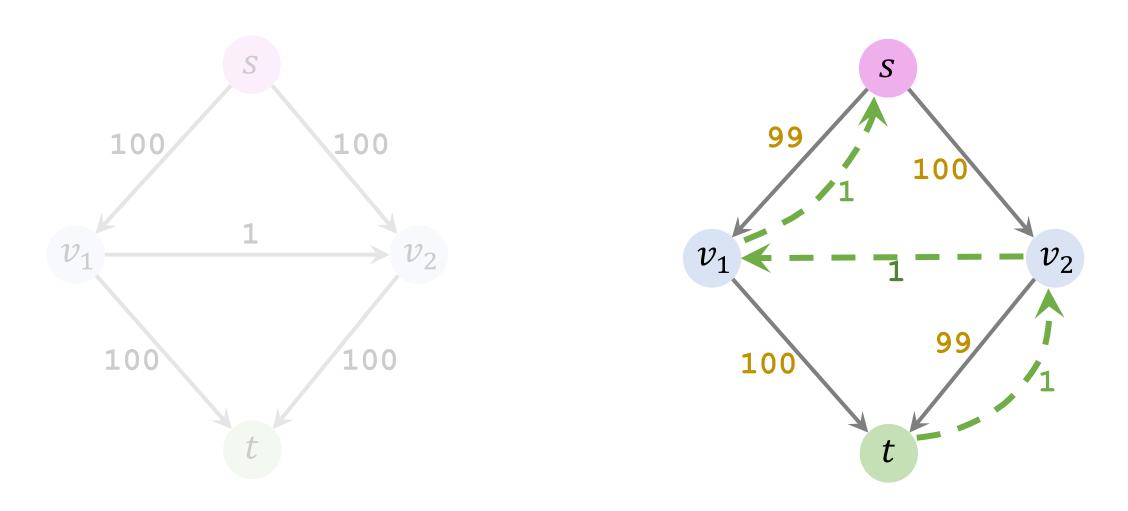


## Iteration 1: Remove saturated edges



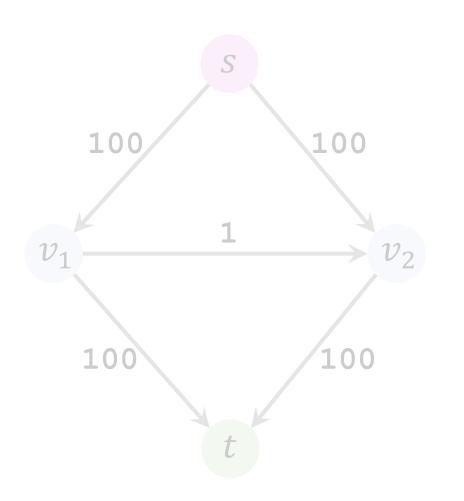


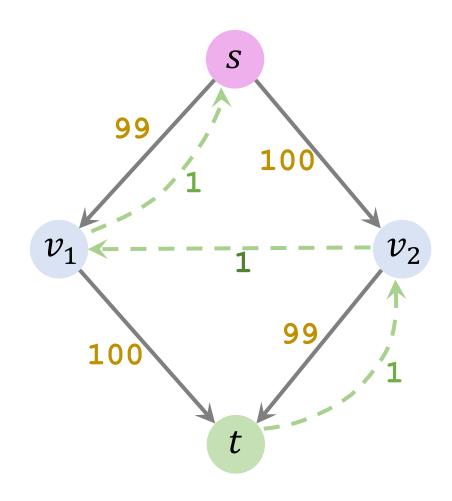
#### Iteration 1: Add backward path



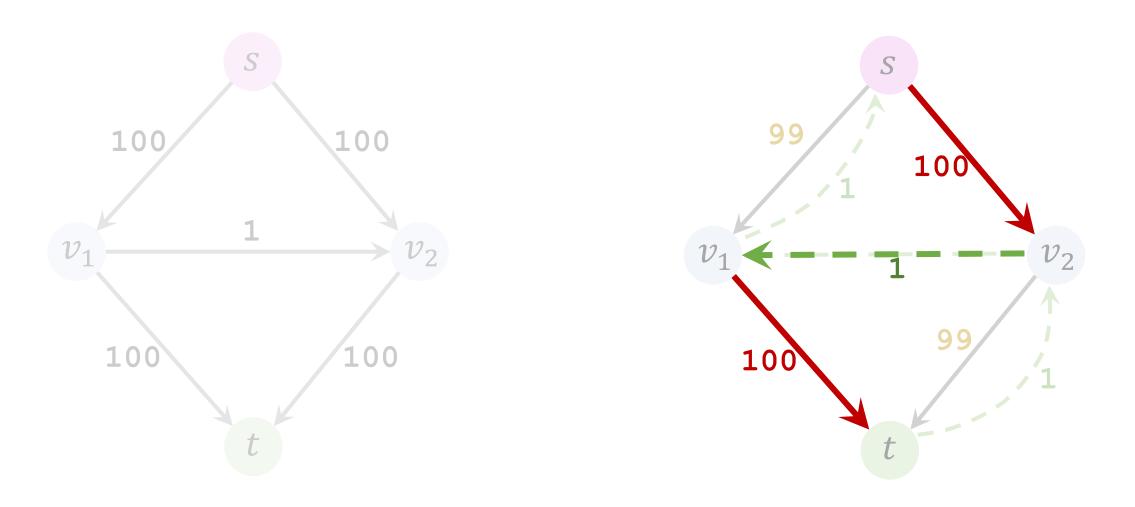
Add backward path  $t \rightarrow v_2 \rightarrow v_1 \rightarrow s$  with capacity = 1.

## Now, the flow is 1



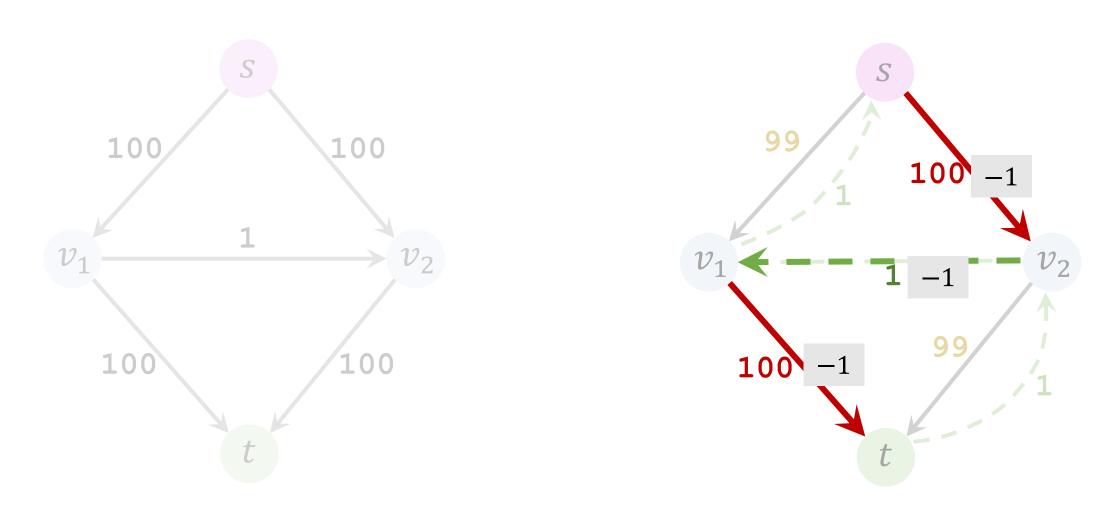


## Iteration 2: Find an augmenting path



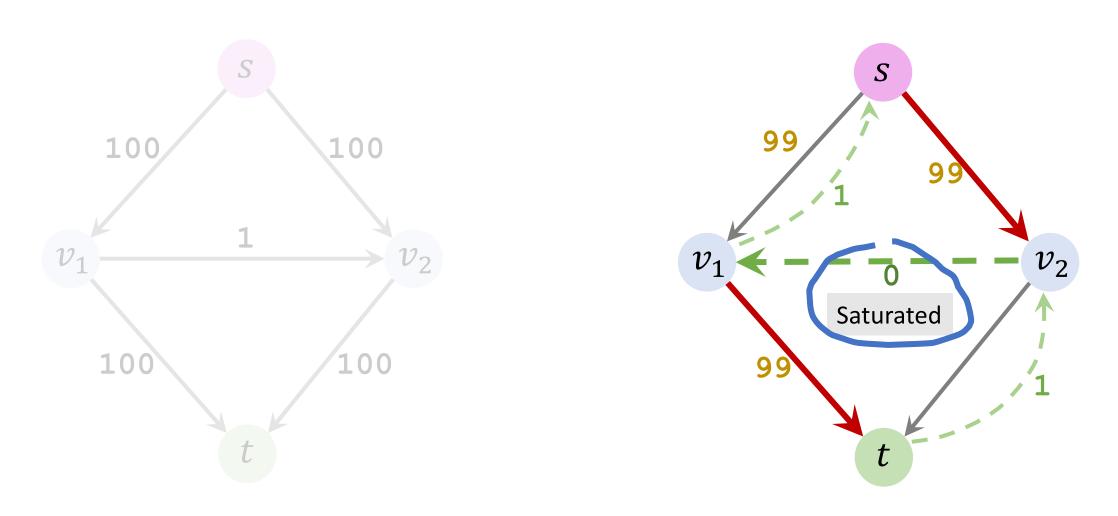
Found path  $s \rightarrow v_2 \rightarrow v_1 \rightarrow t$ . (Bottleneck capacity = 1.)

#### Iteration 2: Update residuals



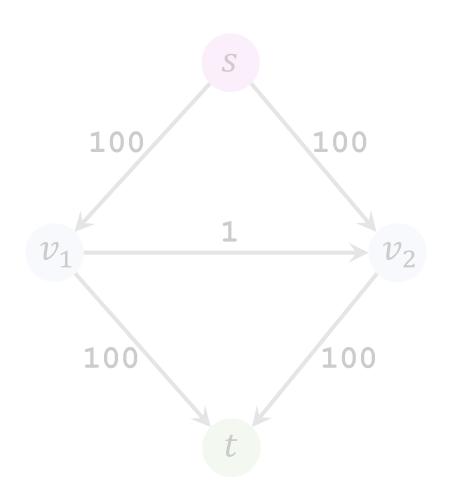
Found path  $s \rightarrow v_2 \rightarrow v_1 \rightarrow t$ . (Bottleneck capacity = 1.)

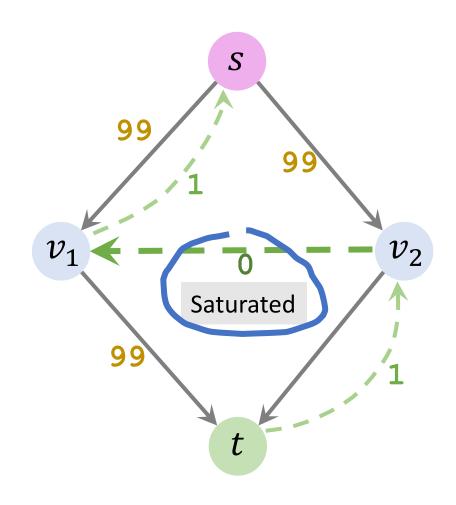
## Iteration 2: Update residuals



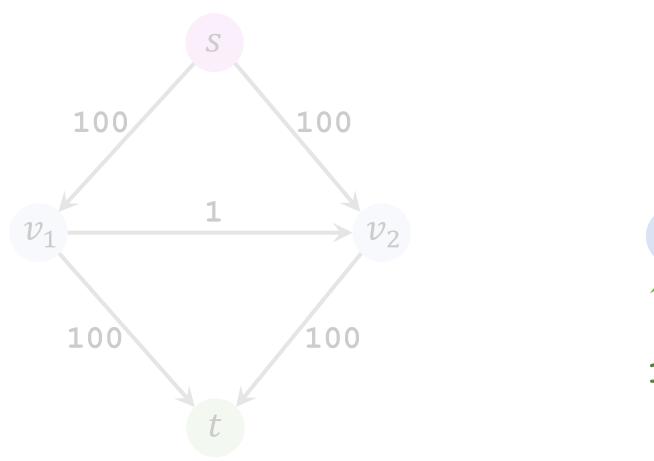
Found path  $s \rightarrow v_2 \rightarrow v_1 \rightarrow t$ . (Bottleneck capacity = 1.)

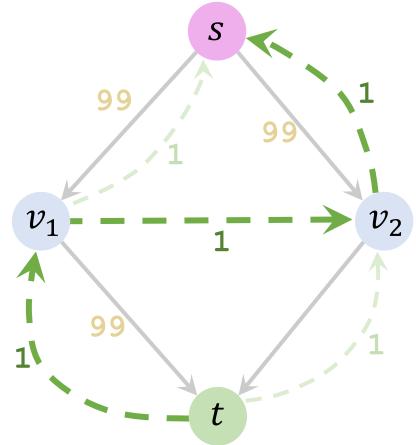
## Iteration 2: Remove saturated edges





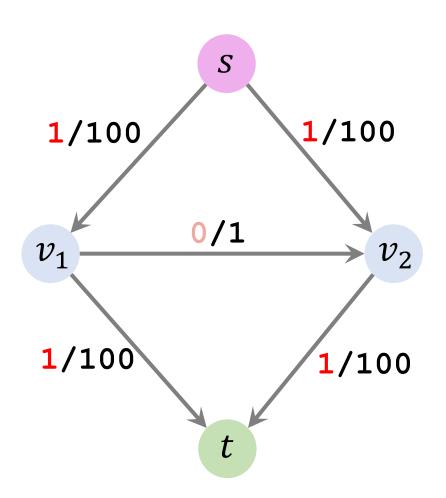
#### Iteration 2: Add backward path

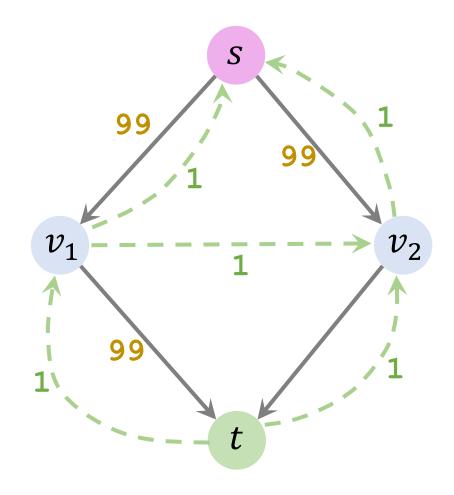




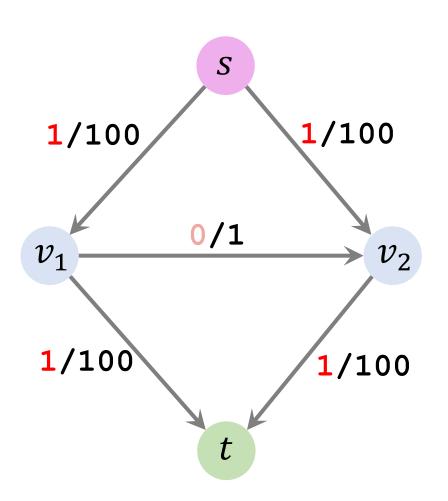
Add backward path  $t \rightarrow v_1 \rightarrow v_2 \rightarrow s$  with capacity = 1.

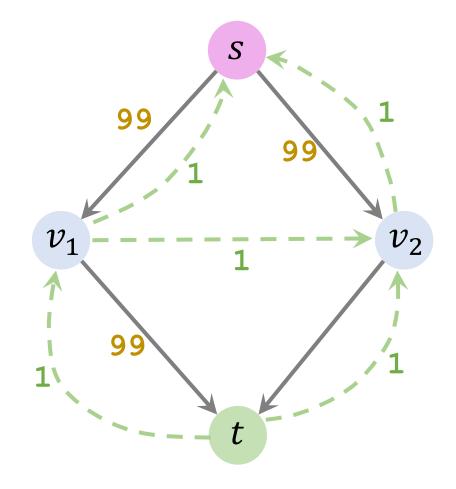
## Now, the flow is 2





## Slow improvement...





In every iteration, the flow leaving the source increases by 1.

#### **Worst-Case Iteration Complexity**

- Ford-Fulkerson algorithm always improve the flow in every iteration.
- Thus, it is guaranteed to converge using at most MaxFlow iterations.

- In our example, each iteration increases the flow by only 1.
- Thus, it actually takes MaxFlow iterations.

In sum, the worst-case number of iterations is MaxFlow.

#### **Worst-Case Time Complexity**

- Let m be the number of edges.
- It takes O(m) time to find a path in unweighted graph. (Ignore the weights in the residual graph.)
- Thus, the per-iteration time complexity is O(m).

- Let the maximum flow be f.
- The worst-case time complexity is  $O(f \cdot m)$ .
- (In practice, the time complexity is not so bad.)

#### **Edmonds-Karp Algorithm**

#### Reference

• Jack Edmonds and Richard M Karp. Theoretical improvements in algorithmic efficiency for network flow problems. *Journal of the ACM*. 19 (2): 248–264, 1972.

#### **Edmonds-Karp Algorithm**

- Edmonds-Karp algorithm is a special case of Ford-Fulkerson algorithm.
- Edmonds-Karp algorithm uses the shortest path from source to sink. (Apply weight 1 to all the edges in the residual graph.)
- Everything else is the same as Ford-Fulkerson algorithm.
- Edmonds-Karp algorithm has  $O(m^2 \cdot n)$  time complexity.
  - *m*: number of edges.
  - *n*: number of vertices.

# **Summary**

### Ford-Fulkerson Algorithm

1. Build a residual graph; initialize the residuals to be the capacities.

#### Ford-Fulkerson Algorithm

- 1. Build a residual graph; initialize the residuals to be the capacities.
- 2. While augmenting path can be found:
  - a. Find an augmenting path (in the residual graph.)
  - b. Find the bottleneck capacity x on the augmenting path.
  - c. Update the residuals. (Along the path, Residual = Residual -x.)
  - d. Add a backward path. (Along the path, edge weights are all x.)

#### Ford-Fulkerson Algorithm

- 1. Build a residual graph; initialize the residuals to be the capacities.
- 2. While augmenting path can be found:
  - a. Find an augmenting path (in the residual graph.)
  - b. Find the bottleneck capacity x on the augmenting path.
  - c. Update the residuals. (Along the path, Residual = Residual -x.)
  - d. Add a backward path. (Along the path, edge weights are all x.)

Time complexity:  $O(f \cdot m)$ . (f is the max flow; m is #edges.)

#### **Edmonds-Karp Algorithm**

- 1. Build a residual graph; initialize the residuals to the capacity.
- 2. While augmenting path can be found:
  - a. Find the shortest augmenting path (in the residual graph.)
  - b. Find the bottleneck capacity b on the augmenting path.
  - c. Update the residuals. (Along the path, Residual = Residual -b.)
  - d. Add a backward path. (Along the path, edge weights are all b.)

Time complexity:  $O(m^2 \cdot n)$ . (*m* is #edges; *n* is #vertices.)

## Thank You!