

# Breadth First Search

Lecture 8



# Graph Exploration

- Given a graph and two specified vertices  $r$  and  $v$ , a fundamental question is:
  - Does the graph contain a path from  $r$  to  $v$ ?
- In fact, given a root vertex  $r$ , we will be able to answer this question simultaneously for all non-root vertices.
- That is, we can efficiently determine which vertices are reachable by **path traversal** starting at the root vertex.



## Search Applications

- Graph Search has a **vast** number of applications.
- These can be simple applications:
  - *How do we explore a maze?*
  - *How do I travel from Montreal to Timbuktu?*
- Or, they can be much more substantive.
  - *What is the best way to search the web?*
  - *How, and how far, will a disease spread through the population?*



# The Generic Search Algorithm

- Here is the generic graph search algorithm:

## The Search Algorithm

Put  $r$  into a bag

While the bag is non-empty

    Remove  $v$  from the bag

    If  $v$  is unmarked

        Mark  $v$

        For each arc  $(v,w)$

            Put  $w$  into the bag



## The Generic Search Algorithm [cont.]

- Here is a slightly more formal pseudocode description.

**Search( $r$ )**

Set  $\mathcal{B} = \{r\}$

While  $\mathcal{B} \neq \emptyset$

    Let  $v \in \mathcal{B}$

    Set  $\mathcal{B} \leftarrow \mathcal{B} \setminus \{v\}$

    If  $v$  is unmarked

        Mark  $v$

        For each arc  $(v,w)$

            Set  $\mathcal{B} \leftarrow \mathcal{B} \cup \{w\}$

## The Search Algorithm

Put  $r$  into a bag

While the bag is non-empty

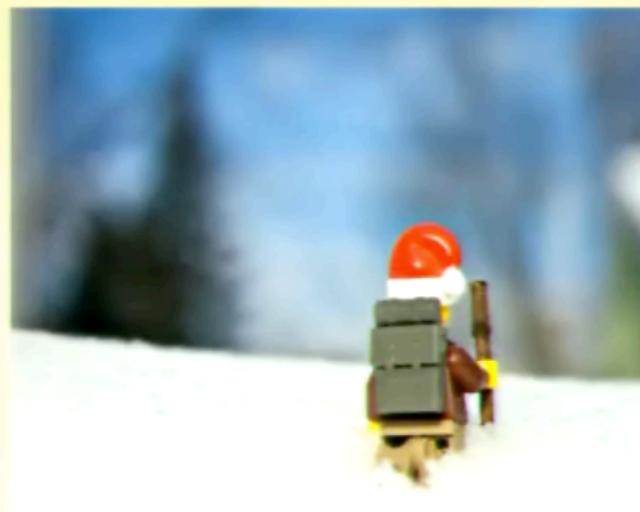
    Remove  $v$  from the bag

    If  $v$  is unmarked

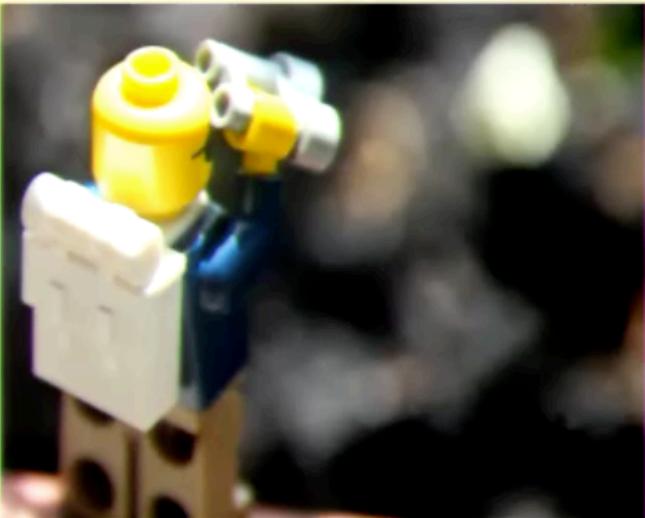
        Mark  $v$

        For each edge  $(v,w)$

            Put  $w$  into the bag



- We can view a vertex as having been discovered when it is marked.
- We will see that if the graph is connected then *every* vertex is discovered.
- But first observe that there are one **strange** thing about this algorithm.
  - We add a vertex to the bag when it is the end-point of an examined edge.  
 $\implies$  Multiple copies of a vertex may be in the bag!
- Surprisingly this will not affect the performance of the algorithm.
  - *Indeed, this will actually be useful to us if we modify the algorithm to account for this by “bagging” edges instead of vertices...*



# The (Revised) Generic Search Algorithm

- This gives the following *updated* generic graph search algorithm:

## The Search Algorithm

Put  $(*, r)$  into a bag

While the bag is non-empty

    Remove  $(u, v)$  from the bag

    If  $v$  is unmarked

        Mark  $v$

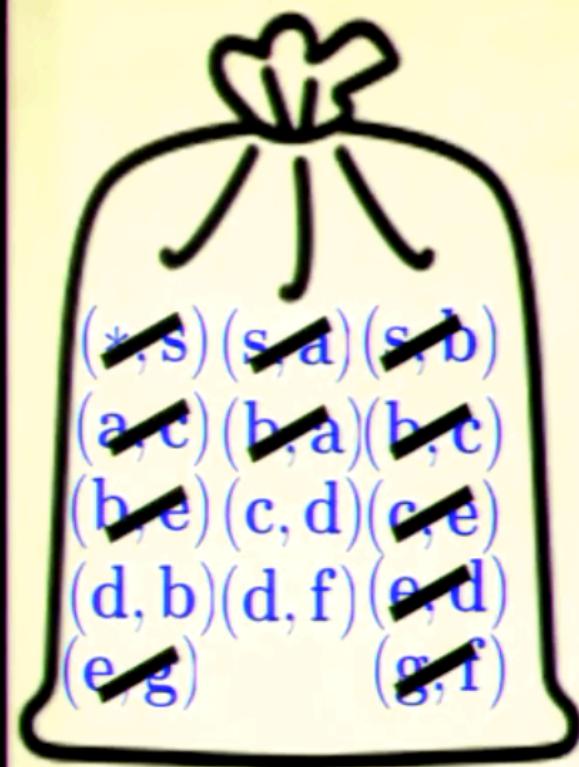
        Set  $p(v) \leftarrow u$

        For each arc  $(v, w)$

            Put  $(v, w)$  into the bag

Keep track of the  
predecessor.

# Search Example



Key



Unmarked Vertex

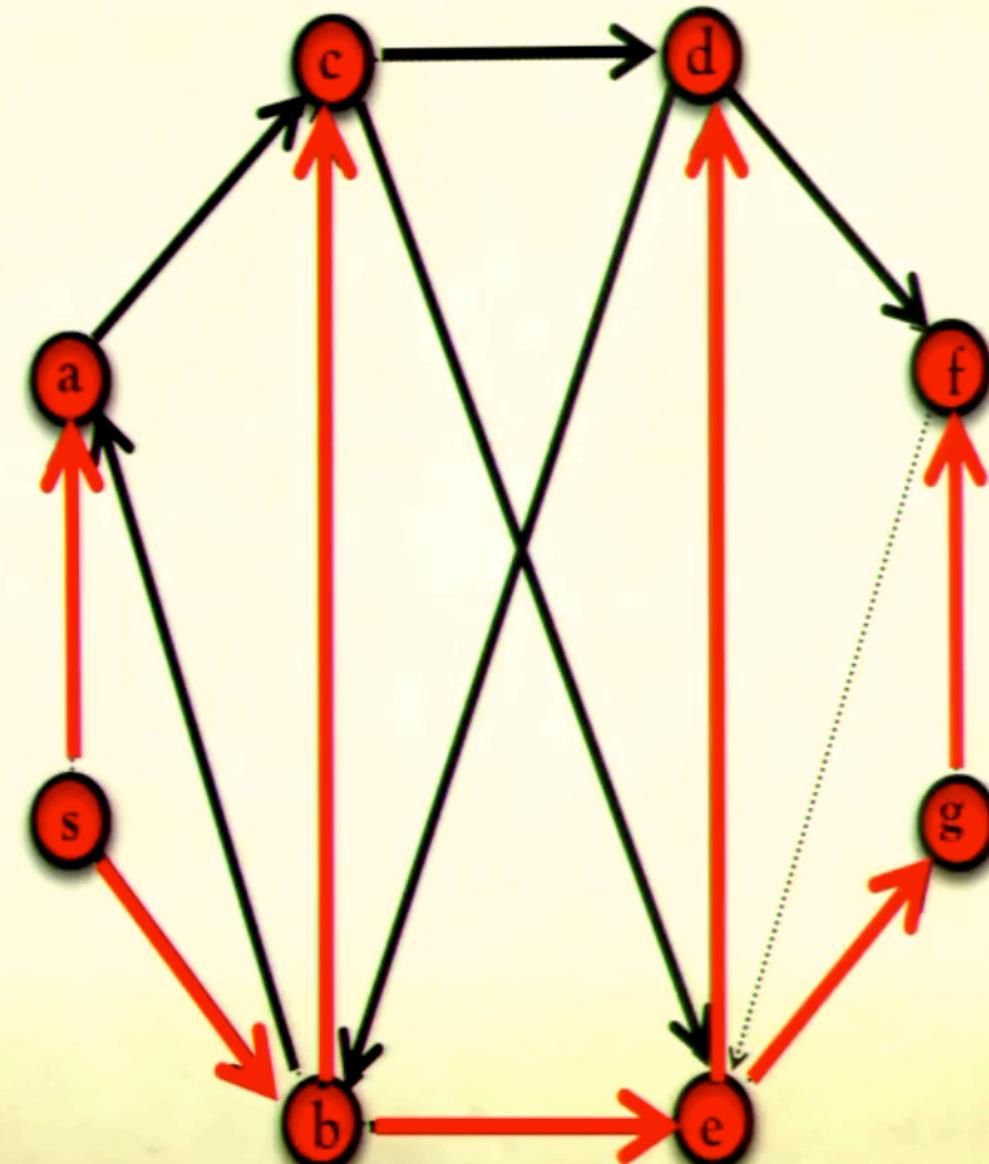


Marked Vertex

..... → Unviewed Arc

→ Viewed Arc (In Bag)

→ Parent Arc



## The Search Algorithm

Put  $(*, r)$  into a bag

While the bag is non-empty

Remove  $(u, v)$  from the bag

If  $v$  is unmarked

Mark  $v$

Set  $p(v) \leftarrow u$

For each arc  $(v, w)$

Put  $(v, w)$  into the bag

## The Running Time

- What is the *running time* of the generic search algorithm?
- We search each arc out of  $v$  only **once**, when  $v$  is first marked.
- The arc is then added to the bag once and later removed from the bag once.

$$\implies \text{Runtime} = O(m)$$

- So this is a **linear time** algorithm.

### The Search Algorithm

Put  $(^*, r)$  into a bag

While the bag is non-empty

    Remove  $(u,v)$  from the bag

    If  $v$  is unmarked

        Mark  $v$

        Set  $p(v) \leftarrow u$

    For each edge  $(v,w)$

        Put  $(v,w)$  into the bag

## Validity

**Theorem.** Let  $G$  be a connected, undirected graph. Then the search algorithm finds every vertex in  $G$ .

**Proof.**

- We must show that each vertex  $v$  is **marked** by the search algorithm.
- We prove this by induction on the smallest number  $k$  of edges in a path from the vertex to the root.

Base Case:  $k = 0$

- Then  $v$  is the root vertex  $r$ .
- But  $r$  is the first vertex marked in the algorithm, so the base case holds.

## Proof [cont].

### Induction Hypothesis:

- Assume any vertex  $v$  that has a path of  $k-1$  (or fewer) edges to the root  $r$  is marked.

### Induction Step:

- Assume there is a path  $P$  with  $k$  edges from  $v$  to  $r$ . Specifically let

$$P = \{v = v_k, v_{k-1}, \dots, v_1, v_0 = r\}$$

- Thus there is a path  $Q$  with  $k-1$  edges from  $u = v_{k-1}$  to  $r$ . That is,

$$Q = \{u = v_{k-1}, \dots, v_1, v_0 = r\}$$

- So, by the induction hypothesis, the vertex  $u$  is marked.
- After we mark  $u$ , we place the edges incident to it in the bag.  
 $\implies$  The edge  $(u, v)$  is added to the bag.
- Thus, when  $(u, v)$  is removed from the bag we will mark  $v$  (if it is not already marked).



### The Search Algorithm

Put  $(^*, r)$  into a bag

While the bag is non-empty

    Remove  $(u,v)$  from the bag

    If  $v$  is unmarked

        Mark  $v$

        Set  $p(v) \leftarrow u$

    For each arc  $(v,w)$

        Put  $(v,w)$  into the bag

## Validity in Directed Graphs

- For directed graphs, a similar argument proves that each vertex that has a directed path to it from the root  $r$  is **marked**.



## Search Trees

- Observe that each non-root vertex has exactly one predecessor.

**Theorem.** Let  $G$  be a connected, undirected graph. Then the predecessor edges form a tree rooted at  $r$ .

**Proof.**

- By induction on the number  $k$  of marked vertices.

Base Case:  $k = 1$

- The root vertex  $r$  is the first vertex marked.  
     $\implies$  Trivially, we have a tree rooted at  $r$ , so the base case holds.

## Proof [cont].

### Induction Hypothesis:

- Assume the predecessor edges for the first  $k-1$  marked vertices form a tree rooted at  $r$ .

### Induction Step:

- Let  $v$  be the  $k$ th vertex to be marked.
- Assume  $v$  was marked when we removed the edge  $(u, v)$ .  
 $\implies u = p(v)$
- But  $(u, v)$  was added to the bag when we marked vertex  $u$ .  
 $\implies$  Vertex  $u$  is in the set  $S$  of the first  $k-1$  vertices to be marked.
- By the induction hypothesis, the predecessor edges for  $S$  form a tree  $T$  rooted at  $r$ .  
 $\implies T \cup (p(v), v)$  is a tree rooted at  $r$  on the first  $k$  marked vertices. □

### The Search Algorithm

Put  $(^*, r)$  into a bag

While the bag is non-empty

Remove  $(u, v)$  from the bag

If  $v$  is unmarked

Mark  $v$

Set  $p(v) \leftarrow u$

For each edge  $(v, w)$

Put  $(v, w)$  into the bag

## Implementational Aspects

- There is some flexibility in how to implement the search algorithm?
  - If the bag contains many arcs, which one should we remove?
- In fact, what in computer science is a “bag” ?
- The “bag” is just short-hand for a data structure.
- Moreover, the choice of data structure used has important consequences...

# Data Structures

- Three choices of **data structure** for the bag give fundamental algorithms:

Queue.



Breadth First Search.

Stack.



Depth First Search.

Priority Queue.



Minimum Spanning  
Tree Algorithm.

# Breadth First Search

- Using a Queue (FIFO) data structure produces:

Breadth First Search Algorithm

Add  $(*, r)$  to a Queue

While the Queue is non-empty

    Remove the first arc  $(u, v)$  from the Queue

    If  $v$  is unmarked

        Mark  $v$

        Set  $p(v) \leftarrow u$

        For each arc  $(v, w)$

            Add  $(v, w)$  into the back of the Queue



$(*, s)(s, a)(s, b)(a, c)(b, a)(b, c)(b, e)(c, d)(c, e)(e, d)(e, g)(d, b)(d, f)(g, f)(f, e)$

## BFS Example

### Key



Unmarked Vertex

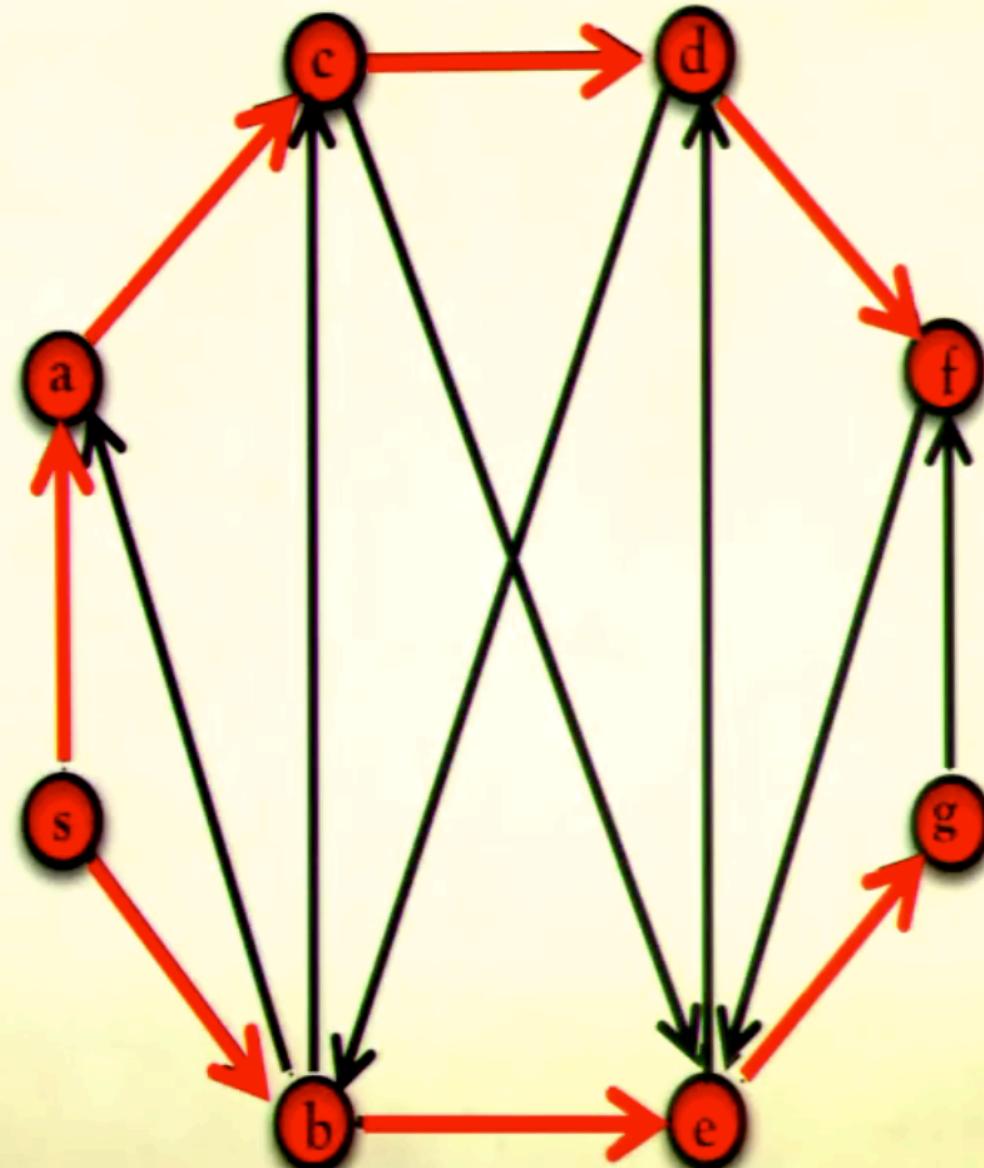


Marked Vertex

..... $\rightarrow$  Unviewed Arc

$\rightarrow$  Viewed Arc (In Bag)

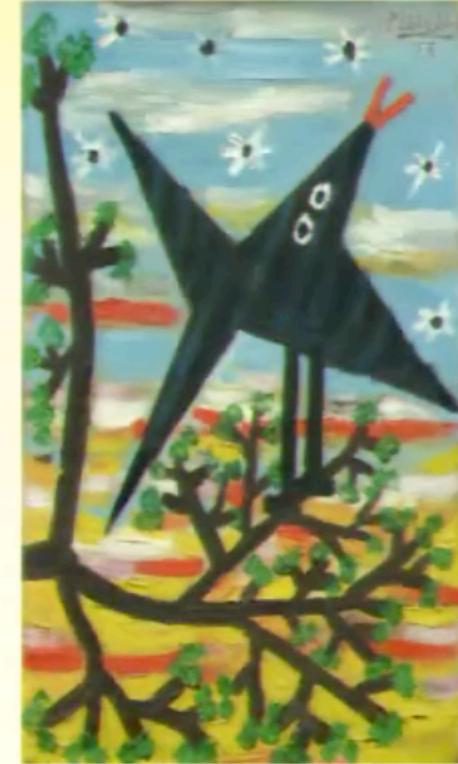
$\rightarrow$  Parent Arc



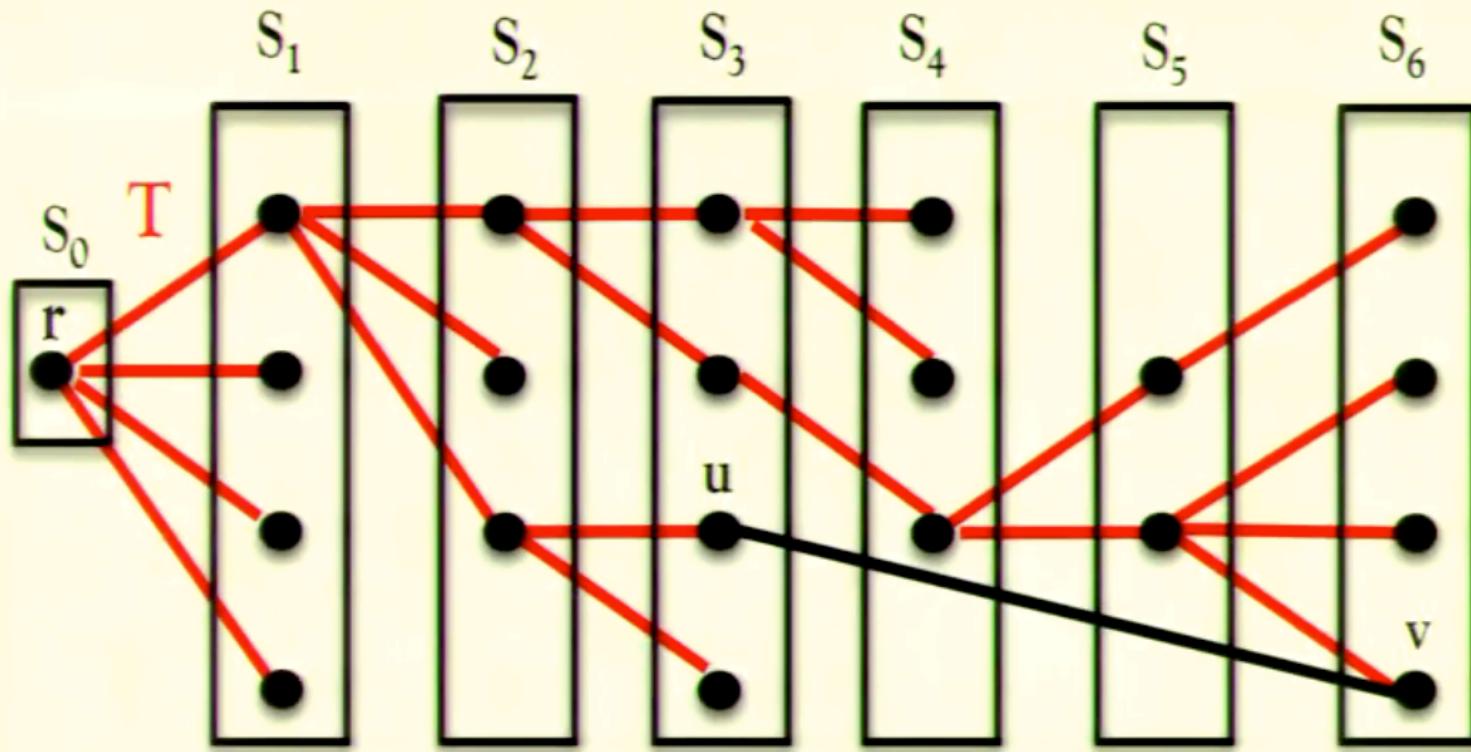
# Breadth First Search Trees

- Because BFS uses a *queue* it is easy to verify that:
  - The edges are **added** to the queue in order of their distance from  $r$ .
  - The vertices are **marked** in order of their distance from  $r$ .
- Specifically:

**Theorem.** For any vertex  $v$ , the path from  $v$  to  $r$  given by the search tree  $T$  of predecessor edges is a shortest path.



# Structure



- Let  $S_\ell$  be the set or “layer” of vertices at distance  $\ell$  from  $r$  in  $T$ .
- Then a vertex  $v \in S_\ell$  is also at distance  $\ell$  from  $r$  in the whole graph  $G$ .
  - Thus implies for every non-tree edge  $(u, v)$ ,  $u$  and  $v$  are either in the same layer or in adjacent layers.
  - If not, we can find a shorter path to the root from  $u$  or  $v$ .

# BFS and Bipartite Graphs

- Recall a graph  $G = (V, E)$  is bipartite if  $V = X \cup Y$  and every edge has exactly one end-point in  $X$  and one end-point in  $Y$ .

**Theorem.** A graph  $G$  is bipartite if and only if it contains no odd length cycles.

**Proof.**

( $\Rightarrow$ )

- Assume  $G$  contains as a subgraph an odd length cycle  $C$ .
- Let  $C = \{v_0, v_1, v_2, \dots, v_{2k}\}$
- Wlog we may assume vertex  $v_0 \in Y$ . Therefore:

$$v_0 \in Y \implies v_1 \in X \implies v_2 \in Y \implies v_3 \in X \cdots \implies v_{2k} \in Y$$

- But  $(v_0, v_{2k}) \in E$ . Thus

$$v_0 \in Y \implies v_{2k} \in X$$

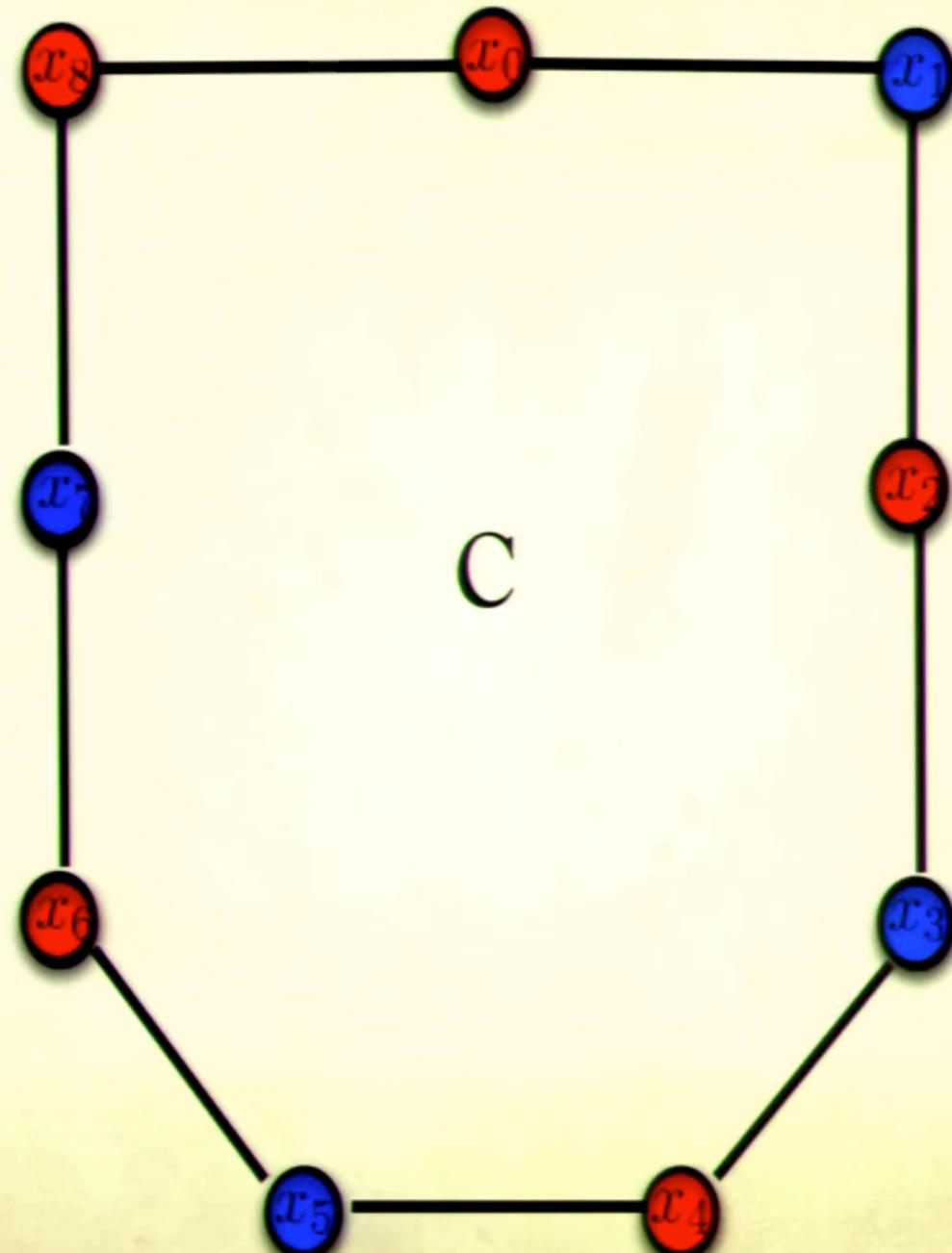
- This contradiction proves that  $G$  contains no odd cycles.

*A Pictorial Proof (k=4).*

Key

 X Vertex

 Y Vertex

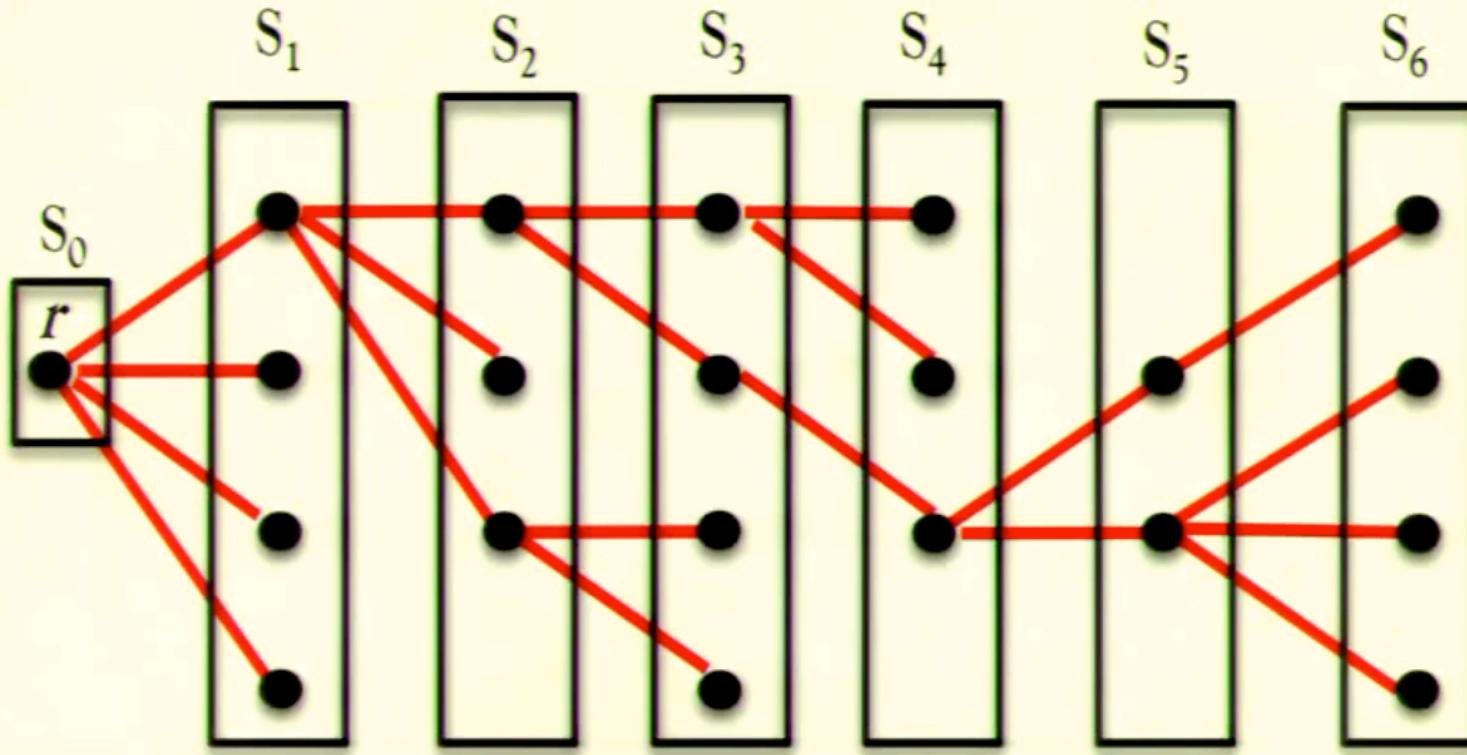


C

## Proof [cont].

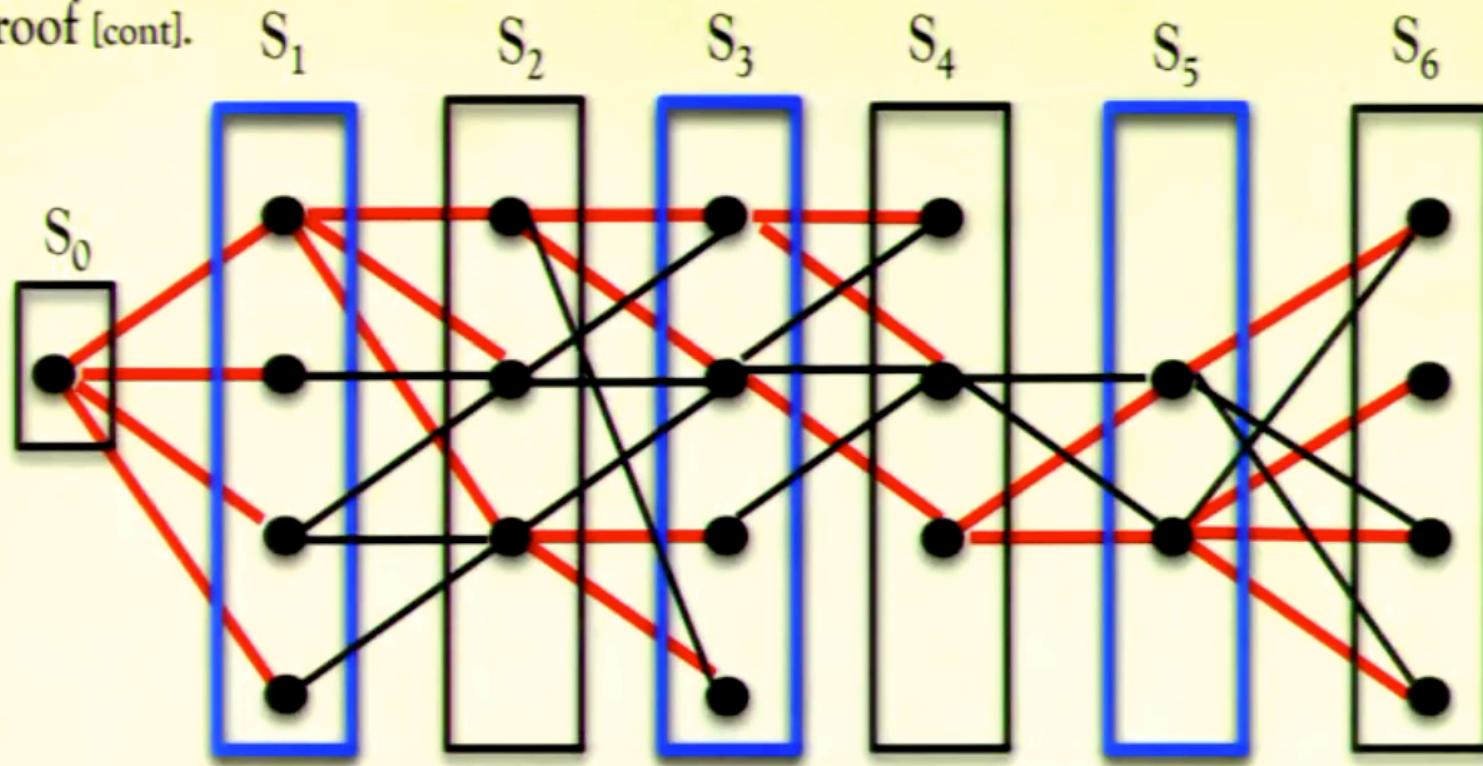
( $\Leftarrow$ )

- Assume  $G$  contains **no** odd length cycles.
- Select an arbitrary root vertex  $r$  and run the BFS algorithm.



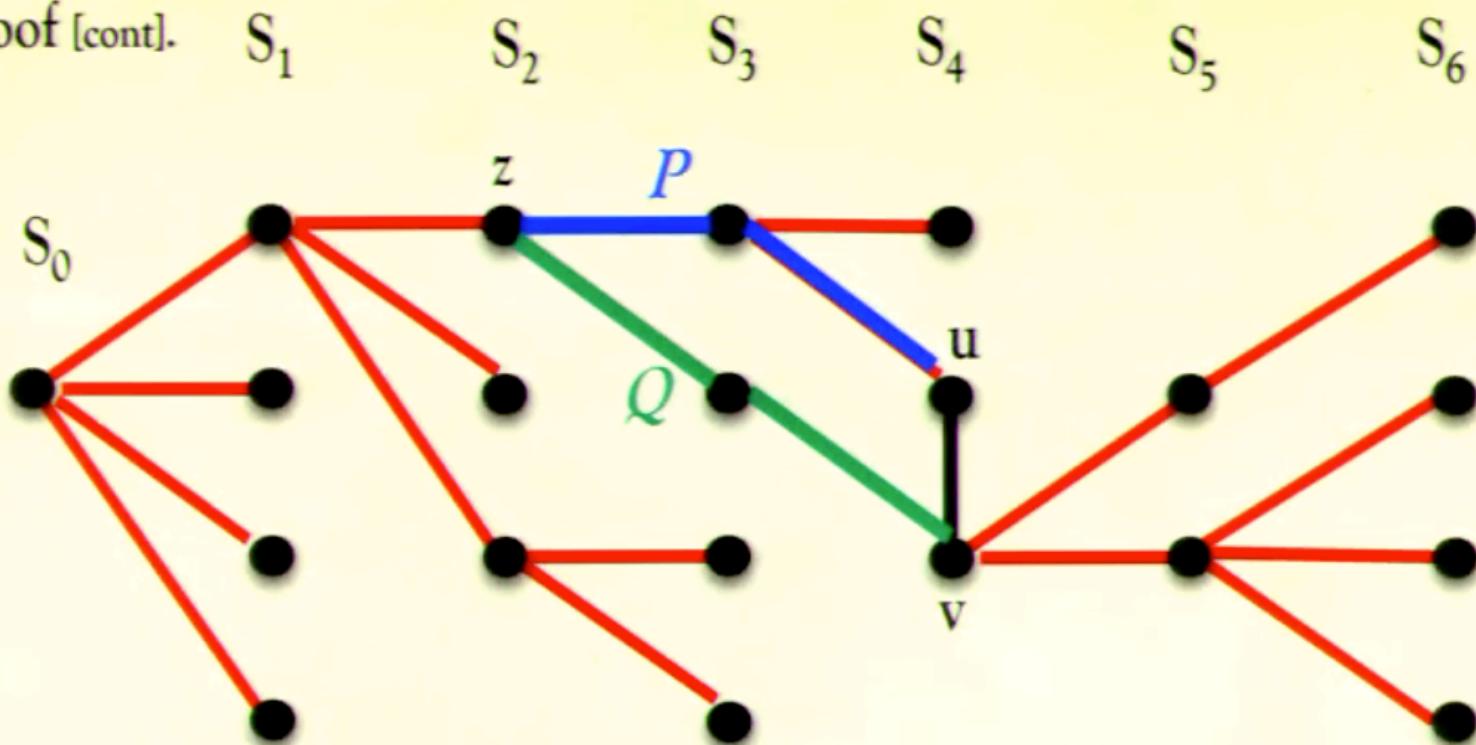
- Recall that for every non-tree edge  $(u, v)$ , we have that  $u$  and  $v$  are either in the **same** layer or in **adjacent** layers.

Proof [cont.]



- Now set:  $X = \bigcup_{\ell \text{ odd}} S_\ell$   $Y = \bigcup_{\ell \text{ even}} S_\ell$
- Suppose, for every non-tree edge  $(u, v)$ , that  $u$  and  $v$  are in adjacent layers.
- Now, for every tree edge  $(u, v)$  we also have  $u$  and  $v$  in adjacent layers.
- But adjacent layers alternate between  $X$  and  $Y$ , so  $G$  is bipartite.

Proof [cont].



- So assume, there is non-tree edge  $(u, v)$  with  $u$  and  $v$  in the same layer.
- Let  $z$  be the closest common ancestor of  $u$  and  $v$  in the search tree  $T$ .
- Let  $P$  be the path in  $T$  from  $u$  to  $z$ ; let  $Q$  be the path in  $T$  from  $v$  to  $z$ .
- Since  $u$  and  $v$  in the same layer we have:  $|P| = |Q|$
- But then the cycle  $C = P \cup Q \cup (u, v)$  has an odd number of edges as: