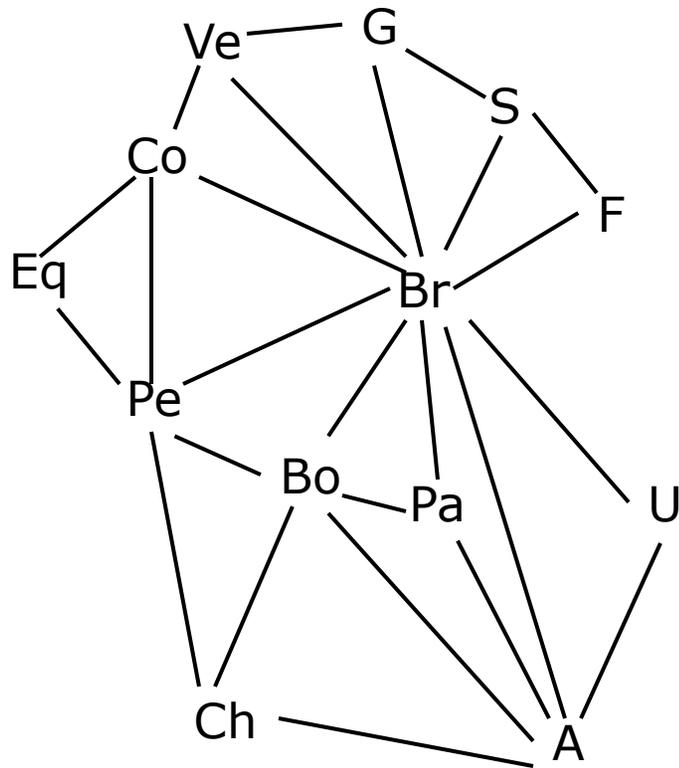


## Section 1.4: Graphs and Trees

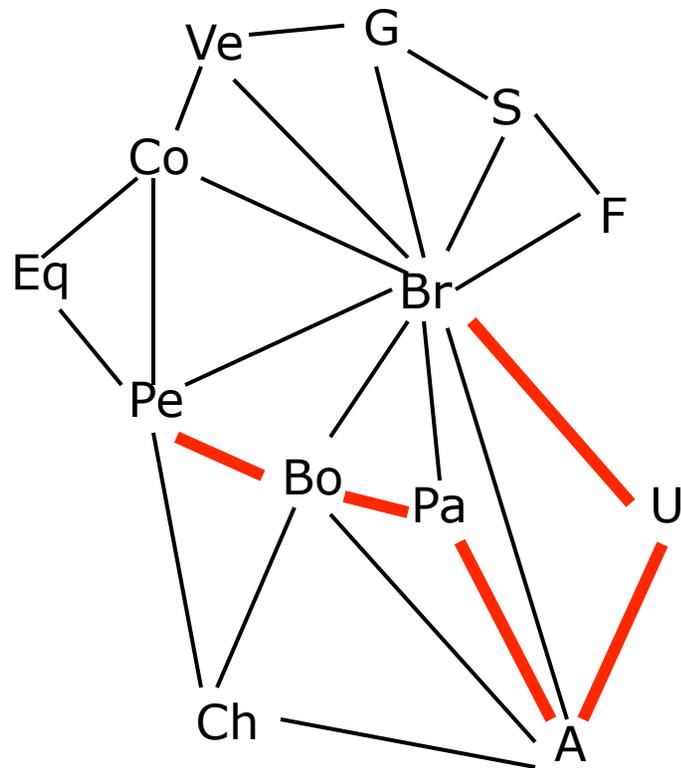
A **graph** is a set of objects (called **vertices** or **nodes**) and **edges** between pairs of nodes.



Vertices = {Ve, G, S, F, Br, Co, Eq, Pe, Bo, Pa, Ch, A, U}  
Edges = { {Ve, G}, {Ve, Br}, ... }

A **path** from vertex  $x_0$  to  $x_n$  is a sequence of edges  $x_0, x_1, \dots, x_n$ , where there is an edge from  $x_{i-1}$  to  $x_i$  for  $1 \leq i \leq n$ .

The **length** of a path is the number of edges in it.



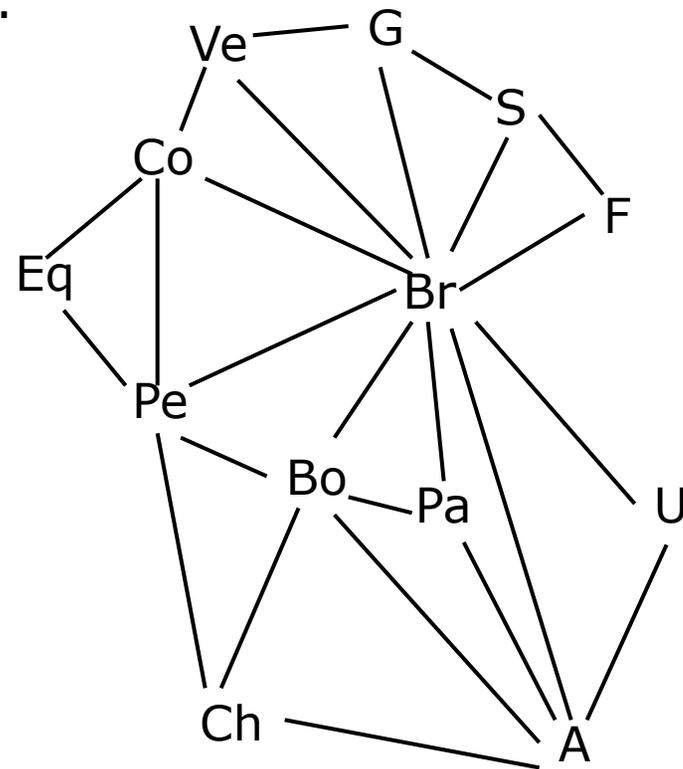
*A path from **Pe** to **Br***

A **cycle** is a path that begins and ends at the same vertex and has no repeated edges.

The sequence **Co,Br,G,Ve,Co** is a cycle.

The sequence **S,F,S** is not a cycle,  
since edge  $\{\mathbf{S},\mathbf{F}\}$  occurs twice.

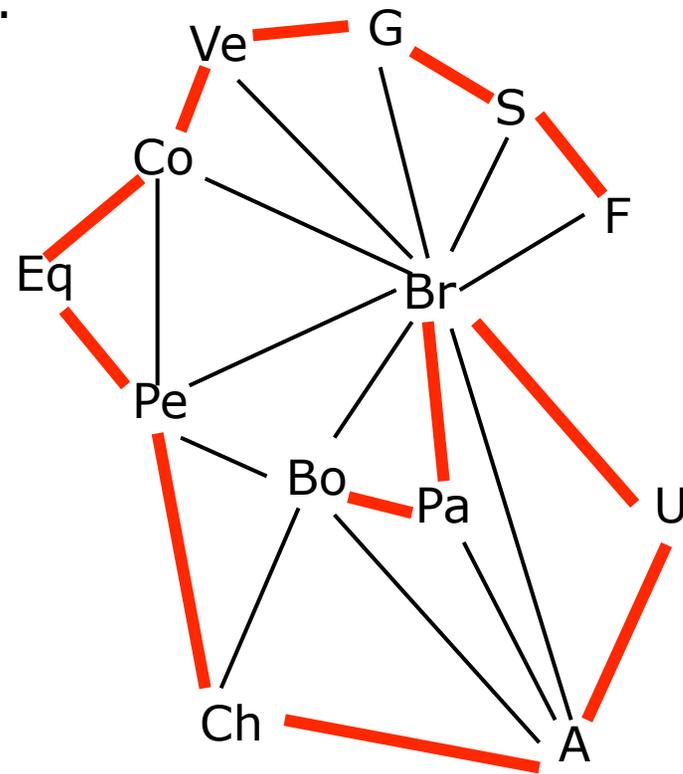
**In-class quiz:** What is the longest  
path from **Bo** to **F**  
with distinct edges and no cycles?



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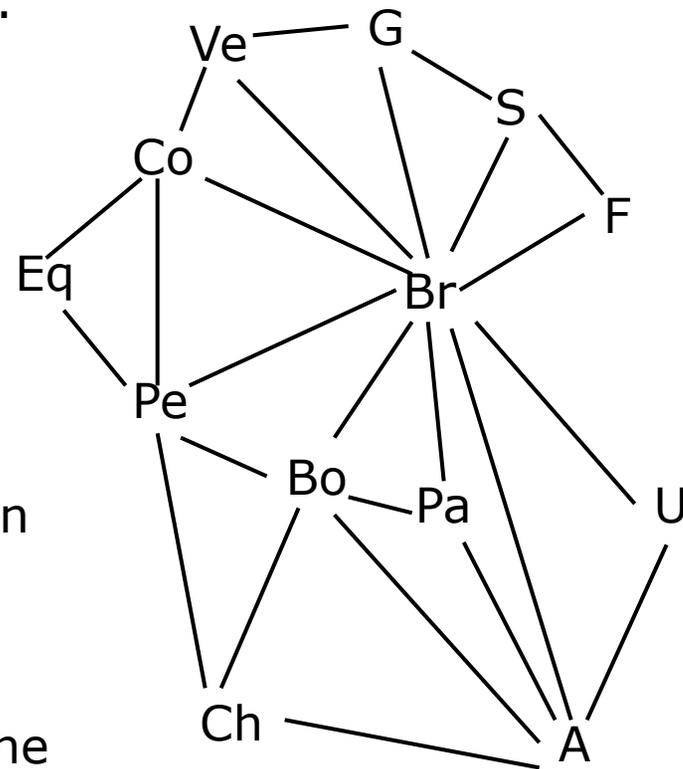
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**In-class quiz:** What is the longest  
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A graph is **n-colorable** if its vertices can  
be colored using n different colors  
such that adjacent vertices have  
different colors.

The **chromatic number** of a graph is the  
smallest such n.

**In-class quiz:** What is the chromatic color of this graph?  
i.e., how many colors does it take to color this graph?



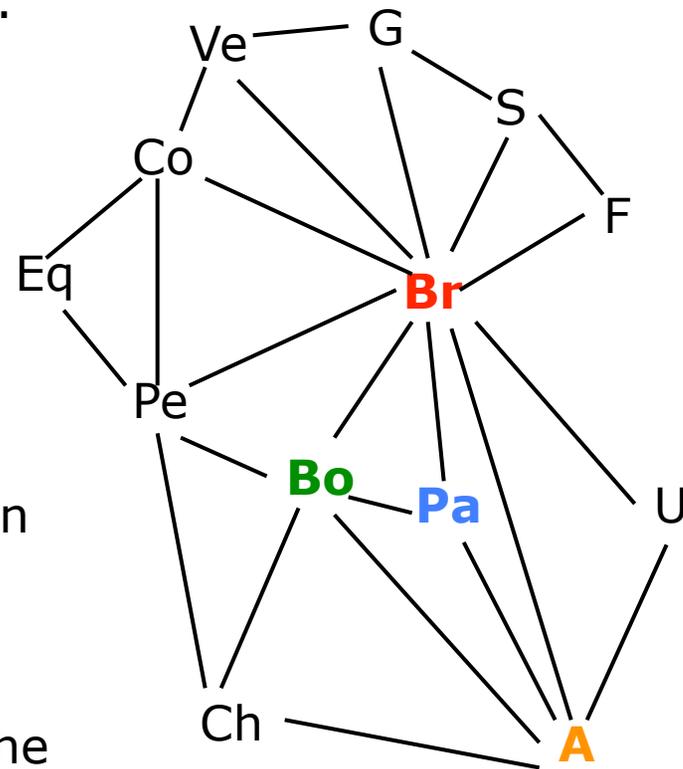
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A planar graph can be drawn on a 2-D plane without edges crossing.  
**Theorem:** All planar graphs can be colored with 4 (or fewer) colors.

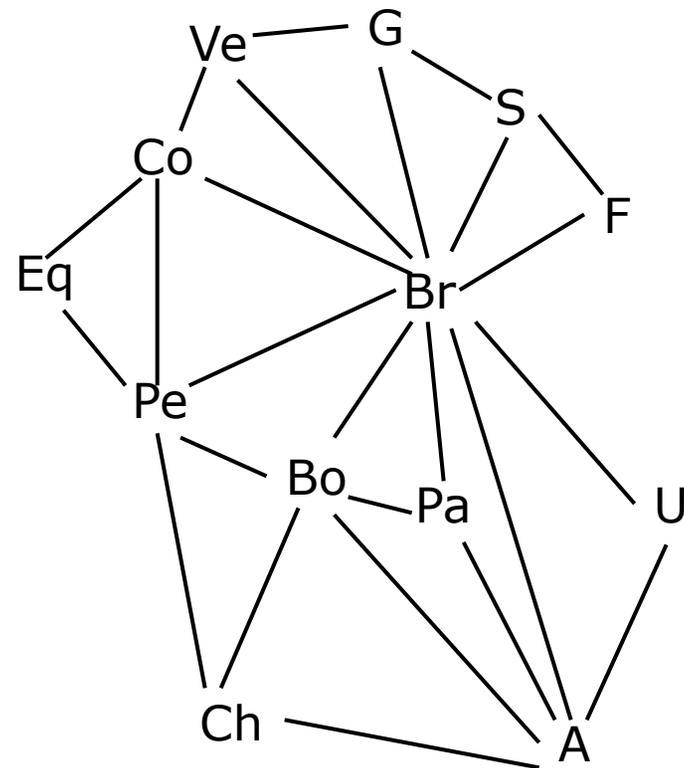
# Graph Traversals

A graph **traversal** starts at some vertex  $v$  and visits all vertices without visiting any vertex more than once.

(We assume connectedness: all vertices are reachable from  $v$ .)

## Breadth-First Traversal

- First visit  $v$ .
- Then visit all vertices reachable from  $v$  with a path length of 1.
- Then visit all vertices reachable from  $v$  with a path length of 2. (... not already visited earlier)
- And so on.



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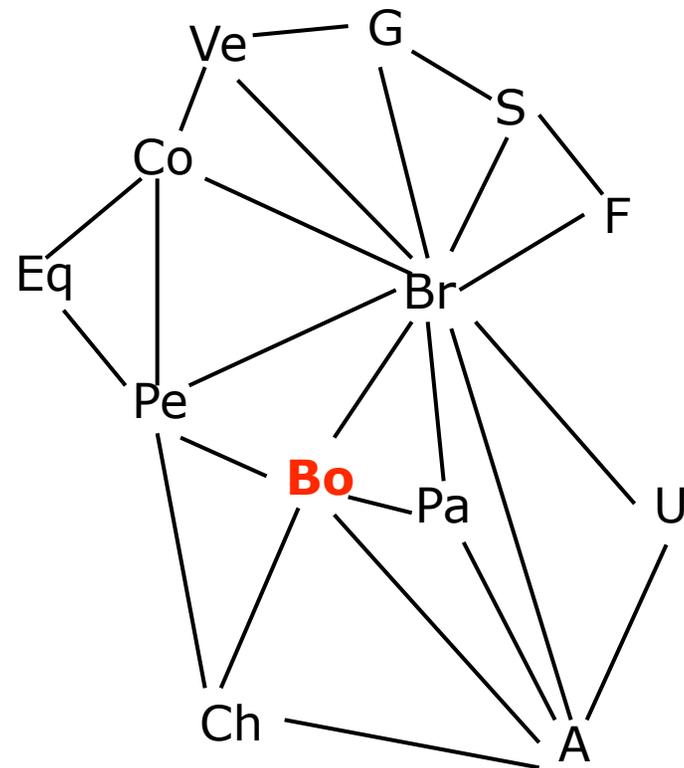
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**Example:**  $v=Bo$

Bo



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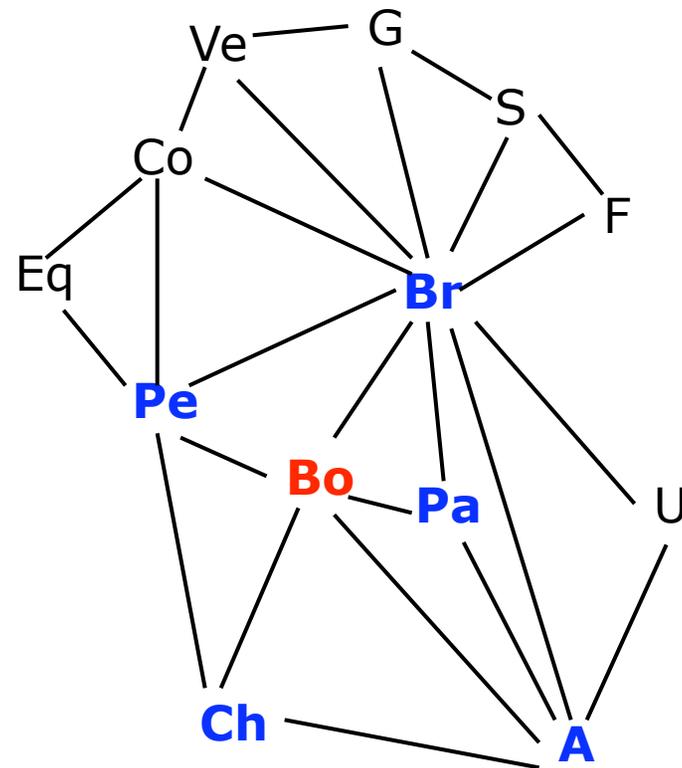
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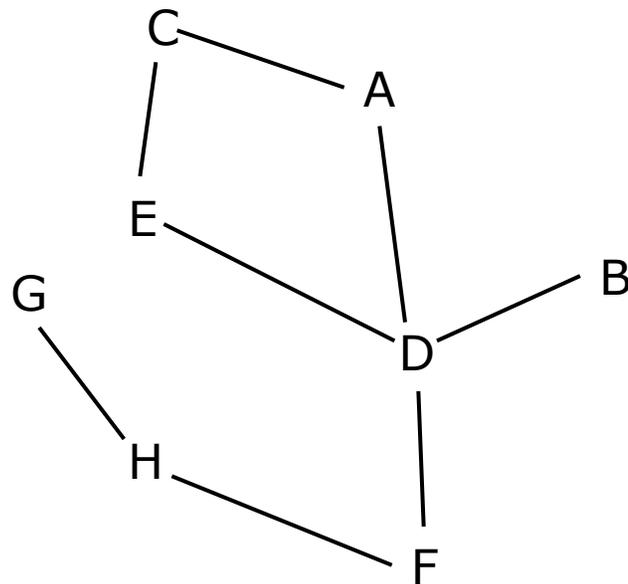
**Example:**  $v=Bo$

Bo,Pe,Br,Pa,A,Ch





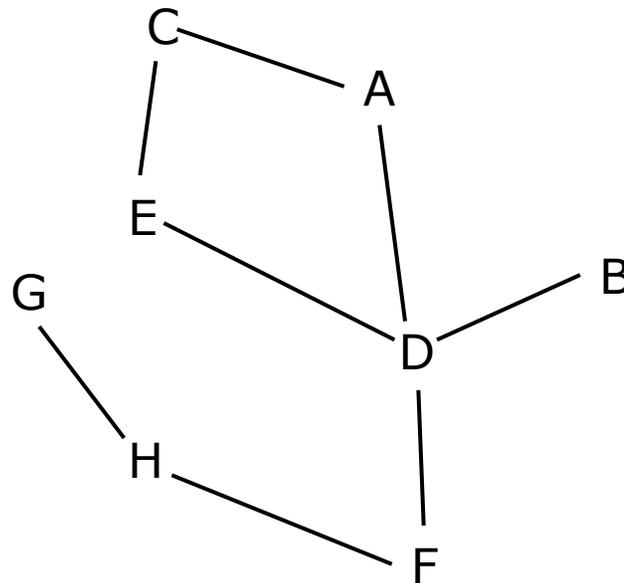
**In-Class Quiz:** Find a breadth-first traversal starting with F.



**In-Class Quiz:** Find a breadth-first traversal starting with F.

**One answer:** F,H,D,G,B,A,E,C

**In-Class Quiz:** Find a breadth-first traversal starting with C.

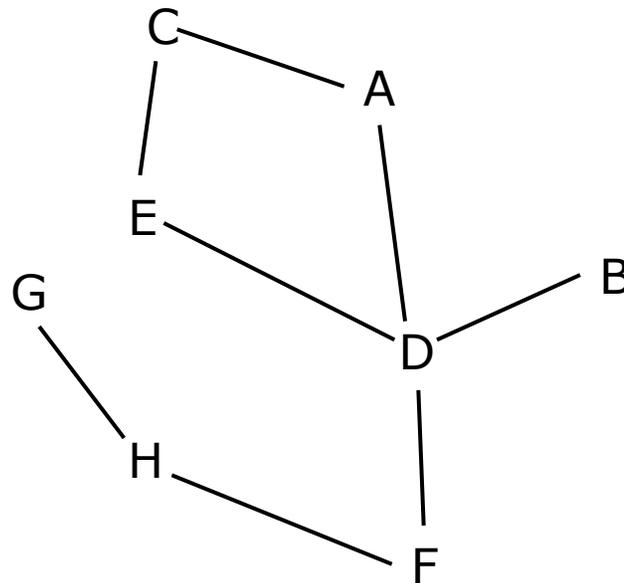


**In-Class Quiz:** Find a breadth-first traversal starting with F.

**One answer:** F,H,D,G,B,A,E,C

**In-Class Quiz:** Find a breadth-first traversal starting with C.

**One answer:** C,A,E,D,F,B,H,G



## Depth-First Traversal

Start with a vertex  $v$  and visit all reachable vertices.

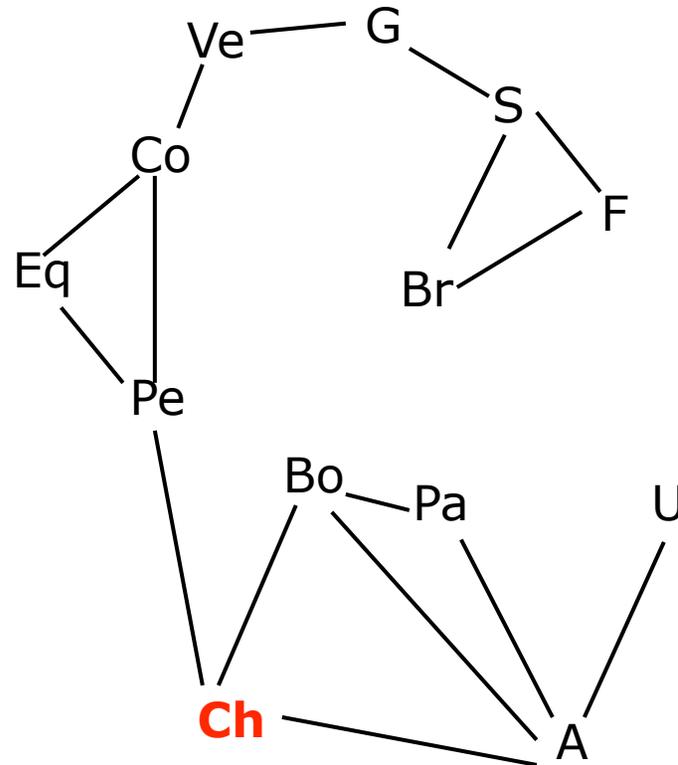
Start by going as far as you can.

Then backup a little and go down another path as far as possible.

Only backup as far as necessary, then try the next path.

**Example:** Start at Ch.

Ch



## Depth-First Traversal

Start with a vertex  $v$  and visit all reachable vertices.

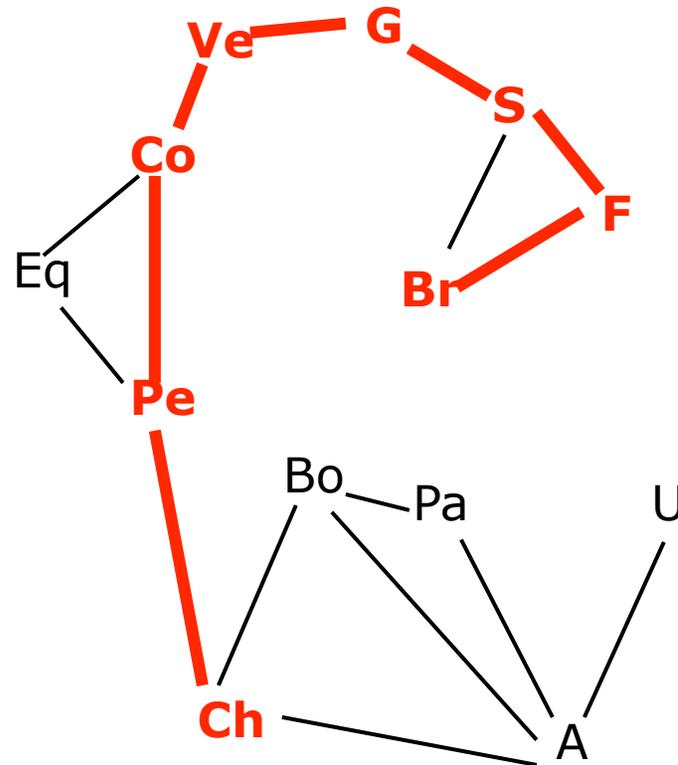
Start by going as far as you can.

Then backup a little and go down another path as far as possible.

Only backup as far as necessary, then try the next path.

**Example:** Start at Ch.

Ch,Pe,Co,Ve,G,S,F,Br



## Depth-First Traversal

Start with a vertex  $v$  and visit all reachable vertices.

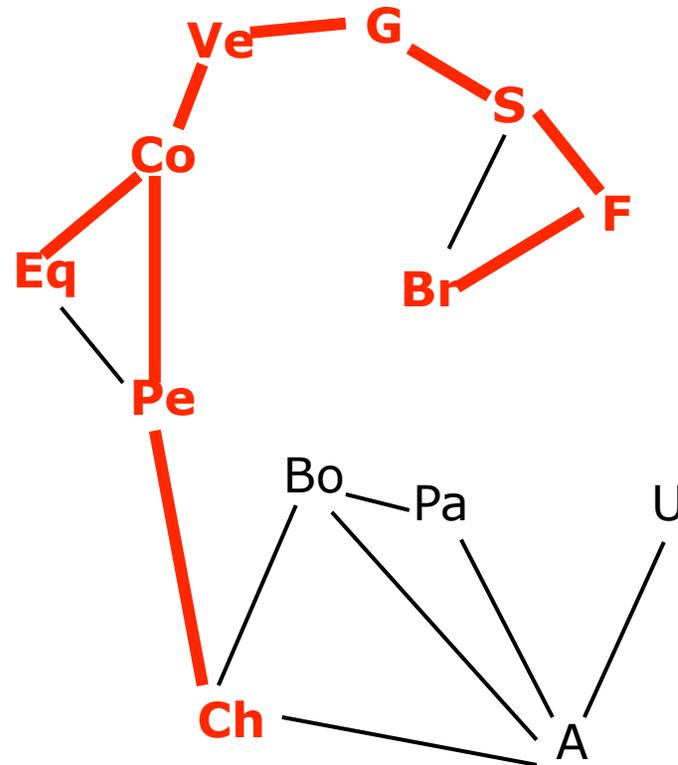
Start by going as far as you can.

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Only backup as far as necessary, then try the next path.

**Example:** Start at Ch.

Ch,Pe,Co,Ve,G,S,F,Br,Eq



## Depth-First Traversal

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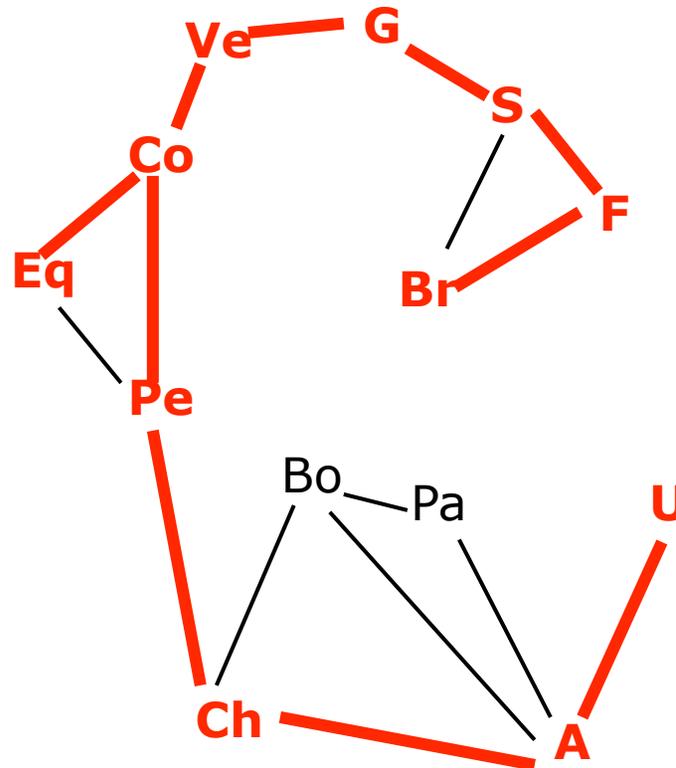
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**Example:** Start at Ch.

Ch,Pe,Co,Ve,G,S,F,Br,Eq,A,U



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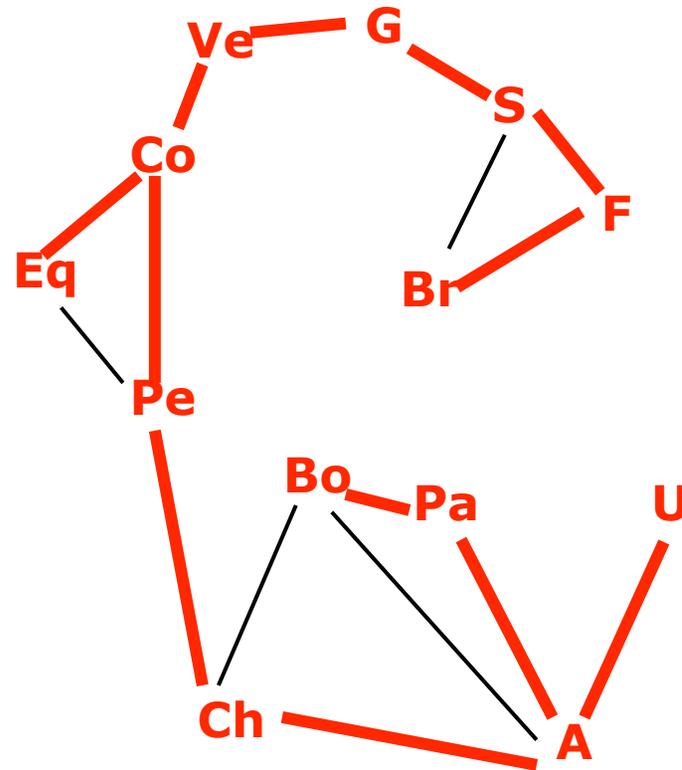
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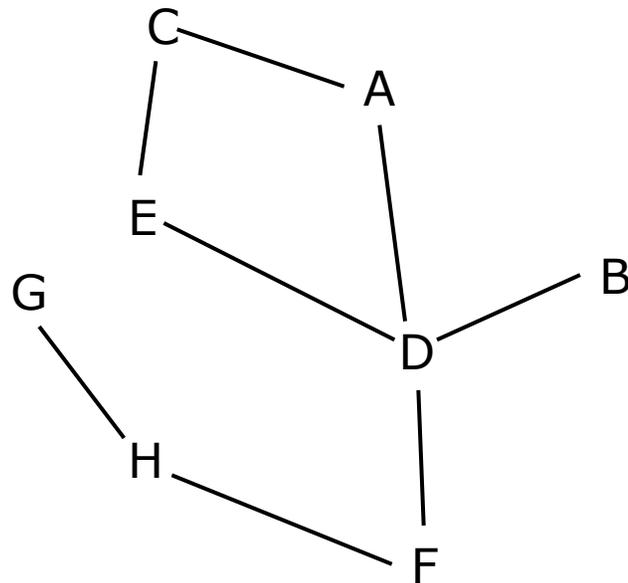
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**Example:** Start at Ch.

Ch,Pe,Co,Ve,G,S,F,Br,Eq,A,U,Pa,Bo



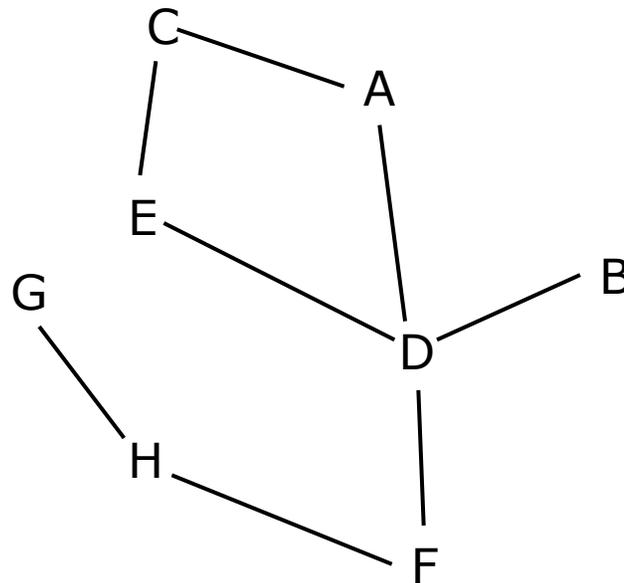
**In-Class Quiz:** Find a depth-first traversal starting a F.



**In-Class Quiz:** Find a depth-first traversal starting a F.

One Answer: F,H,G,D,B,A,C,E

**In-Class Quiz:** Find a depth-first traversal starting a E.

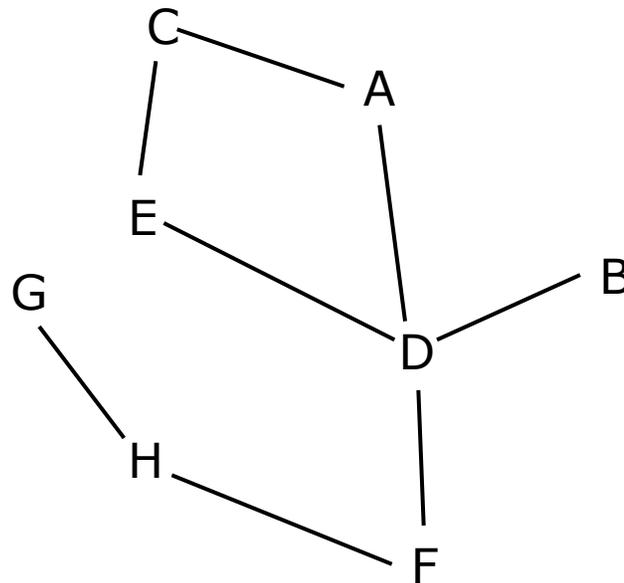


**In-Class Quiz:** Find a depth-first traversal starting a F.

One Answer: F,H,G,D,B,A,C,E

**In-Class Quiz:** Find a depth-first traversal starting a E.

One Answer: E,D,F,H,G,A,C,B



## An algorithm to visit vertices in depth-first order

visit(v) – This function should be called when a vertex is first visited.

The function being defined is “D”.

Recursive: D calls itself

```
D(v):  
  if v has not been visited then  
    visit(v)  
    for each edge from v to x  
      D(x)  
    endFor  
  endIf
```

# Trees

A tree is a special kind of graph

**Connected** – a path between any two nodes

No cycles

Trees are drawn “upside down”

**Root** – the node at the top; Every tree has exactly one root.

**Parent / Children** – The parent is immediately above its children

**Leaves** – Nodes without children

**Height** (or **depth**) of the tree

– length of longest path from root to some leaf.

## Example:

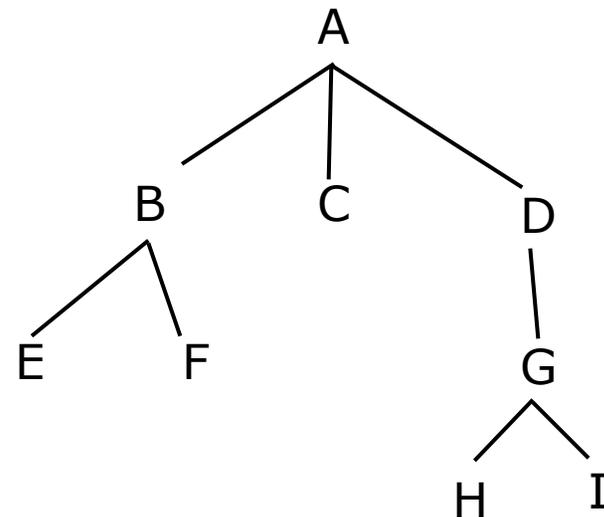
Which node is the root?

What are the children of A?

Who is the parent of node G?

Which nodes are leaves?

What is the depth of this tree?



# Subtrees

Any node in a tree is the root of a subtree.

## Representing Trees with Lists

One way to represent a tree is as a list whose head is the root of the tree and whose tail is a list of subtrees. Each subtree is represented the same way.

$\langle A, xxx, yyy, zzz \rangle$

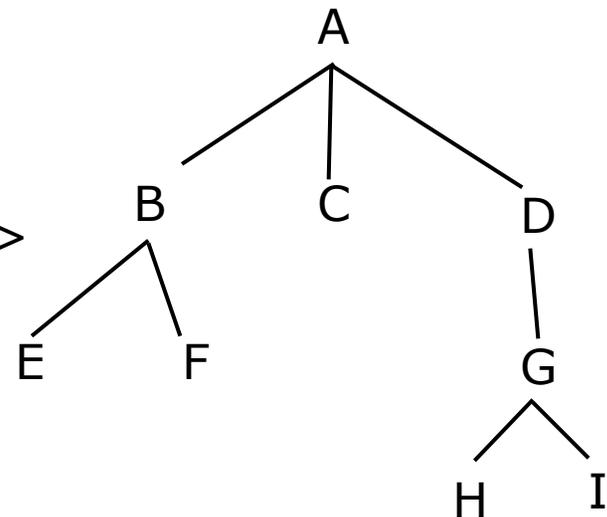
where

$xxx = \langle B, \langle E \rangle, \langle F \rangle \rangle$

$yyy = \langle C \rangle$

$zzz = \langle D, \langle G, \langle H \rangle, \langle I \rangle \rangle \rangle$

$\langle A, \langle B, \langle E \rangle, \langle F \rangle \rangle, \langle C \rangle, \langle D, \langle G, \langle H \rangle, \langle I \rangle \rangle \rangle \rangle$

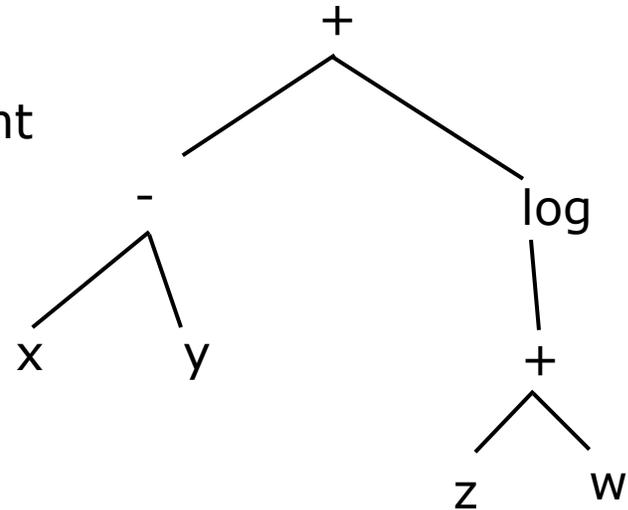


# Representing Expressions with Trees

Any algebraic expression can be represented with a tree.

**Example:**  $(x-y) + \log(z+w)$

**In-class quiz:** Find a depth-first, left-to-right traversal of this tree.



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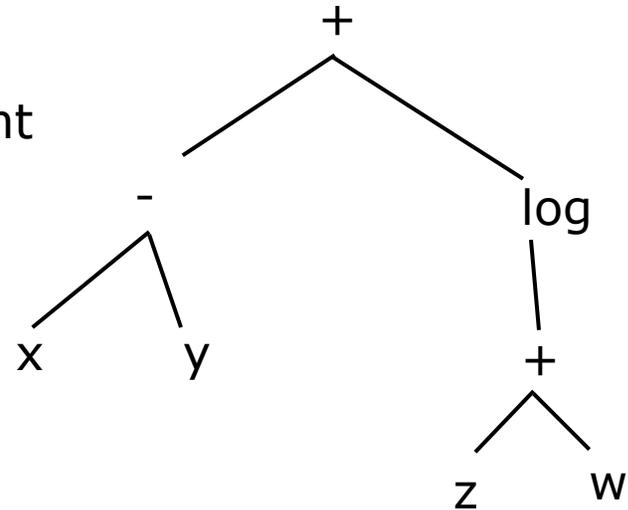
**Example:**  $(x-y) + \log(z+w)$

**In-class quiz:** Find a depth-first, left-to-right traversal of this tree.

+ - x y log + z w

This is the **prefix form** of the expression.

*Note: Parentheses are never needed in a prefix-form expression.*



# Binary Trees

Each vertex either...

is empty, denoted  $\langle \rangle$

has two subtrees that are binary trees.

**Left** subtree, **right** subtree

Alternately: nodes have  $\leq 2$  children.

Representing binary trees with tuples

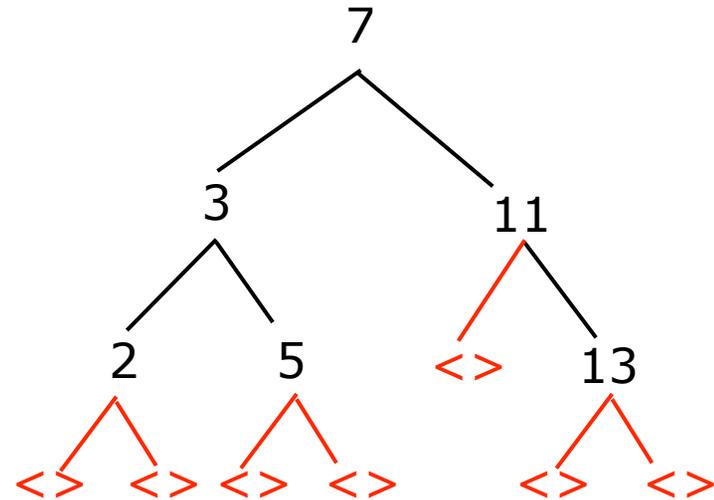
empty:  $\langle \rangle$

non-empty:  $\langle L, x, R \rangle$

where  $x$  is the subtree's root,  $L$  and  $R$  are the two subtrees.

A node with no children (a leaf):  $\langle \langle \rangle, 2, \langle \rangle \rangle$

A node with two children:  $\langle \langle \langle \rangle, 2, \langle \rangle \rangle, 3, \langle \langle \rangle, 5, \langle \rangle \rangle \rangle$



A **binary search tree** represents ordered information.

The predecessors of  $x$  are in the left subtree of  $x$ .

The successors of  $x$  are in the right subtree of  $x$ .

**Example:** This is a binary search tree for the first 6 prime numbers.

# Spanning Trees

A spanning tree for a connected graph is a tree whose nodes are the nodes of the graph and whose edges are a subset of the edges of the graph.

A **weighted graph**: Each edge has an associated value, its weight.

A **minimal spanning tree** is a spanning tree that minimizes the weights on the edges in the tree.

## Prim's Algorithm:

Let  $V$  be the set of vertices in the graph

Compute  $S$  = the set of edges in the spanning tree

$W$  = a variable, a set of vertices reached

Initialize  $S := \emptyset$

Pick any  $v$  in  $V$ . Set  $W := \{v\}$

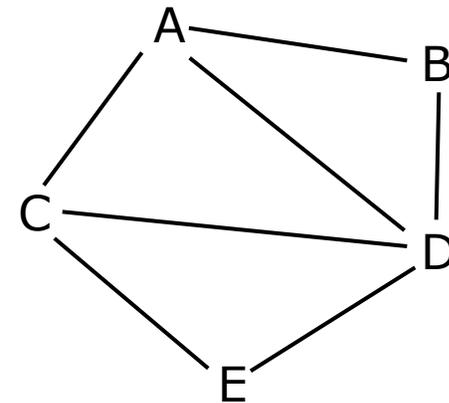
**while**  $W \neq V$

Find a minimum weight edge  $\{x,y\}$ , where  $x \in W$  and  $y \in V - W$

$S := S \cup \{\{x,y\}\}$

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**endWhile**



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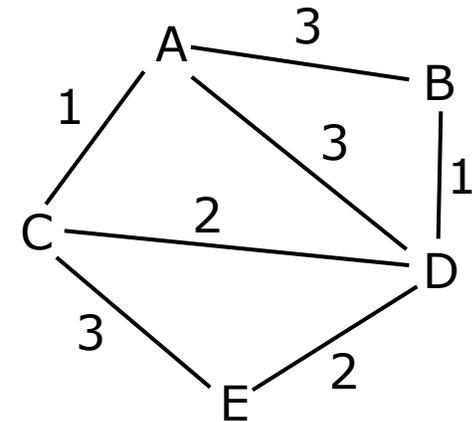
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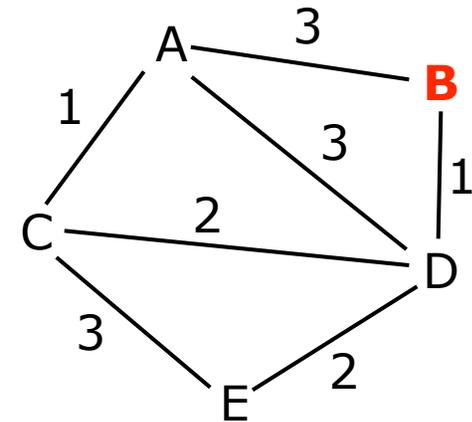
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$W = \{ \mathbf{B} \}$

$S = \{ \}$

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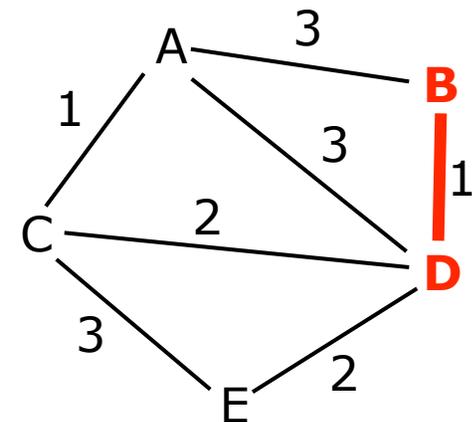
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$W = \{ \mathbf{B}, \mathbf{D} \}$

$S = \{ \mathbf{BD} \}$

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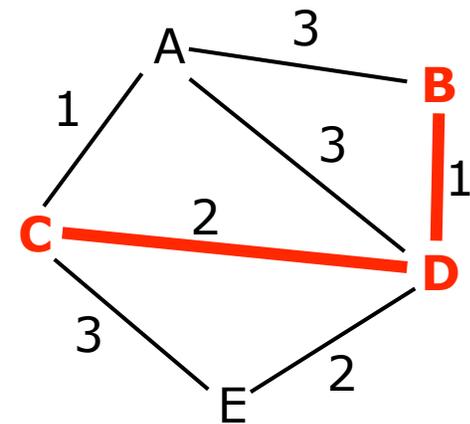
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$W = \{ \mathbf{B}, \mathbf{D}, \mathbf{C} \}$

$S = \{ \mathbf{BD}, \mathbf{CD} \}$

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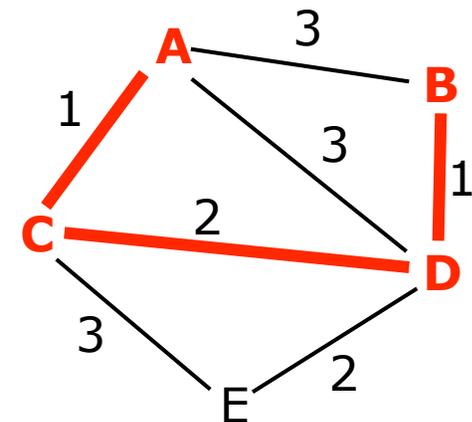
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$$W = \{ \mathbf{B, D, C, A} \}$$

$$S = \{ \mathbf{BD, CD, AC} \}$$

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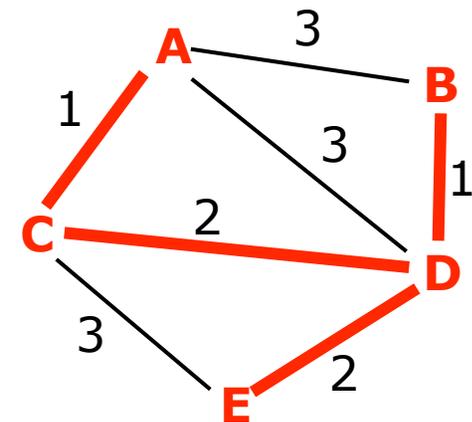
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$W = \{ \mathbf{B, D, C, A, E} \}$

$S = \{ \mathbf{BD, CD, AC, DE} \}$