

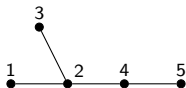
## Rooted trees

Recall that a **tree** is an acyclic connected graph. A **rooted tree** is a (labeled) tree, together with a choice of special vertex.

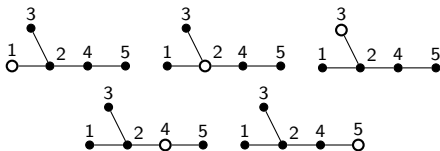
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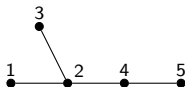
then there are 5 associated *rooted* trees:



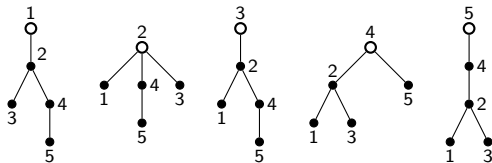
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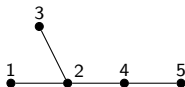


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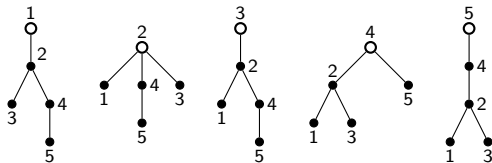
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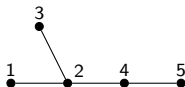
**Aside:** How many rooted trees are there with vertex set  $V = \{1, \dots, n\}$ ?

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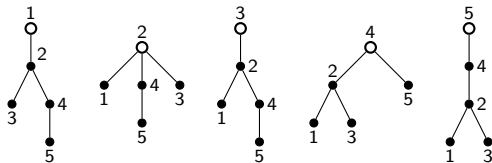
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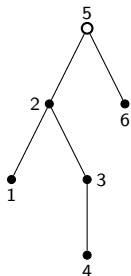
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$$n^{n-2} * n = \boxed{n^{n-1}}$$

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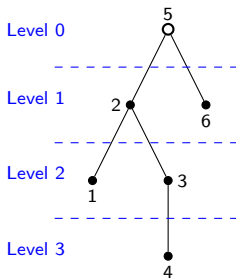


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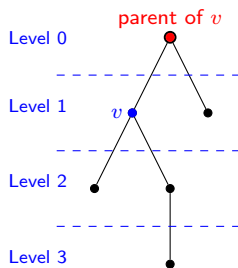
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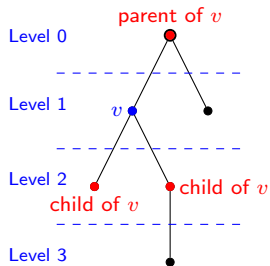
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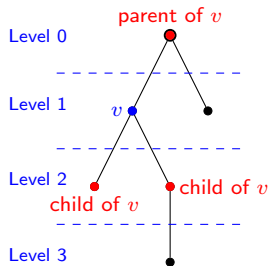
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Recall a **leaf** is a vertex of degree 1; note that leaves are the vertices with no children. Everything else is called an **internal vertex**.

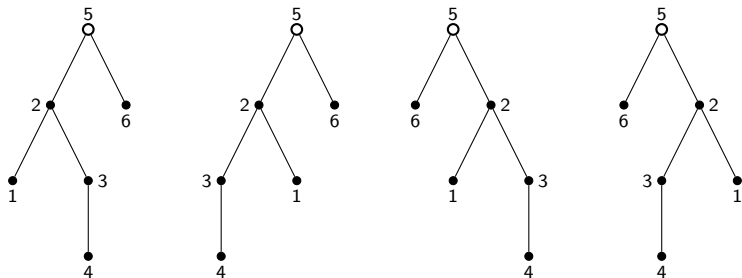
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Recall that a **tree** is an acyclic connected graph. A **rooted tree** is a (labeled) tree, together with a choice of special vertex. An **ordered rooted tree** (ORT) is a rooted tree, together on a choice of order on each of the children of each vertex.

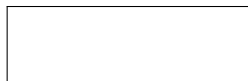
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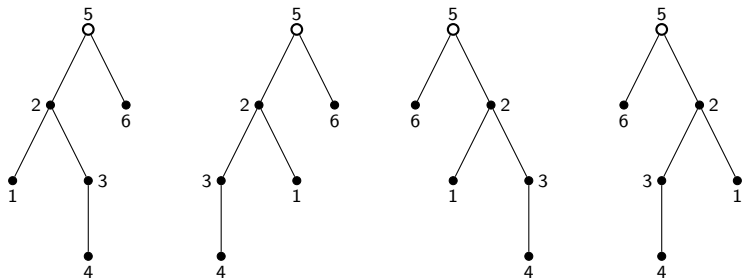


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Given a rooted tree, there are  $\prod_{v \text{ internal}} (\deg(v) - 1)$  associated ORT's.

**You try:** How many ORT's are there on the vertex set  $V = \{1, 2, 3, 4\}$ ?

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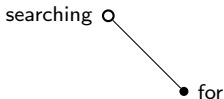
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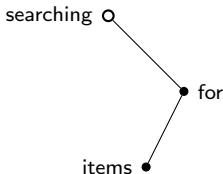


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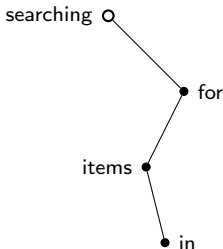


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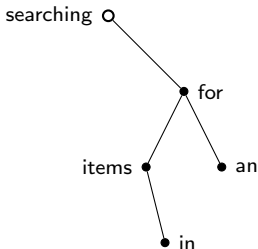


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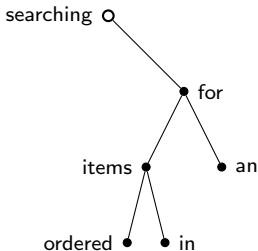


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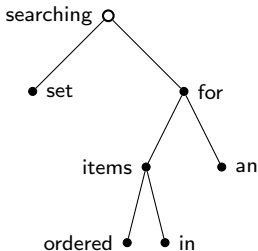


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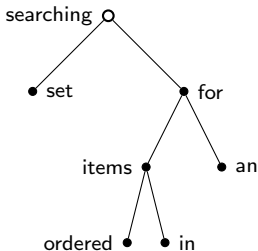


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**You try:** add the words { build, the, search, tree } to the above ORT.

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**Remark:** There are algorithms for balancing search trees as they get built. (See: “data structures”)

**Moral:** Building the tree takes some work, but once it’s built, it reduces the computational complexity of finding items.

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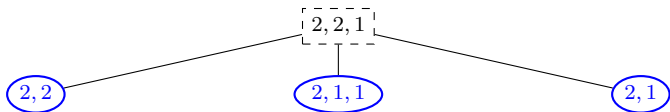
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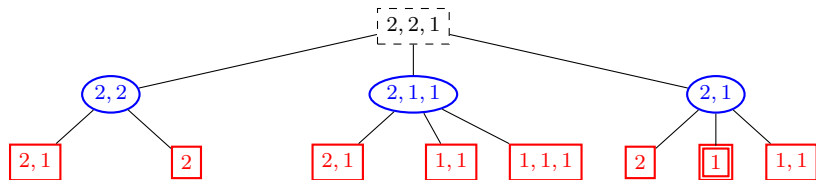




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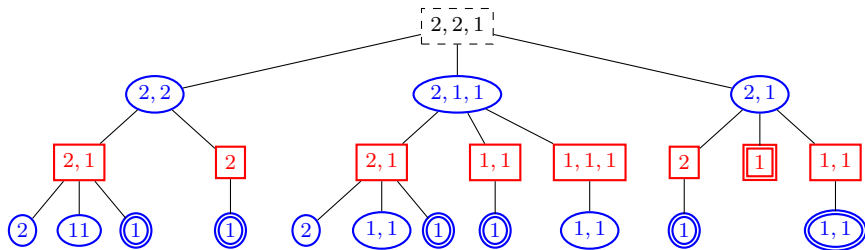
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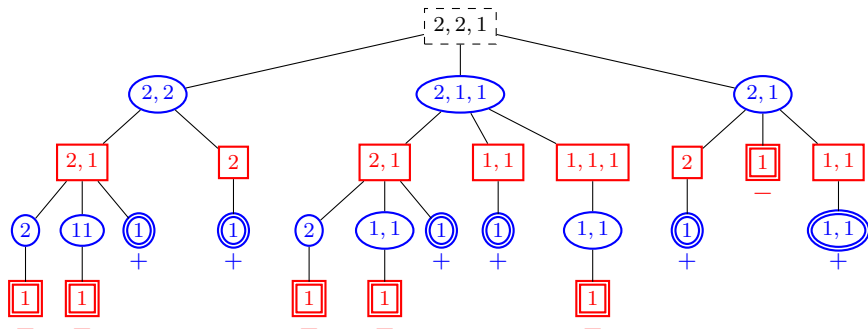




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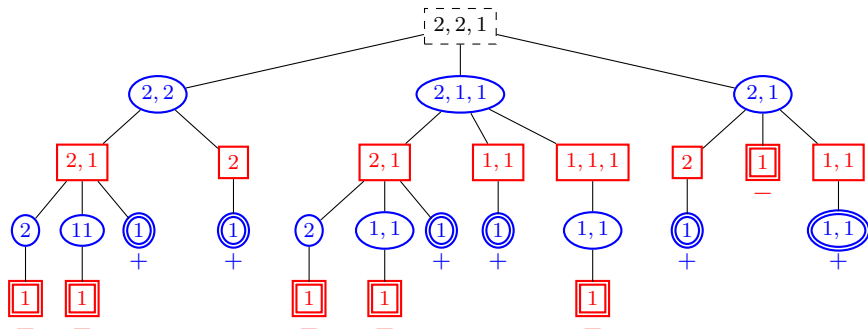


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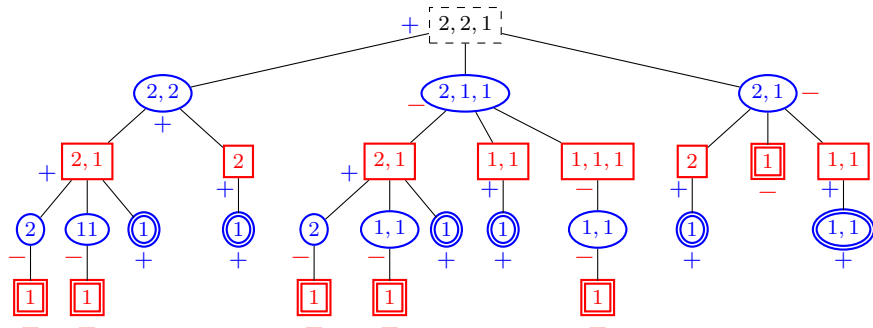


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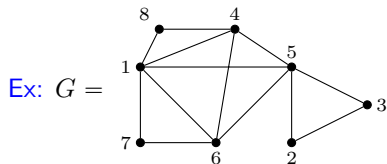


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**Thm:** The value says who will win if each player follows a min/max strategy.

## Application 3: Searching graphs

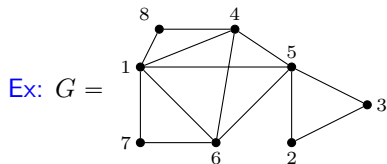
Let  $G$  be a simple connected graph, and put an order on the vertices.





## Application 3: Searching graphs

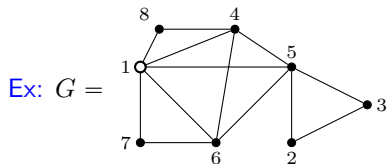
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Depth-first search:

## Application 3: Searching graphs

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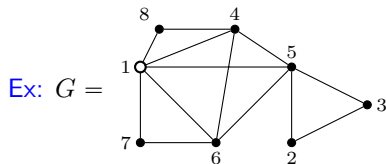


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## Application 3: Searching graphs

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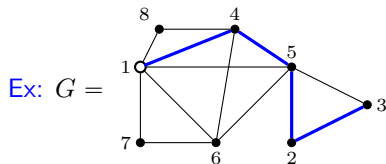


Depth-first search:

1. Pick a vertex to start at.
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## Application 3: Searching graphs

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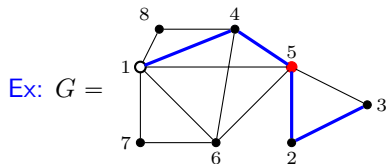


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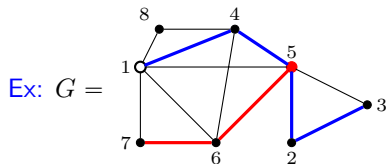


Depth-first search:

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3. Tracing backwards along your last walk, stop at the last vertex that had an available neighbor.

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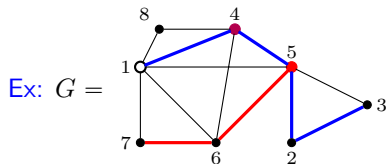


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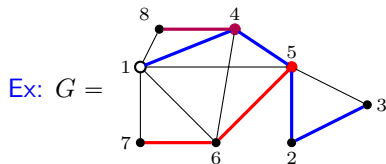


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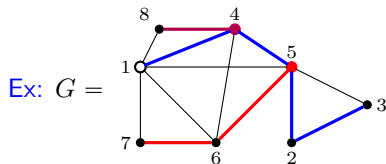
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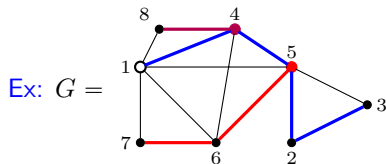


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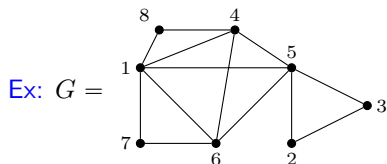
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The result is a *rooted spanning tree*.

# Searching graphs

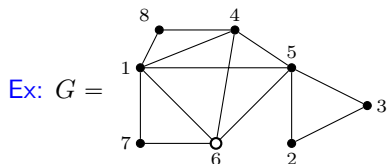
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Breadth-first search:

# Searching graphs

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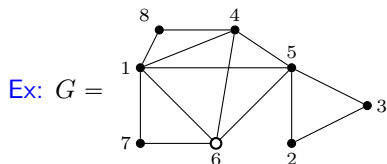


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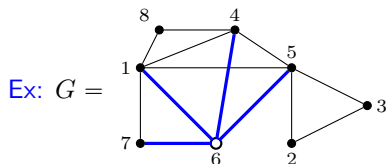


Breadth-first search:

1. Pick a vertex to start at.
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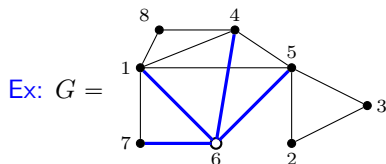


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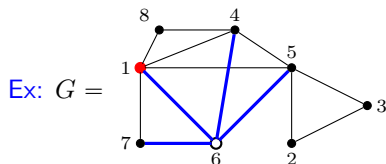


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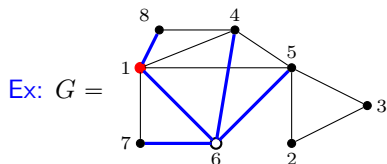
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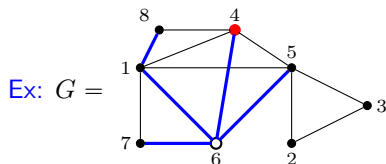


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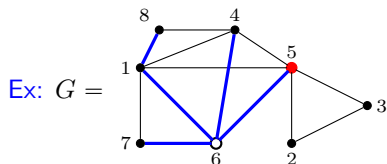


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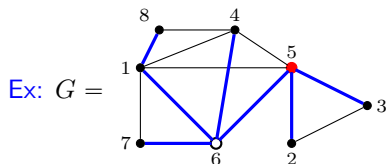


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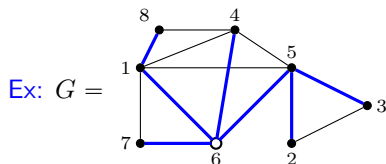


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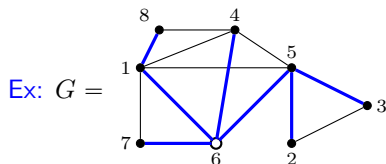


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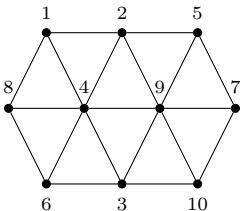


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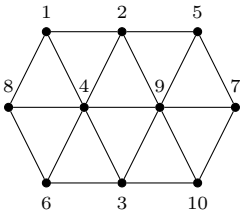
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The result is also a *rooted spanning tree*. Note that at each recursion, you're building all of the vertices at a given level.

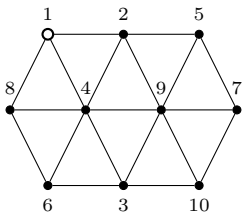
You try: Starting from vertex 1, compute the depth-first and breadth-first search trees for the graph



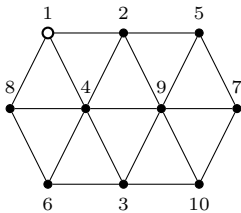
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Depth:



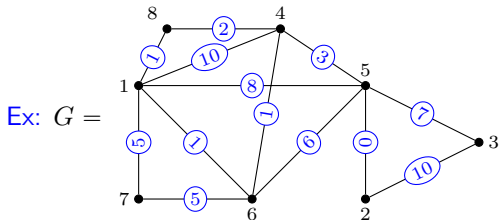
Breadth:



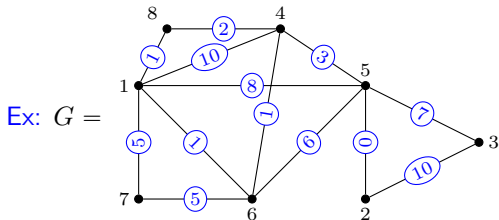


A **weighted graph** is a graph together with numerical weighting on the edges.

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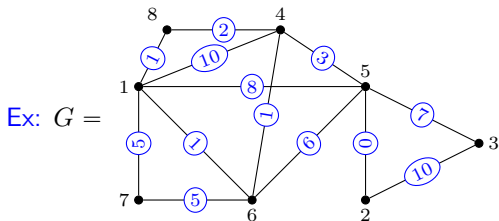


Relevant questions:

- Given vertices  $u$  and  $v$ , what's the smallest-weight walk from  $u$  to  $v$ ?  
(Think: flights, cab rides, production lines, etc.)
- What is the smallest-weight spanning tree?

See also: [Traveling salesman problem](#).

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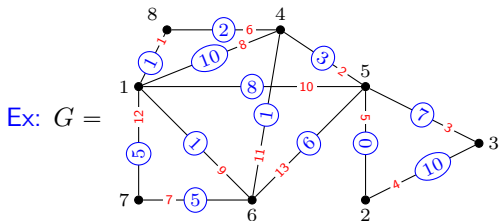
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**Prim's algorithm:** Order the edges.

1. Pick an edge of minimum weight and add it (and its vertices) to your tree.
2. Of all edges incident to vertices already included, moving in order, add all edges of minimum available weight (without creating cycles).
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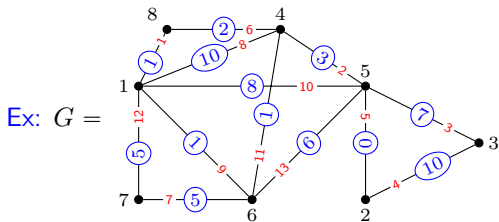
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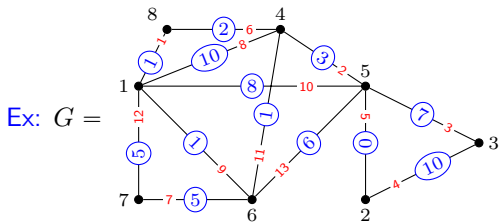
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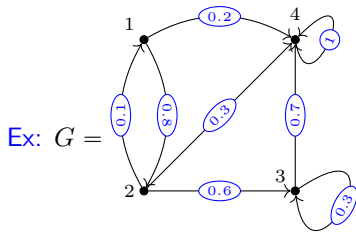


## Random walks

Let  $G$  be a weighted directed graph (assume no multiple arrows), satisfying the property that for any vertex  $v$ , the sum of the weights on the out-arrows is 1.

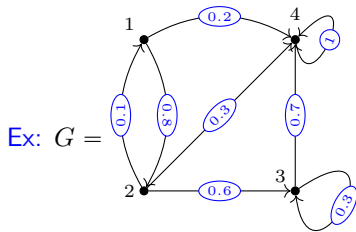
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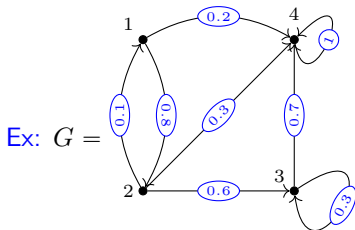
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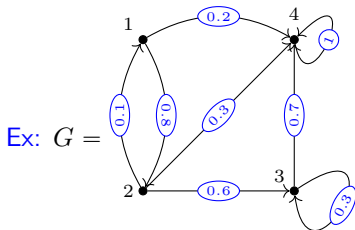


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**Example:** Suppose you play a game of dice, where at each turn you roll two six-sided dice. If you roll a multiple of 4, you get \$3; if you don't, you pay \$1.

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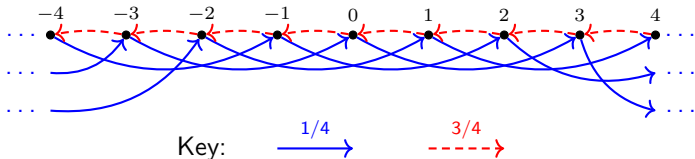
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Relevant questions: Starting at vertex  $u$ ...

1. What's the probability that you'll reach vertex  $v$ ?
2. After  $n$  steps, what's the probability that you've landed at  $v$ ?
3. Is it more likely for a walk gravitate toward any one vertex? Is it more likely that a random walk wanders off in any particular direction?