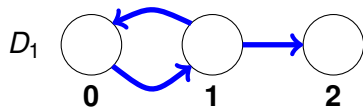
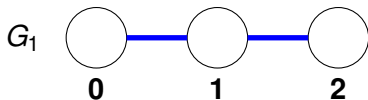


CS250: Discrete Math for Computer Science

L28: Searching Undirected Graphs: Depth First Search

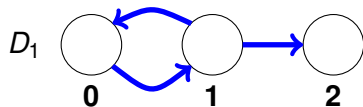
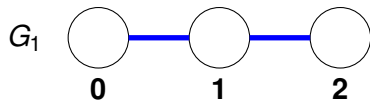
Walks versus Paths

A **path** is a walk that **never visits the same edge or vertex twice**, **except** a path may **start and end** at the **same vertex** in which case it is called a **cycle**.



Walks versus Paths

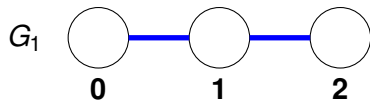
A **path** is a walk that **never visits the same edge or vertex twice**, **except** a path may **start and end** at the **same vertex** in which case it is called a **cycle**. A **loop** is a **cycle of length 1**. There are no cycles of length 0.



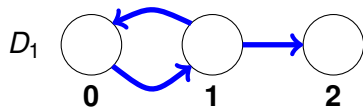
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Note: this definition differs for directed and undirected graphs. The undirected graph G_1 is acyclic.



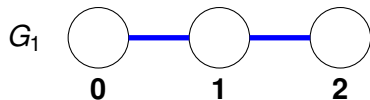
acyclic



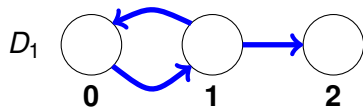
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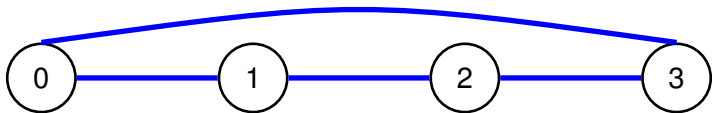
Note: this definition differs for directed and undirected graphs. The undirected graph G_1 is acyclic. However, the directed graph, D_1 , has a cycle: $(0, 1, 0)$.



acyclic



cyclic



$$w_1 = (0)$$

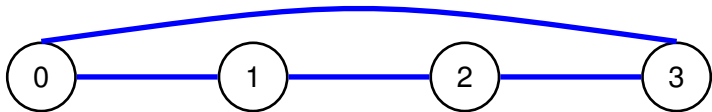
$$w_2 = (0, 1)$$

$$w_3 = (0, 1, 2)$$

$$w_4 = (0, 1, 0)$$

$$w_5 = (0, 1, 2, 3)$$

$$w_6 = (0, 1, 2, 3, 0)$$



$$w_1 = (0)$$

$$w_2 = (0, 1)$$

$$w_3 = (0, 1, 2)$$

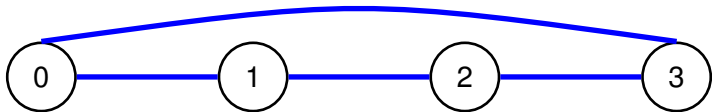
$$w_4 = (0, 1, 0)$$

$$w_5 = (0, 1, 2, 3)$$

$$w_6 = (0, 1, 2, 3, 0)$$

iClicker 28.1 In the above undirected graph, which of the above walks are paths?

A: all of them **B: all except w_4** **C: all except w_4 and w_6**



$$w_1 = (0)$$

$$w_2 = (0, 1)$$

$$w_3 = (0, 1, 2)$$

$$w_4 = (0, 1, 0)$$

$$w_5 = (0, 1, 2, 3)$$

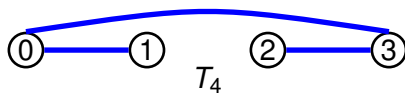
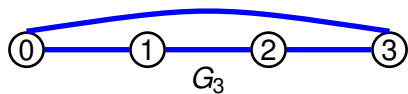
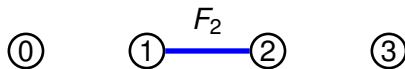
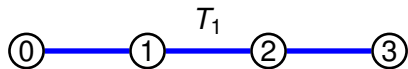
$$w_6 = (0, 1, 2, 3, 0)$$

iClicker 28.2 Which of the above walks are cycles?

A: w_4 and w_6 **B:** just w_6

Cyclic versus Acyclic

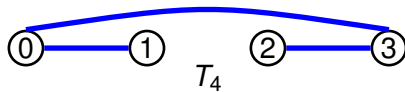
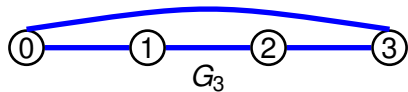
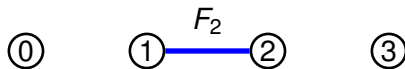
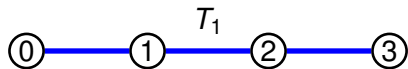
A graph with at **at least one cycle** is called **cyclic**.



Cyclic versus Acyclic

A graph with at **at least one cycle** is called **cyclic**.

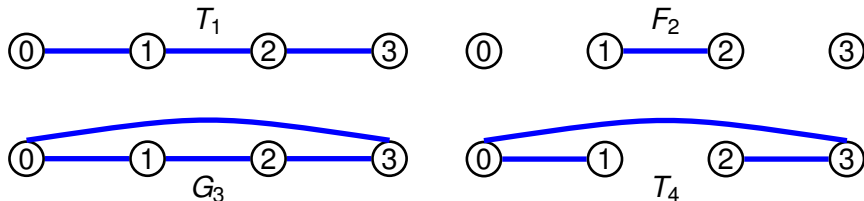
A graph that has **no cycles** is called **acyclic**.



Cyclic versus Acyclic

A graph with at **at least one cycle** is called **cyclic**.

A graph that has **no cycles** is called **acyclic**.

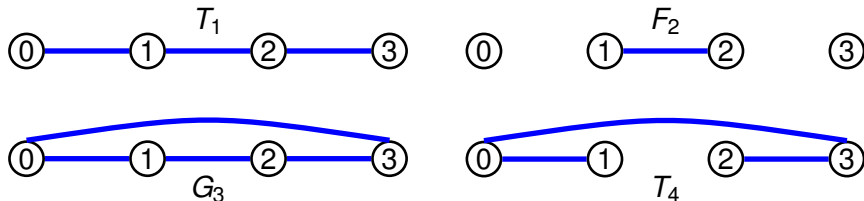


Rest of today: all graphs will be **undirected** and **loop free**.

Cyclic versus Acyclic

A graph with at **at least one cycle** is called **cyclic**.

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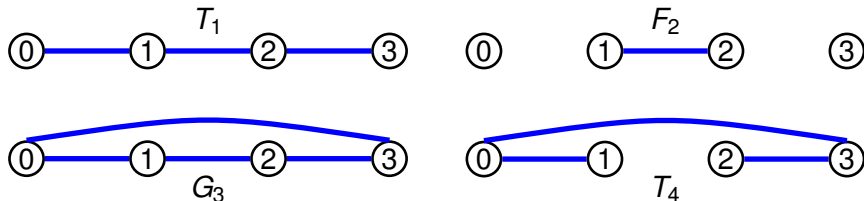
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A **forest** is an **undirected acyclic graph**.

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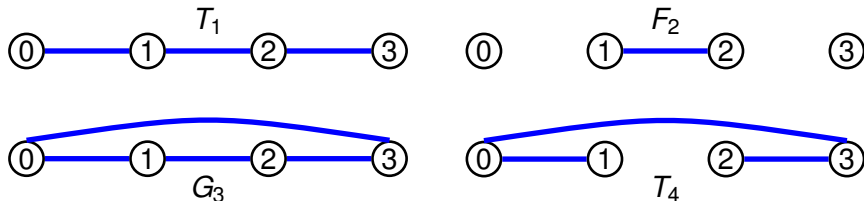
A **forest** is an **undirected acyclic graph**.

An undirected graph is **connected** if every pair of vertices has a path between them.

Cyclic versus Acyclic

A graph with at **at least one cycle** is called **cyclic**.

A graph that has **no cycles** is called **acyclic**.



Rest of today: all graphs will be **undirected** and **loop free**.

A **forest** is an **undirected acyclic graph**.

An undirected graph is **connected** if every pair of vertices has a path between them.

An undirected **tree** is a **connected forest**.

Connected Components

A **connected component**, C , of an undirected graph, G , is a **maximal connected** subgraph of G .

Connected Components

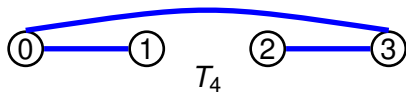
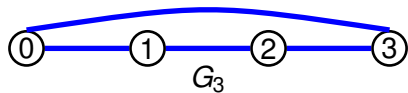
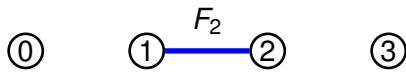
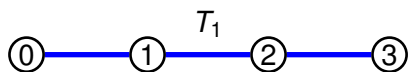
A **connected component**, C , of an undirected graph, G , is a **maximal connected** subgraph of G .

If G is **connected** then G itself is G 's **unique connected component**.

Connected Components

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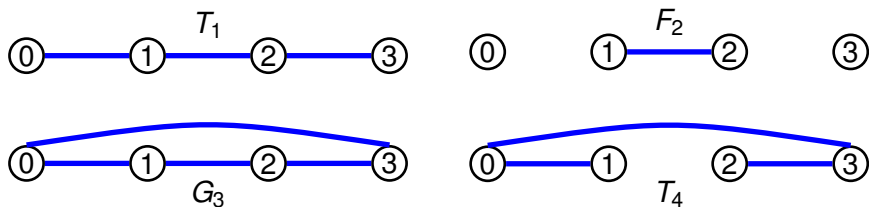
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Connected Components

A **connected component**, C , of an undirected graph, G , is a **maximal connected** subgraph of G .

If G is **connected** then G itself is G 's **unique connected component**.



iClicker 28.3 How many connected components does F_2 have? $V^{F_2} = \{0, 1, 2, 3\}$ $E^{F_2} = \{(1, 2), (2, 1)\}$

A: 1

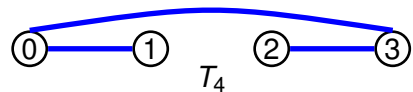
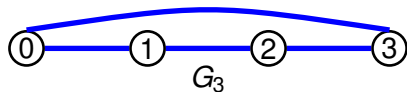
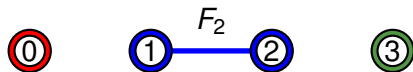
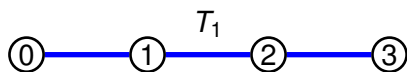
B: 2

C: 3

Connected Components

A **connected component**, C , of an undirected graph, G , is a **maximal connected** subgraph of G .

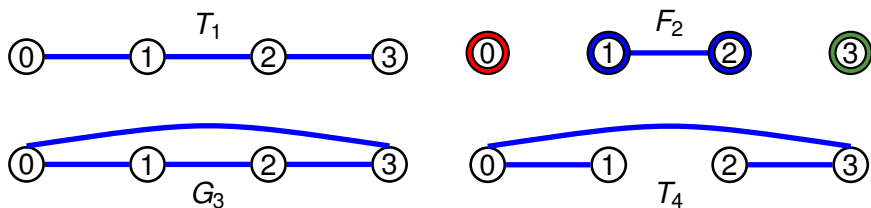
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Connected Components

A **connected component**, C , of an undirected graph, G , is a **maximal connected** subgraph of G .

If G is **connected** then G itself is G 's **unique connected component**.



Recall E^* is the reflexive transitive closure of E . For undirected graphs, E^* is an equivalence relation and it partitions the vertices into connected components:

$$[v]_{E^*} = \{u \in V \mid E^*(u, v)\}$$

Wanted: fast algorithm to

- ▶ **search** a **graph**

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- ▶ compute its **connected components**

Wanted: fast algorithm to

- ▶ **search** a **graph**
- ▶ compute its **connected components**
- ▶ determine if it is **cyclic** or **acyclic**

Depth First Search (undirected graphs)

DFSmain(G)

```
for each u in V :  
    color[u] = white  
    parent[u] = NULL  
time=0  
for each u in V :  
    if (color[u] == white):  
        DFSVisit(u)
```

DFSVisit(u)

```
color[u] = red           // in process  
d[u] = ++time           // discover  
for each v in Adj(u) :  
    if (color[v] == white) : // unseen  
        parent[v] = u       // tree edge  
        DFSVisit(v)  
color[u] = black        // done  
f[u] = ++time           // finish
```


black Tree edge brown Back edge

DFSVisit(u)

color[u] = **red**

d[u] = ++time

for each v in Adj(u) :

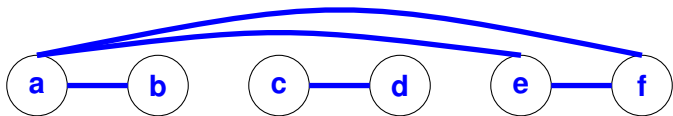
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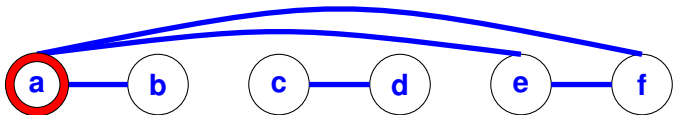
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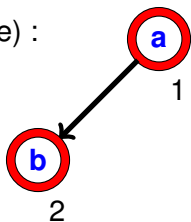
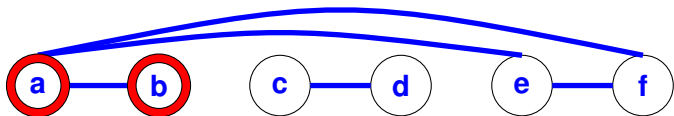
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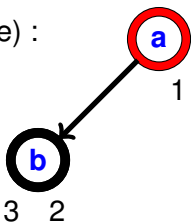
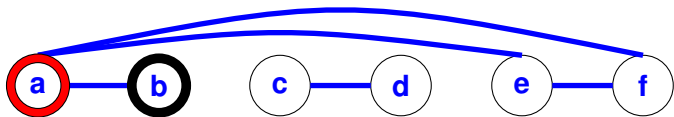
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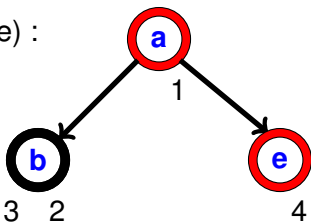
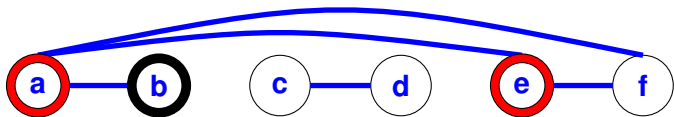
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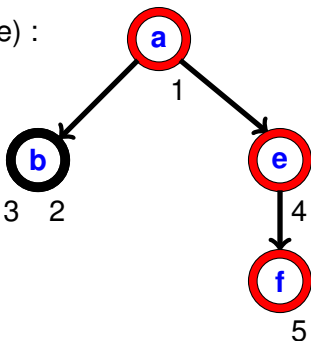
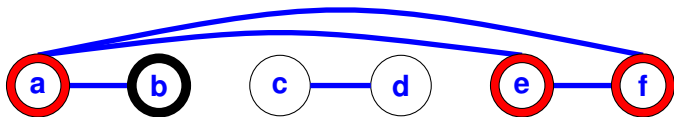
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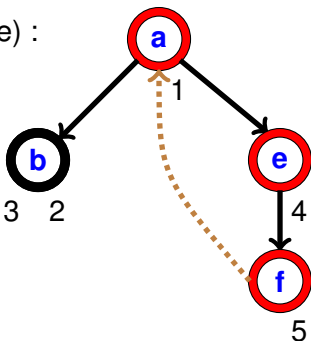
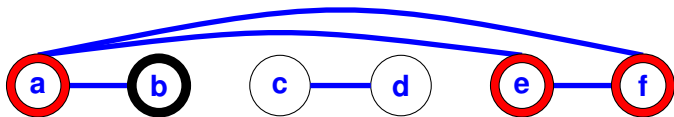
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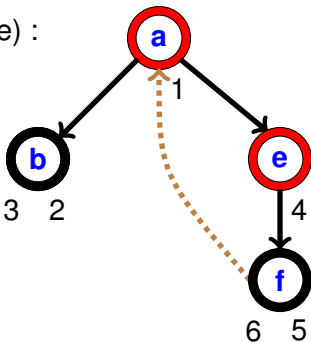
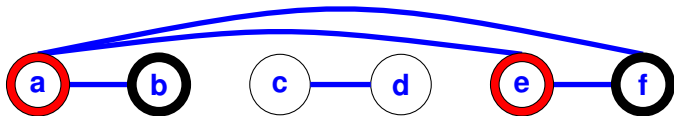
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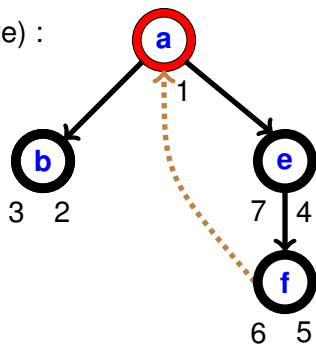
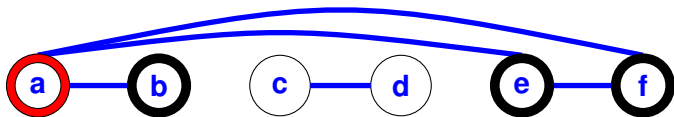
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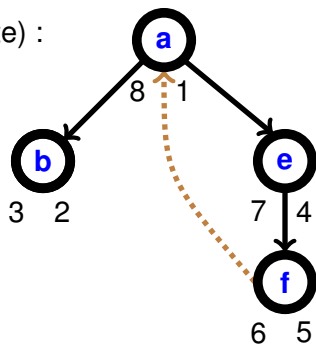
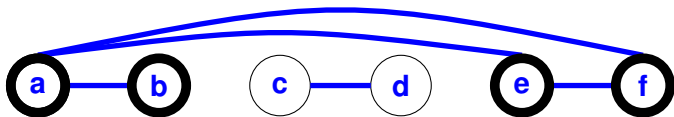
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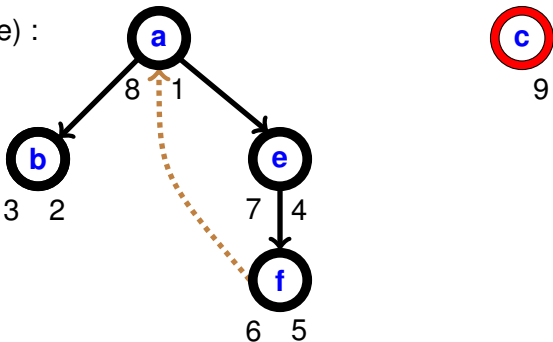
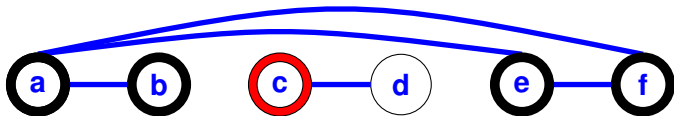
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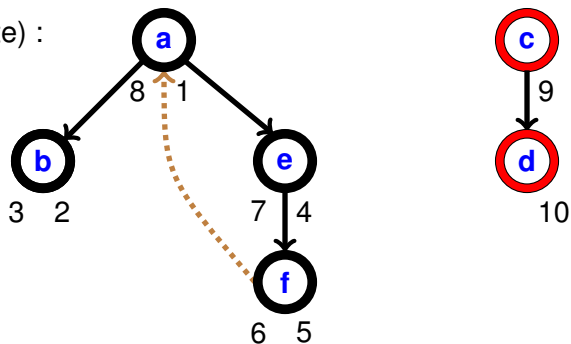
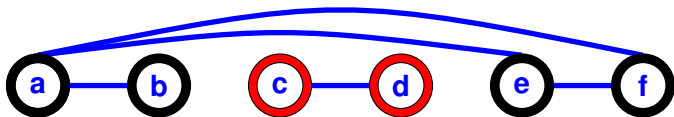
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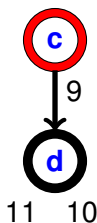
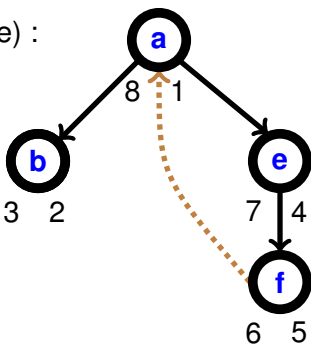
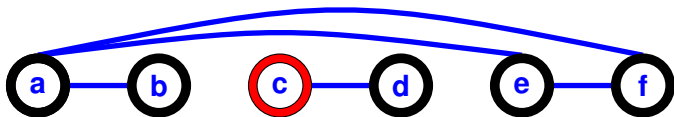
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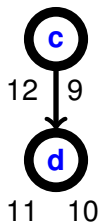
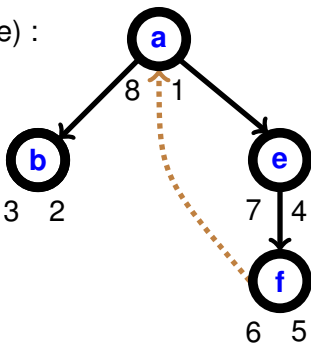
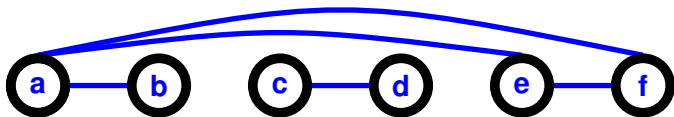
if (color[v] == white) :

parent[v] = u

DFSVisit(v)

color[u] = **black**

f[u] = ++time



Depth First Search (undirected graphs)

DFSmain(G)

```
for each u in V :  
    color[u] = white  
    parent[u] = NULL  
time=0  
for each u in V :  
    if (color[u] == white):  
        DFSVisit(u)
```

DFSVisit(u)

```
color[u] = red           // in process  
d[u] = ++time           // discover  
for each v in Adj(u) :  
    if (color[v] == white) : // unseen  
        parent[v] = u       // tree edge  
        DFSVisit(v)  
color[u] = black        // done  
f[u] = ++time           // finish
```

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Let G be an undirected graph with n vertices and m edges.

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3. DFS determines which of these components is cyclic: a component is **cyclic** iff it has a **backedge**.

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base case: $1 = |[r]| = \{r\}$ visited first step of $\text{DFSVisit}(r)$. ✓

inductive case: Assume **indHyp**: for all $H, r \in V^H$,
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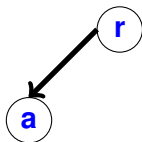
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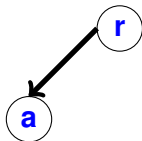


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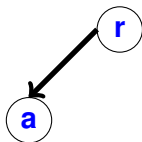


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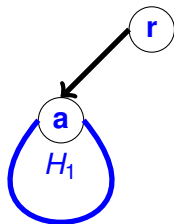


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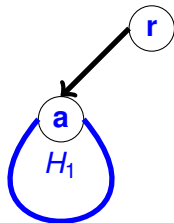
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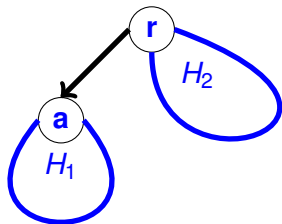
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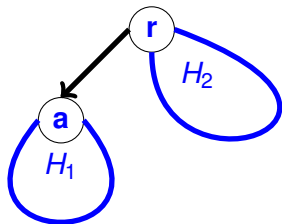
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By **indHyp**, DFSVisit(r) visits all of H_2 .

Thus initial call of DFSVisit(r) visits all of $G = H_1 \cup H_2$. ✓

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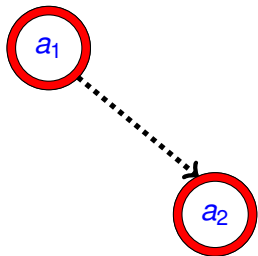


Conversely, suppose that G contains a cycle and let $C = a_1, a_2, \dots, a_{k-1}, a_1$ be a cycle. Let a_1 be the first vertex of the cycle that is visited in $\text{DFS}(G)$.

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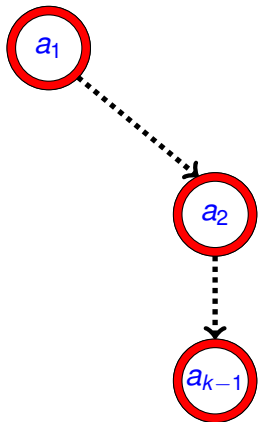


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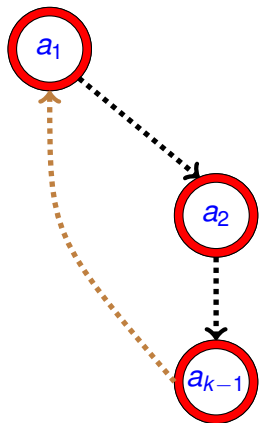


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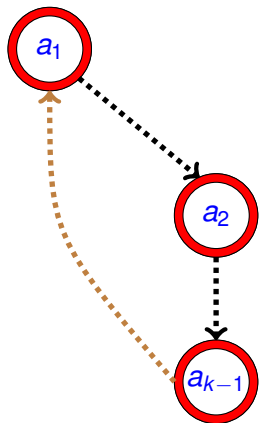
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When a_{k-1} is visited, a_1 is red and not a_{k-1} 's parent. Thus the edge (a_{k-1}, a_1) is a backedge.



□