

# Subgraphs, Paths and Connectivity

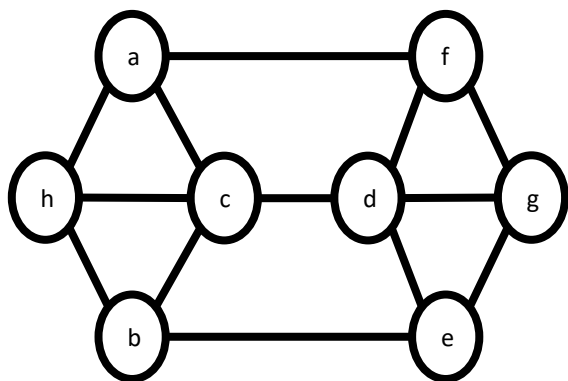
Lecture 25  
By Marina Barsky

# Subgraphs

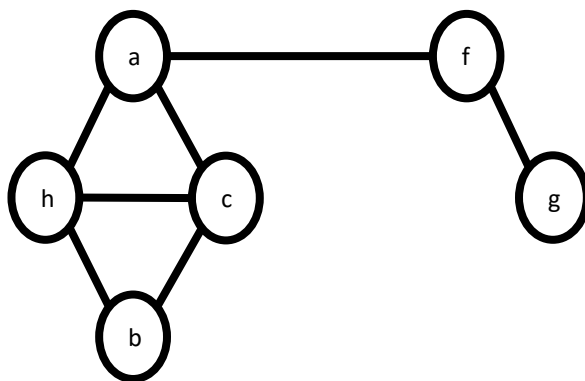
A **subgraph** of a graph is obtained by deleting any subset of vertices and edges.

- If a vertex is deleted, then all of its incident edges disappear

A subgraph is **spanning** if it includes **all** of the vertices (only some edges are deleted).

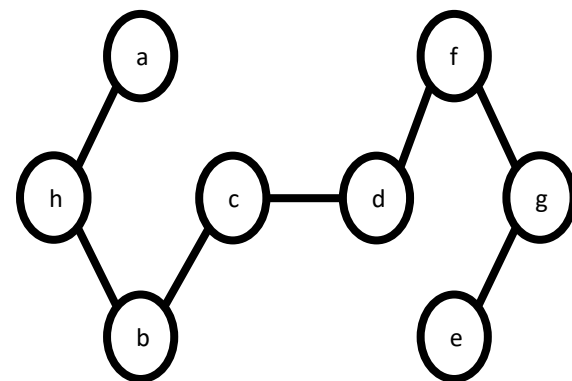


A graph.



A non-spanning subgraph.

An induced subgraph  
 $G[\{a, b, c, h, f, g\}]$ .



A spanning subgraph.

An **induced subgraph** is obtained by deleting any subset of vertices.

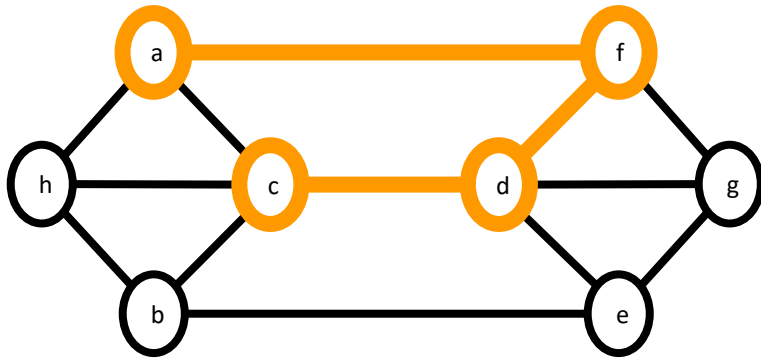
It is denoted by  $G[U]$  where  $U$  is the set of vertices that are not deleted.

# Paths

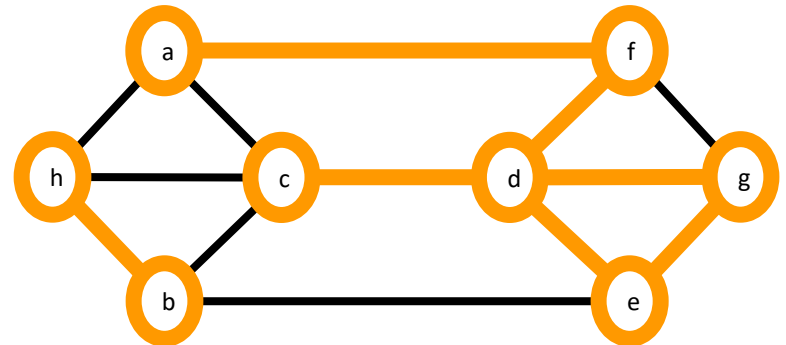
A **path** of length  $k$  is an alternating sequence of vertices and edges:

$$v_1, (v_1, v_2), v_2, (v_2, v_3), v_3, \dots, v_k, (v_k, v_{k+1}), v_{k+1} \text{ where } v_i \neq v_j \text{ if } i \neq j.$$

In other words, there are  $k+1$  vertices and  $k$  edges, the vertices are distinct, and each edge connects consecutive vertices on the path.



A highlighted path  
 $a, (a,f), f, (f,d), d, (d,c), c$



This is not a path since it is disconnected and also  $d$  appears multiple times.

The **length of a path** is the number of traversed edges.

A path from  $u$  to  $v$  is a **shortest path** if there is no shorter path from  $u$  to  $v$ .

For example, there are two shortest paths from  $f$  to  $e$  above.

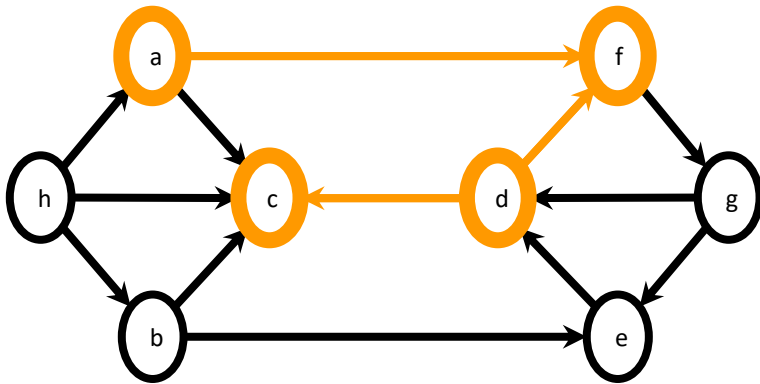
# Cycles

- A **cycle** (sometimes called a **circuit**) in a graph is a **path** where the first vertex is the same as the last one
- All the edges in a **cycle** are distinct

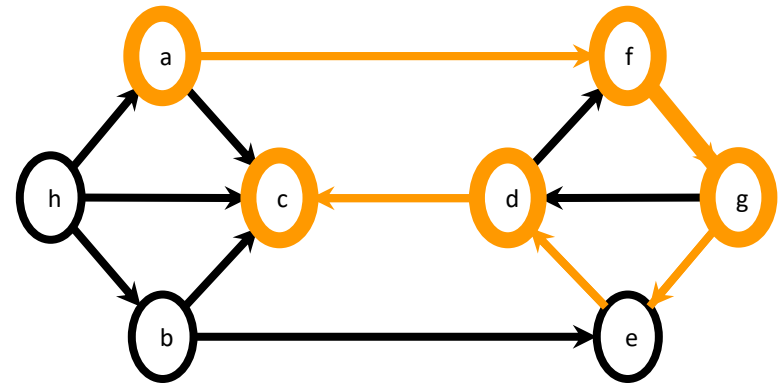
# Directed Paths

In a directed graph each edge is oriented in one of two ways with respect to a path:

- The edge is *forward* if it has the form  $v_i, (v_i, v_{i+1}), v_{i+1}$ .
- The edge is *backward* if it has the form  $v_i, (v_{i+1}, v_i), v_{i+1}$ .



A highlighted path  
a, (a,f), f, (f,d), d, (d,c), c  
where (f,d) is the only backwards edge.

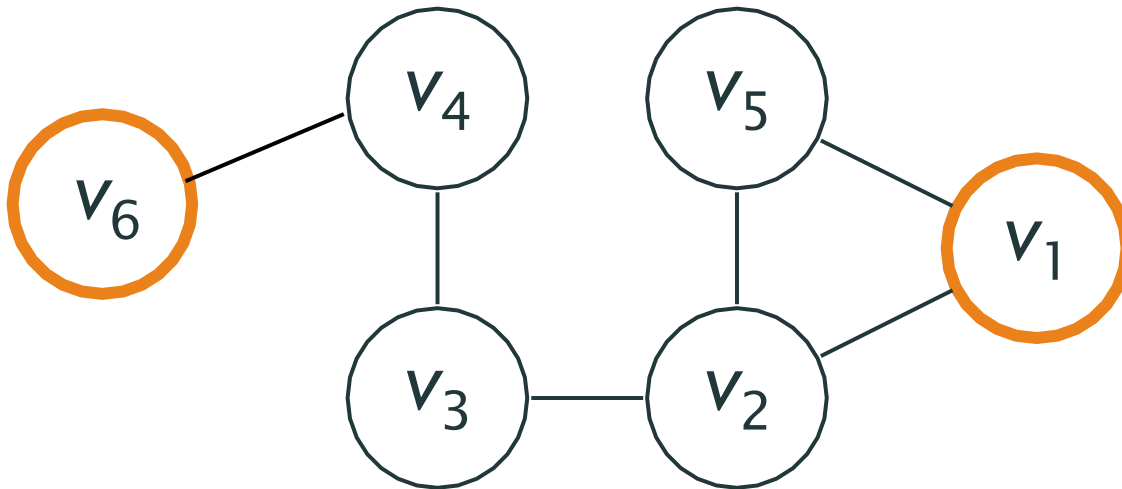


A directed path from a to c.

A path is a *directed path* if every edge is a forward edge.

# Connectivity in undirected graphs

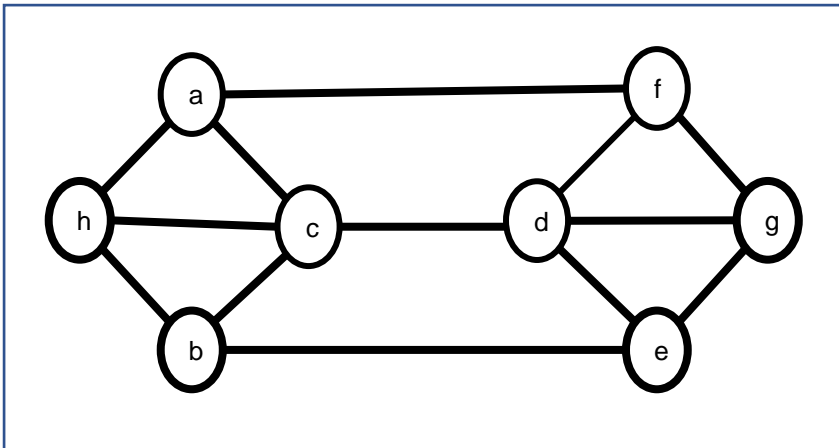
- Two vertices are **connected**, if there is a **path** between them
- The definition is transitive: if  $u$  and  $v$  are connected and  $v$  and  $w$  are connected, then  $u$  and  $w$  are connected as well



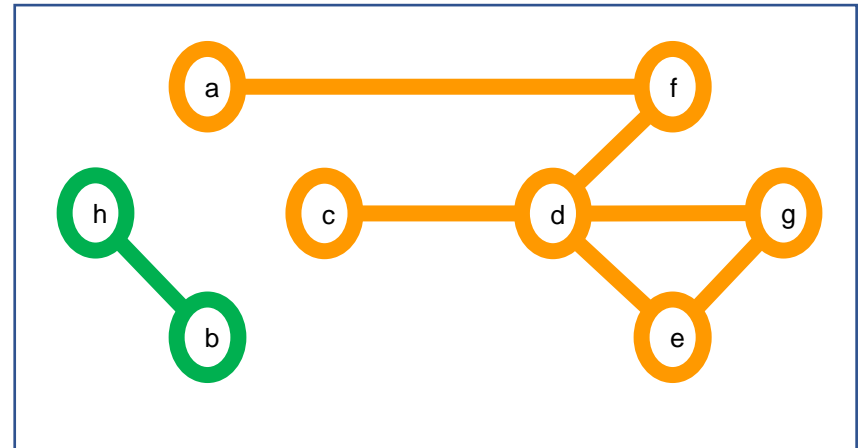
$v_1$  and  $v_6$  are connected.

# Connected graph

- A graph is **connected**, if any two of its nodes are connected. In other words, there is a path between any pair of nodes



This graph is connected.



This graph is not connected.

# Trees and Forests

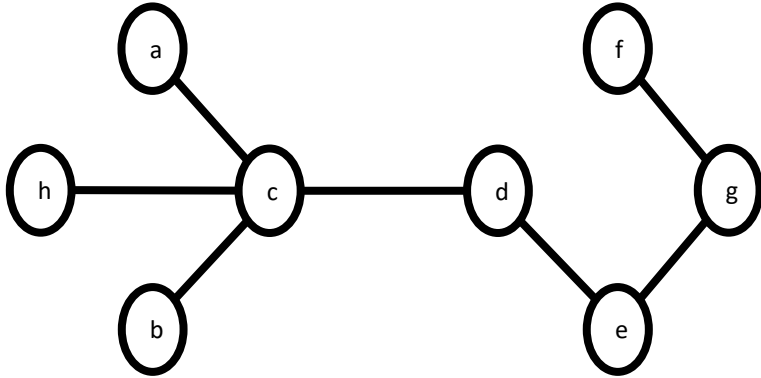


# Trees and Forests

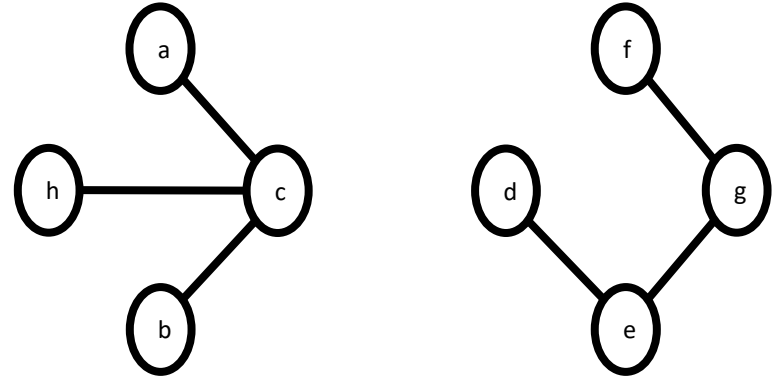
A **tree** is a connected **acyclic** graph. That is, each node is connected to some other node, and there are no cycles.

A **forest** is an acyclic graph (i.e. its connected components are trees.)

A **leaf** is a vertex of degree one, and the other vertices are *internal nodes*.



A tree with four leaves and four internal vertices.



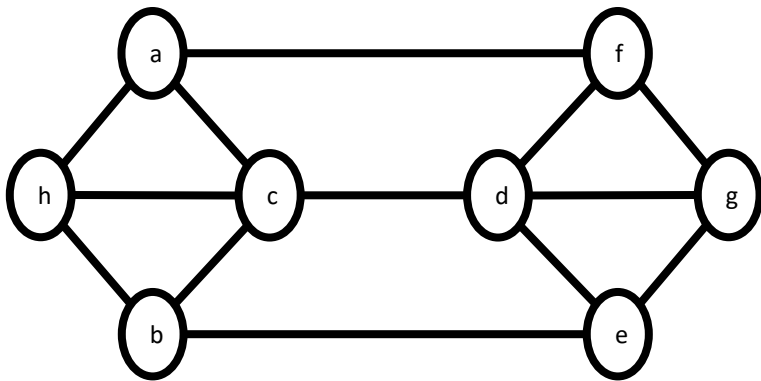
A forest with two component trees.

## Lemmas:

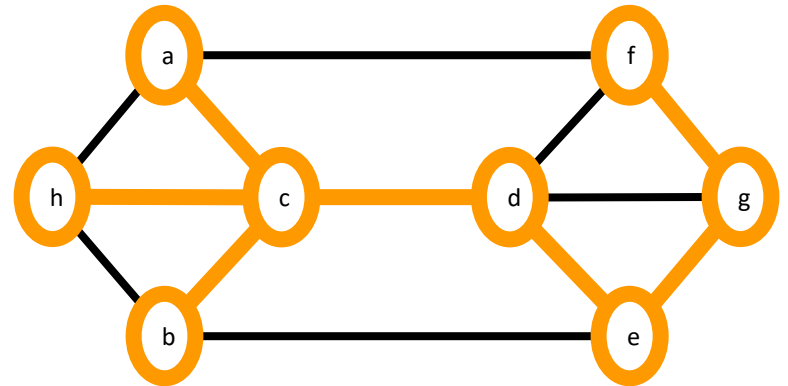
- A tree on  $n$  vertices has  $n-1$  edges.
- A forest with  $n$  vertices and  $c$  components has  $n-c$  edges.
- There is a unique path between any two vertices within a tree.

# Spanning Trees

A *spanning tree* is a subgraph that is spanning and is a tree.



A connected graph.



A spanning tree of the graph.

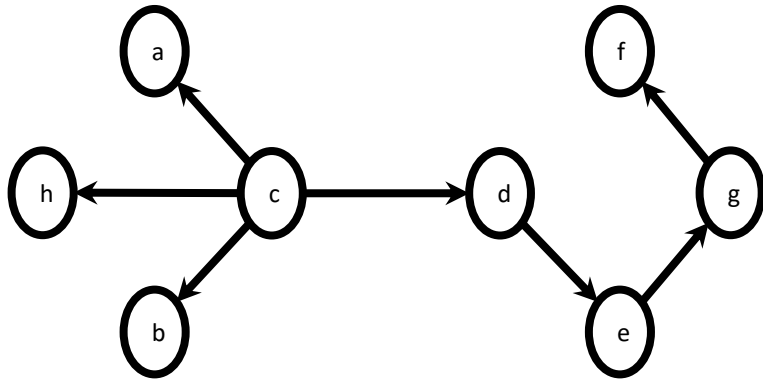
## Lemma:

A graph is connected if and only if it has a spanning tree.

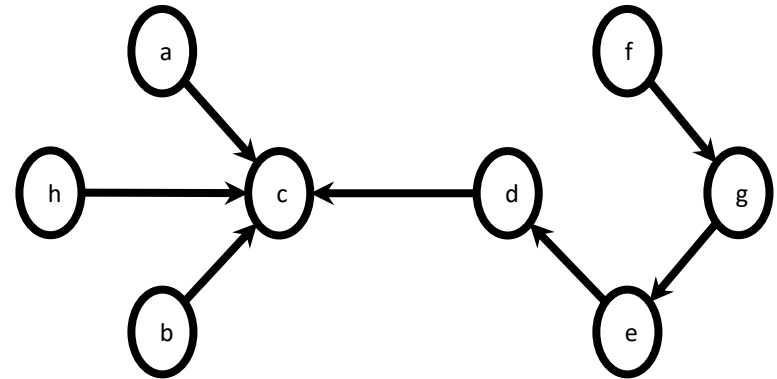
# Rooted Trees

A **rooted tree** has a specified **root** vertex.

Every edge joins a *parent* and a *child* vertex, where the parent is closer to the root.



A rooted tree from vertex c.  
Edges are directed outward from the root (i.e.  
parent to child).



A rooted tree from vertex c.  
Edges are directed inward to the root (i.e.  
child to parent).

Sometimes we direct edges *outward* from the root or *inward* to the root.  
When rooted trees are drawn the root is typically placed at the top and every  
parent is placed above its children.



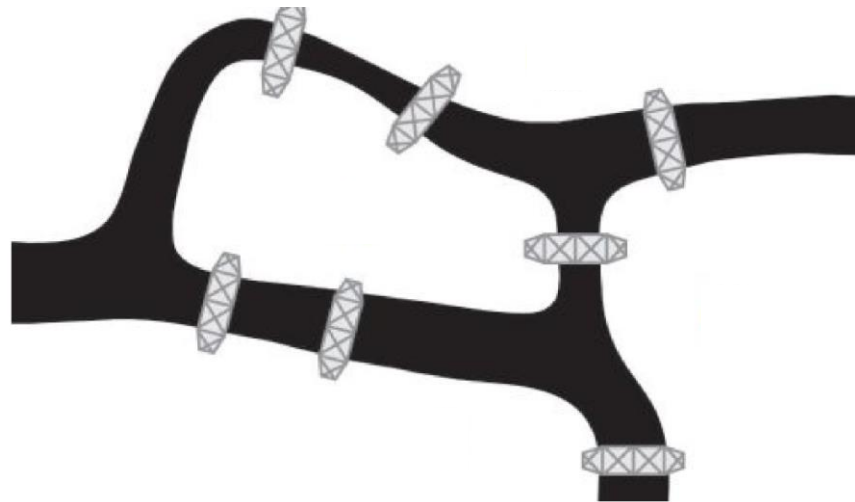
Leonhard Euler  
1707 - 1783

Modeling with graphs and paths

# Seven bridges of Königsberg

# Euler's dilemma:

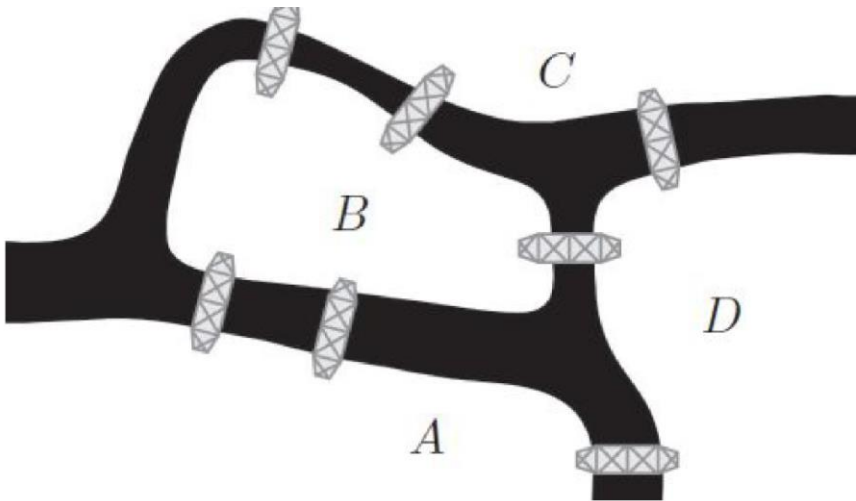
Can I take a walk and cross each bridge exactly once?



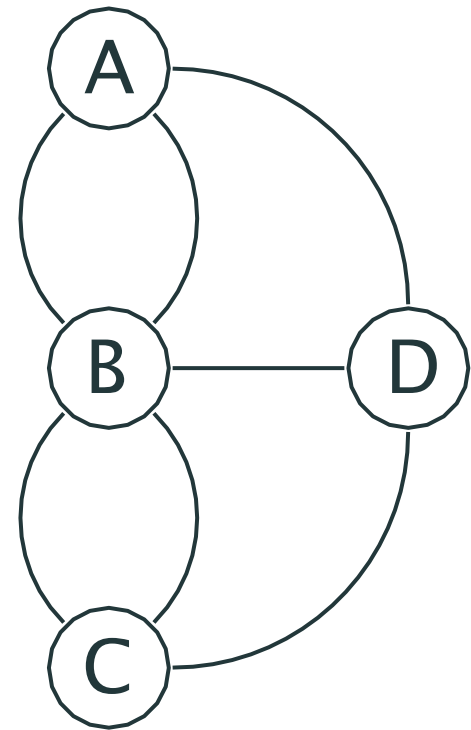
**Seven bridges of Königsberg**

# Eulerian path problem

Is there a path which visits **every edge** of the graph **exactly once**?



Seven bridges of Königsberg

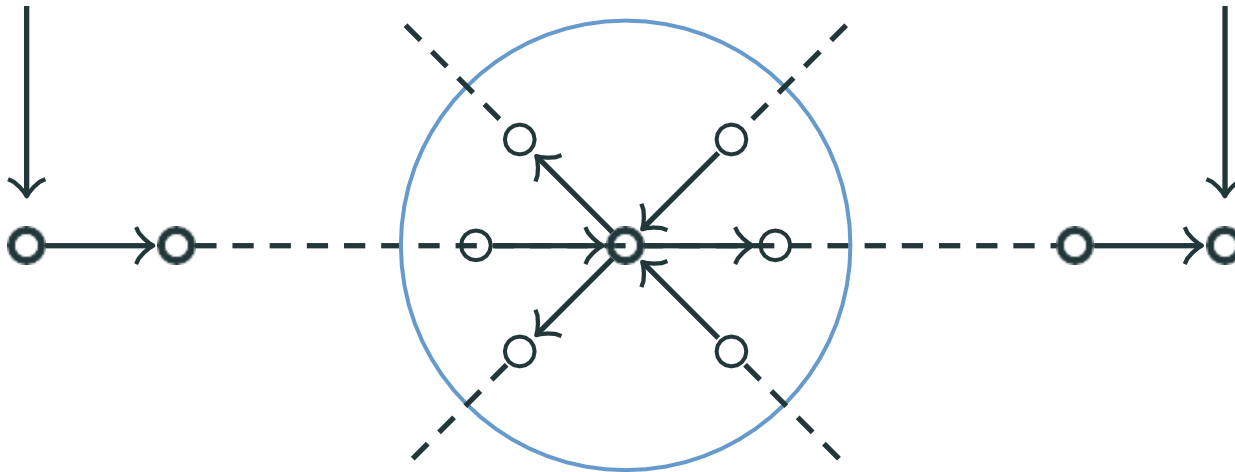


Modeled as Graph

# Eulerian Path

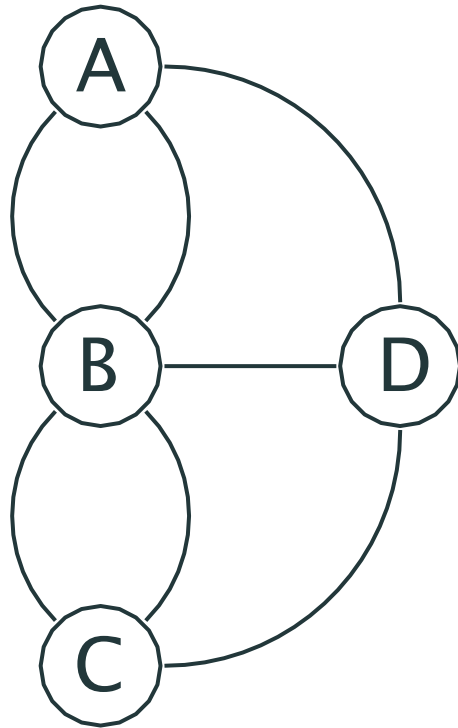
START

FINISH

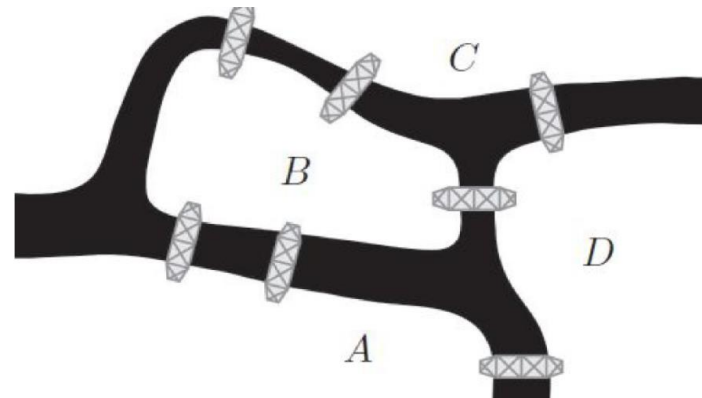


Necessary condition: all but START and FINISH vertices must have **even** degrees. Why?

# Seven bridges of Königsberg



Is there an **Eulerian Path** through these seven bridges?

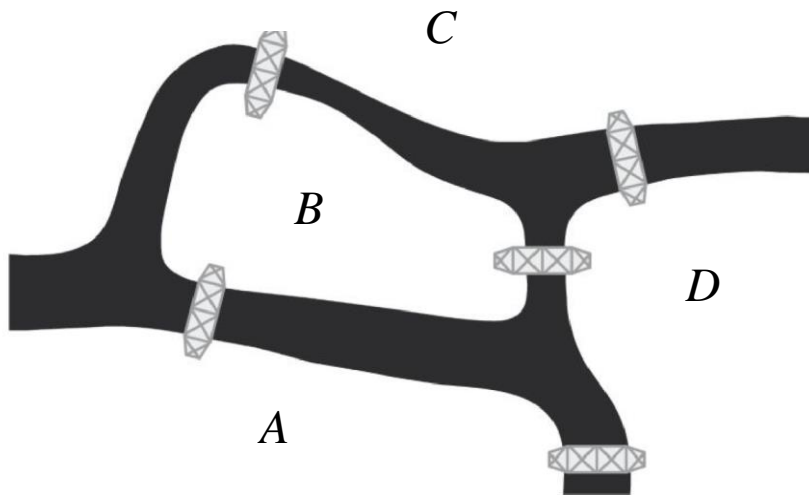


Königsberg, 17-th century

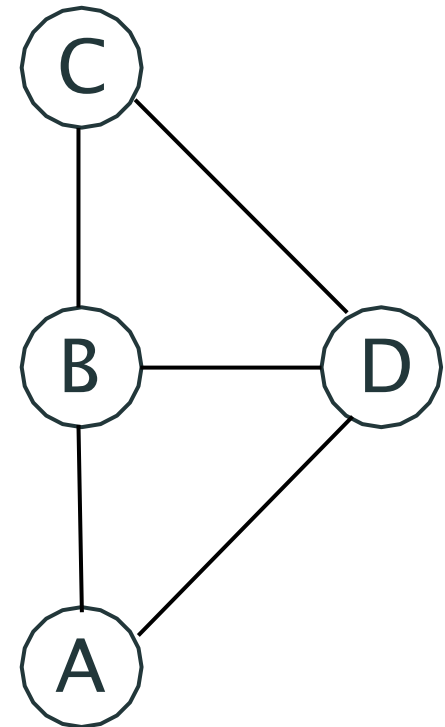


# Five Bridges of Kaliningrad

Is there an **Eulerian Path** through these five bridges?



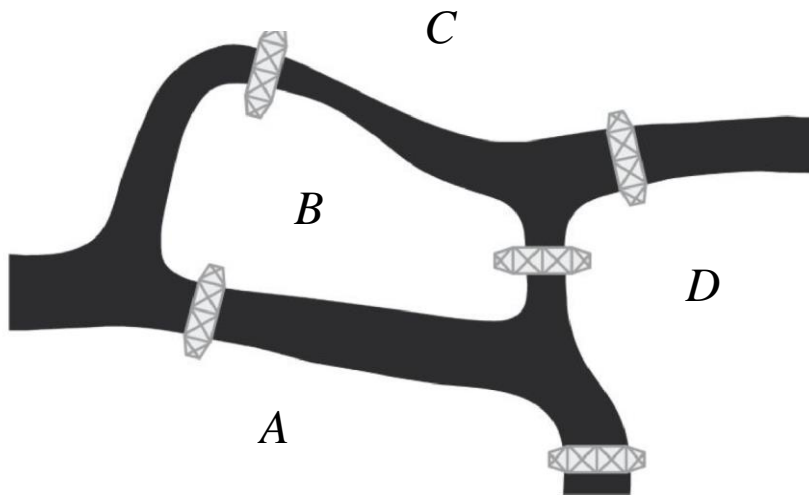
Königsberg (Kaliningrad), 21-th century



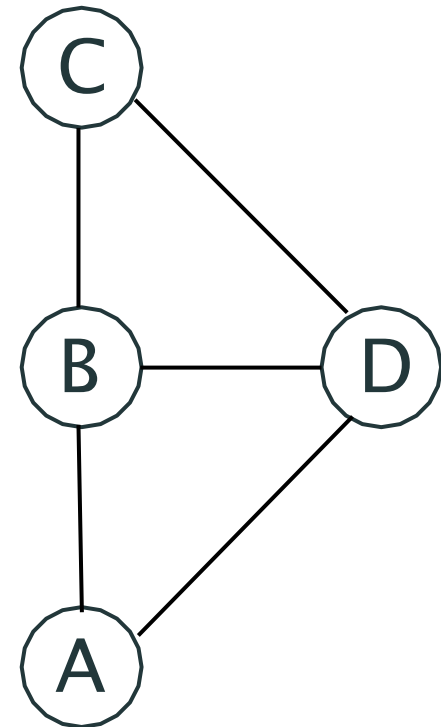
# Five Bridges of Kaliningrad

B and D have **odd** degree

If there exists an Eulerian path, B and D must be START and FINISH



Königsberg (Kaliningrad), 21-th century



## Eulerian Cycle

An **Eulerian cycle (circuit)** visits every **edge exactly once** and **returns** to the starting vertex.

- A cycle must have the same starting and ending vertex
- While in a path the starting and ending node should not necessarily be the same (but they might be the same). So the cycle is a special case of a path.

# Criteria for Eulerian Cycle (Path)

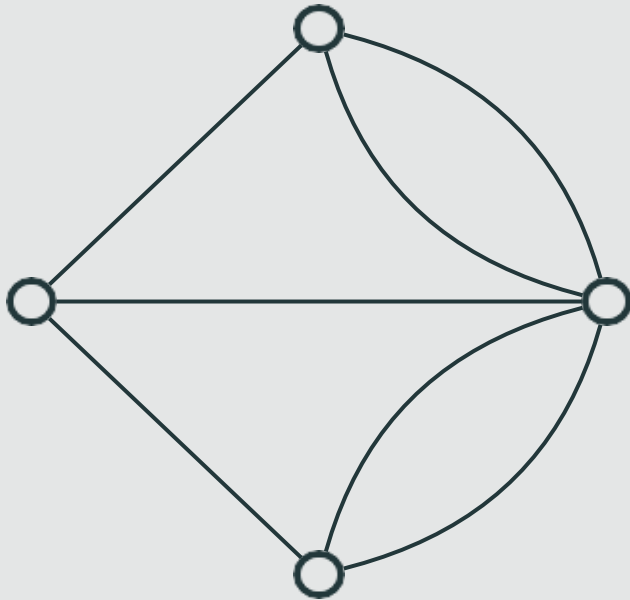
## Theorem

A **connected** undirected graph contains an Eulerian cycle, **if and only if** the degree of every node is **even**.

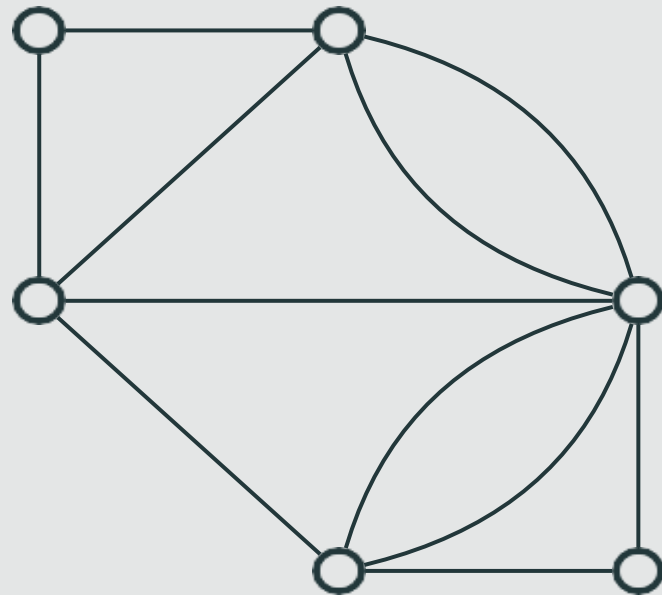
Note: every cycle is also a path, so if we have an Eulerian cycle, we also have an Eulerian path

But if we only want a path which is not a cycle, then exactly 2 vertices (namely start and end) are allowed to have odd degrees.

## Graph A



## Graph B

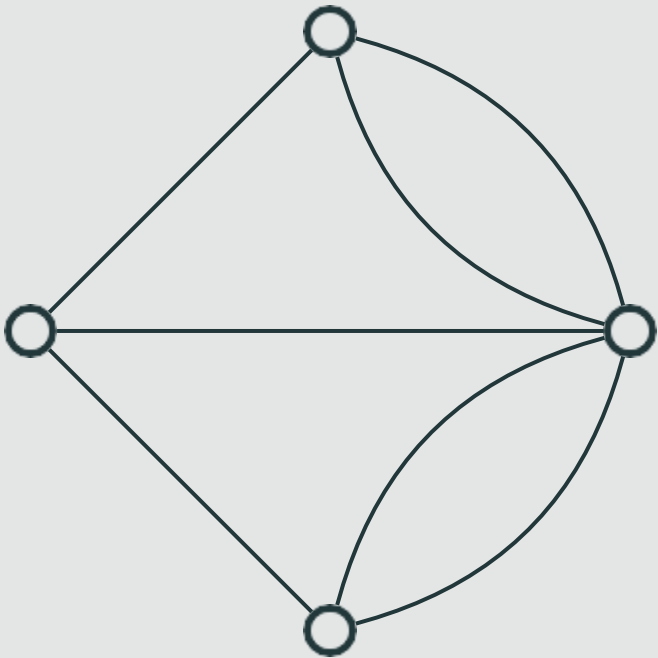


Which graph is an Eulerian graph (contains Eulerian cycle)?

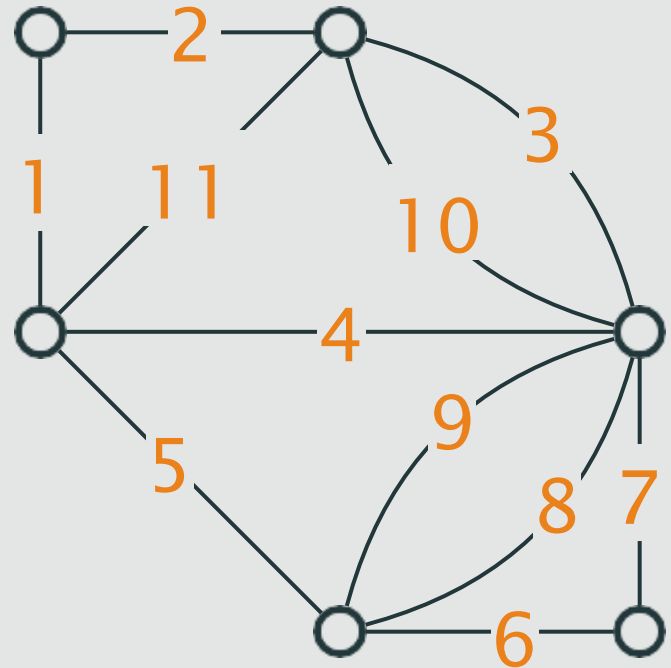
- A. Graph A
- B. Graph B
- C. Both A and B
- D. Neither A nor B



## Non-Eulerian graph

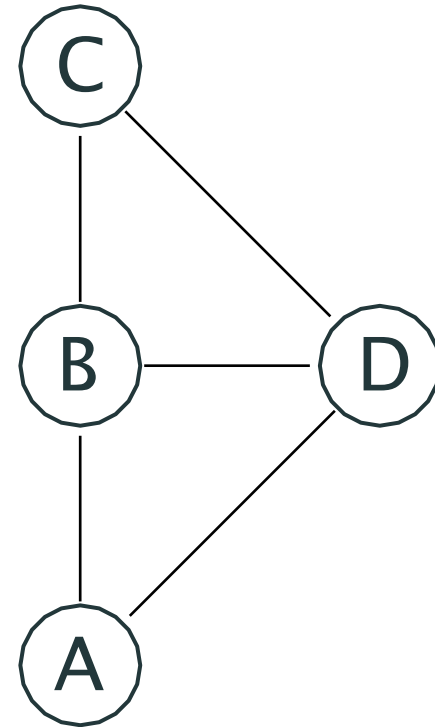
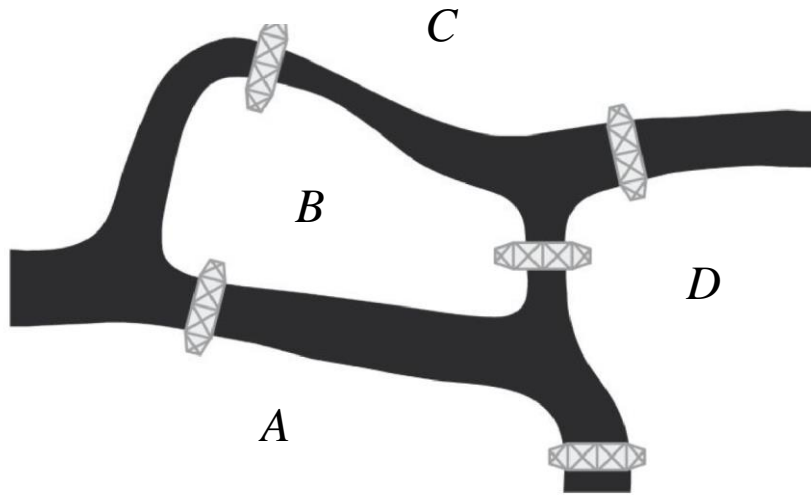


## Eulerian graph



Eulerian path (cycle)

# Algorithm for finding Eulerian Cycle (Path)



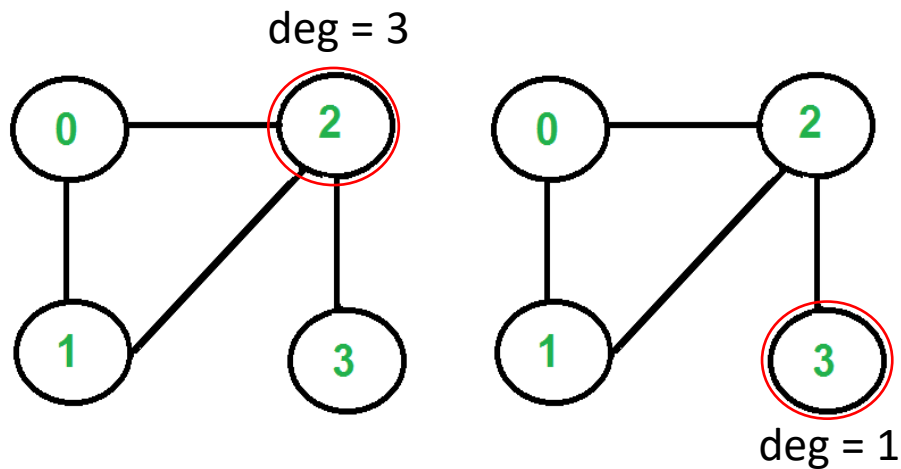
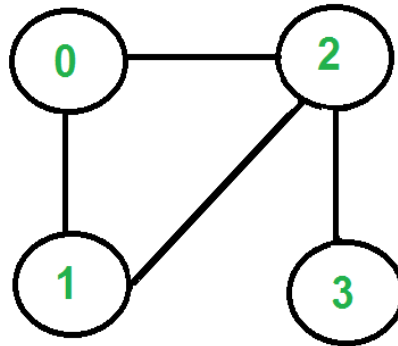
The theorem about the existence of an Eulerian cycle can be transformed into an efficient algorithm for constructing it

# Eulerian Path Algorithm

- If there are no odd-degree vertices, start anywhere  
If there are 2 odd-degree vertices, start at one of them.
- Out of the current vertex follow any edge
  - If you have a choice between a *bridge* and a *non-bridge*, always **choose the non-bridge**: “don’t burn bridges“ so that you can come back to a vertex and traverse remaining edges
  - Remove each followed edge (or mark as processed)
- Stop when you run out of edges

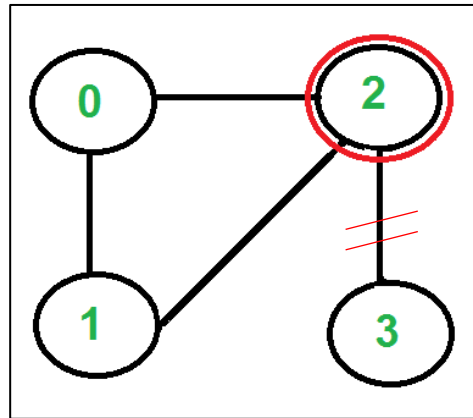
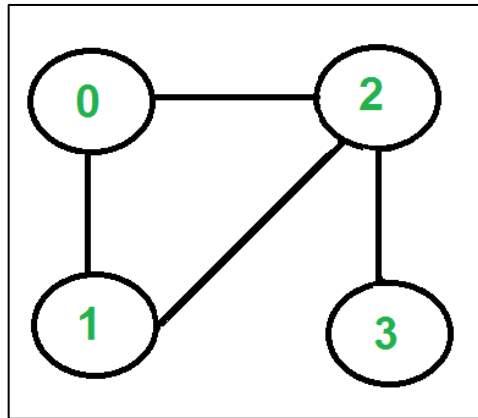


# Example



Two vertices with odd degree –  
choose any of them to start

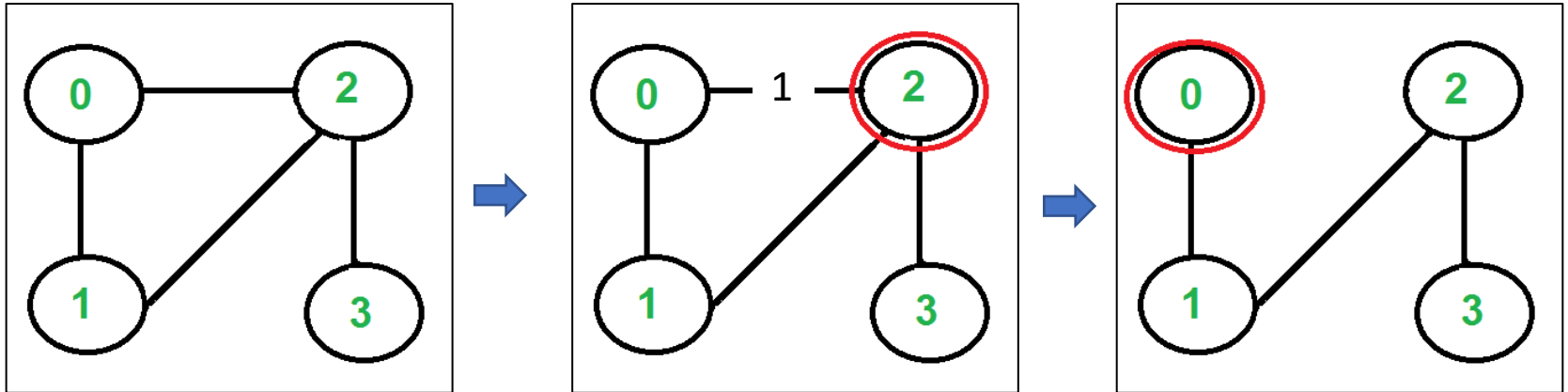
# Example: where to go first?



Do not go there:  
(2,3) is a bridge

Eulerian Path:

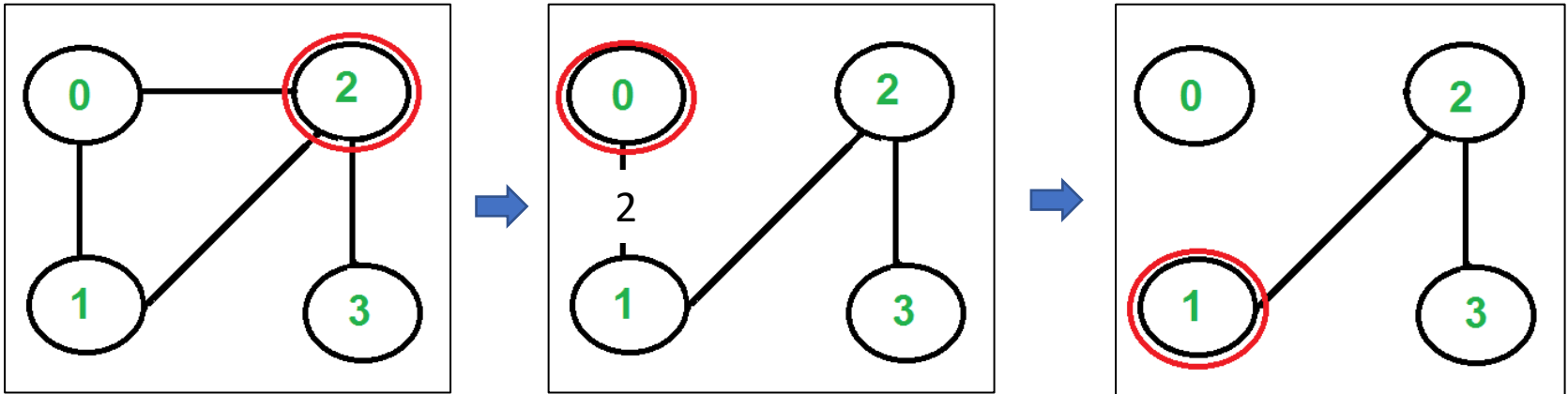
# Example: step 1



Move along (2,0) and then delete edge (2,0)

Eulerian Path: (2,0)

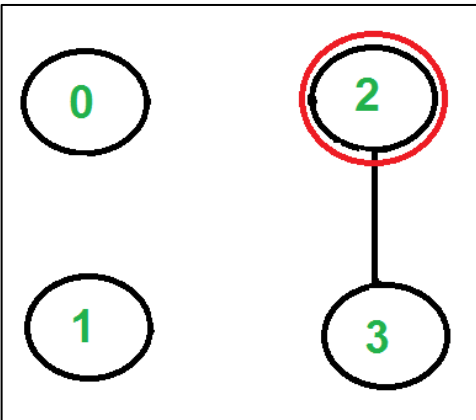
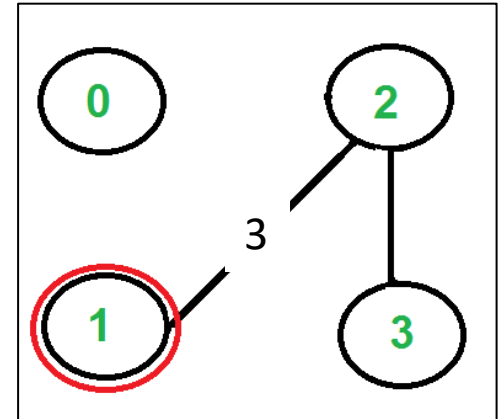
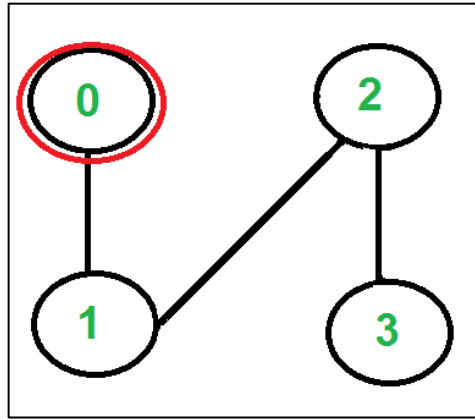
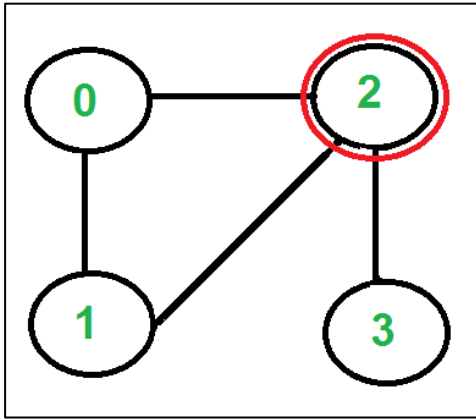
# Example: step 2



Move along (0,1) and then delete edge (0,1)

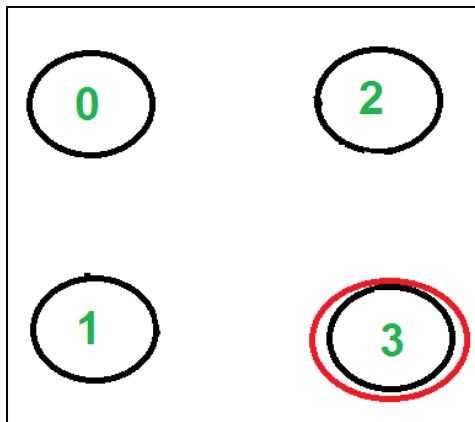
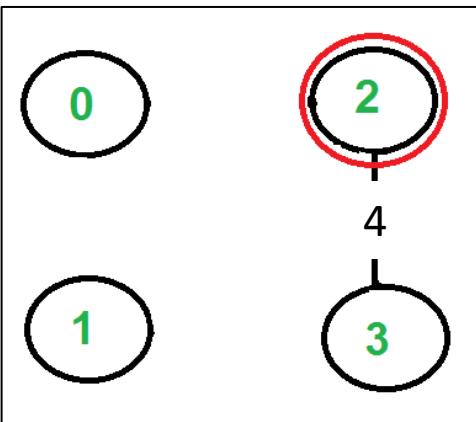
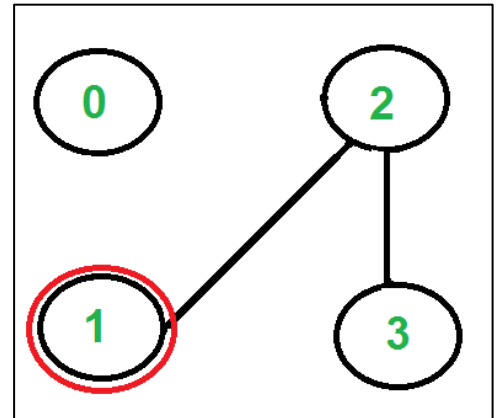
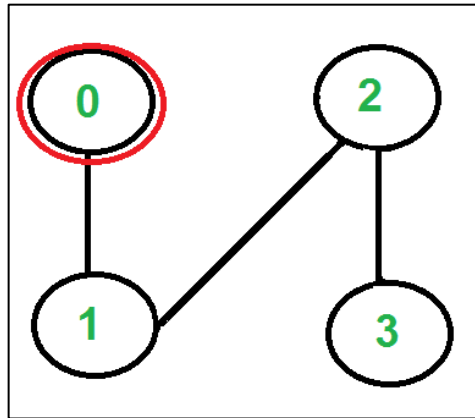
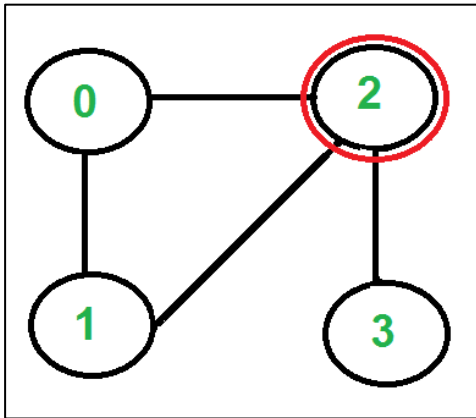
Eulerian Path: (2,0), (0,1)

# Example: step 3



Eulerian Path: (2,0), (0,1), (1,2)

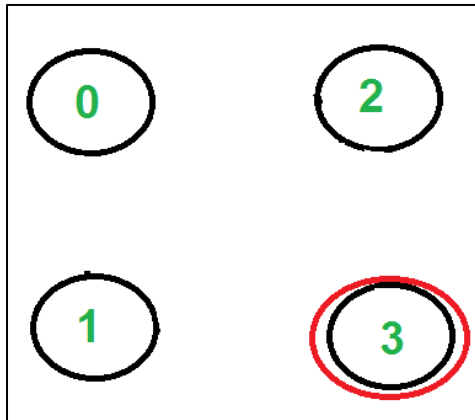
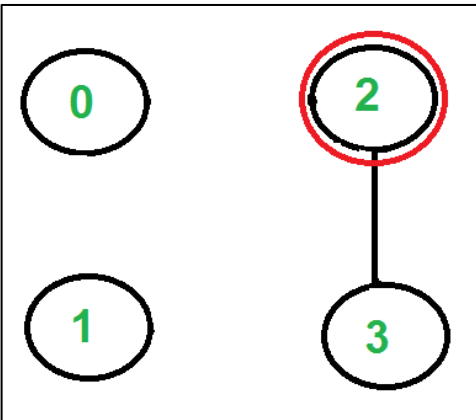
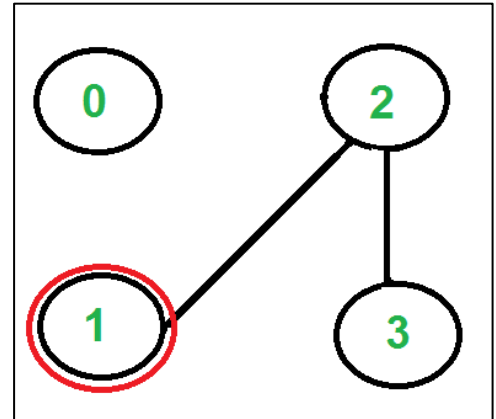
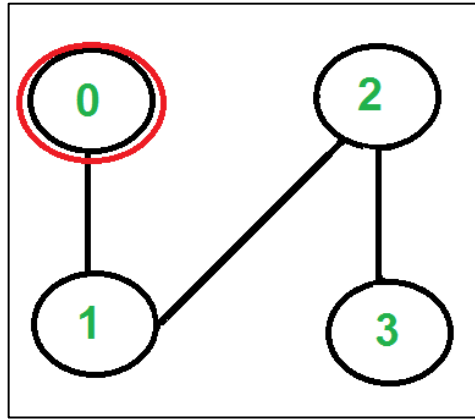
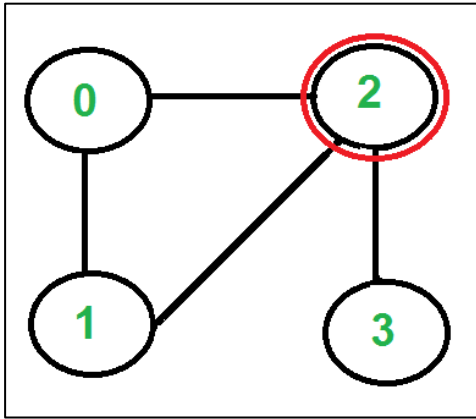
# Example: step 4



Move along (2,3)

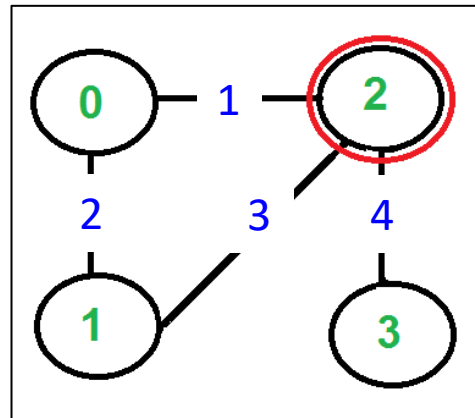
Eulerian Path: (2,0), (0,1), (1,2), (2,3)

# Example: the end



Eulerian Path: (2,0), (0,1), (1,2), (2,3)

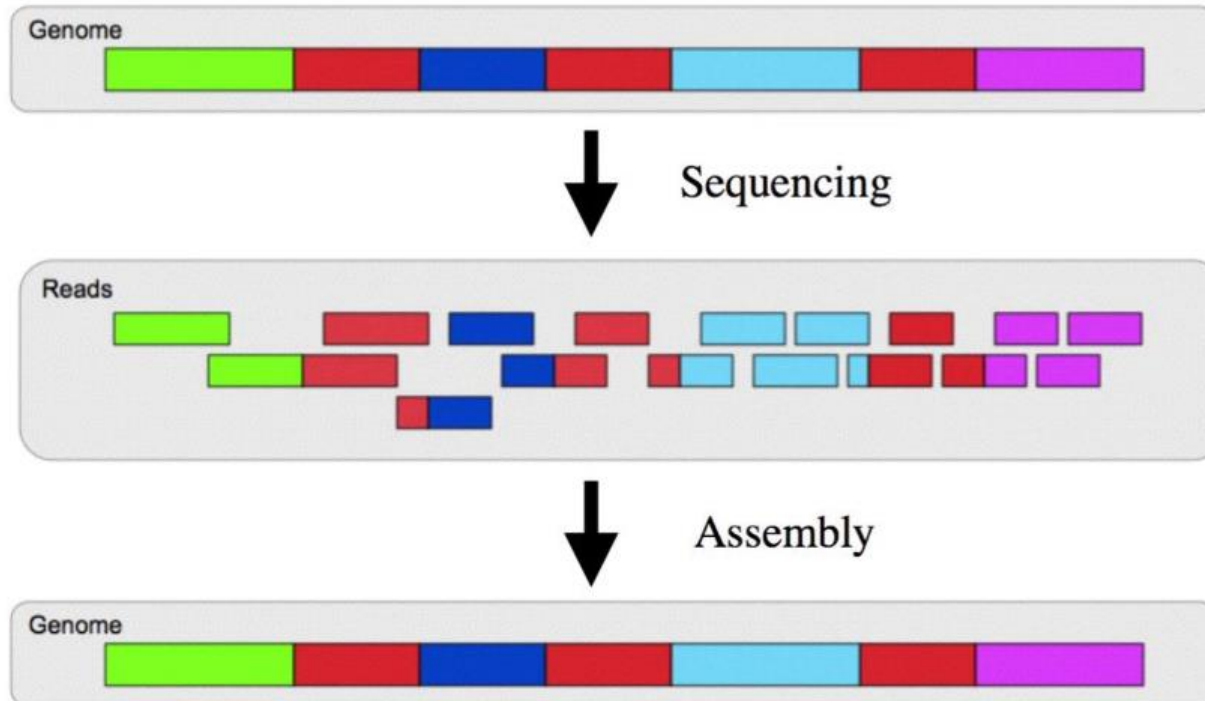
# Example: the end



Eulerian Path: (2,0), (0,1), (1,2), (2,3)



# Genome Assembly problem



# Genome Assembly problem: toy example

Find a string whose all substrings of length 3  
are:

AGC, ATC, CAG, CAT, CCA, GCA, TCA, TCC.

How is this related to paths in graphs?..

# All Substrings of Length 3

DISCRETE

DIS

ISC

SCR

CRE

RET

ETE

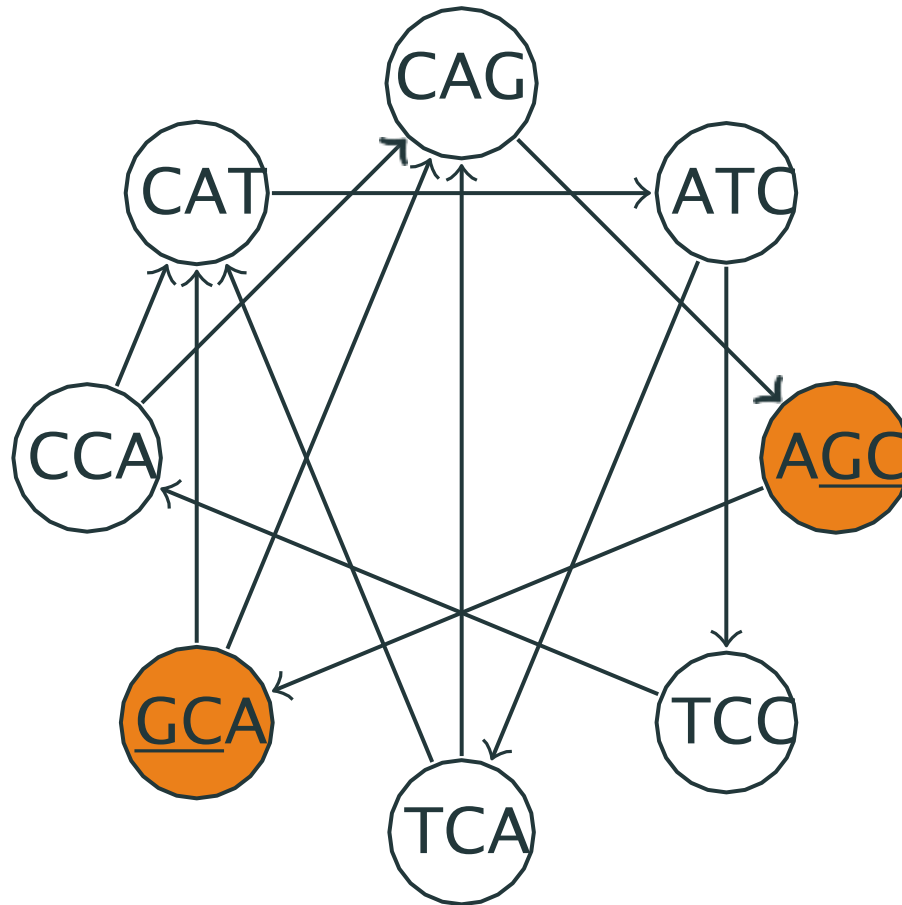
Every two neighbor 3-substrings have a common part of length 2, called an **overlap**

# Finding a Permutation

- Goal: Find a string whose all substrings of length 3 are AGC, ATC, CAG, CAT, CCA, GCA, TCA, TCC
- Hence, we need to **order** these 3-substrings such that the overlap between any two consecutive substrings is equal to 2

# Overlap Graph

AGC  
ATC  
CAG  
CAT  
CCA  
GCA  
TCA  
TCC



There is an edge from  $s_1$  to  $s_2$  if  $s_1[2:3]=s_2[1:2]$

# Different approach

(De Bruijn; Pevzner, Tang, Waterman)

## State-of-the-art genome assemblers

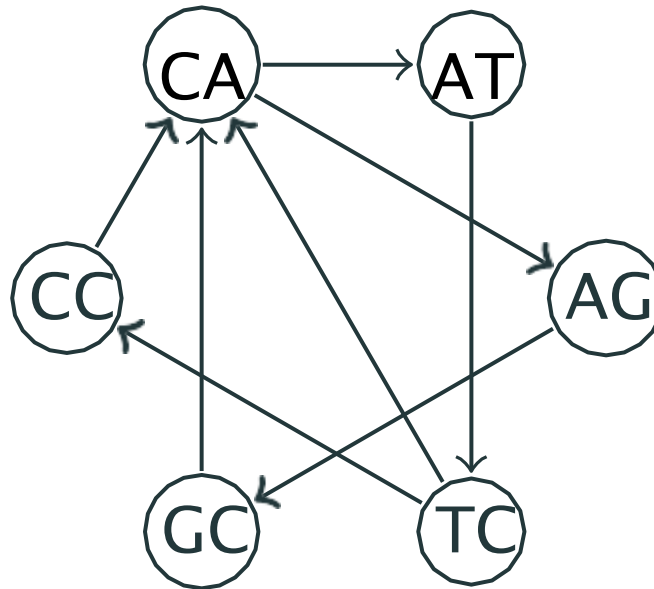
- In the overlap graph, each **node** corresponds to the input substring
- Let's instead represent each **edge** by the same substring, broken into 2 nodes (overlaps):

E.g., represent the string CAT as an edge

CA → AT

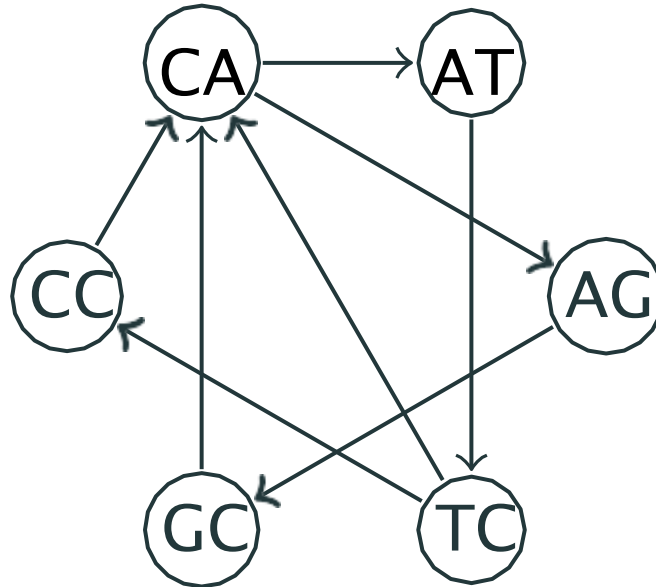
# De Bruijn Graph

AGC, ATC, CAG, CAT, CCA, GCA,  
TCA, TCC



# De Bruijn Graph

AGC, ATC, CAG, CAT, CCA, GCA,  
TCA, TCC

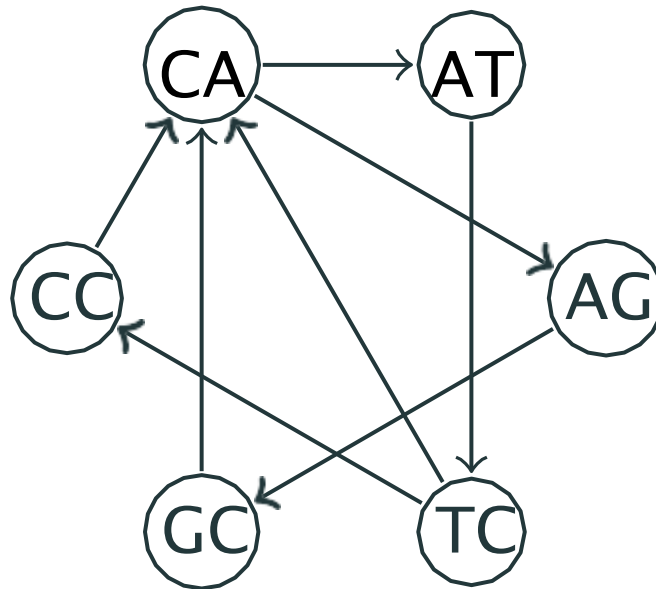


now, we need to find an order of **edges**



# De Bruijn Graph

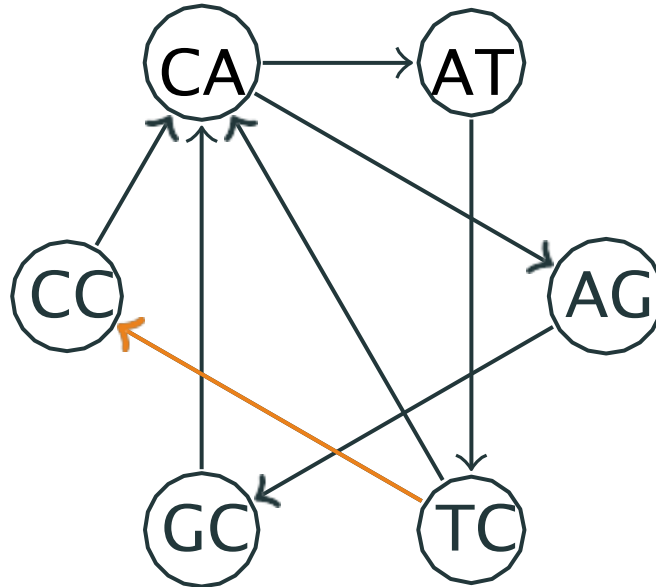
AGC, ATC, CAG, CAT, CCA, GCA,  
TCA, TCC



that is, an **Eulerian path**

# De Bruijn Graph

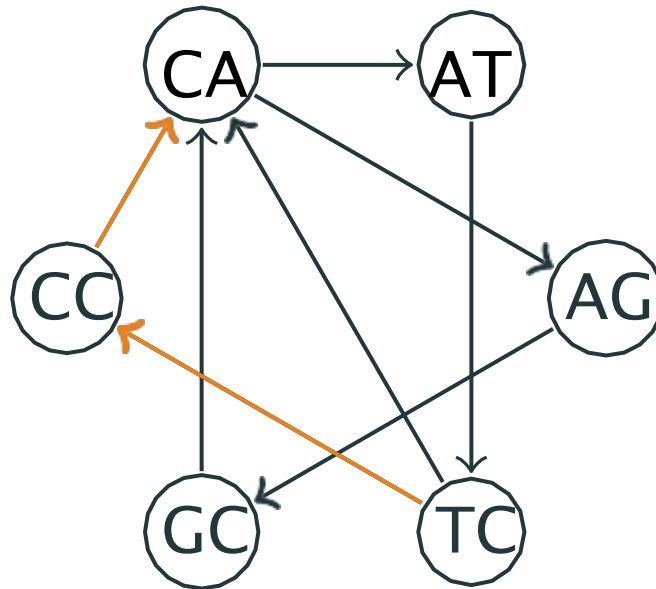
AGC, ATC, CAG, CAT, CCA, GCA,  
TCA, TCC



TCC

# De Bruijn Graph

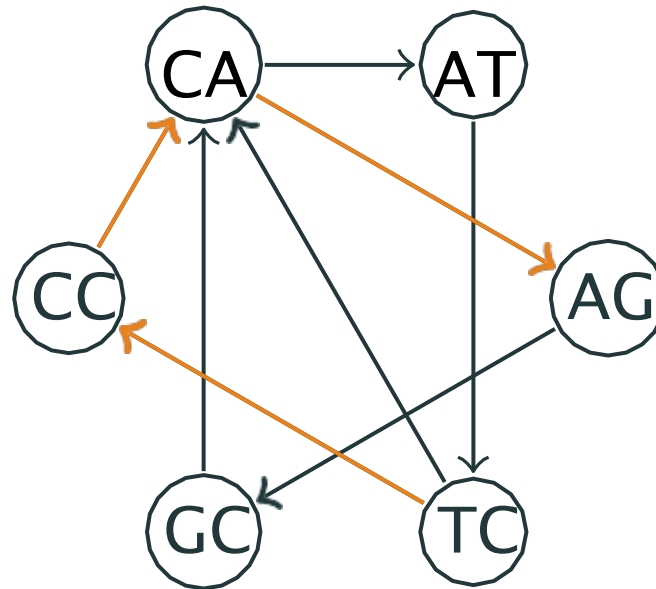
AGC, ATC, CAG, CAT, CCA, GCA,  
TCA, TCC



TCCA

# De Bruijn Graph

AGC, ATC, CAG, CAT, CCA, GCA,  
TCA, TCC



TCCAG

# Group activity

## DeBruijn Graph

- Imagine that you are given a **large** set of 3-letter strings which represent all possible different substrings of the large “genome” string:

*him, eno, ome, chi, nom, mpg, pge, gen, imp*

- Recover the whole “genome” sequence by building a graph model of the problem.
- Draw the graph and explain which algorithm you used on this model to recover the original “genome”