

# Scheduling

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Set of tasks for baking cookies:

- Shop for groceries
- Put the cookies in the oven
- Clean the kitchen
- Beat the eggs in a bowl
- Measure the flour and sugar in a bowl
- Mix the eggs with the flour and sugar
- Turn on the oven
- Set the timer
- Take out the cookies

# Scheduling

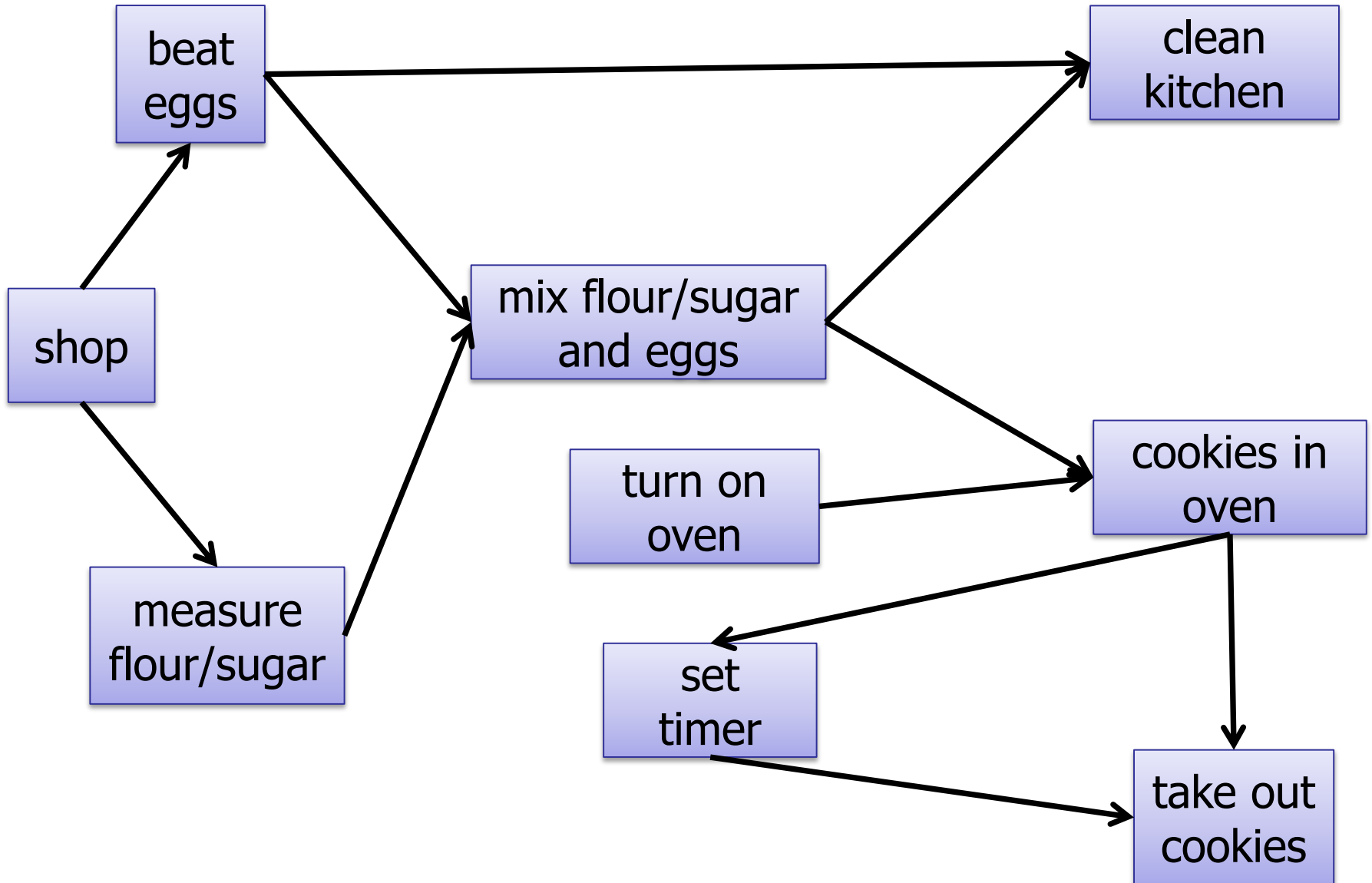
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## Ordering:

- Shop for groceries **before** beat the eggs
- Shop for groceries **before** measure the flour
- Turn on the oven **before** put the cookies in the oven
- Beat the eggs **before** mix the eggs with the flour
- Measure the flour **before** mix the eggs with the flour
- Put the cookies in the oven **before** set the timer
- Measure the flour **before** clean the kitchen
- Beat the eggs **before** clean the kitchen
- Mix the flour and the eggs **before** clean the kitchen

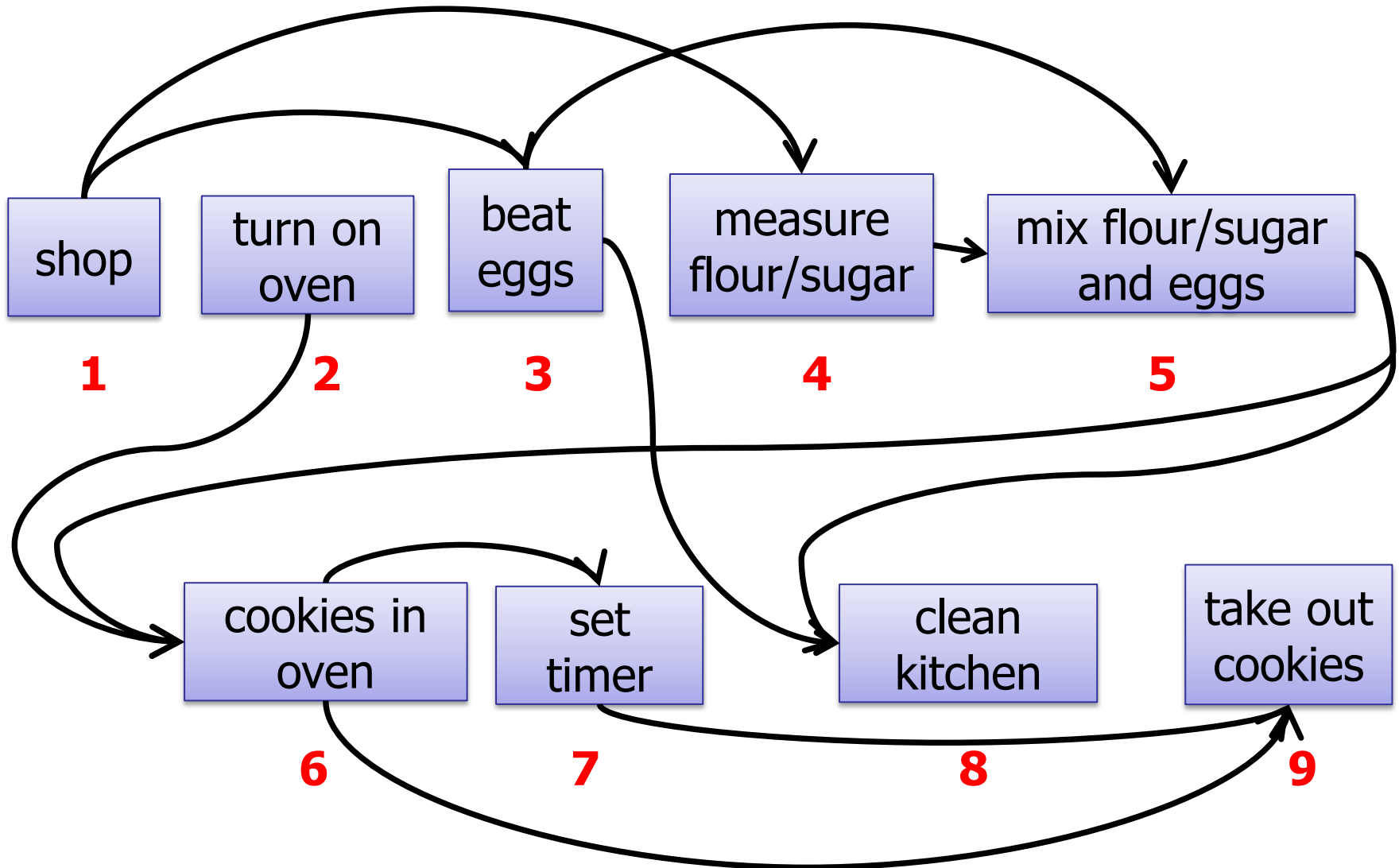
# Scheduling

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# Topological Ordering

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# Topological Order

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## Properties:

1. Sequential total ordering of all nodes

1. shop

2. turn on oven

3. measure flour/sugar

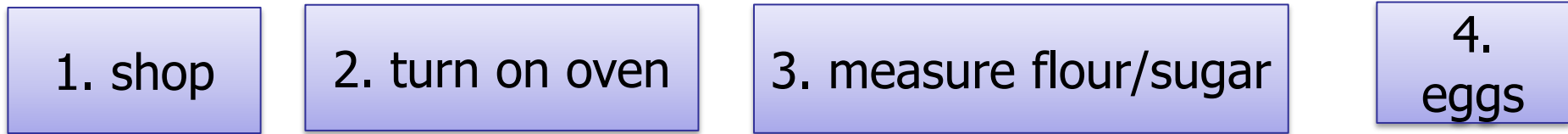
4.  
eggs

# Topological Order

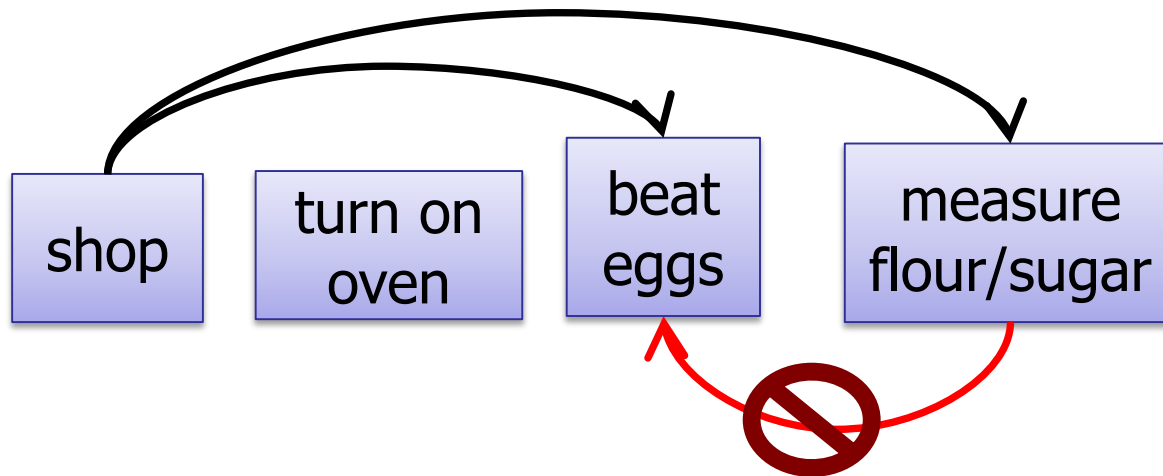
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## Properties:

1. Sequential total ordering of all nodes

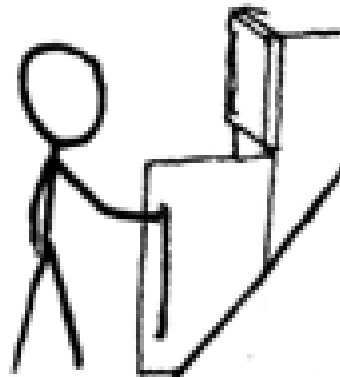


2. Edges only point forward

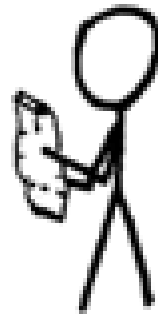


# Which one should we do first?

I HAVE LEFTOVER CHEESE.  
I SHOULD GET CHIPS  
AND MAKE NACHOS.



I HAVE LEFTOVER CHIPS.  
I SHOULD GET CHEESE  
AND MAKE NACHOS.

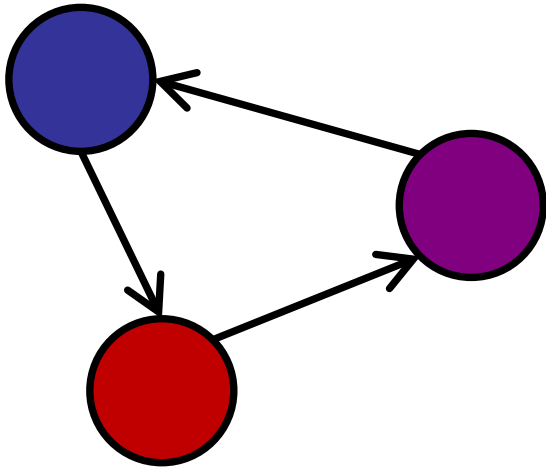


A DELICIOUS CYCLE

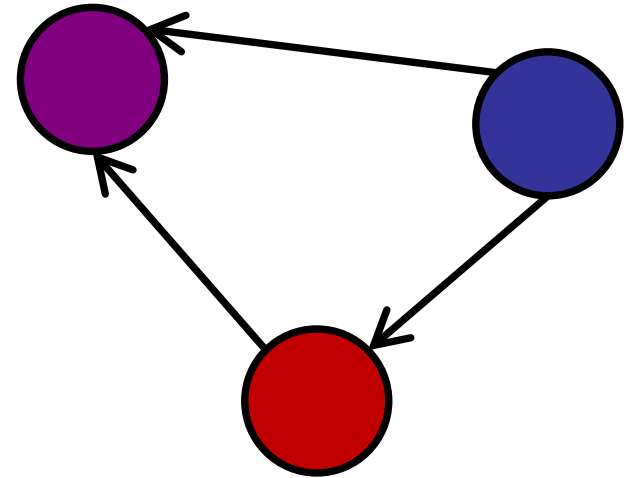
# Directed Acyclic Graphs

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Cyclic



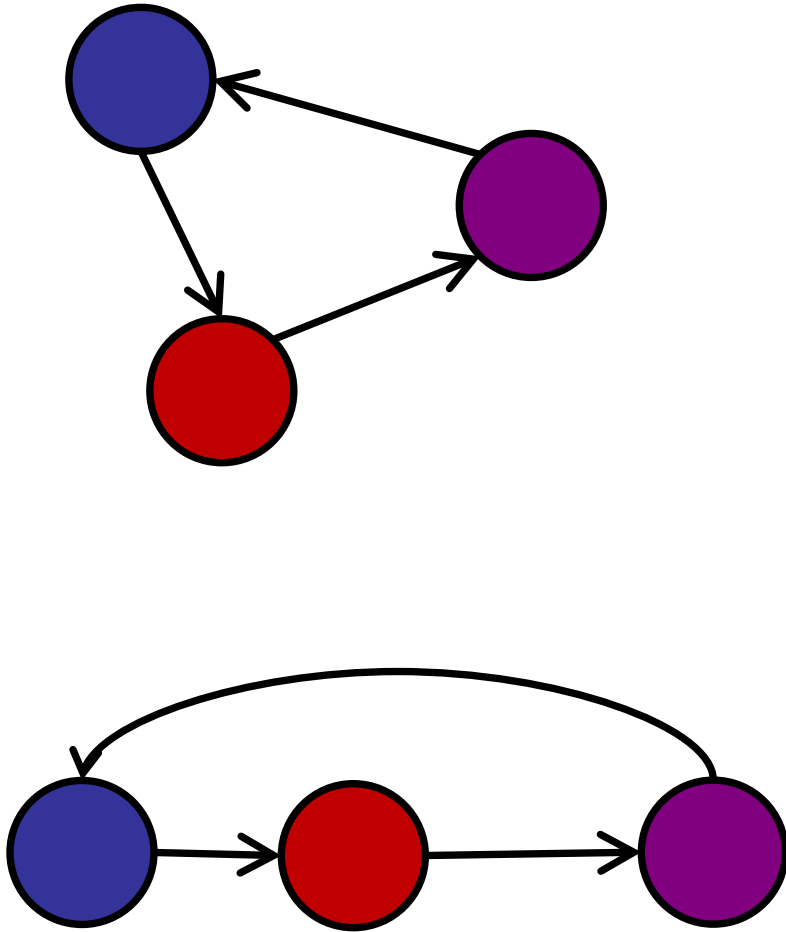
Acyclic



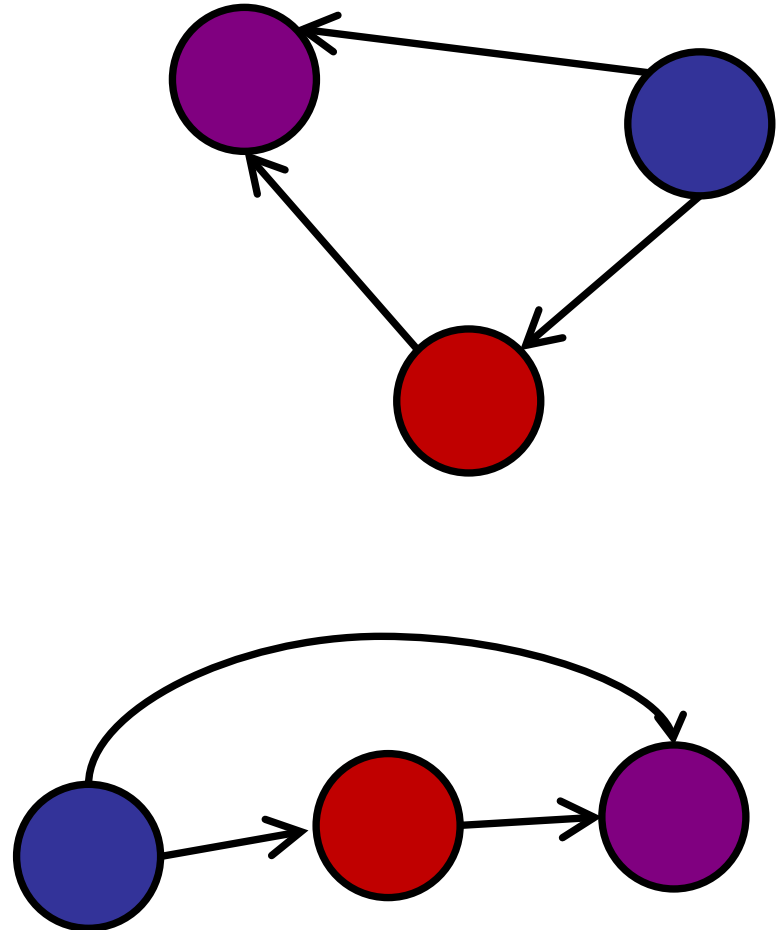


# Directed Acyclic Graphs

Cyclic

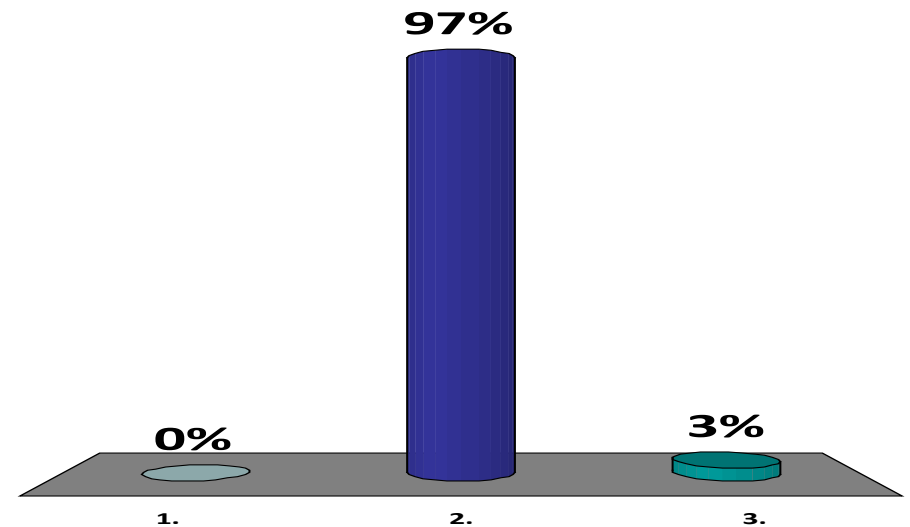
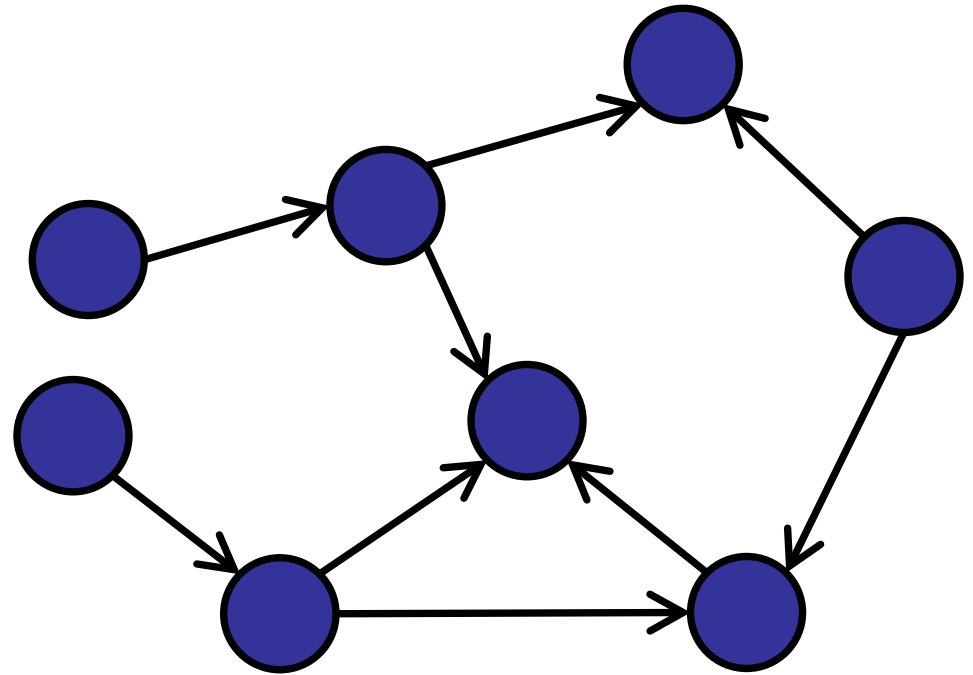


Acyclic



Is this graph:

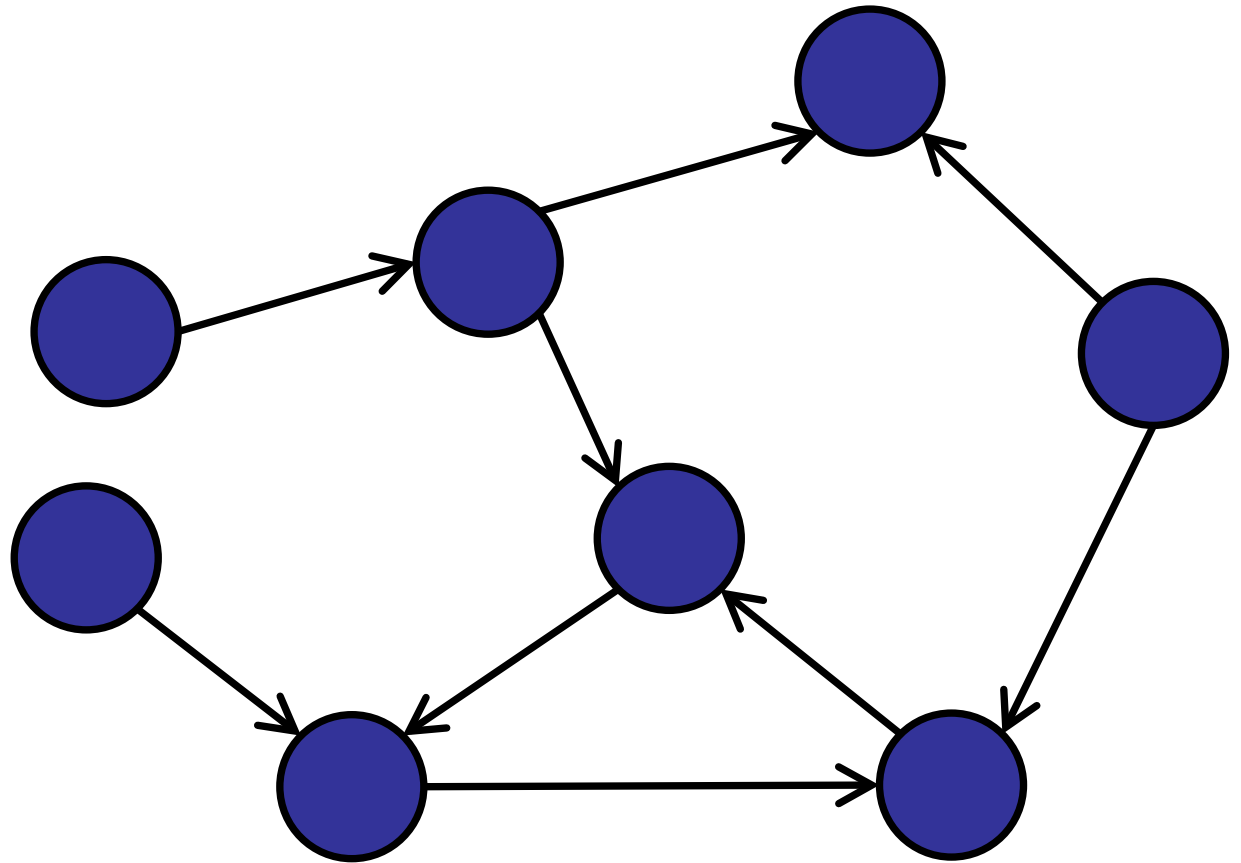
- 1. Cyclic
- ✓ 2. Acyclic
- 3. Transcendental



# Directed Acyclic Graphs

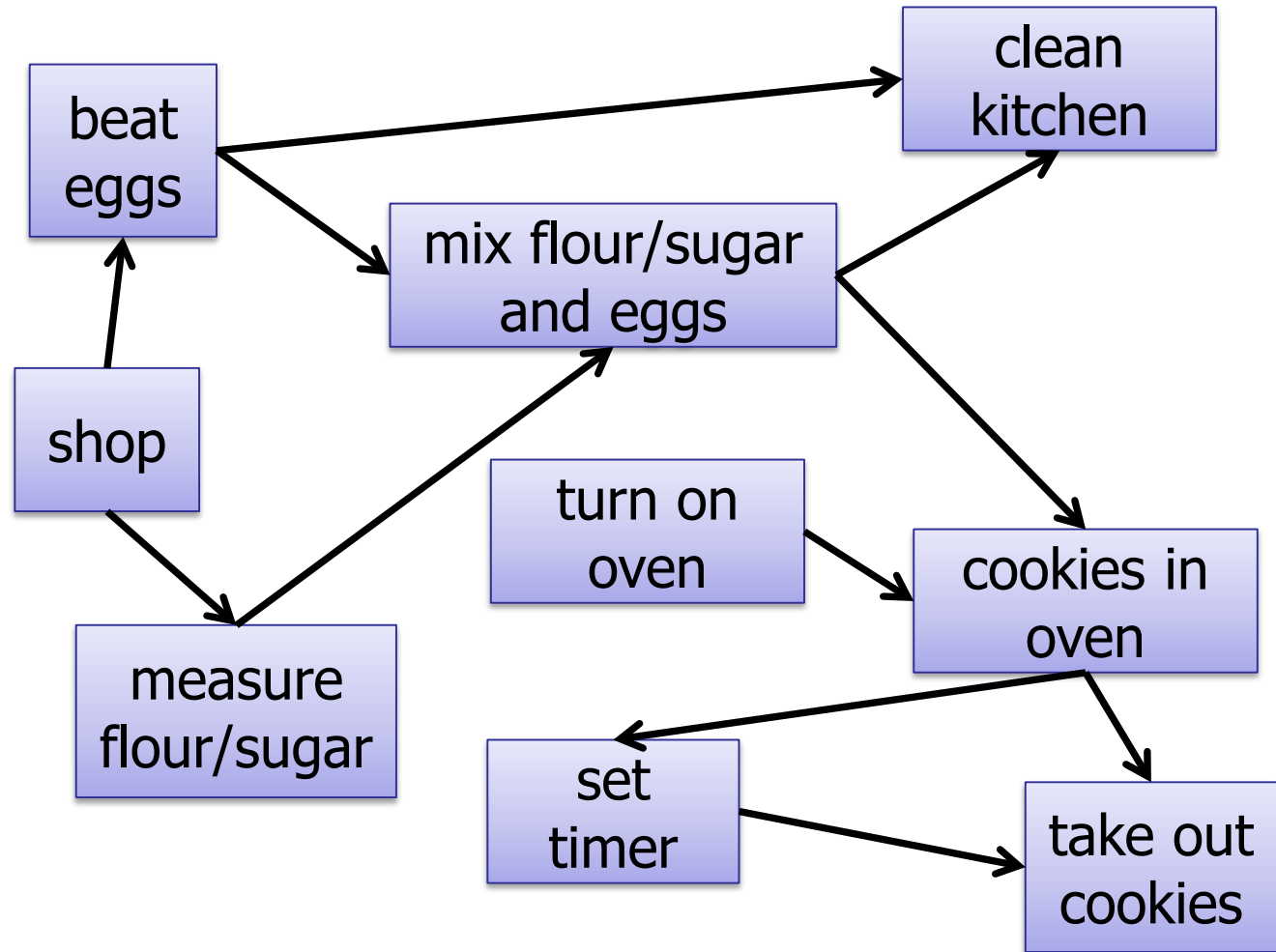
---

Cyclic or Acyclic?



# Directed Acyclic Graph (DAG)

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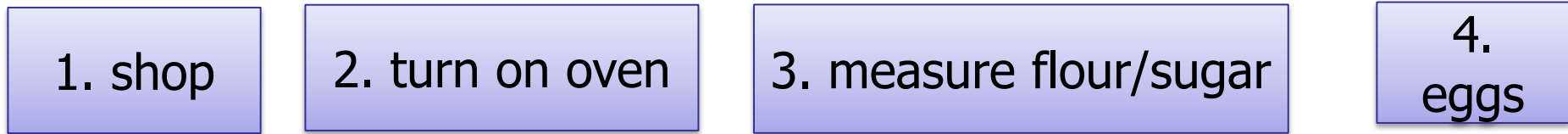


# Topological Order

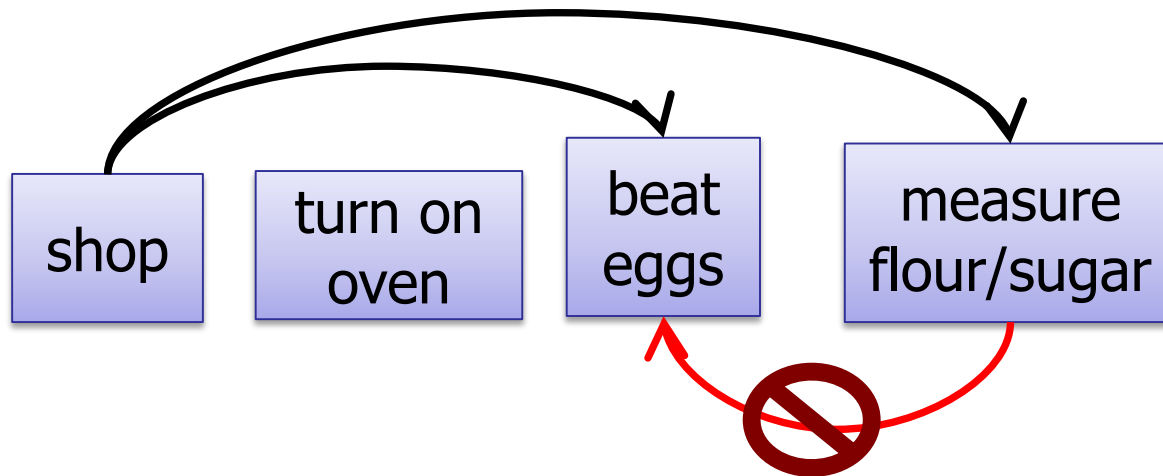
---

## Properties:

1. Sequential total ordering of all nodes

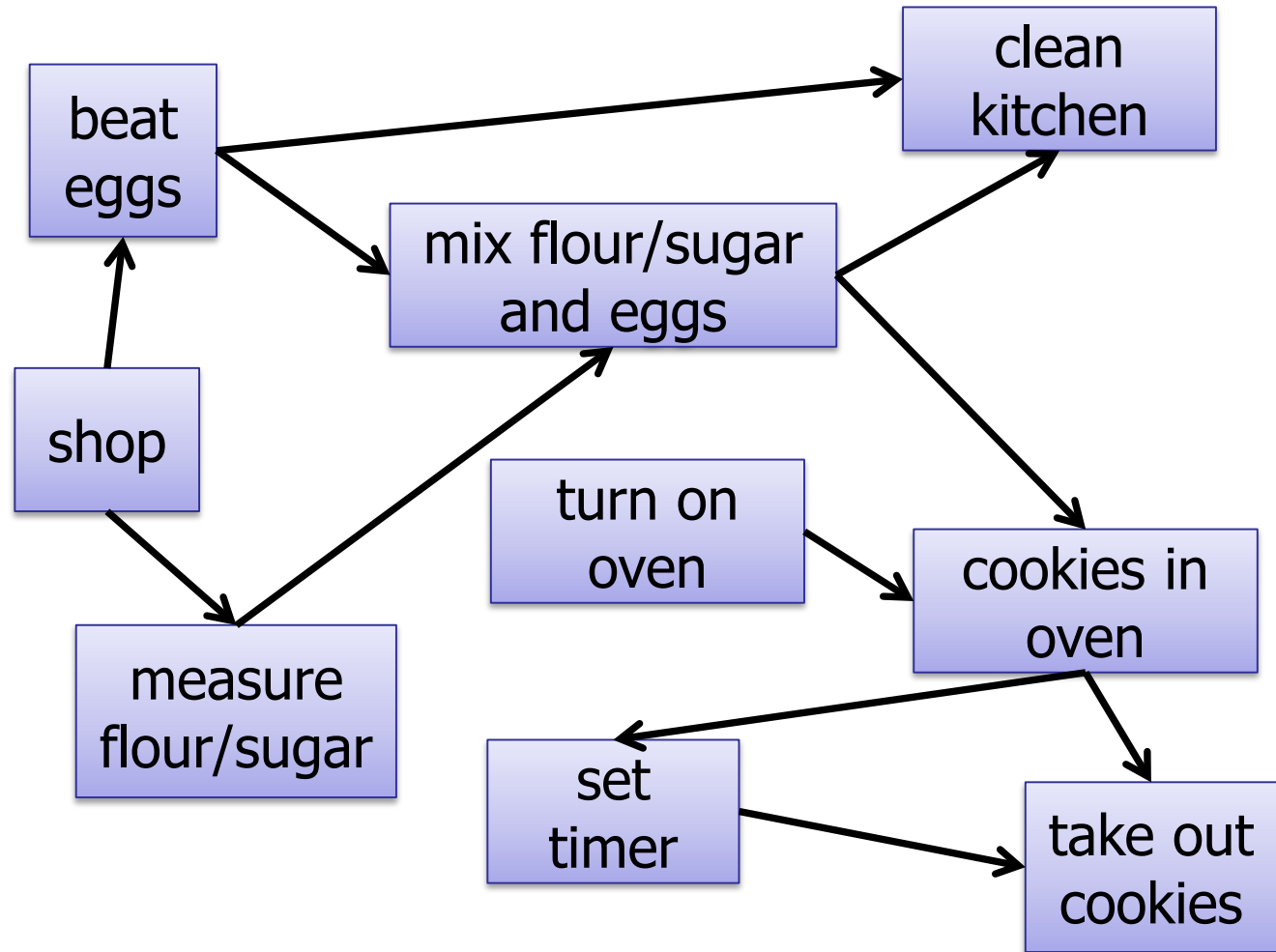


2. Edges only point forward



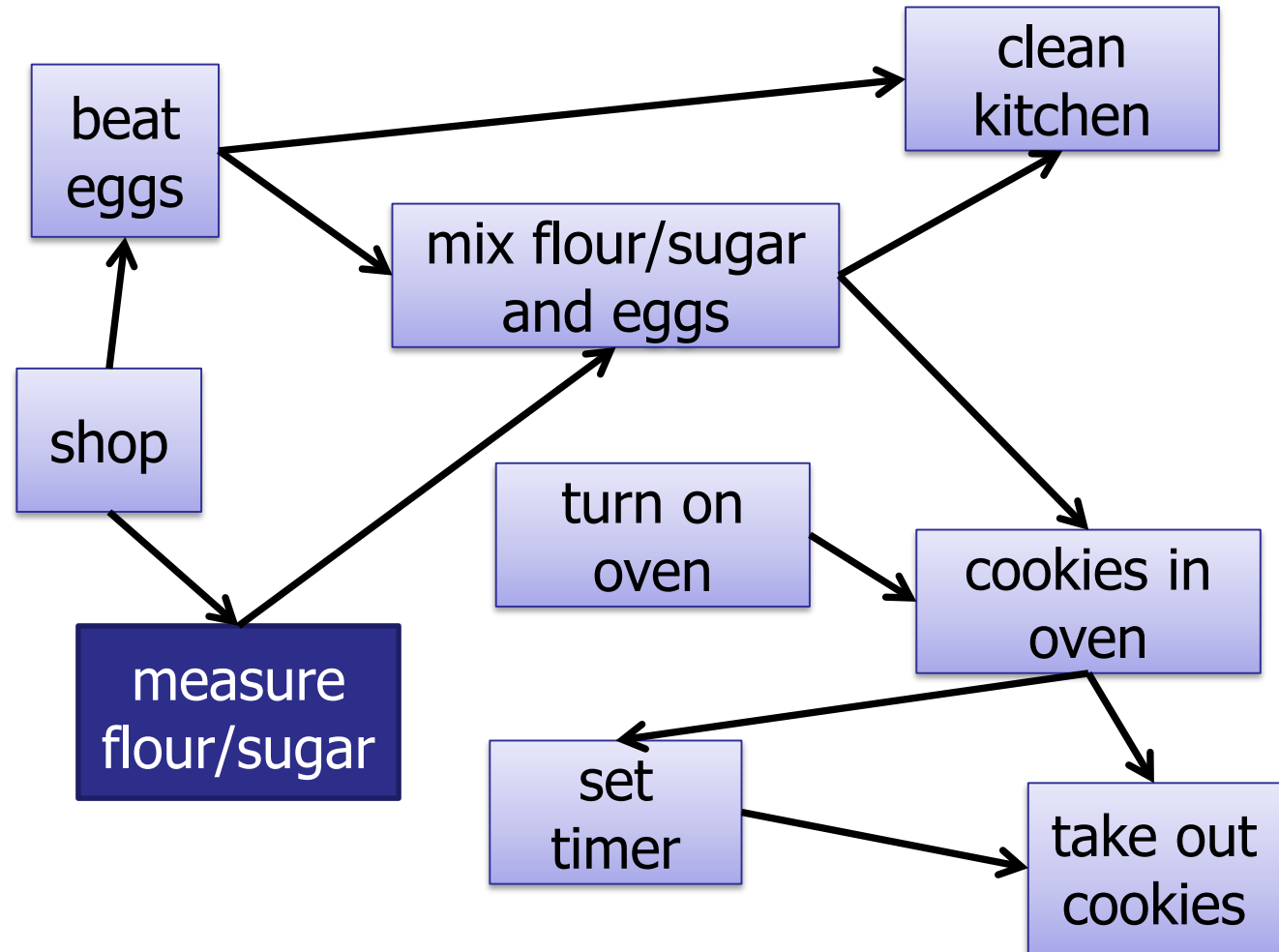
# Depth-First Search (First Try)

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# Depth-First Search

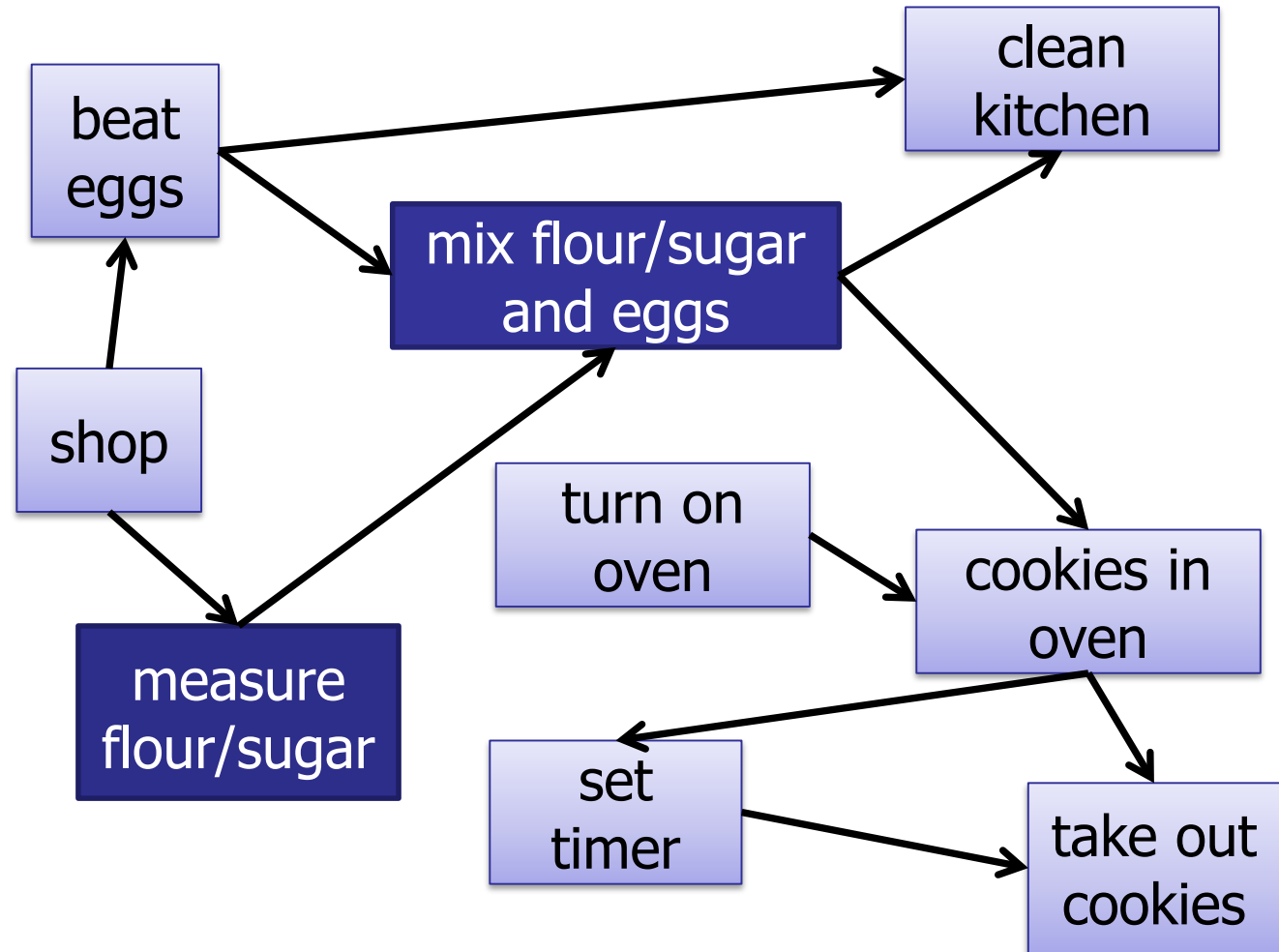
## 1. measure



Deep Blue: First Visit  
Black: Finished Visit

# Depth-First Search

1. measure
2. mix

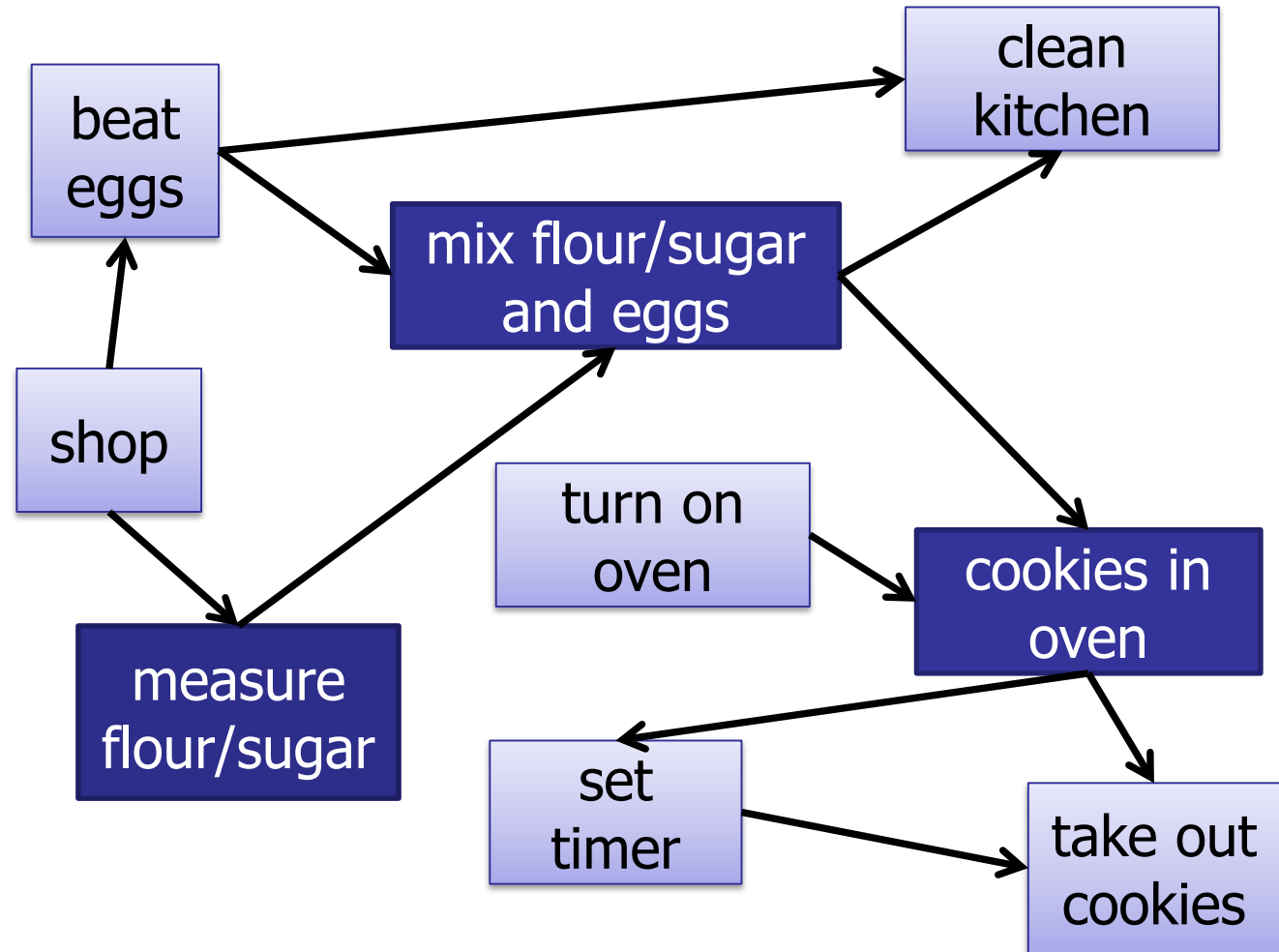


Deep Blue: First Visit  
Black: Finished Visit



# Depth-First Search

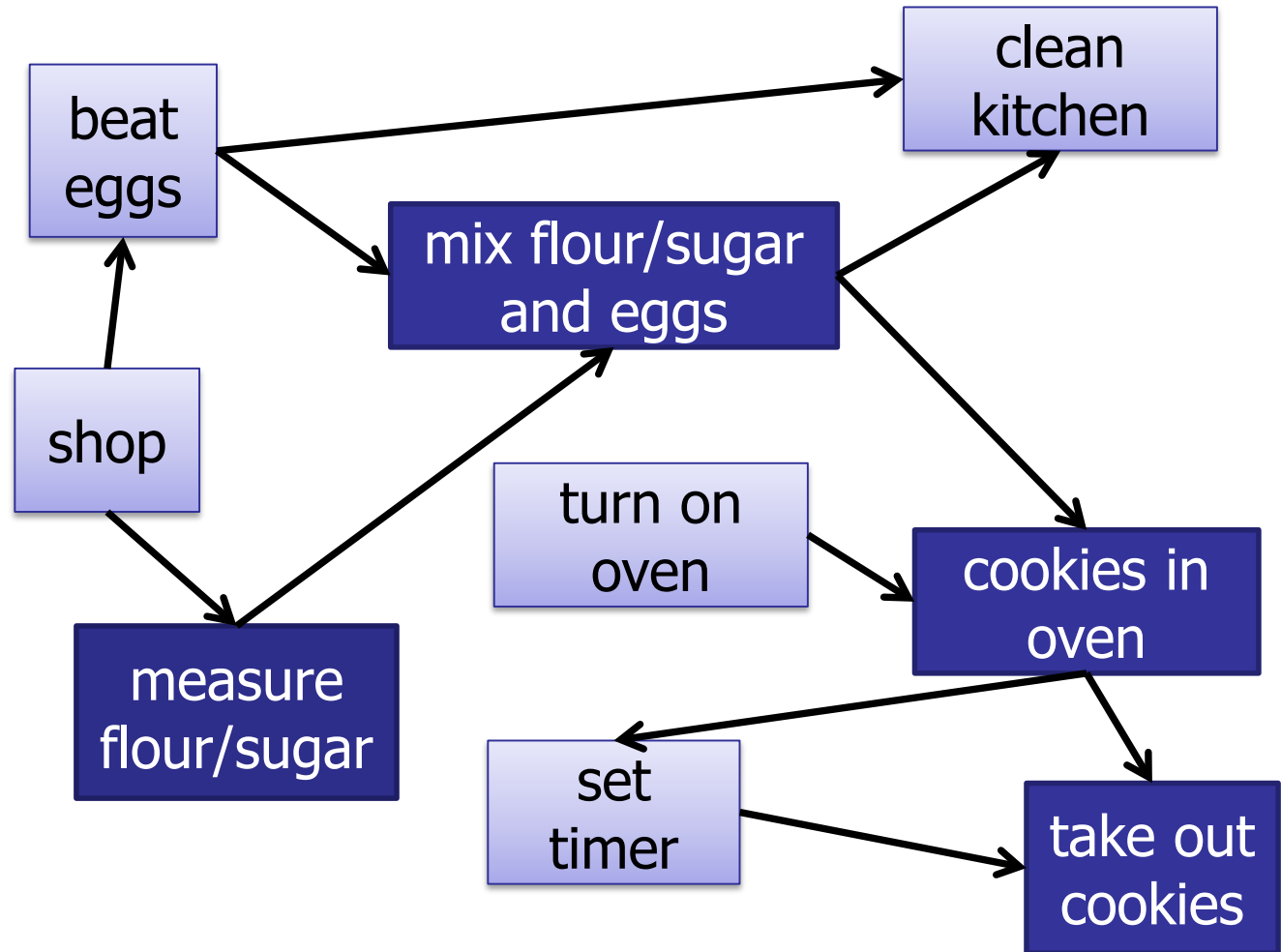
1. measure
2. mix
3. in oven



Deep Blue: First Visit  
Black: Finished Visit

# Depth-First Search

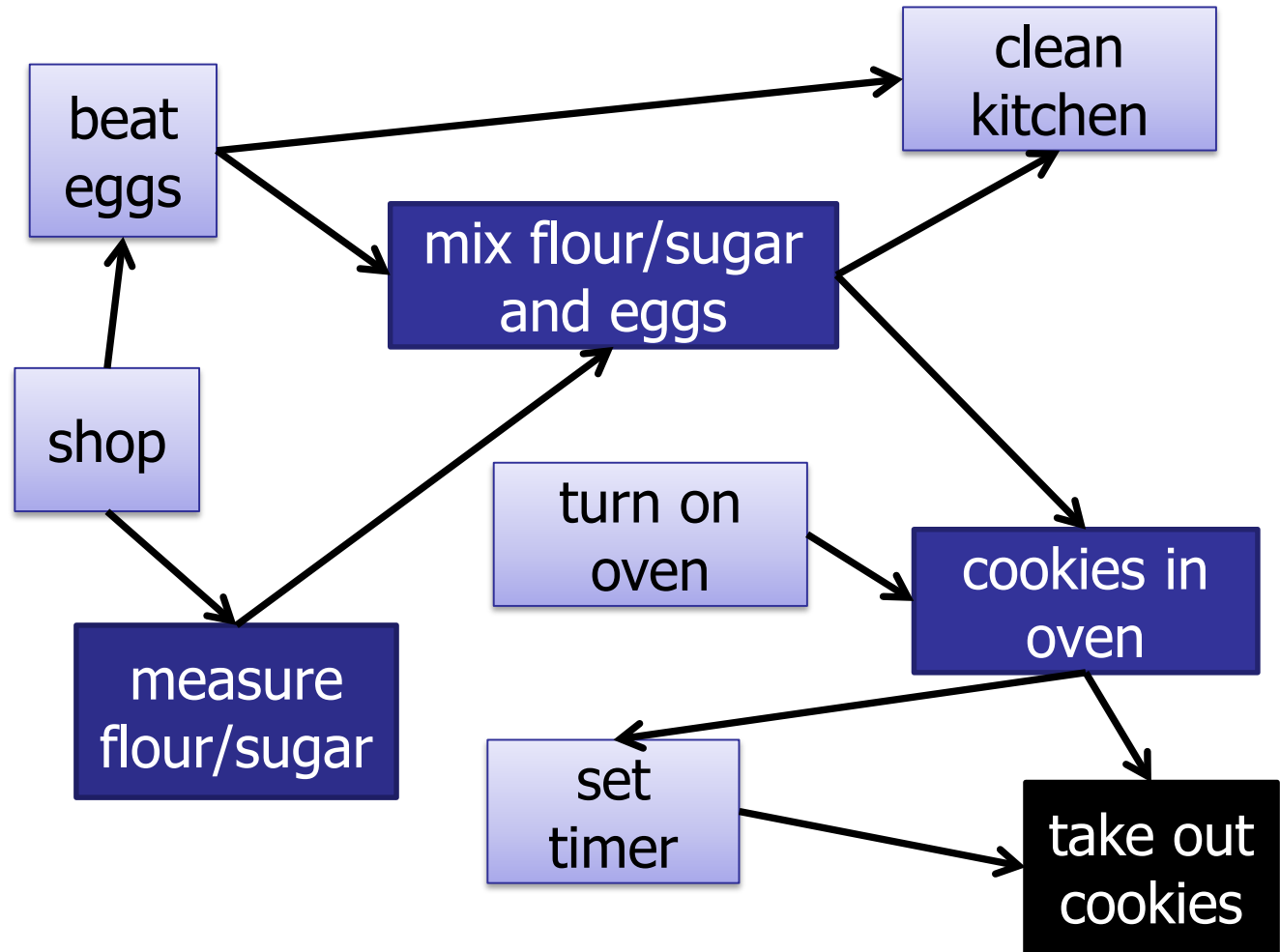
1. measure
2. mix
3. in oven
4. take out



Deep Blue: First Visit  
Black: Finished Visit

# Depth-First Search

1. measure
2. mix
3. in oven
4. take out

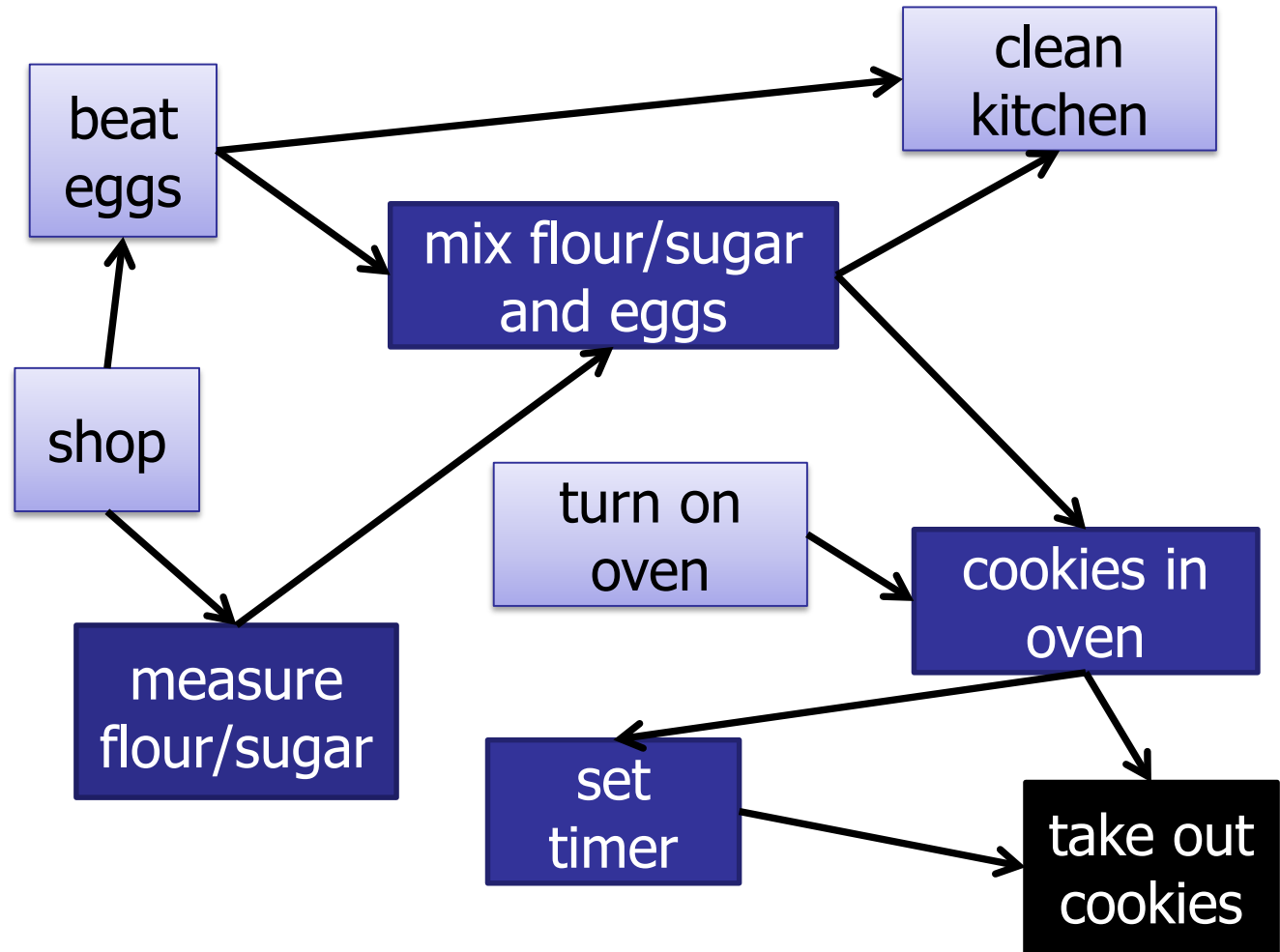


Deep Blue: First Visit  
Black: Finished Visit

# Depth-First Search

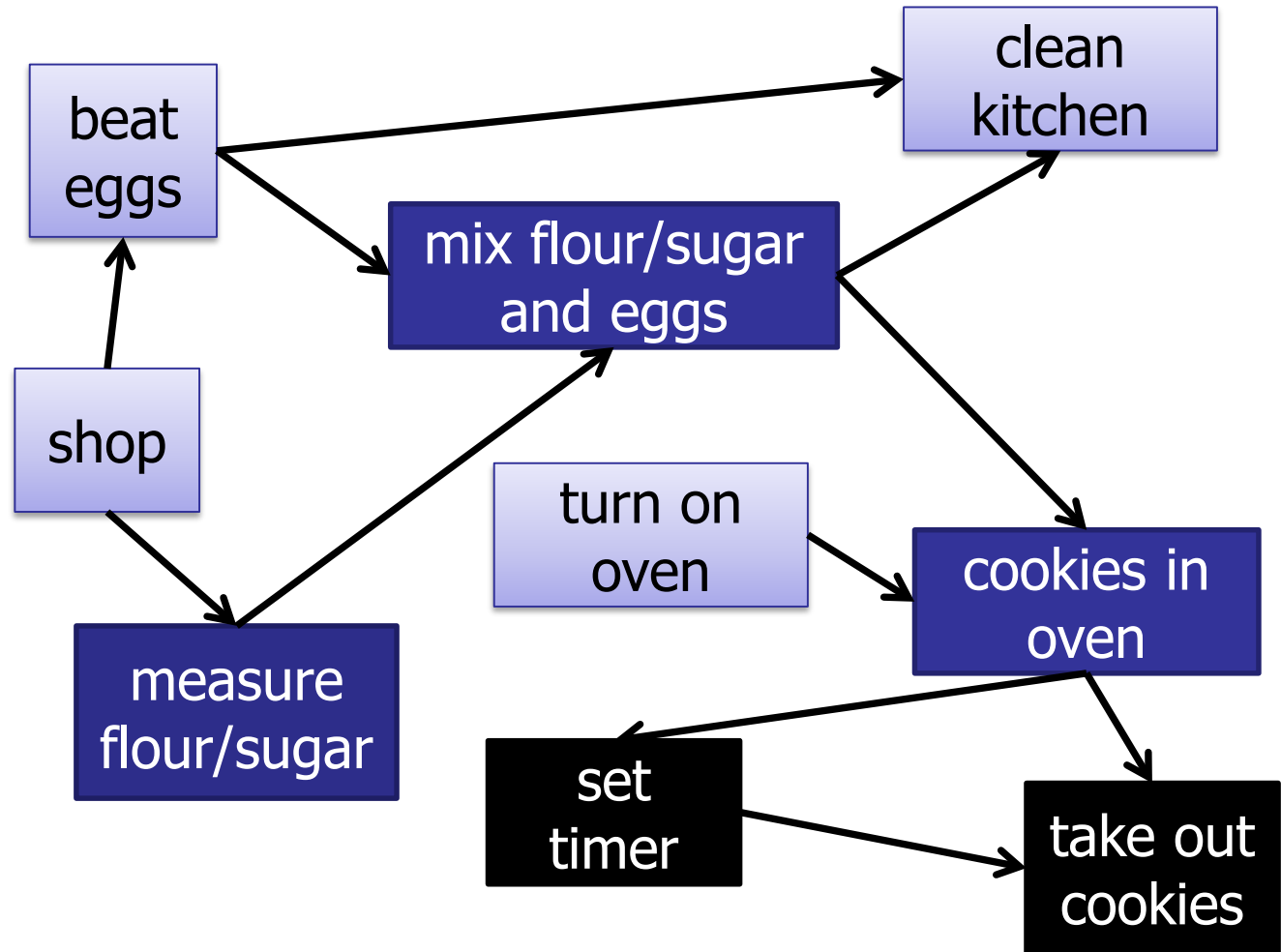
---

1. measure
2. mix
3. in oven
4. take out
5. set timer



# Depth-First Search

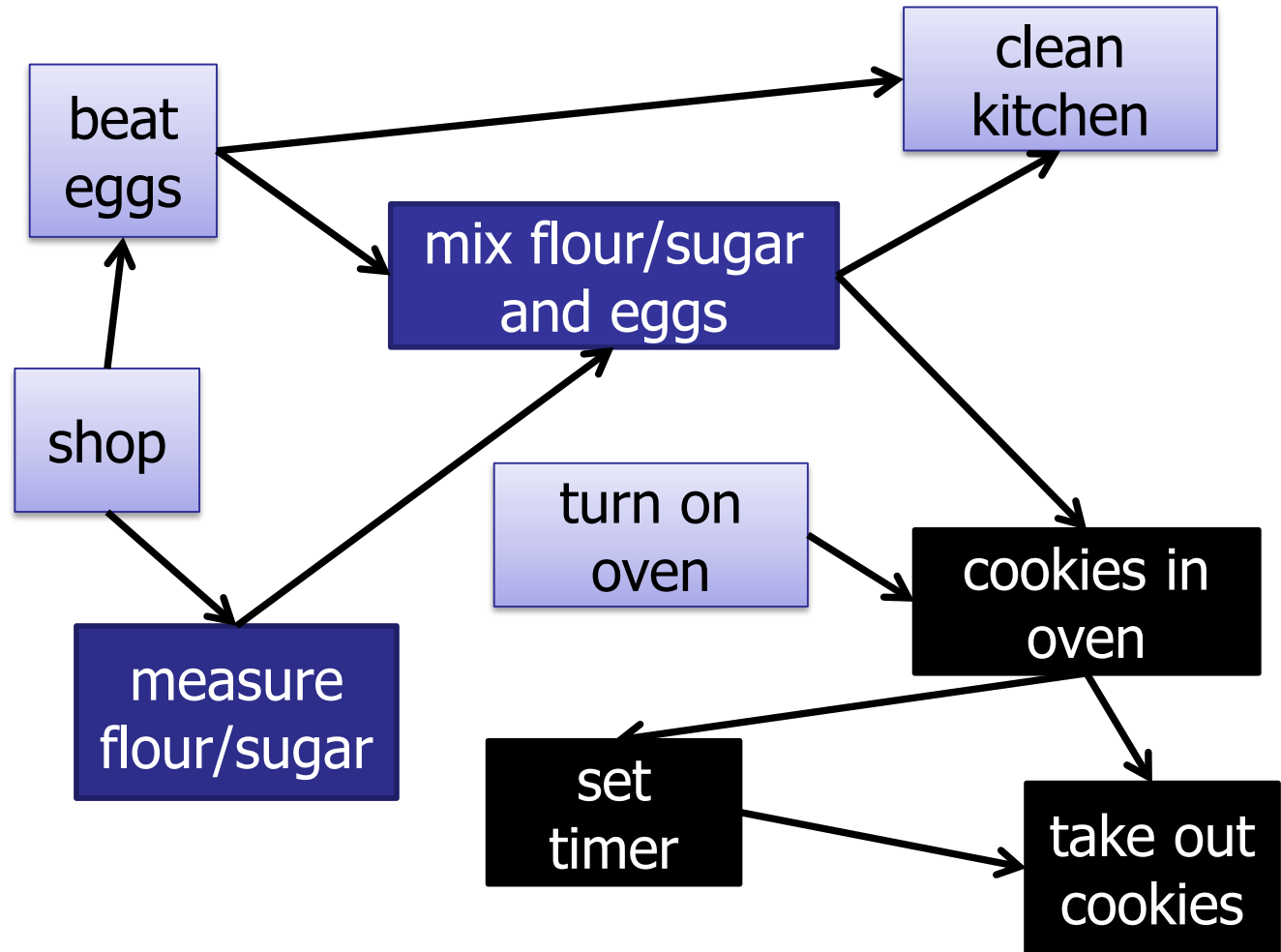
1. measure
2. mix
3. in oven
4. take out
5. set timer



Deep Blue: First Visit  
Black: Finished Visit

# Depth-First Search

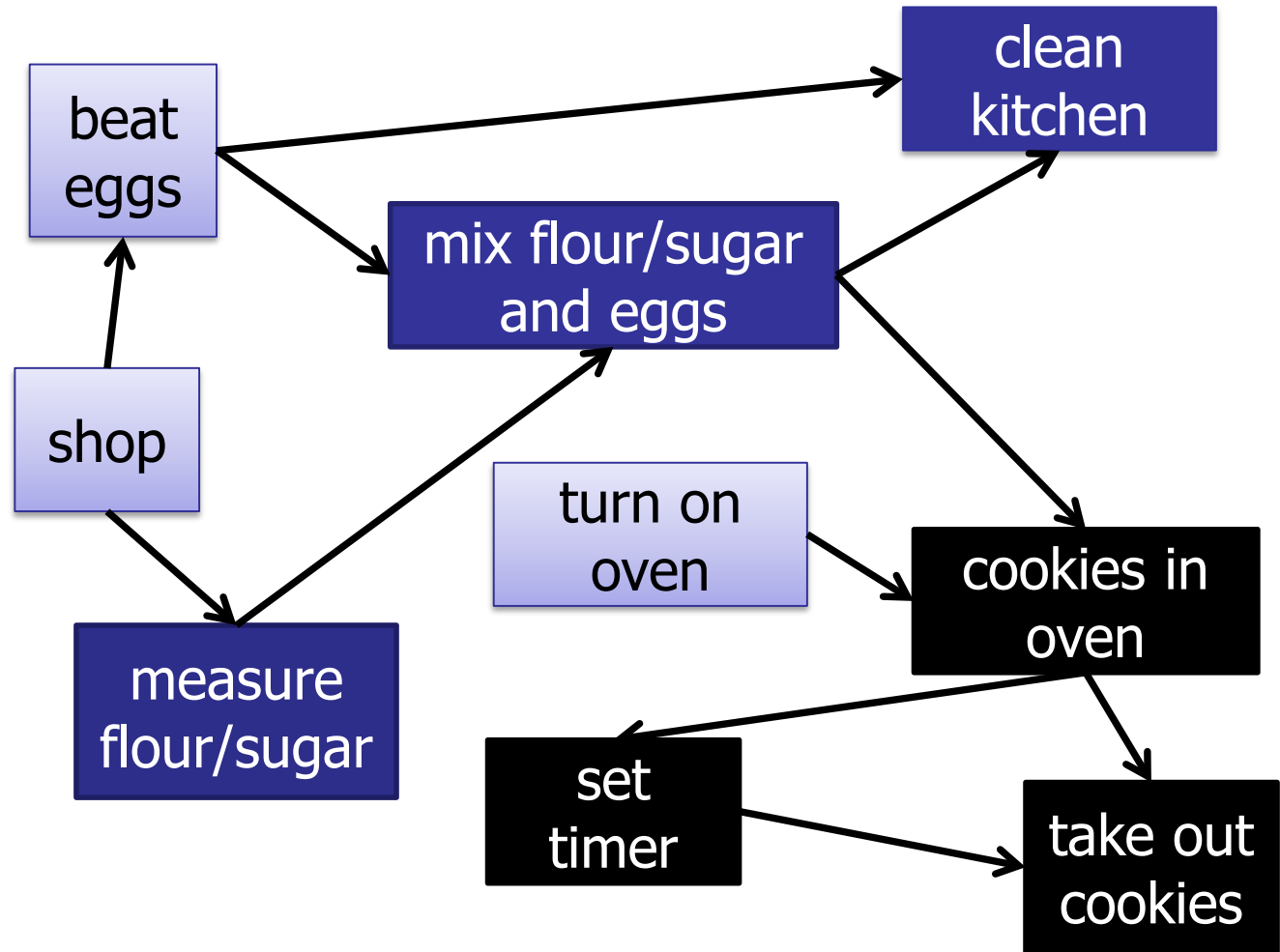
1. measure
2. mix
3. in oven
4. take out
5. set timer



Deep Blue: First Visit  
Black: Finished Visit

# Depth-First Search

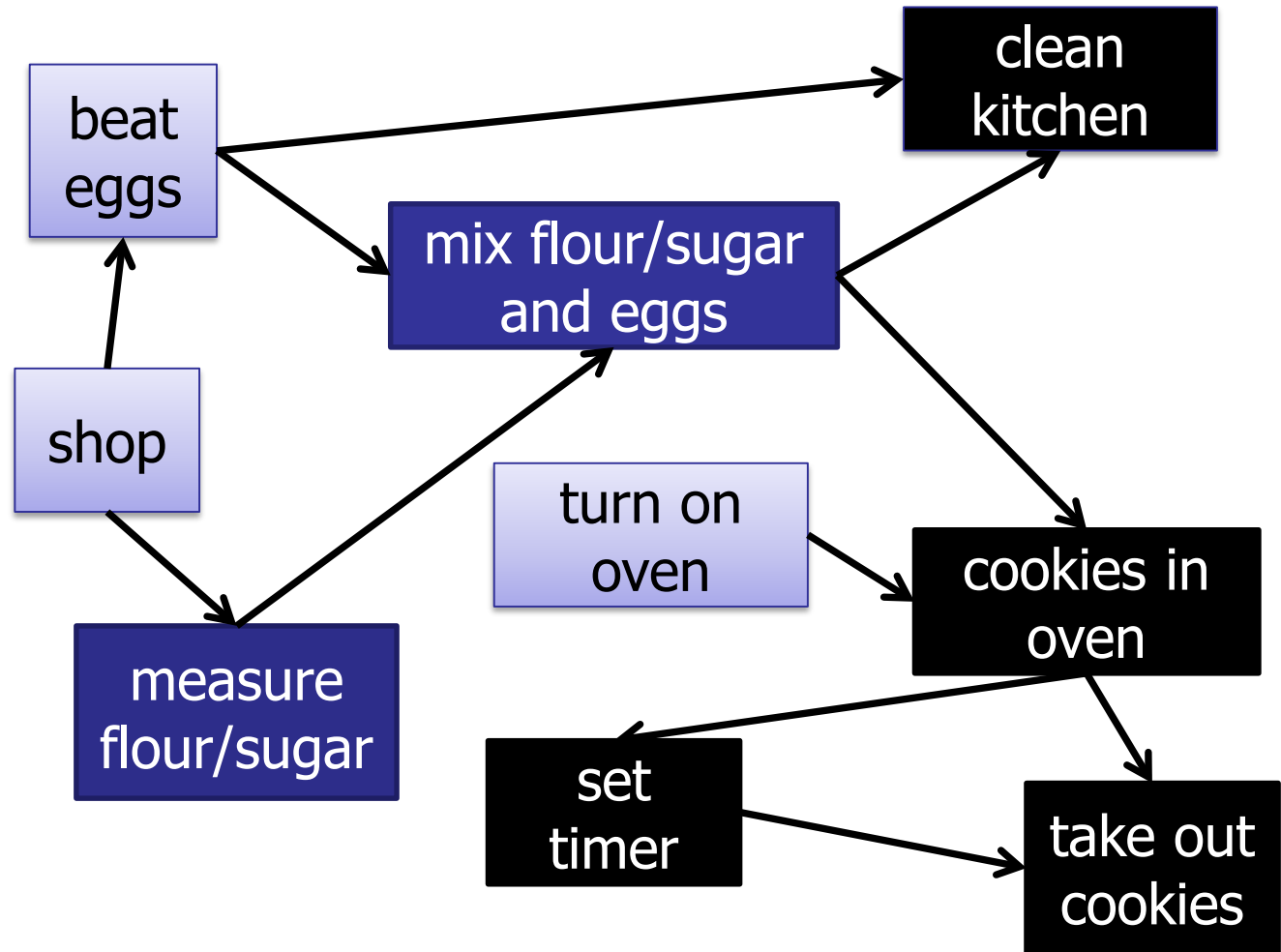
1. measure
2. mix
3. in oven
4. take out
5. set timer
6. clean



Deep Blue: First Visit  
Black: Finished Visit

# Depth-First Search

1. measure
2. mix
3. in oven
4. take out
5. set timer
6. clean



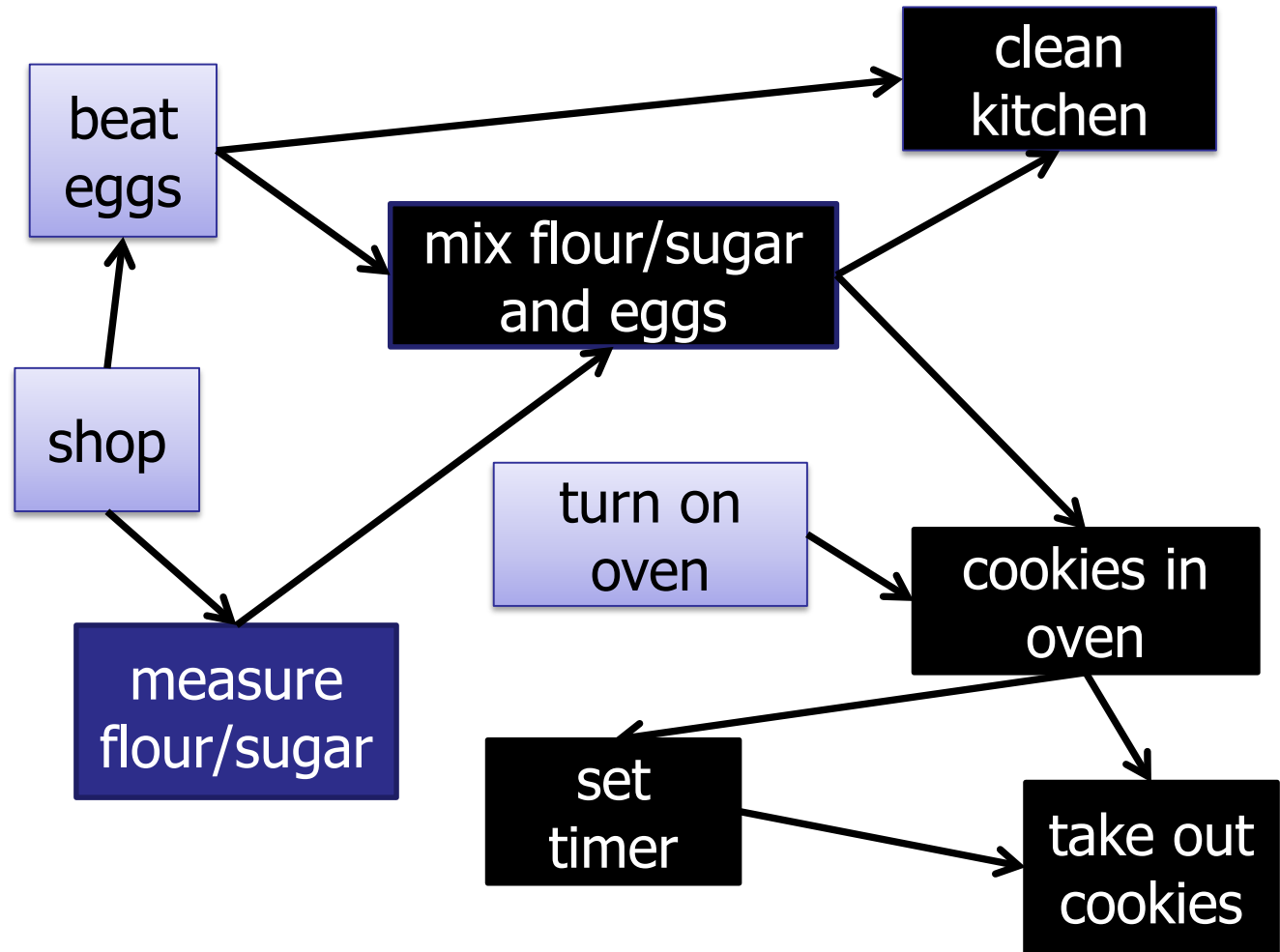
Deep Blue: First Visit  
Black: Finished Visit



# Depth-First Search

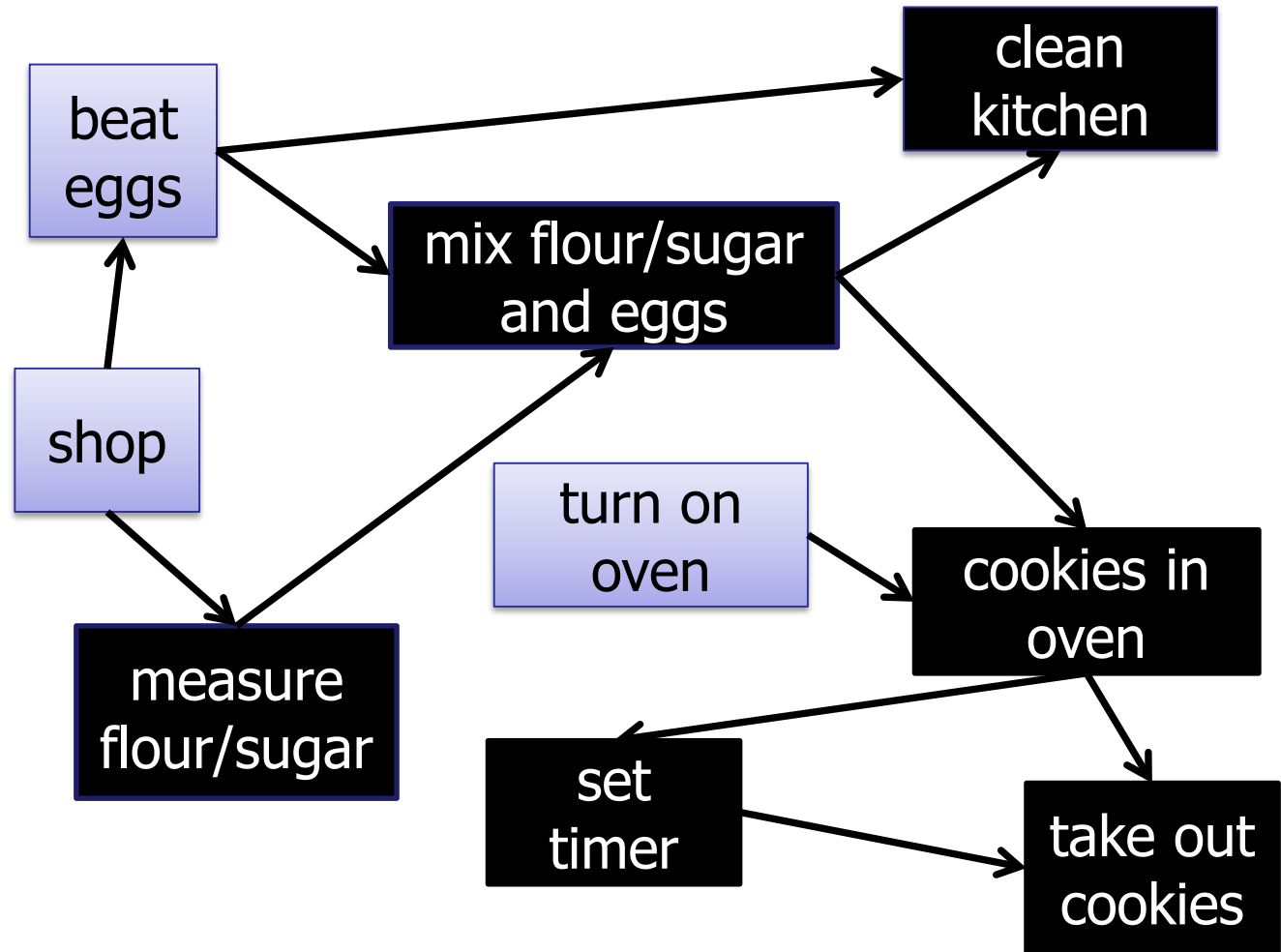
---

1. measure
2. mix
3. in oven
4. take out
5. set timer
6. clean



# Depth-First Search

1. measure
2. mix
3. in oven
4. take out
5. set timer
6. clean



Deep Blue: First Visit  
Black: Finished Visit

# Searching a (Directed) Graph

---

## **Pre-Order** Depth-First Search:

- Process each node when it is *first* visited.

# Searching a (Directed) Graph

---

## **Pre-Order** Depth-First Search:

- Process each node when it is *first* visited.

## **Post-Order** Depth-First Search:

- Process each node when it is *last* visited.
- Or, when all the neighbors are visited
- Or, when it is finished

# Depth-First Search

---

```
DFS-visit(Node[] nodeList, boolean[] visited, int startId){  
    for (every neighbor v of startId) {  
        if (!visited[v]){  
            visited[v] = true;  
  
            ProcessNode (v) ;  
  
            DFS-visit(nodeList, visited, v);  
        }  
    }  
}
```

# Depth-First Search

---

```
DFS-visit(Node[] nodeList, boolean[] visited, int startId){  
    for (every neighbor v of startId) {  
        if (!visited[v]){  
            visited[v] = true;  
            DFS-visit(nodeList, visited, v);  
            ProcessNode (v) ;  
        }  
    }  
}
```

# Searching a (Directed) Graph

---

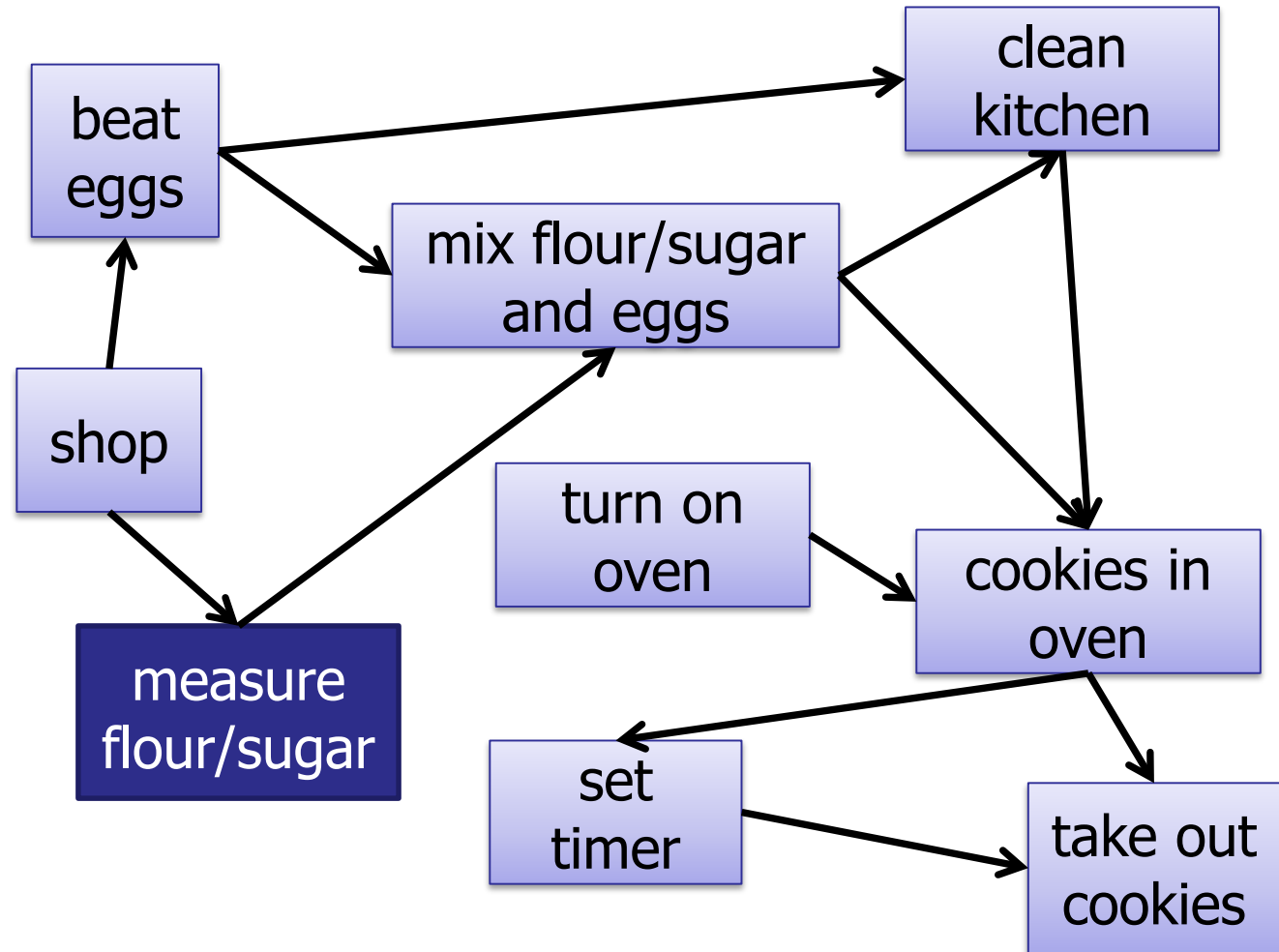
## **Pre-Order** Depth-First Search:

- Process each node when it is *first* visited.

## **Post-Order** Depth-First Search:

- Process each node when it is *last* visited.
- Or, when all the neighbors are visited
- Or, when it is finished

# Post-Order Depth-First Search

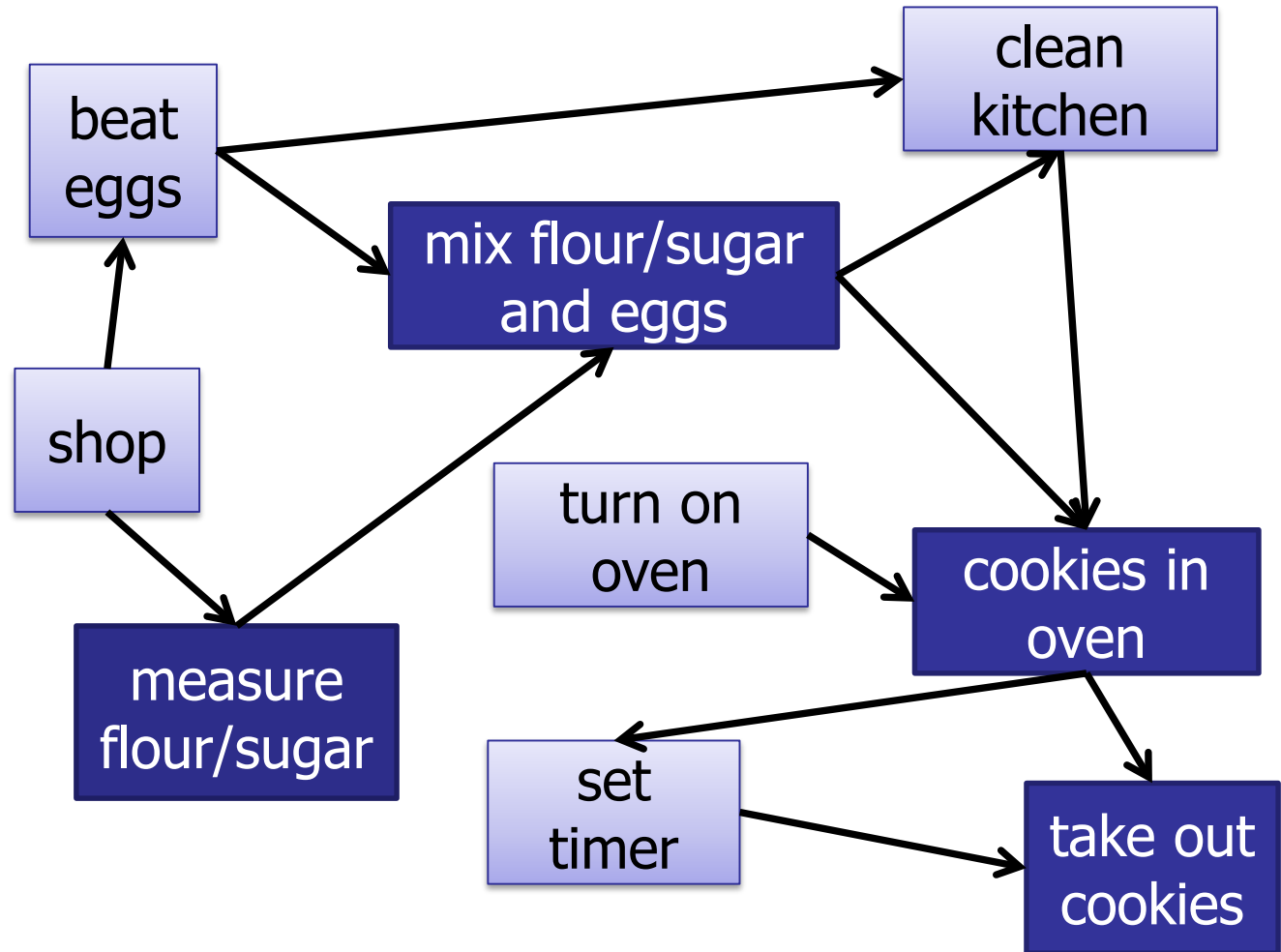


Deep Blue: First Visit  
Black: Finished Visit



# Post-Order Depth-First Search

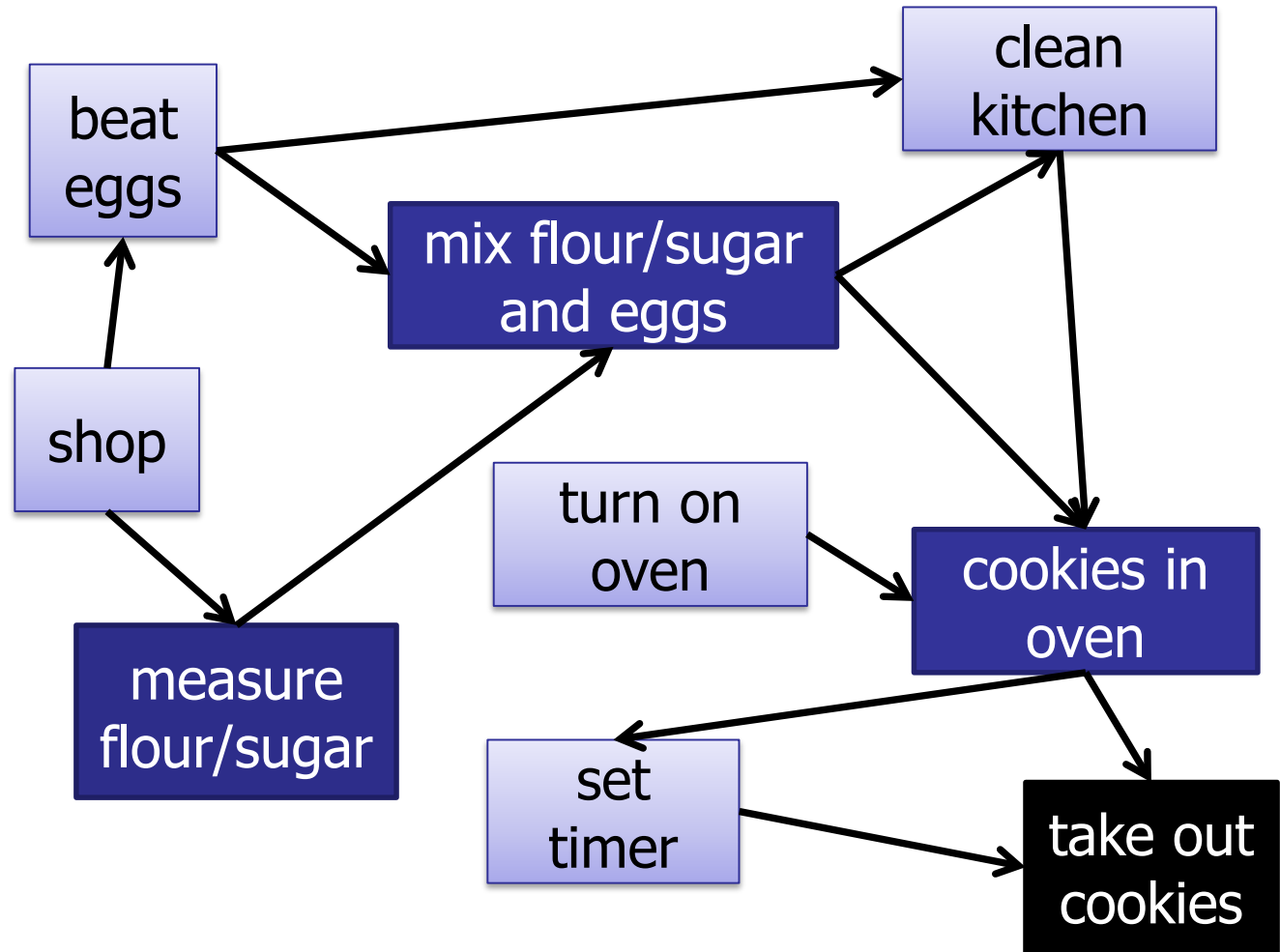
---



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

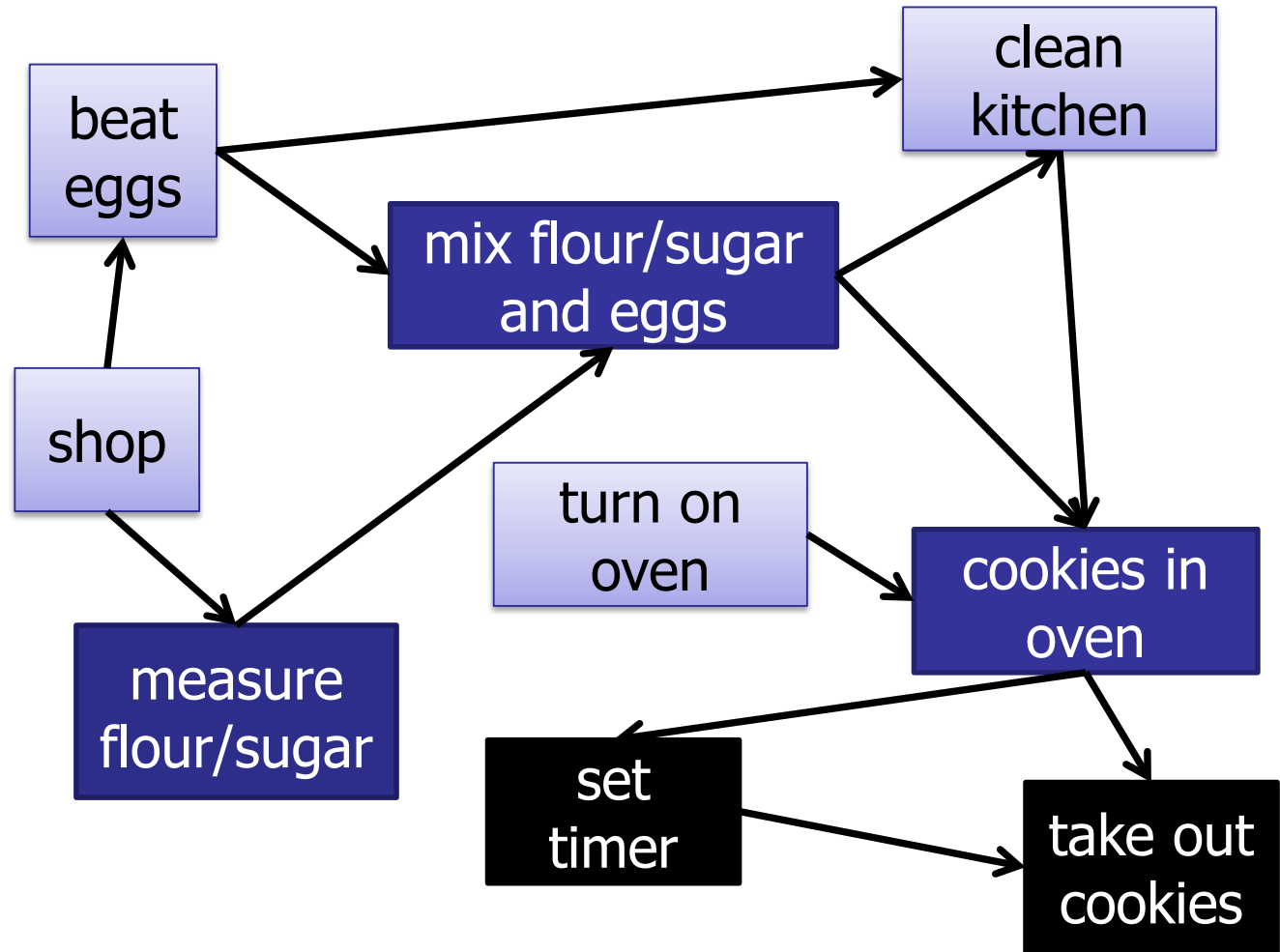
- 1.
- 2.
- 3.
- 4.
- 5.
- 6.
- 7.
- 8.
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

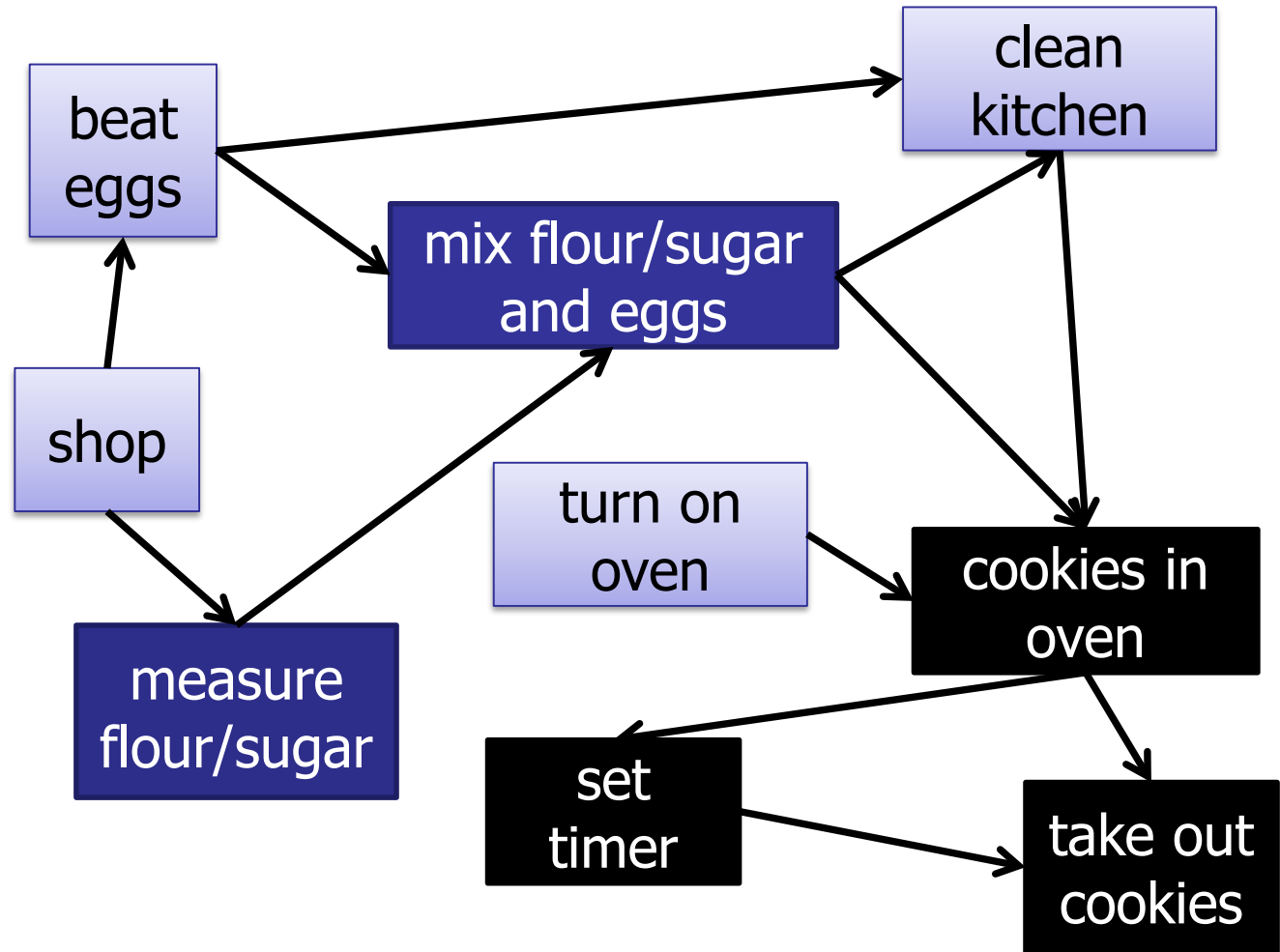
- 1.
- 2.
- 3.
- 4.
- 5.
- 6.
- 7.
8. set timer
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

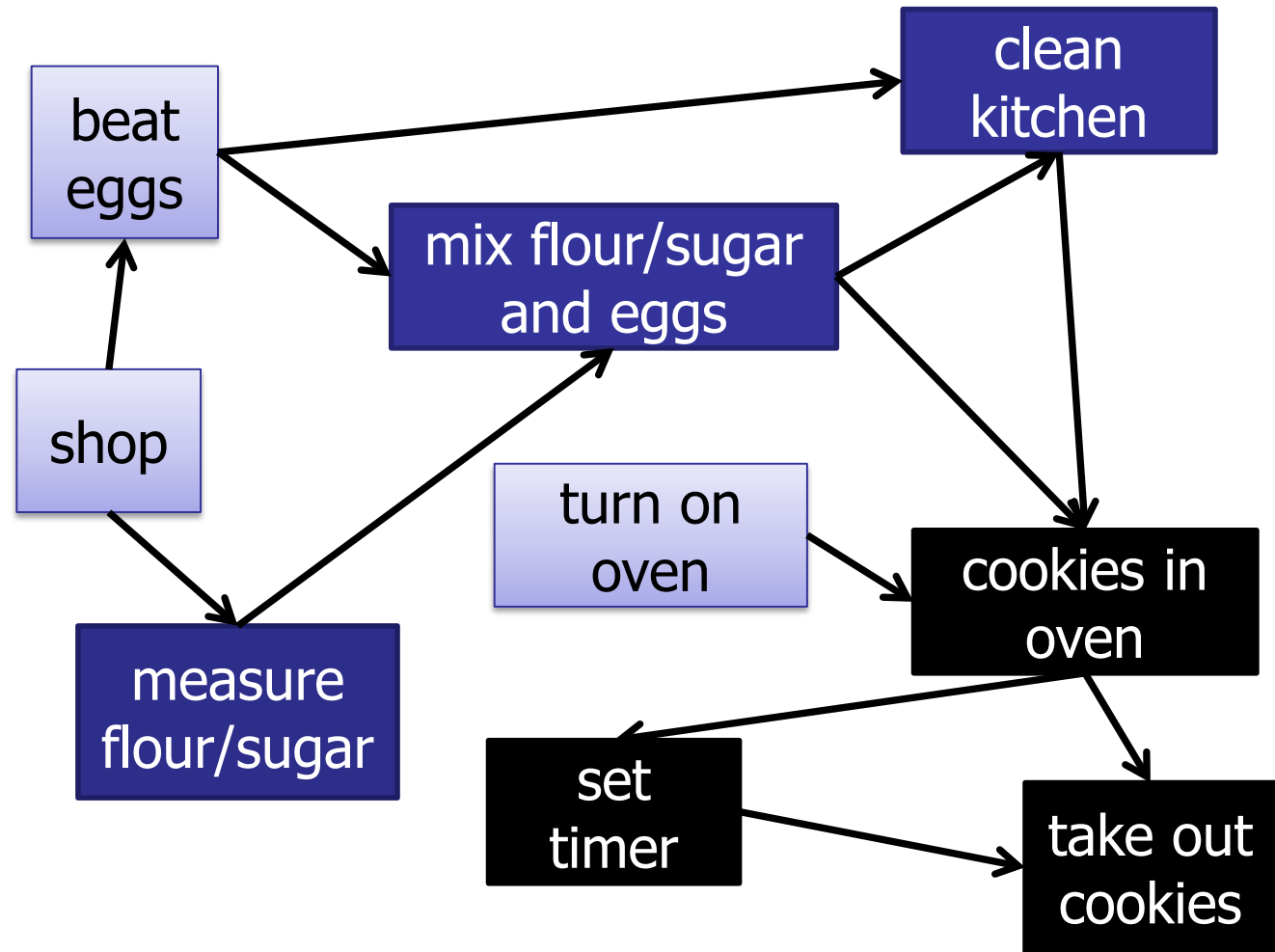
- 1.
- 2.
- 3.
- 4.
- 5.
- 6.
7. in oven
8. set timer
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

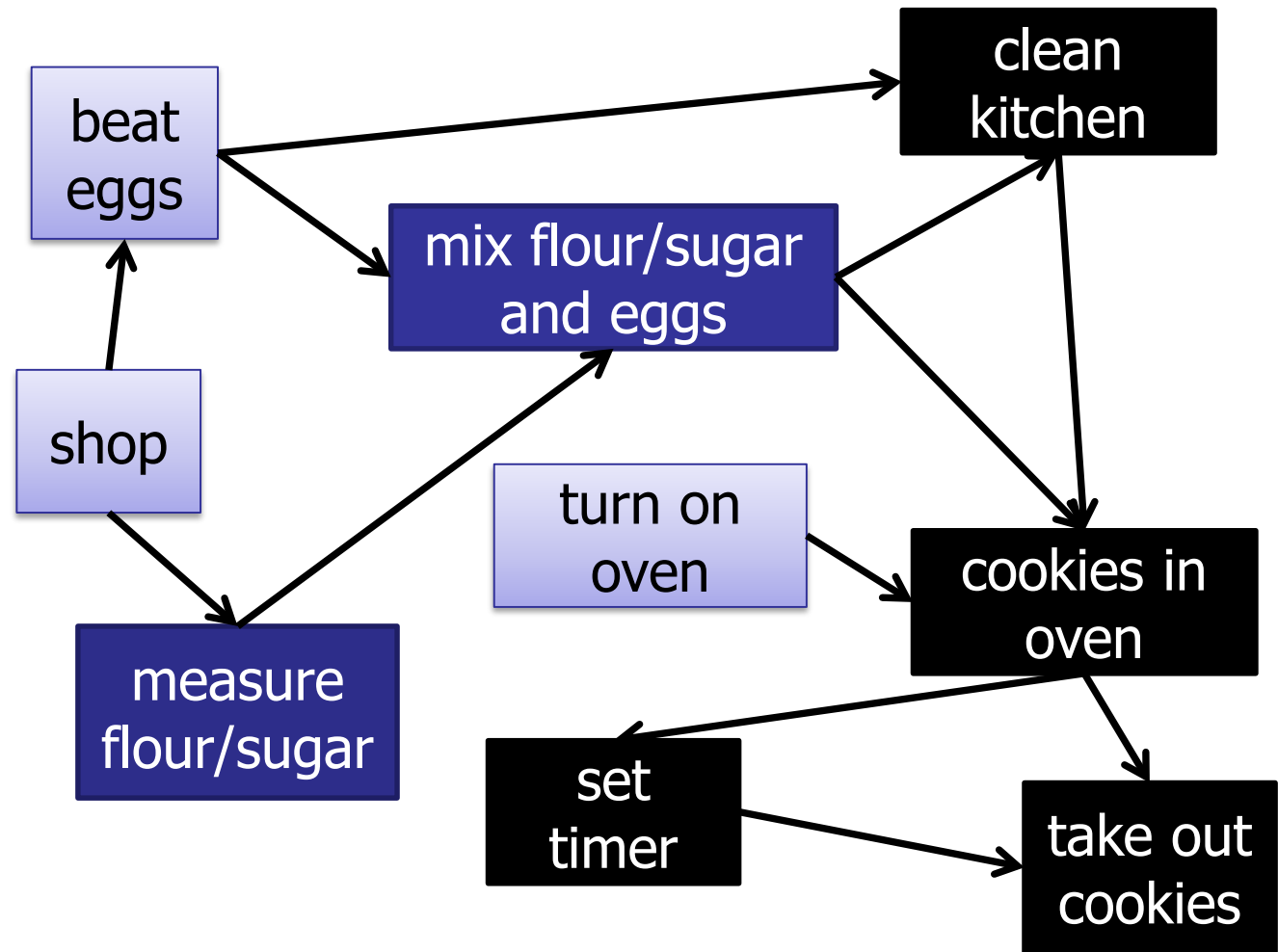
- 1.
- 2.
- 3.
- 4.
- 5.
- 6.
7. in oven
8. set timer
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

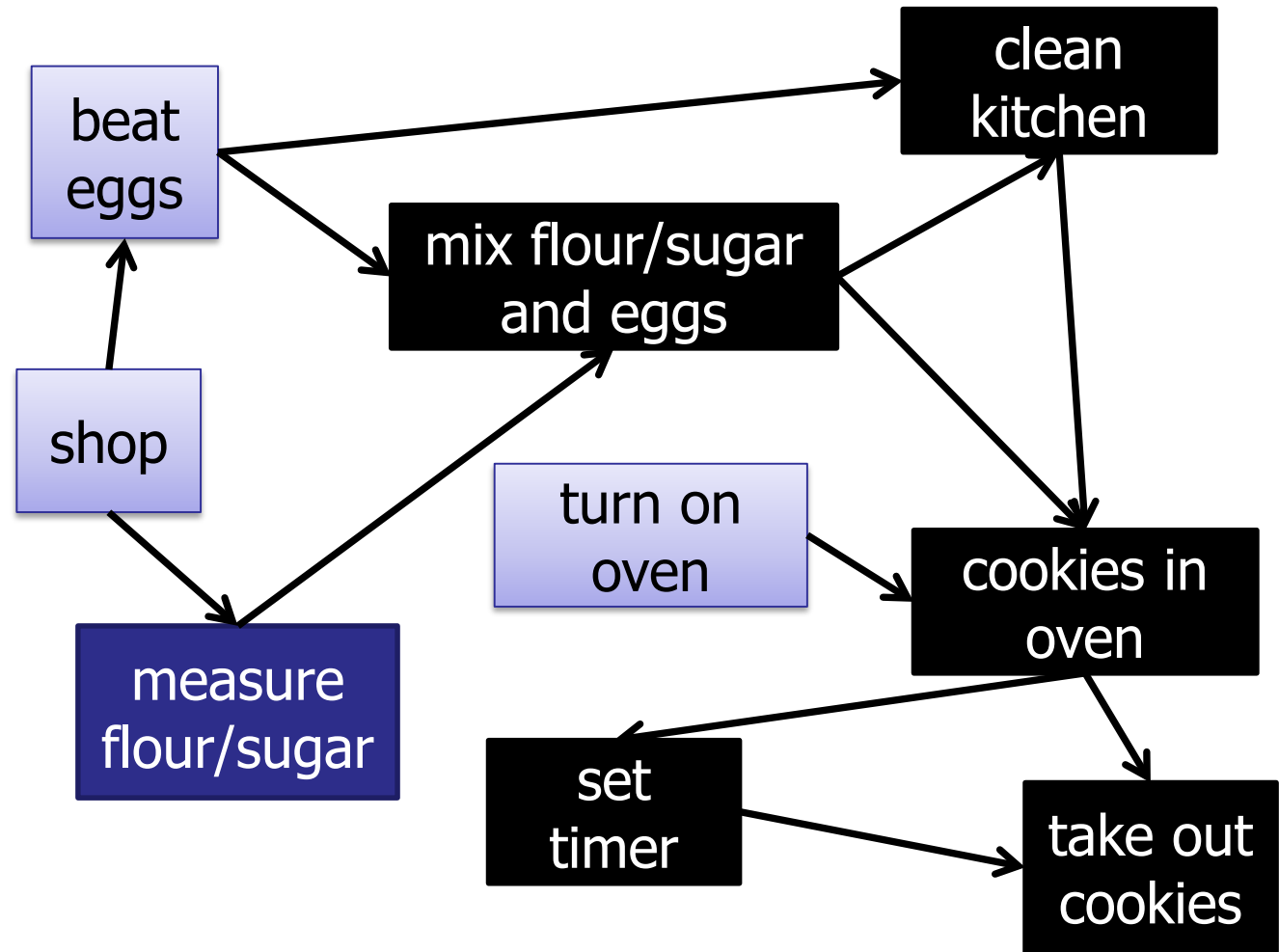
- 1.
- 2.
- 3.
- 4.
- 5.
6. clean
7. in oven
8. set timer
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

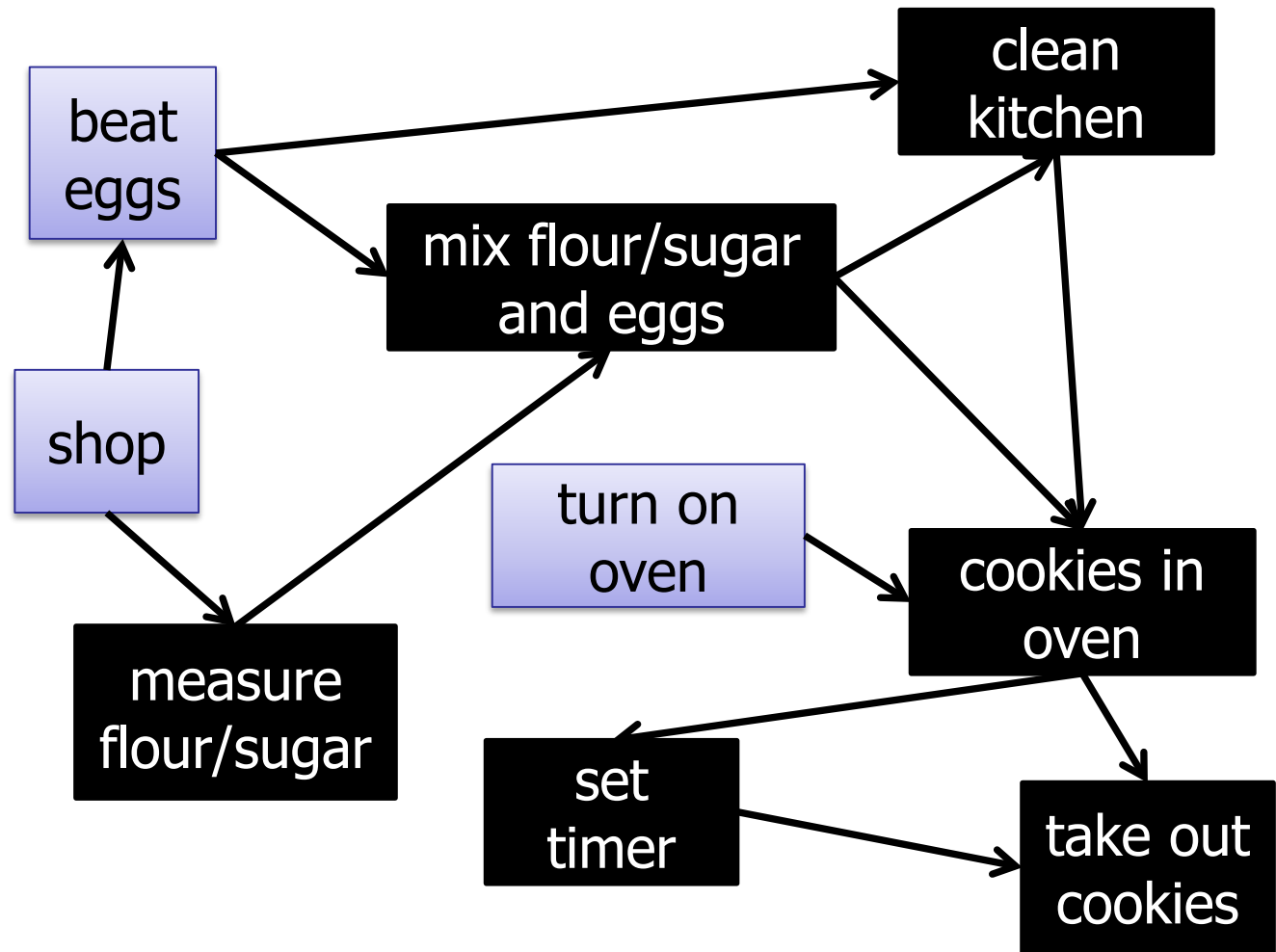
- 1.
- 2.
- 3.
- 4.
5. mix
6. clean
7. in oven
8. set timer
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

- 1.
- 2.
- 3.
4. measure
5. mix
6. clean
7. in oven
8. set timer
9. take out

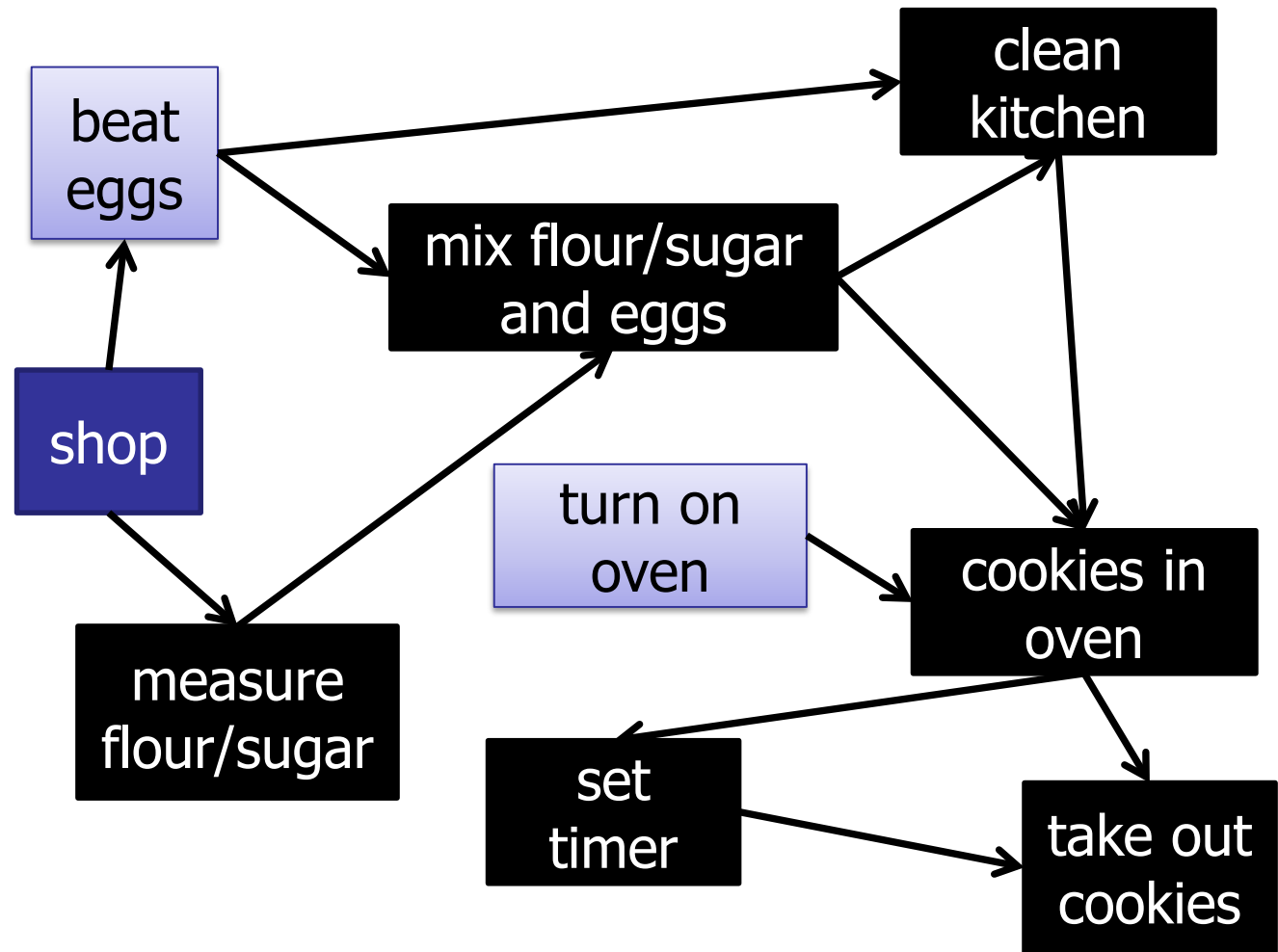


Deep Blue: First Visit  
Black: Finished Visit



# Post-Order Depth-First Search

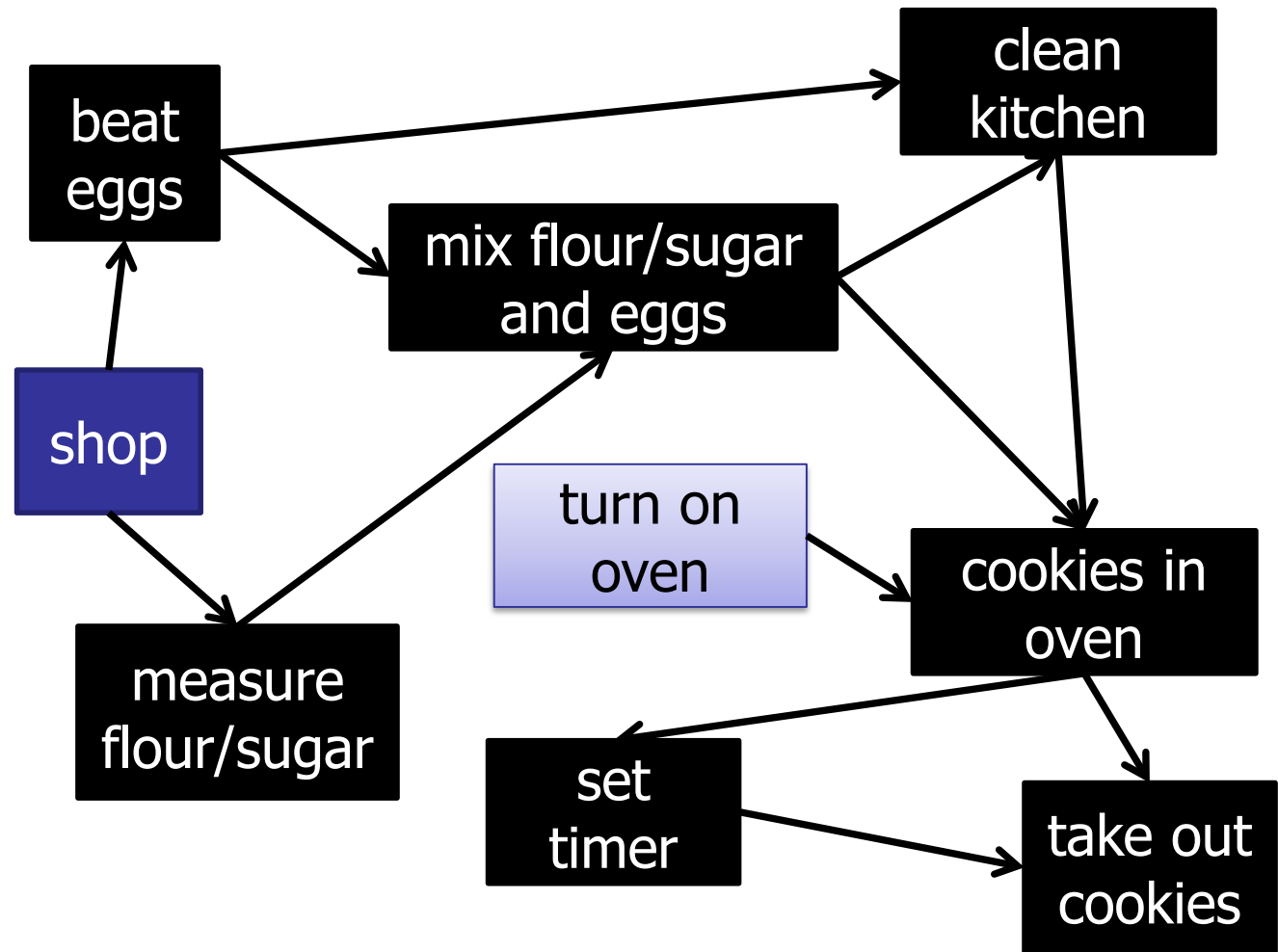
- 1.
- 2.
- 3.
4. measure
5. mix
6. clean
7. in oven
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9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

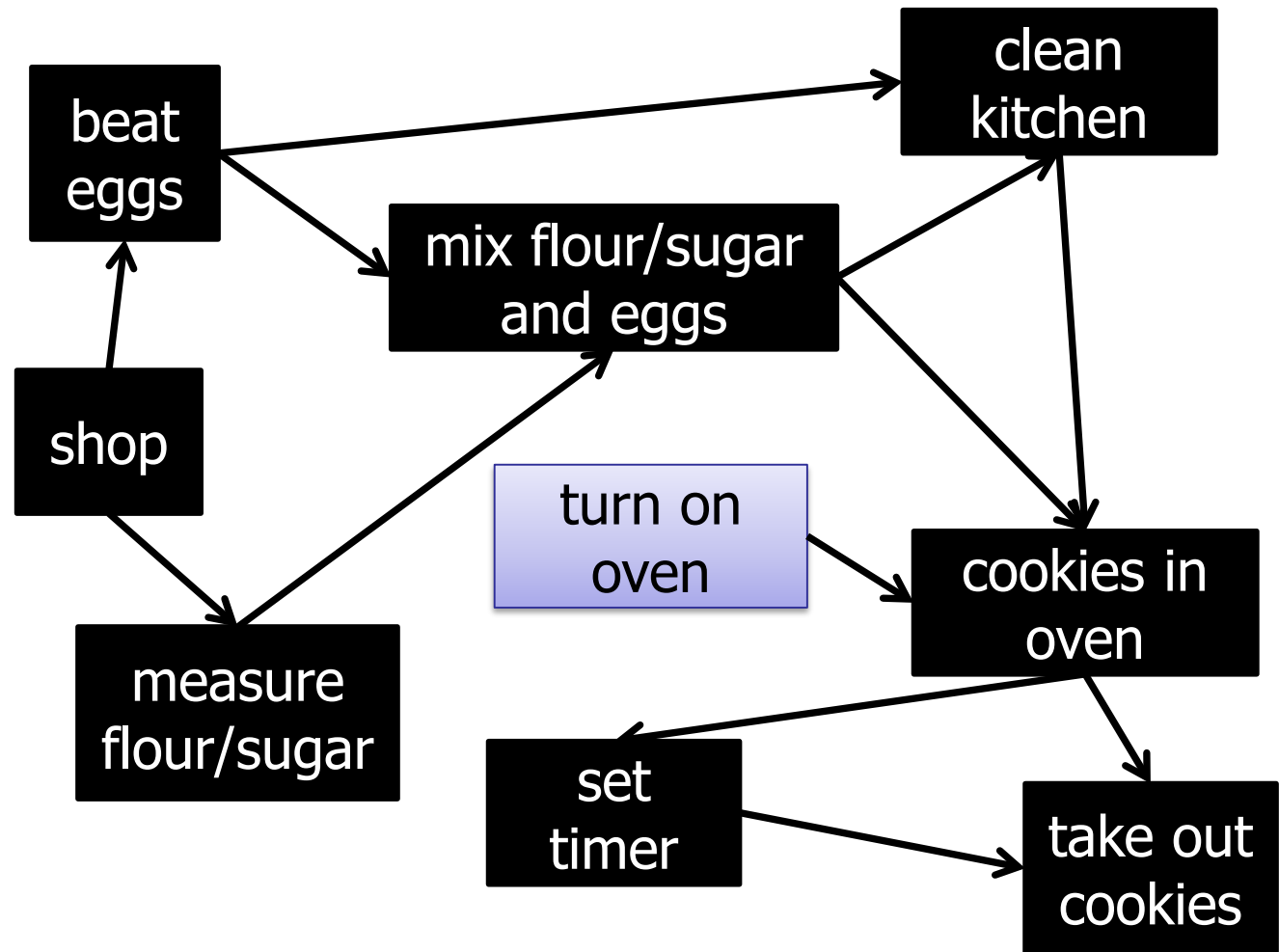
- 1.
- 2.
3. beat
4. measure
5. mix
6. clean
7. in oven
8. set timer
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

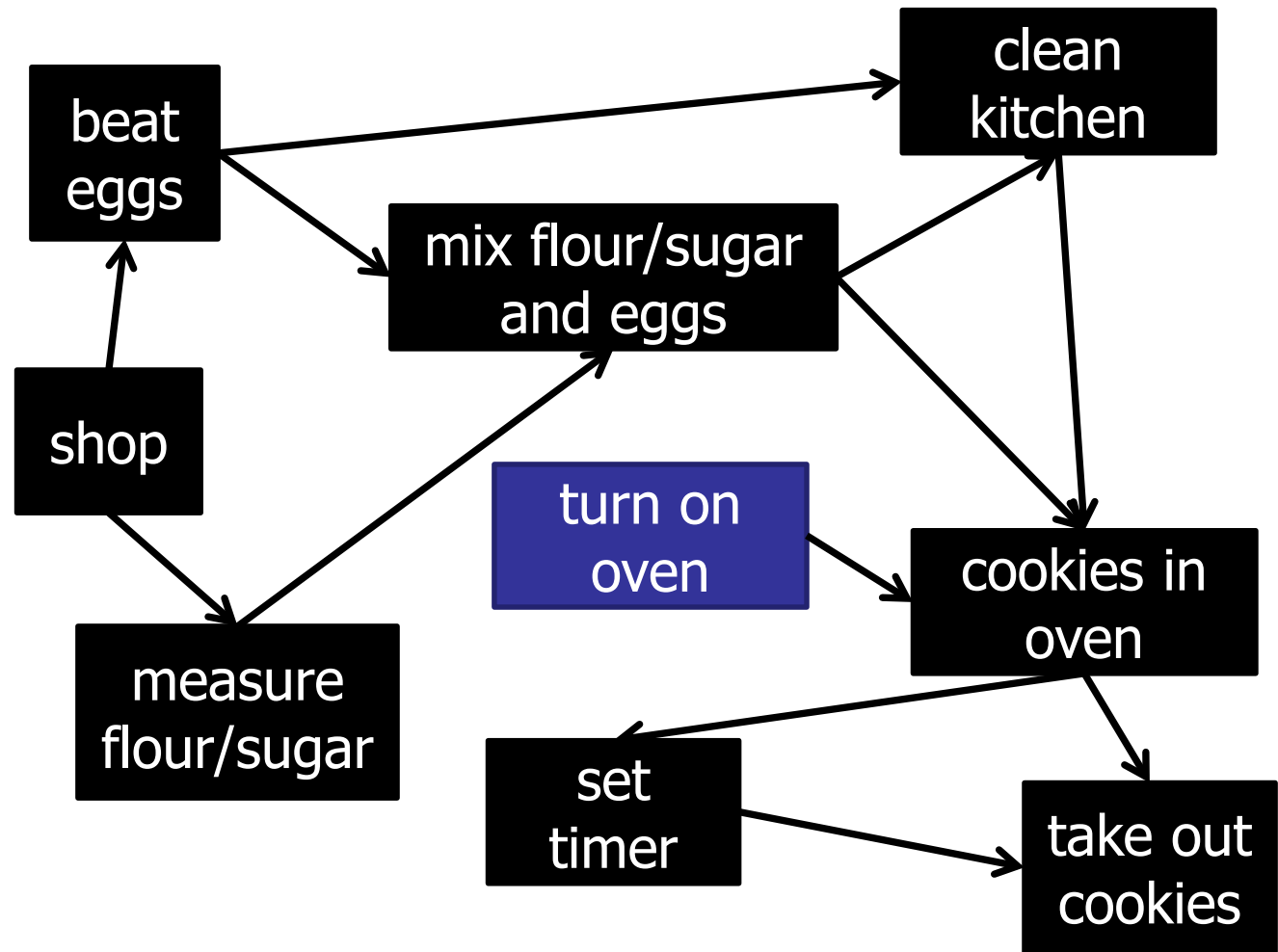
- 1.
2. shop
3. beat
4. measure
5. mix
6. clean
7. in oven
8. set timer
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

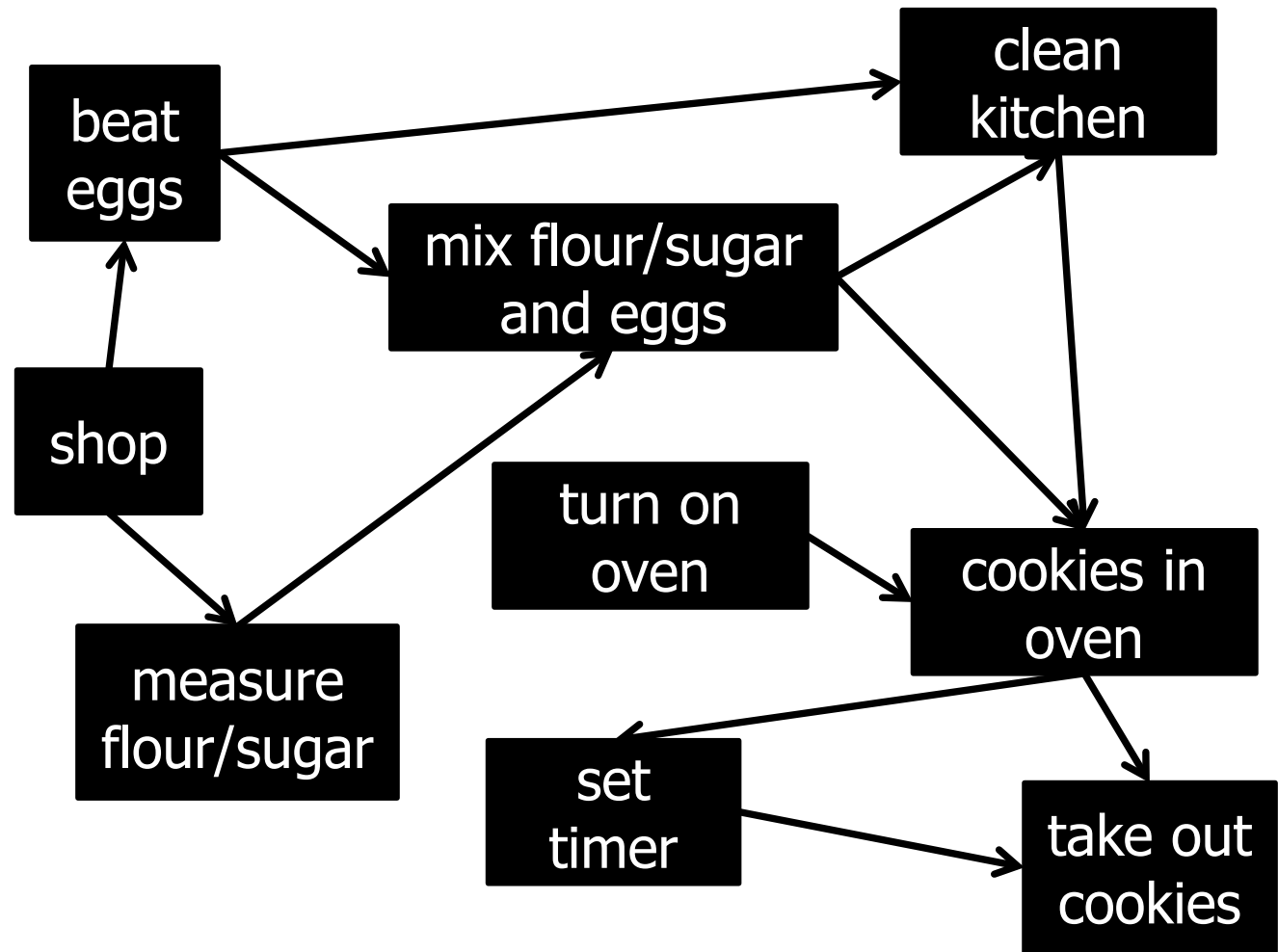
- 1.
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7. in oven
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Deep Blue: First Visit  
Black: Finished Visit

# Post-Order Depth-First Search

1. on oven
2. shop
3. beat
4. measure
5. mix
6. clean
7. in oven
8. set timer
9. take out



Deep Blue: First Visit  
Black: Finished Visit

# Topological Sort

---

What is the time complexity of topological sort?

DFS:  $O(V+E)$

# Depth-First Search

---

```
DFS-visit(Node[] nodeList, boolean[] visited, int startId){  
    for (every neighbor v of startId) {  
        if (!visited[v]){  
            visited[v] = true;  
            DFS-visit(nodeList, visited, v);  
            schedule.prepend(v) ;  
        }  
    }  
}
```

# Depth-First Search

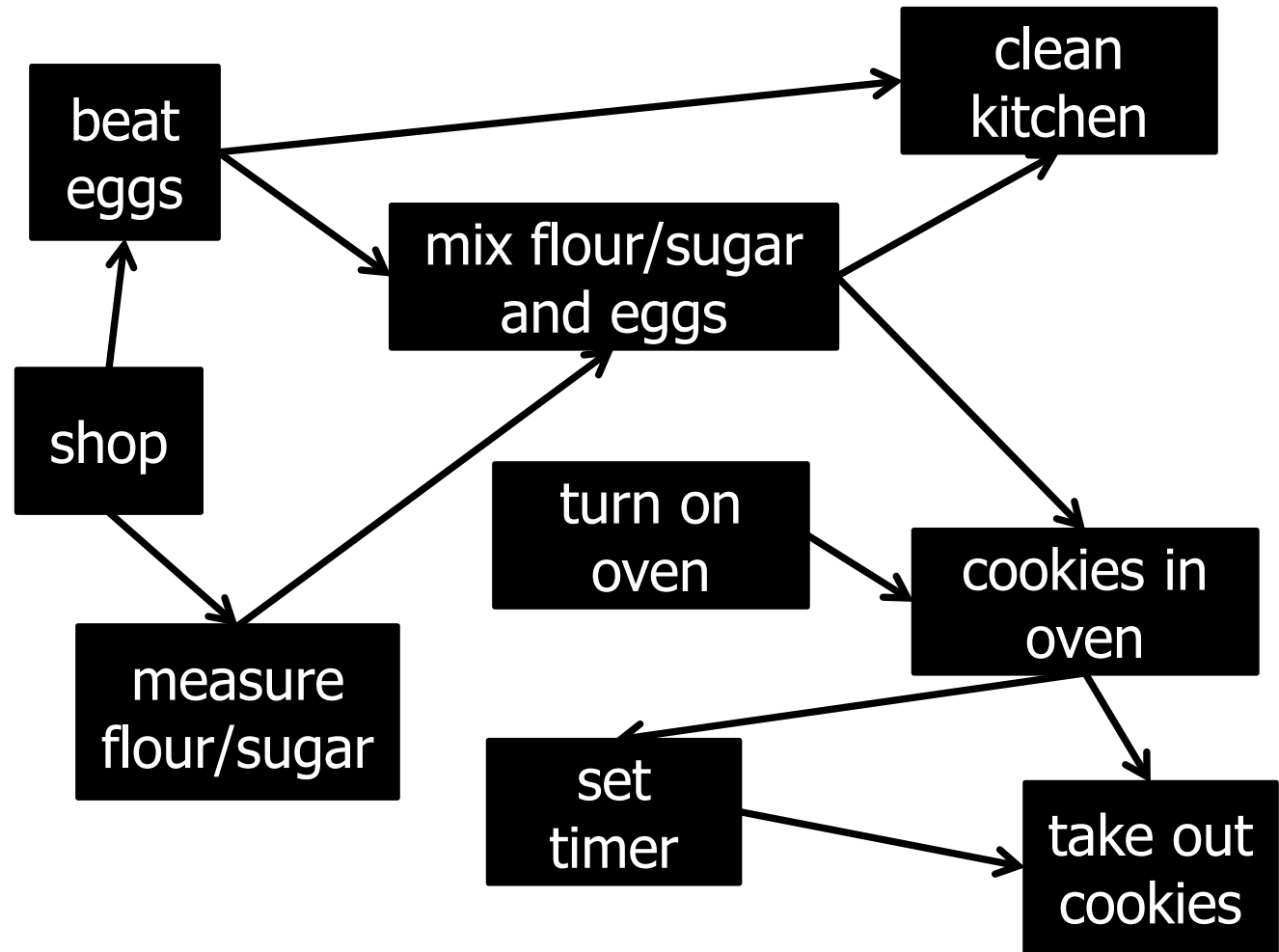
---

```
for (start = i; start < nodeList.length; start++) {  
    if (!visited[start]) {  
        visited[start] = true;  
        DFS-visit(nodeList, visited, start);  
        schedule.prepend(v) ;  
    }  
}  
}
```



# Post-Order Depth-First Search

1. on oven
2. shop
3. beat
4. measure
5. mix
6. clean
7. in oven
8. set timer
9. take out



# Topological Sort

---

Input:

- Directed Acyclic Graph (DAG)

Output:

- Total ordering of nodes, where all edges point forwards.

Algorithm:

- Post-order Depth-First Search
- $O(V + E)$  time complexity

# Topological Sort

---

Alternative algorithm:

Input: directed graph  $G$

Repeat:

- $S$  = all nodes in  $G$  that have *no* incoming edges.
- Add nodes in  $S$  to the topo-order
- Remove all edges adjacent to nodes in  $S$
- Remove nodes in  $S$  from the graph

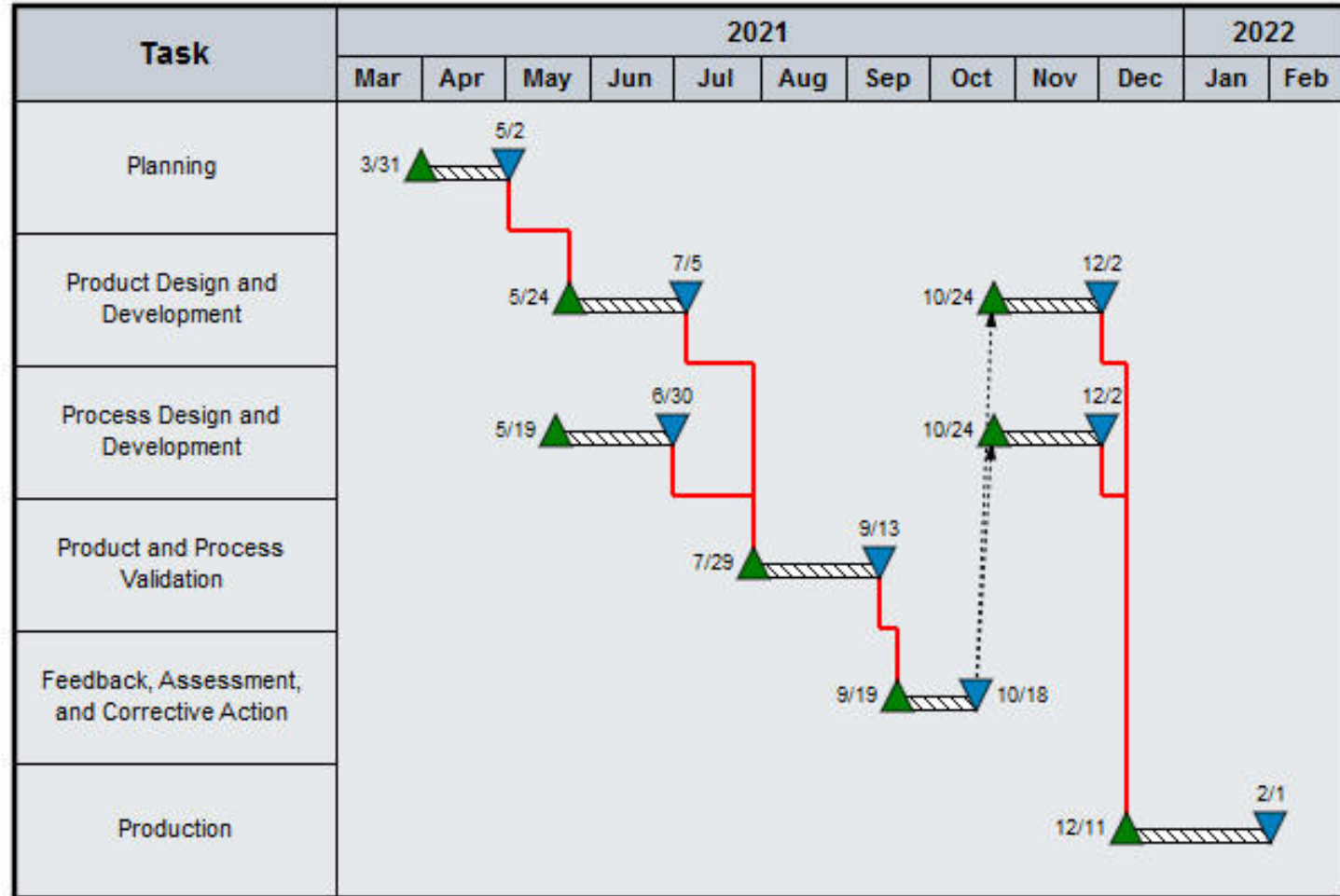
Time:

- $O(V + E)$  time complexity

# SW Project Dependency

## Product Development Schedule Phase One

Created Using Milestones Software  
[www.kidasa.com](http://www.kidasa.com)



# Roadmap

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## Part I: Directed Graphs

- What is a directed graph?
- Searching directed graphs (DFS / BFS)
- Topological Sort
- Connected Components

## Part II: Shortest Paths

- The SSSP Problem
- Bellman-Ford

# Roadmap

---

## Part I: Directed Graphs

- What is a directed graph?
- Searching directed graphs (DFS / BFS)
- Topological Sort
- Connected Components

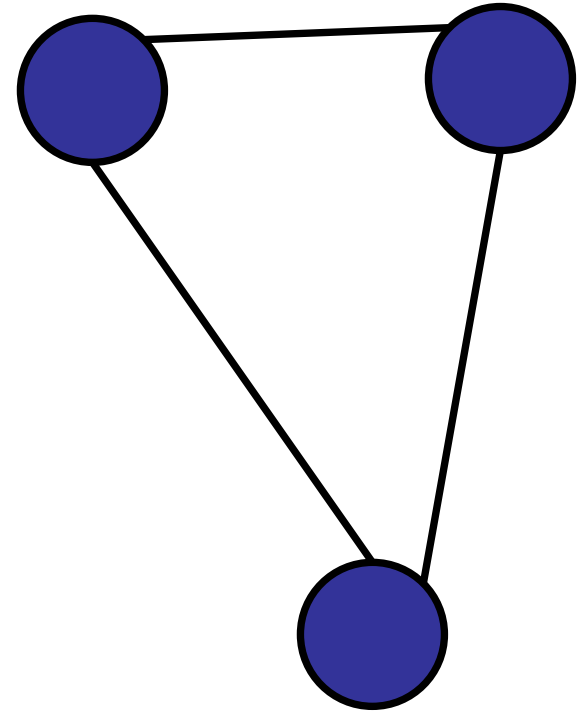
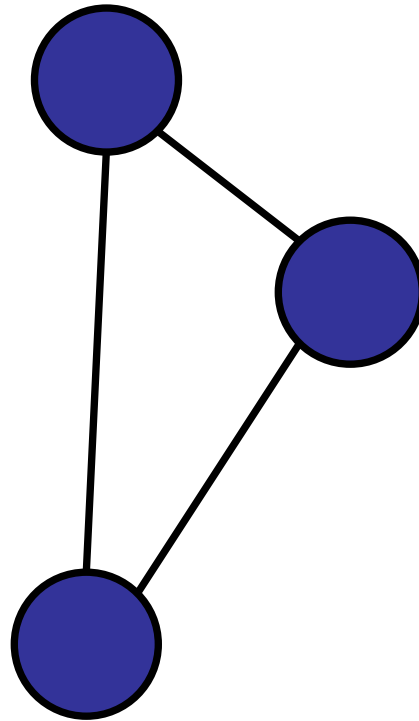
## Part II: Shortest Paths

- The SSSP Problem
- Bellman-Ford

# Connected Components

---

Undirected graphs



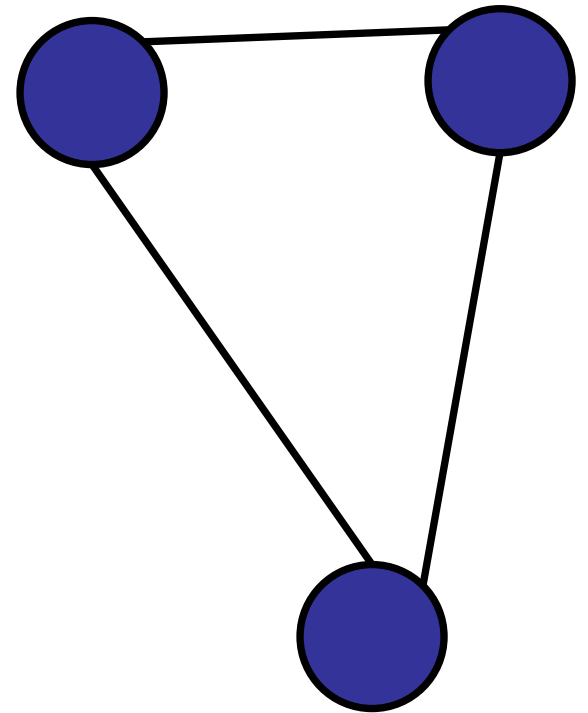
Two connected components

# Connected Components

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## Undirected graphs

Vertex **v** and **w** are in the same connected component if and only if there is a path from **v** to **w**.





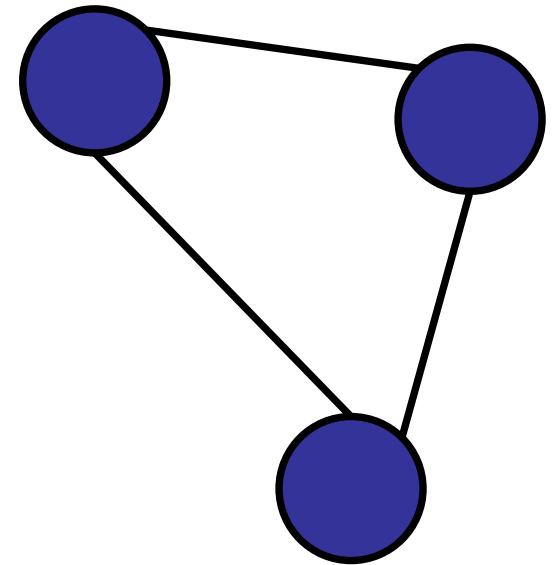
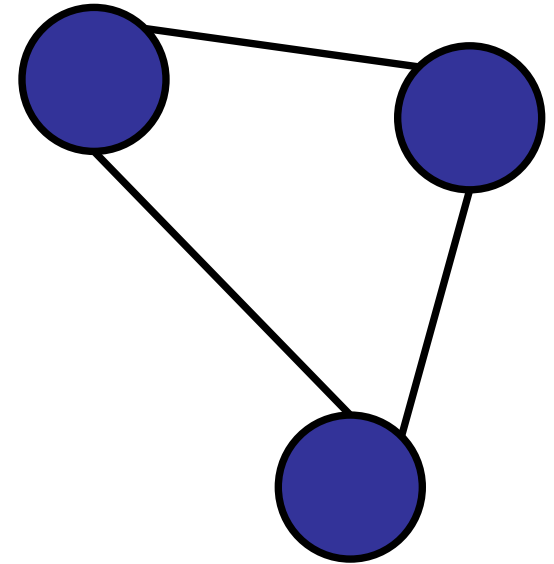
# Connected Components

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## Undirected graphs

Vertex  $v$  and  $w$  are in the same connected component if and only if there is a path from  $v$  to  $w$ .

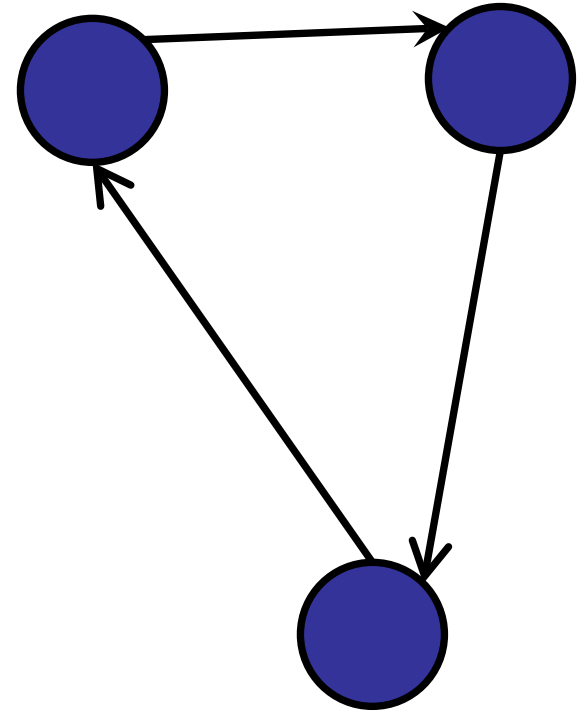
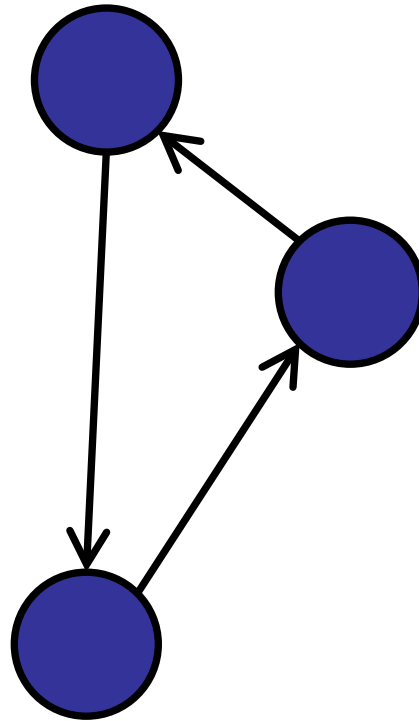
There is a set  $\{v_1, v_2, \dots, v_k\}$  where there is no path from any  $v_i$  to  $v_j$  if and only if there are  $k$  connected components.



# Connected Components

---

Directed graphs

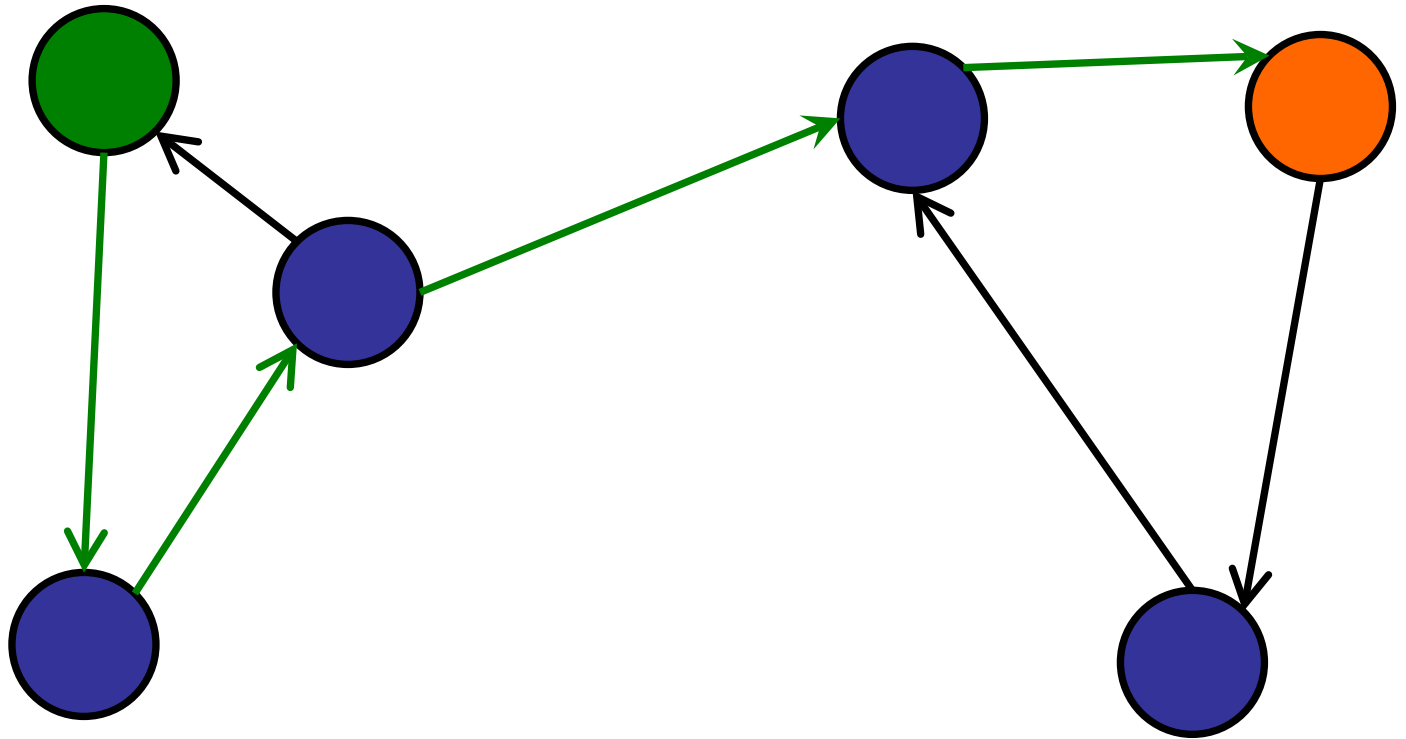


Two connected components

# Connected Components

---

Directed graphs

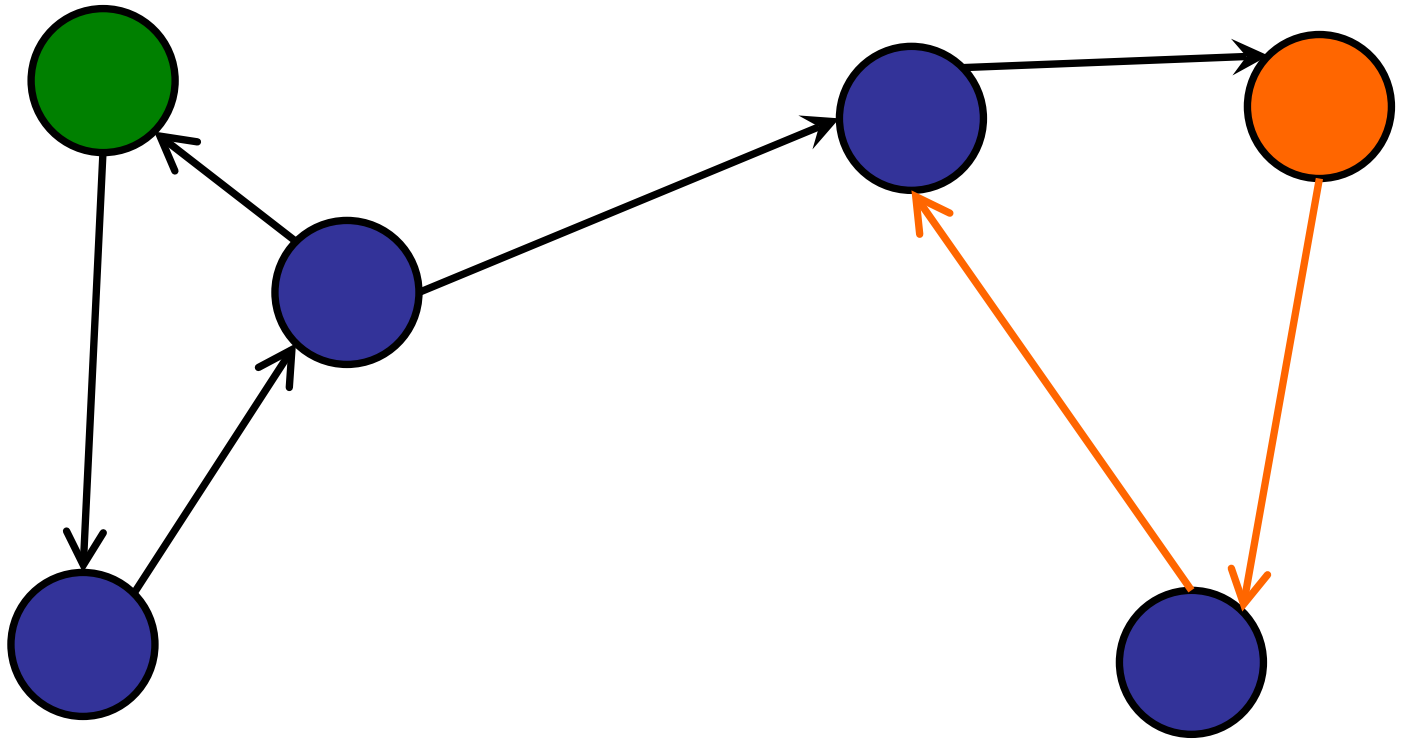


Two connected components??

# Connected Components

---

Directed graphs



Two connected components??

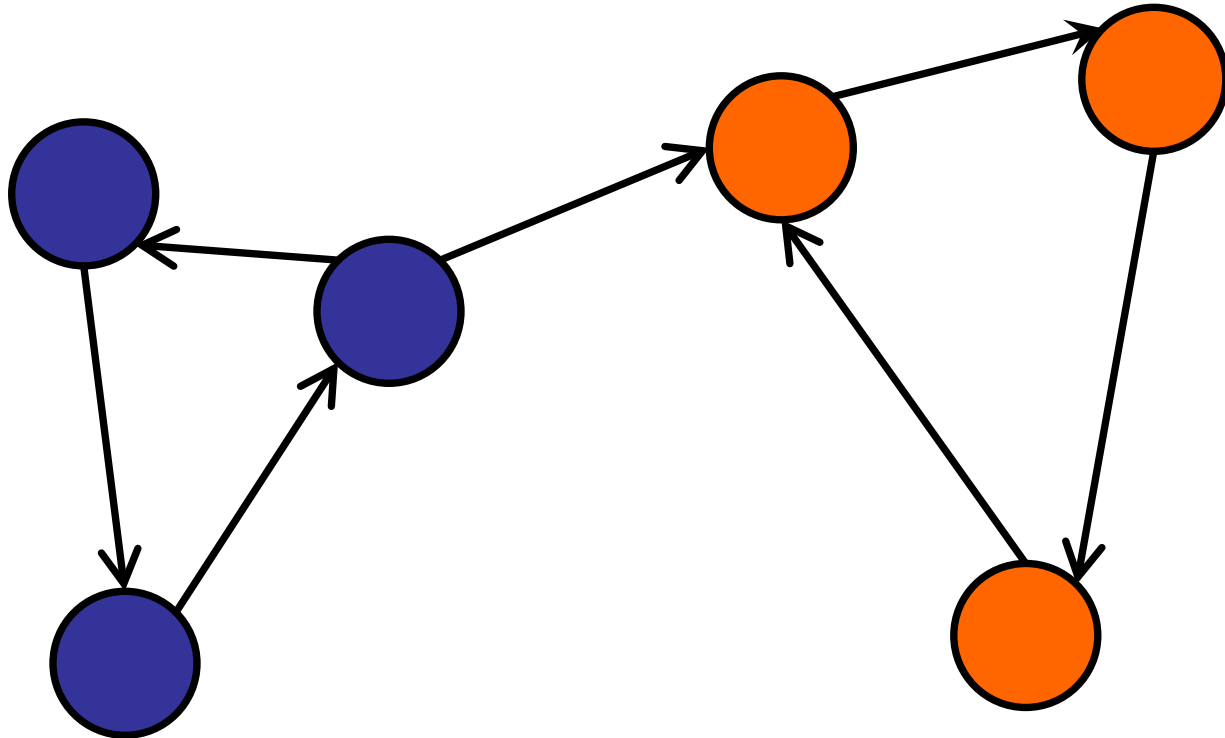
# Connected Components

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## Strongly connected component

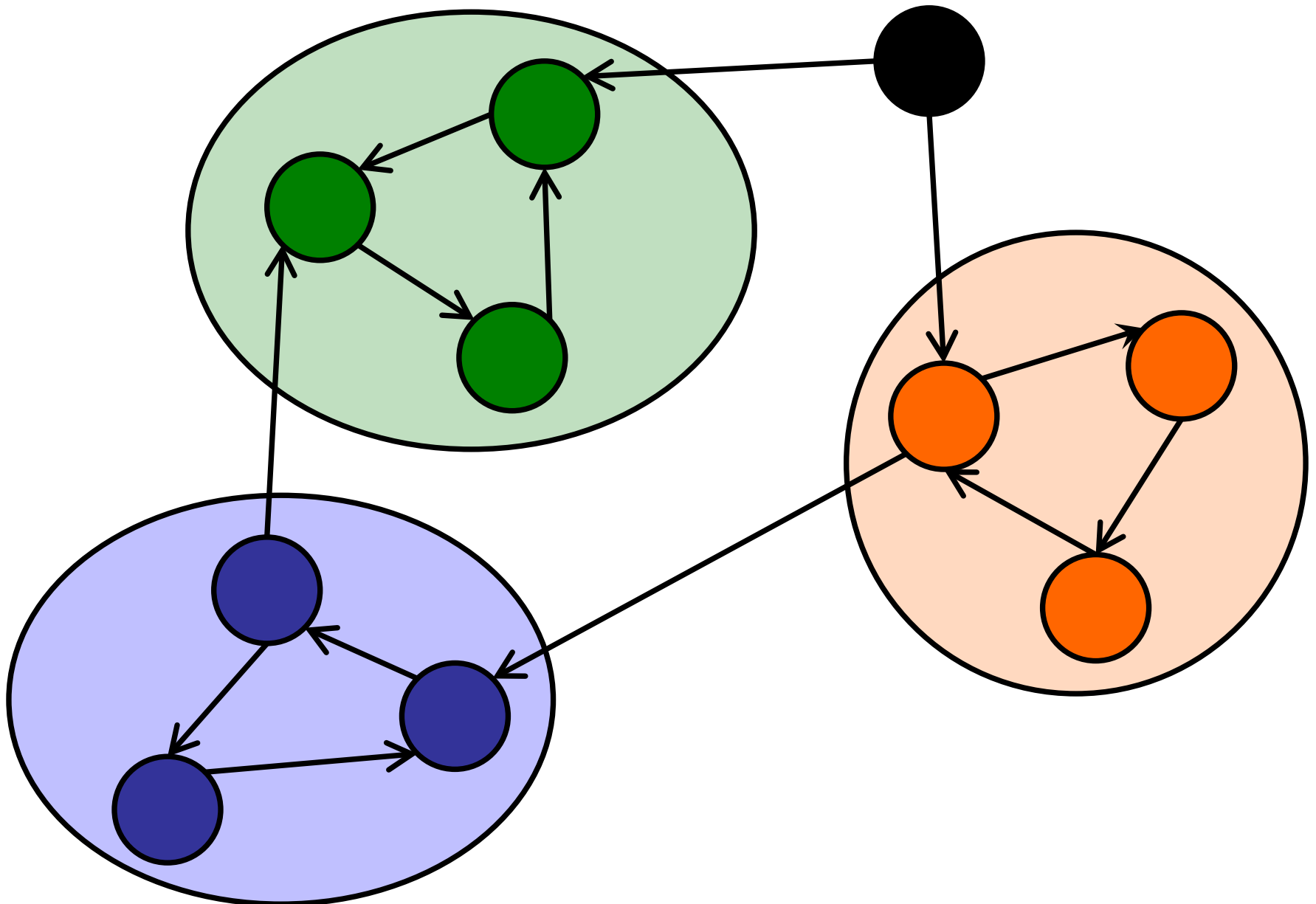
For every vertex  $v$  and  $w$ :

- There is a path from  $v$  to  $w$ .
- There is a path from  $w$  to  $v$ .



# Connected Components

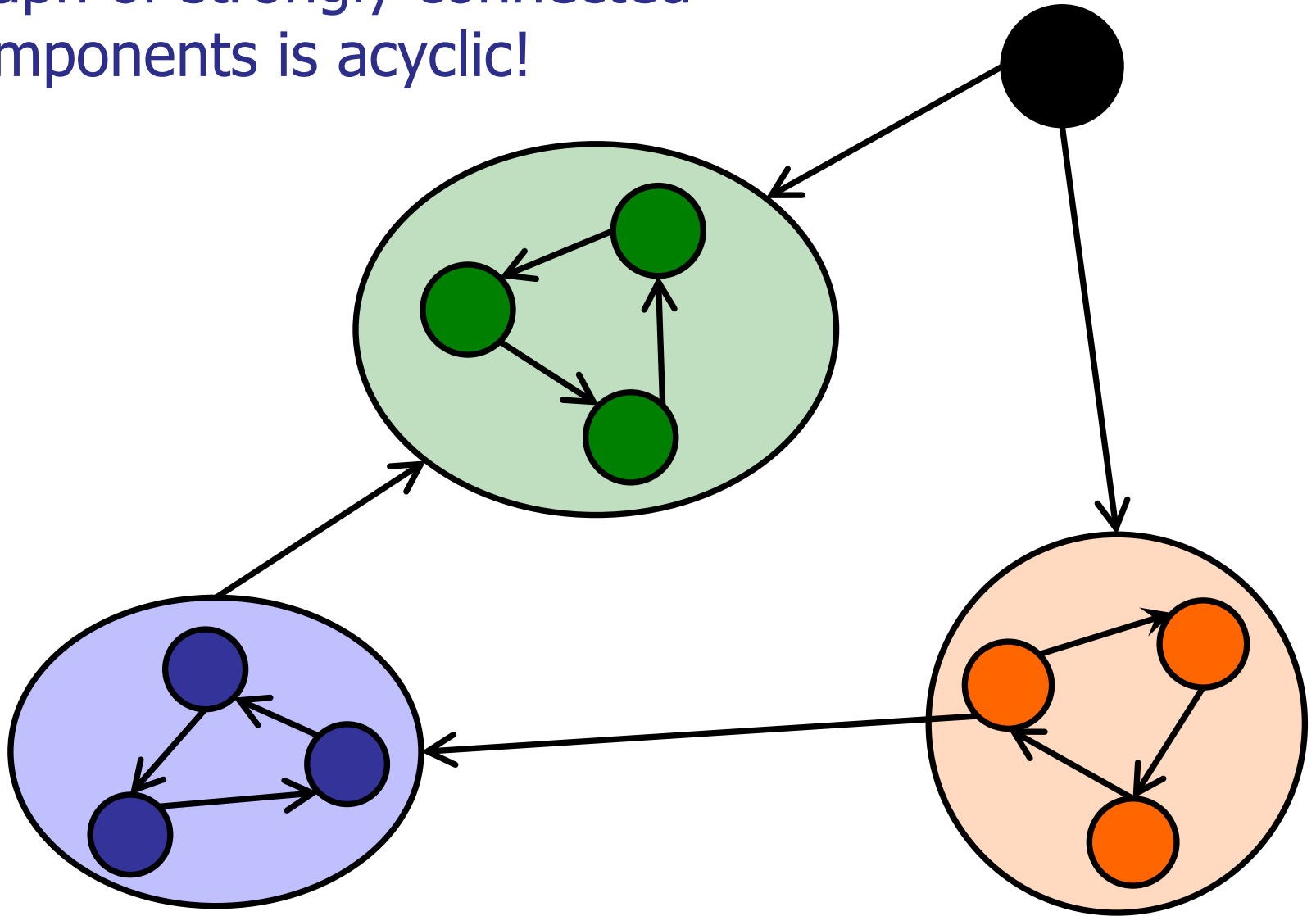
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# Connected Components

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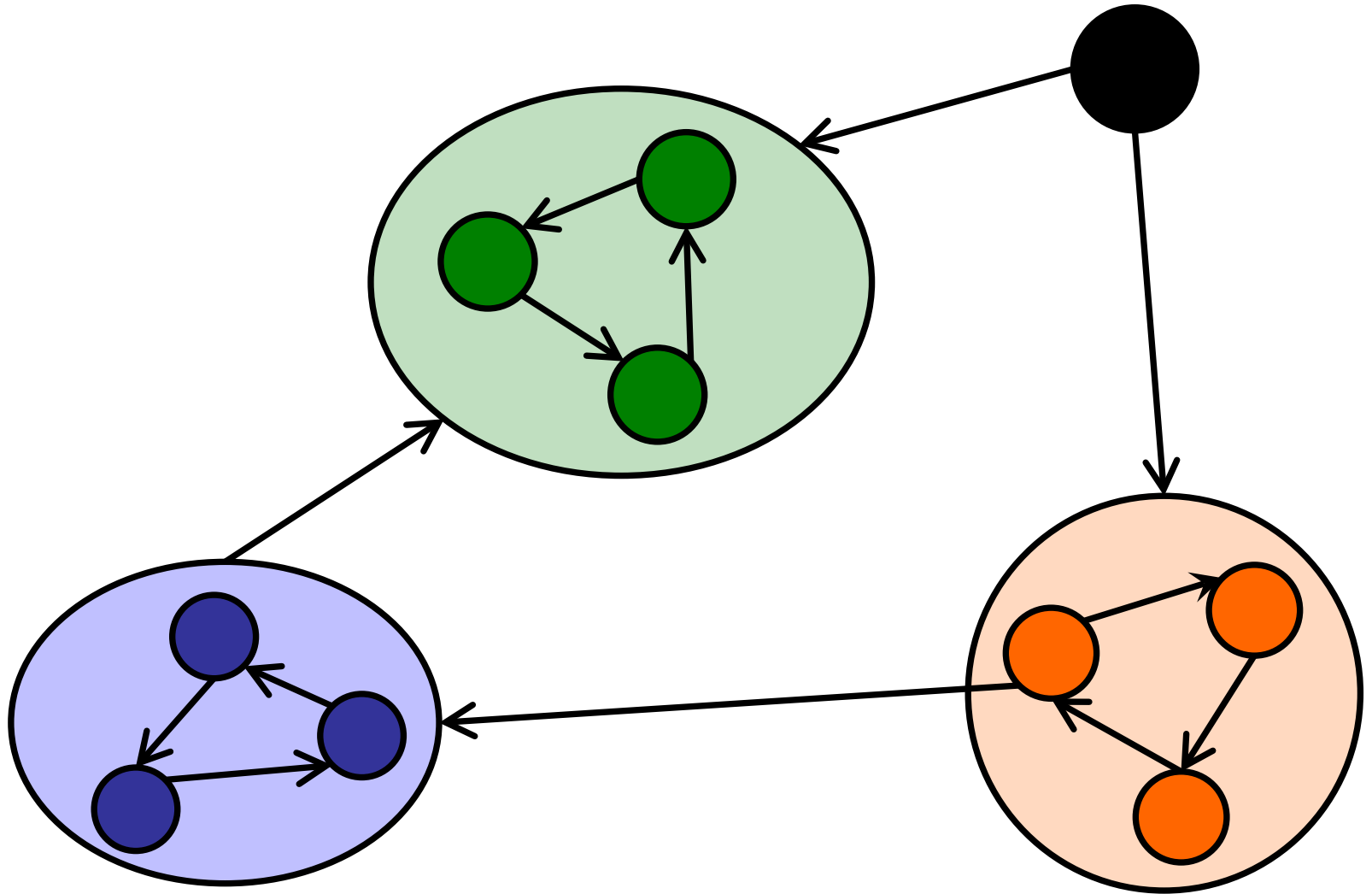
Graph of strongly connected components is acyclic!



# Connected Components

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Challenge: find all strongly connected components.





# Roadmap

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## Part I: Directed Graphs

- What is a directed graph?
- Searching directed graphs (DFS / BFS)
- Topological Sort
- Connected Components

## Part II: Shortest Paths

- The SSSP Problem
- Bellman-Ford