

Algorithms and Probability

Week 1

Zusammenhang

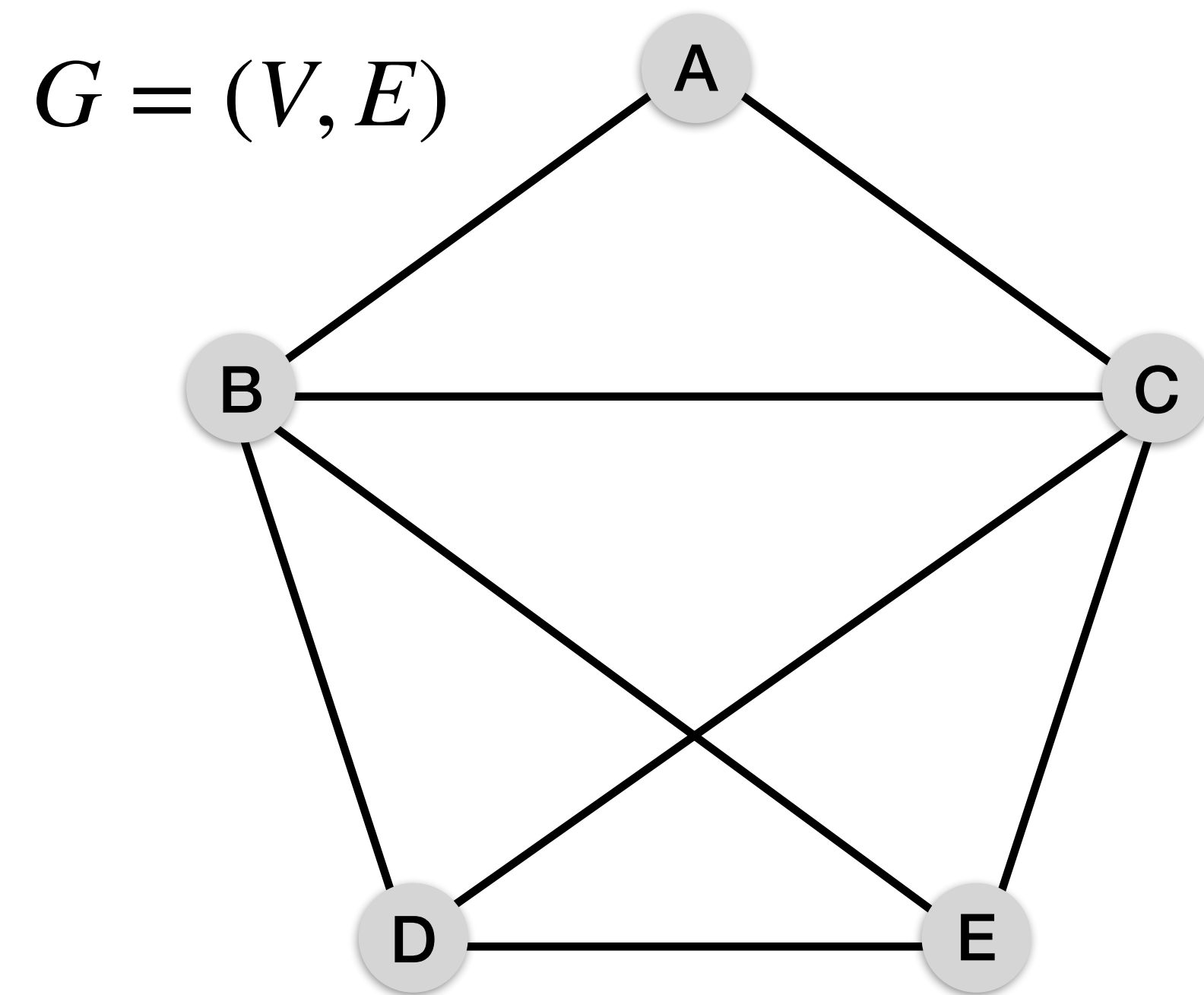
Definition 1.23. A graph $G = (V, E)$ is said to be k -connected (or k -vertex-connected) if it remains connected whenever fewer than k vertices are removed.

Definition 1.24. A graph $G = (V, E)$ is said to be k -edge-connected if it remains connected whenever fewer than k edges are removed.

Zusammenhang

- If the induced subgraph $G[V \setminus X]$, for $X \subseteq V$, is not connected anymore, then we call X a *vertex separator* (Knotenseparator).
- If $u, v \in V$ are in different connected components in $G[V \setminus X]$, then we call X a *u - v vertex separator* (u - v -Knotenseparator).
- Similarly, we can define *edge separator* (Kantenseparator) and *u - v edge separator* (u - v -Kantenseparator).

Examples



$$X = \{B, C\}$$
$$G[V \setminus X]$$

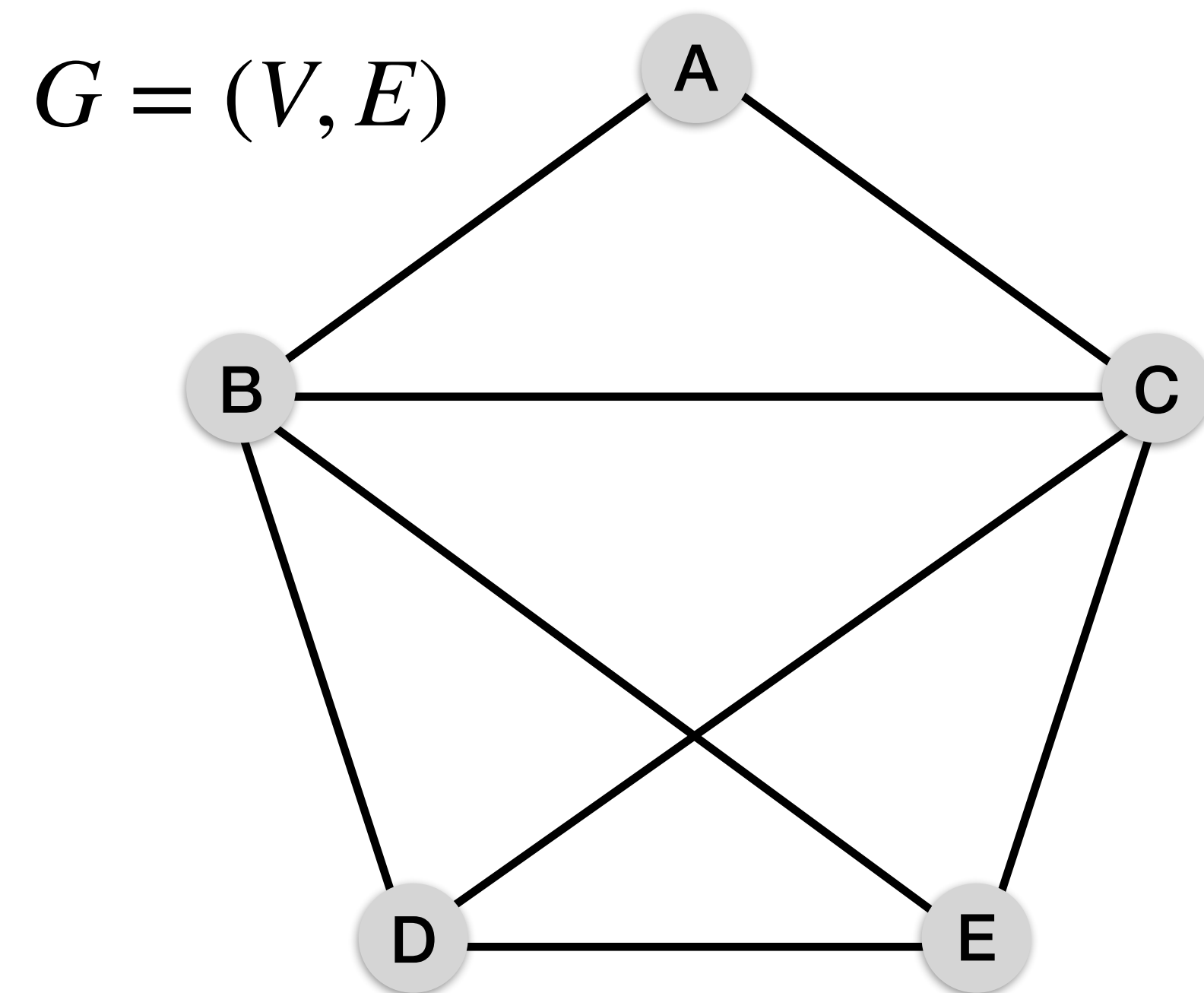


(*) G is 2-connected. Taking away any single vertex does not change G 's connectivity.

(**) The induced subgraph $G[V \setminus X]$ is not connected. X is a *vertex separator*.

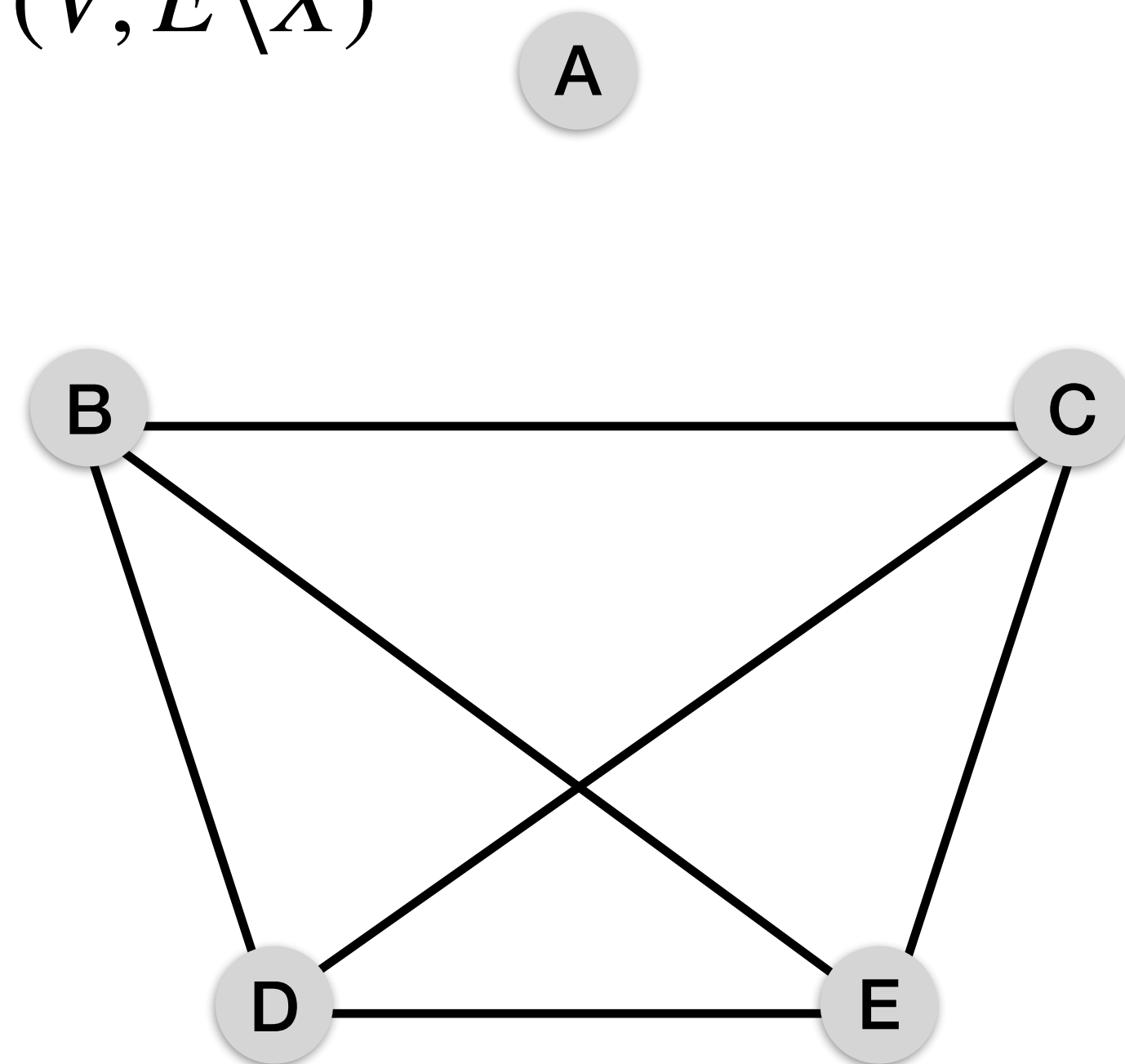
(***) X is a A - D *vertex separator*, because A and D are in different connected components after removing the vertices in X .

Examples



$$X = \{\{B, A\}, \{A, C\}\}$$

$$\tilde{G} = (V, E \setminus X)$$



(*) G is 2-edge-connected. Taking away any single edge does not change G 's connectivity.

(**) \tilde{G} is not connected. X is a *edge separator*.

(***) X is a *A-B edge separator*, because A and B are in different connected components after removing the edges in X .

Zusammenhang

- It is easy to see that any k -connected graph is also l -connected for $l < k$ (this also applies to k -edge-connected).
- We define the *vertex/edge connectivity* of G to be the *biggest k* such that G is k -connected/ k -edge-connected.
- We have:

vertex connectivity \leq edge connectivity \leq minimal degree

Zusammenhang

Satz 1.25 (Menger). Sei $G = (V, E)$ ein Graph und $u, v \in V, u \neq v$. Dann gilt:

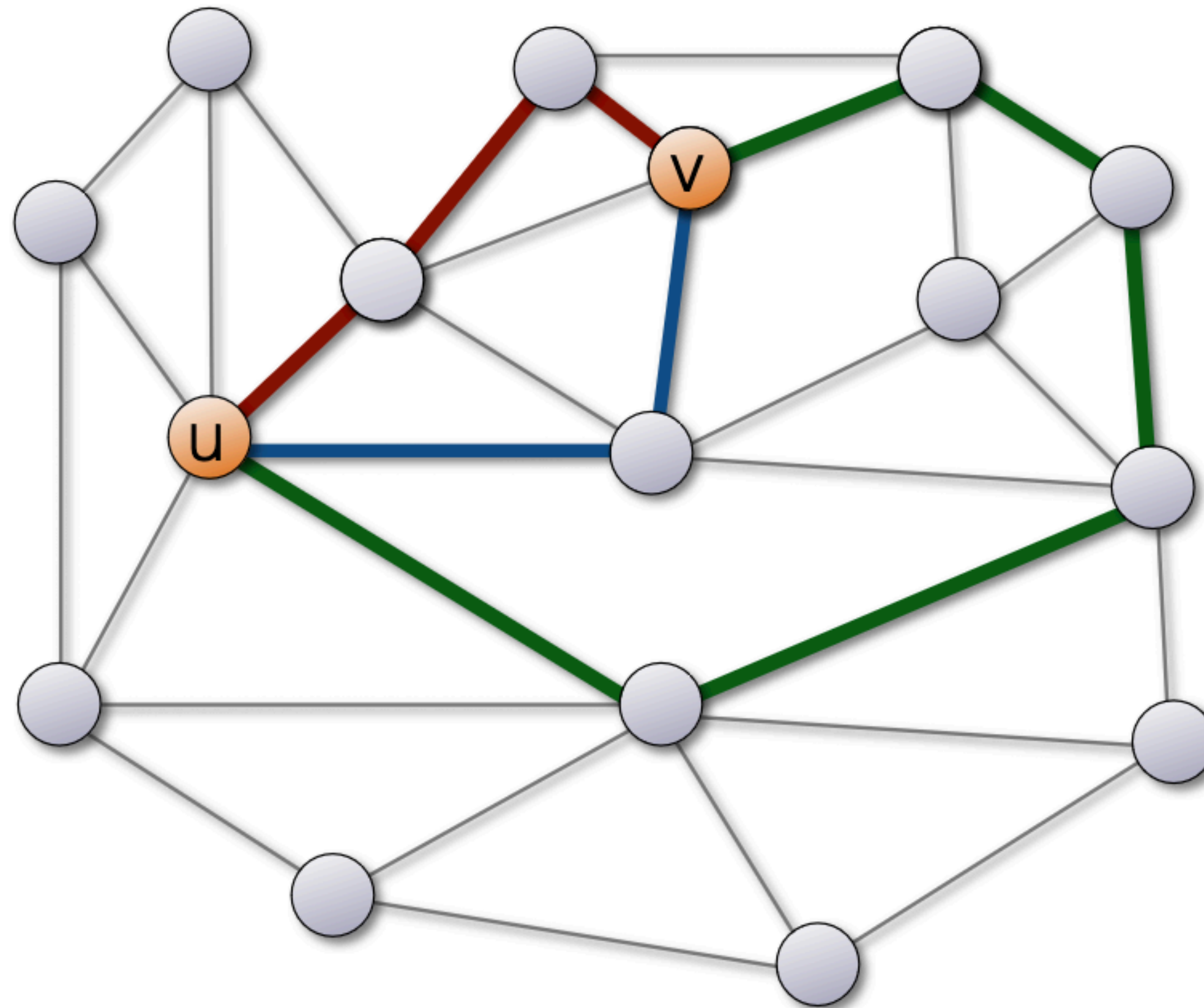
- a) Jeder u - v -Knotenseparator hat Grösse mindestens $k \iff$ Es gibt mindestens k intern-knotendisjunkte u - v -Pfade.
- b) Jeder u - v -Kantenseparator hat Grösse mindestens $k \iff$ Es gibt mindestens k kantendisjunkte u - v -Pfade.

Without proof (for now).

Satz 1.25 (Menger). Sei $G = (V, E)$ ein Graph und $u, v \in V, u \neq v$. Dann gilt:

- a) Jeder u - v -Knotenseparator hat Grösse mindestens $k \iff$ Es gibt mindestens k intern-knotendisjunkte u - v -Pfade.
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Zusammenhang

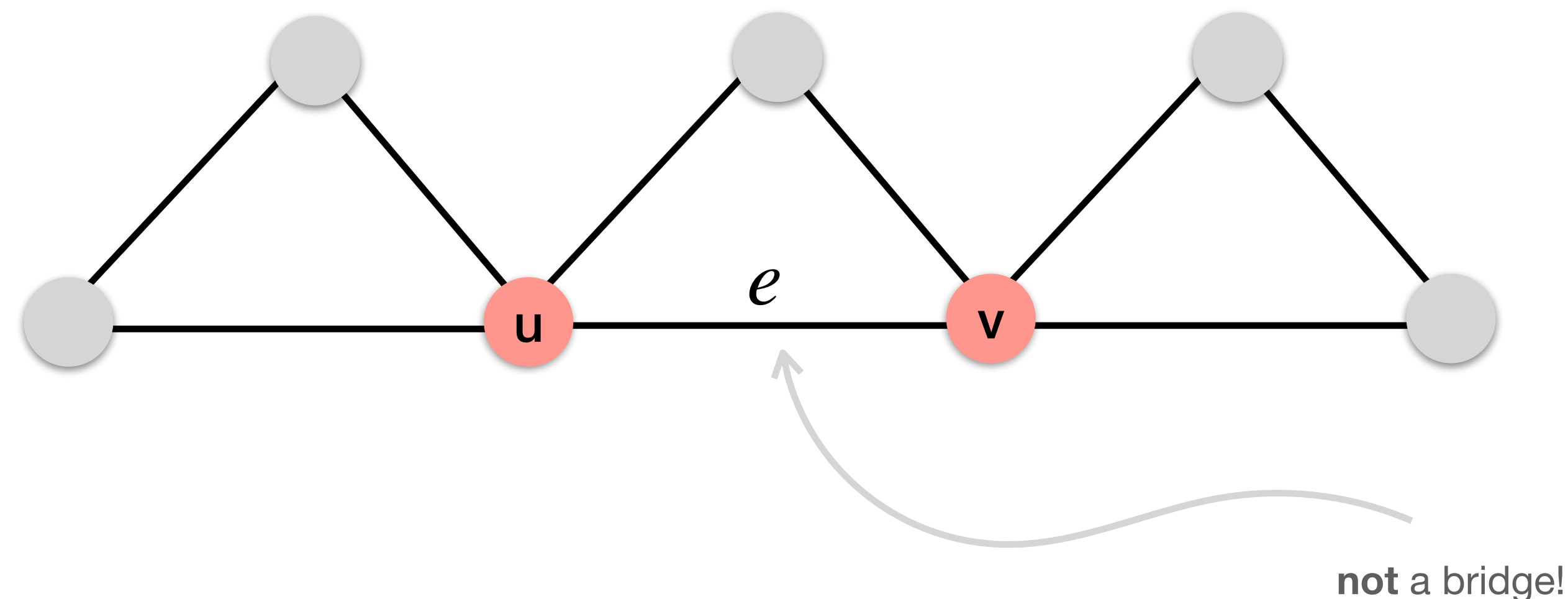


Zusammenhang

Lemma: Let $G = (V, E)$ be a connected graph. If $\{u, v\} \in E$ is a bridge, then u and v are cut vertices unless they have degree 1.

What about the other direction? Let $e = \{u, v\} \in E$ with u, v cut vertices. Is e a bridge?

Counterexample:



Blöcke

Definition: Sei $G = (V, E)$. Wir definieren eine Äquivalenzrelation auf E durch

$$e \sim f :\Leftrightarrow \begin{cases} e = f, & \text{oder} \\ \exists \text{ Kreis durch } e \text{ und } f \end{cases}$$

Die Äquivalenzklassen nennen wir **Blöcke**.

DiscMath Recap

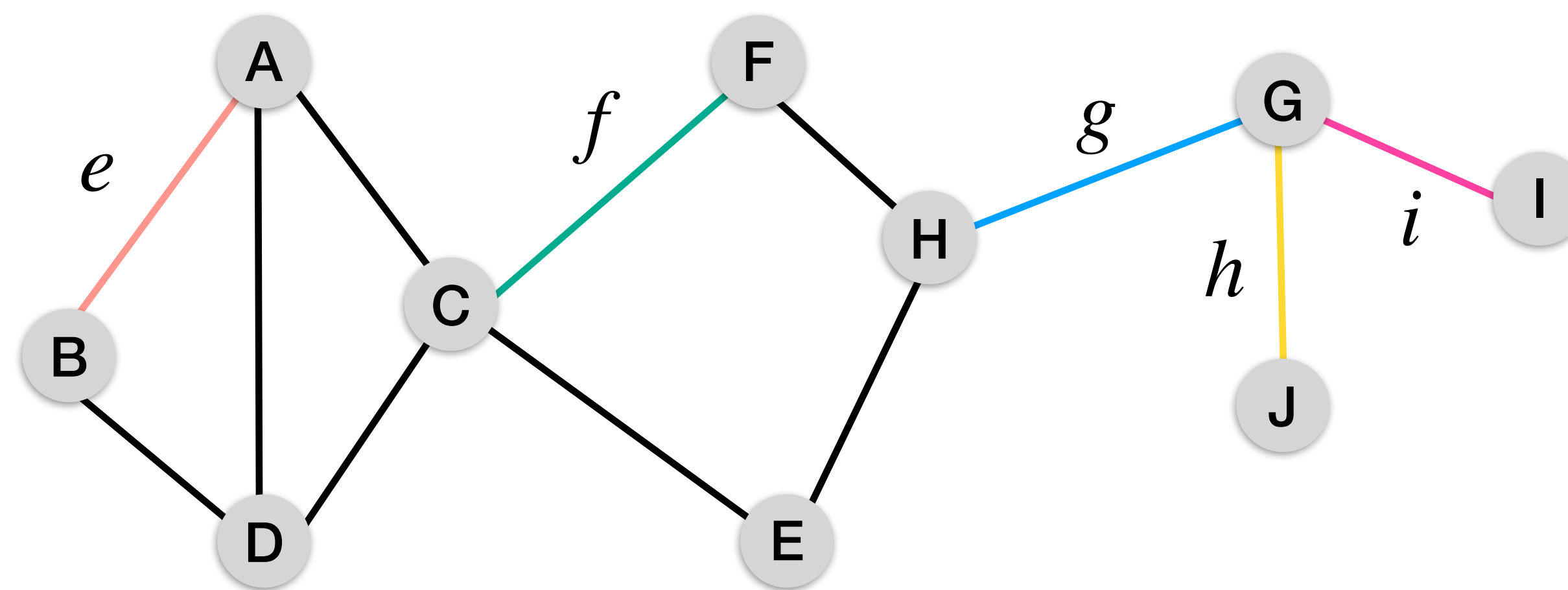
A binary relation \sim on a set X is said to be an *equivalence relation* if and only if it is:

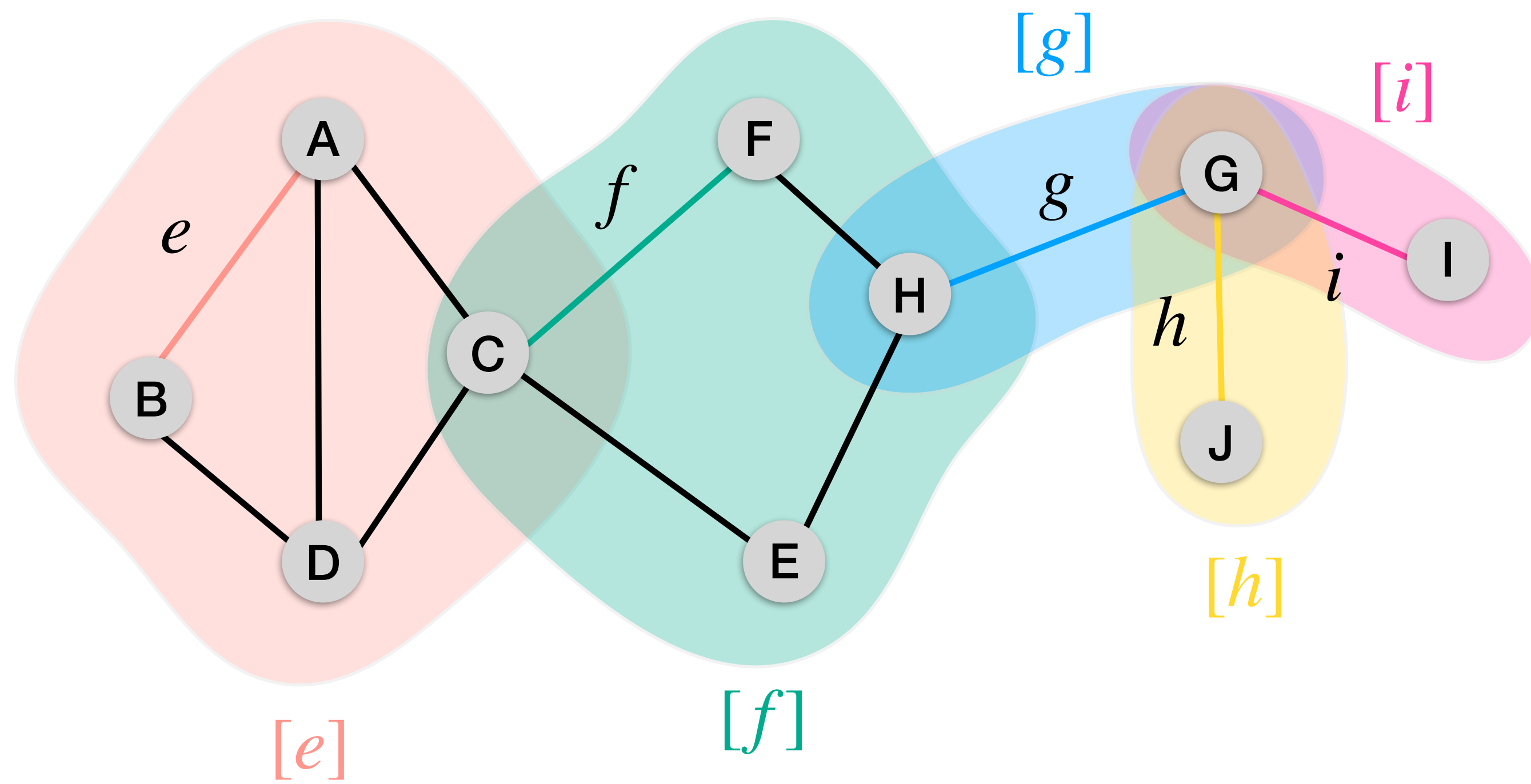
- **Reflexive:** $a \sim a$
- **Symmetric:** $a \sim b$ if and only if $b \sim a$
- **Transitive:** if $a \sim b$ and $b \sim c$ then $a \sim c$

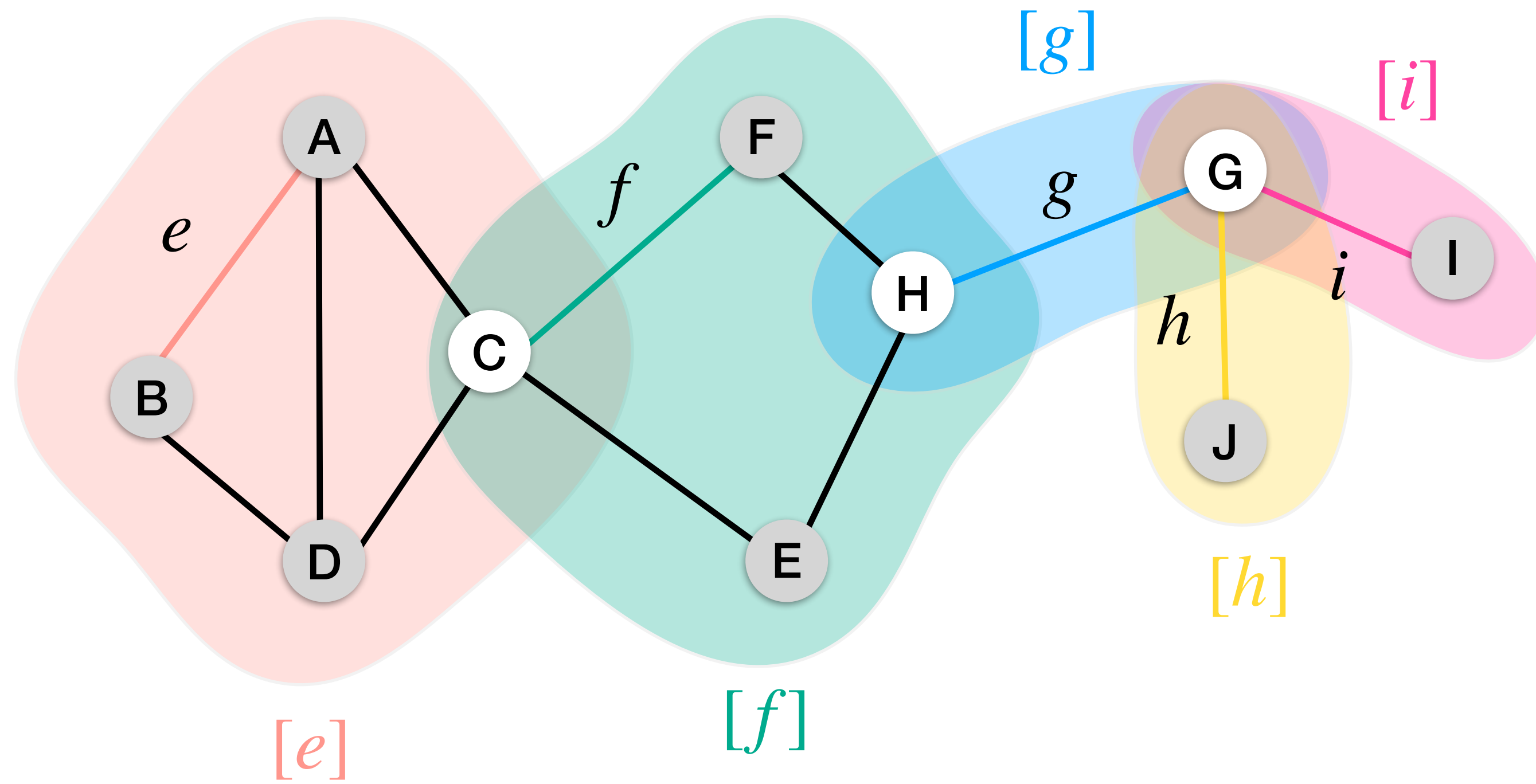
For all $a, b, c \in X$.

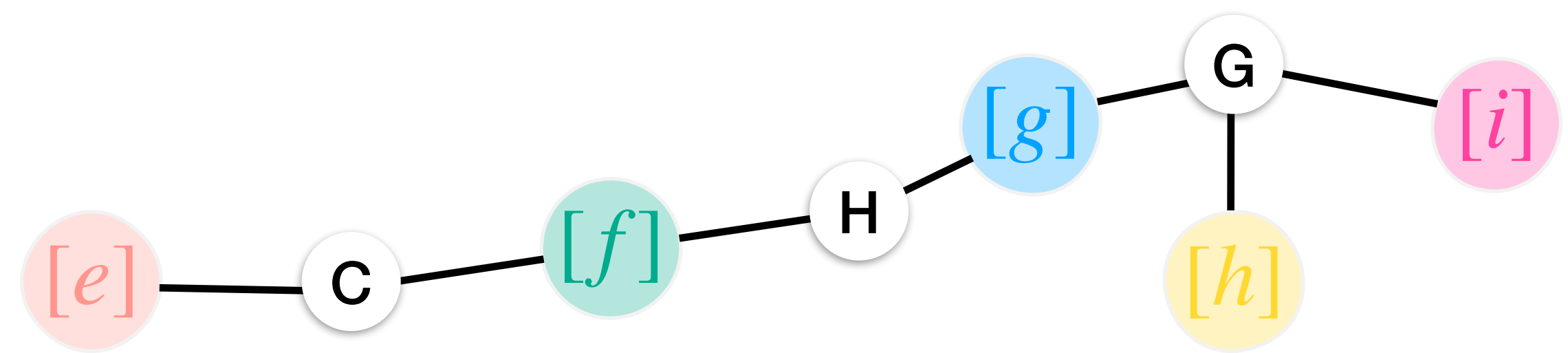
The *equivalence class* of a under \sim is defined as $[a] := \{x \in X : x \sim a\}$.

(*) Example: modulo 2 equivalence relation on \mathbb{Z} , then the two equivalence classes are even and odd numbers.





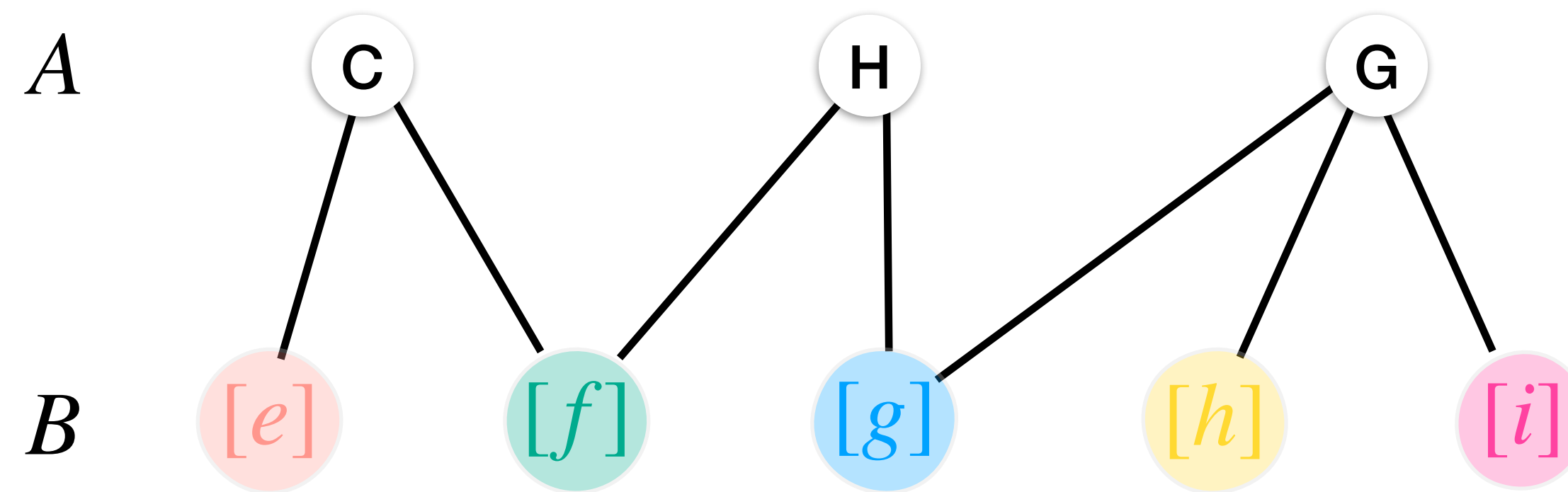




Definition: Sei $G = (V, E)$ ein zusammenhängender Graph.

Der **Block-Graph** von G ist der bipartite Graph $T = (A \uplus B, E_T)$ mit

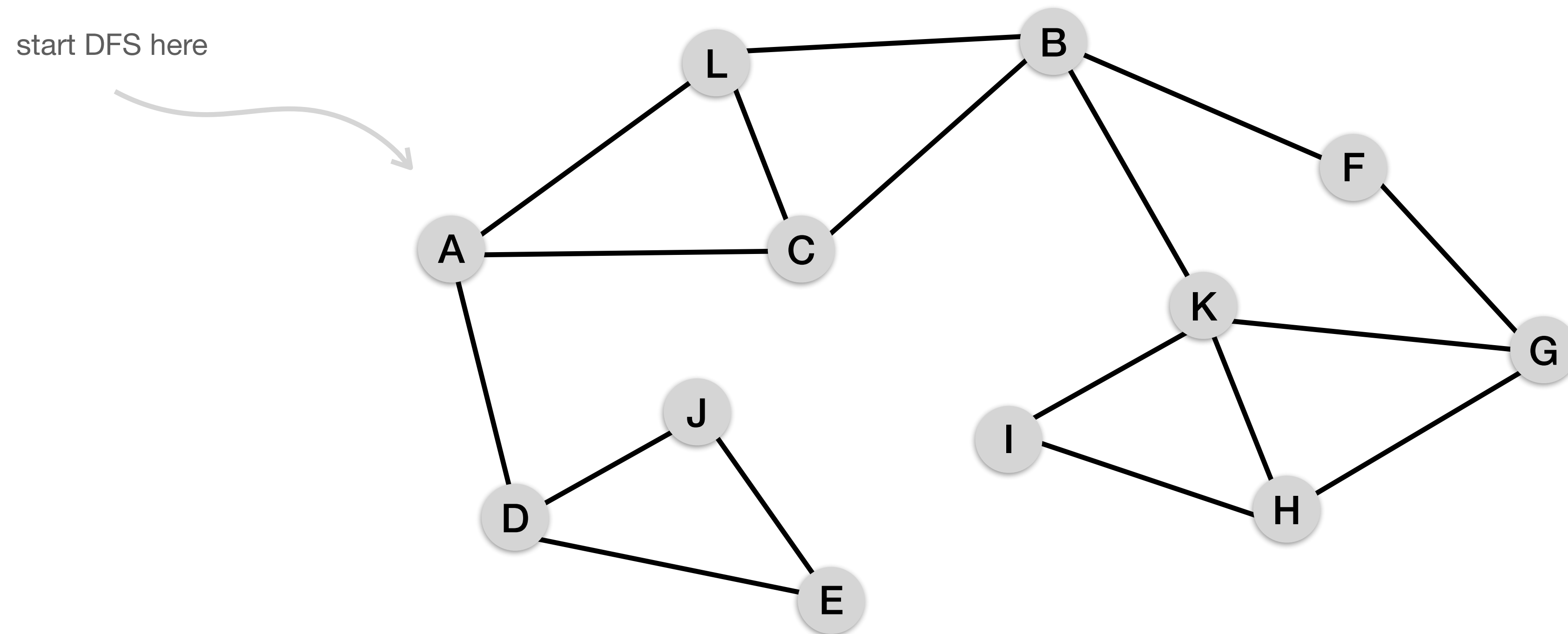
- $A = \{\text{Artikulationsknoten von } G\}$.
- $B = \{\text{Blöcke von } G\}$.
- $\forall a \in A, b \in B : \{a, b\} \in E_T \iff a \text{ inzident zu einer Kante in } b$.



DFS for finding bridges/cut vertices

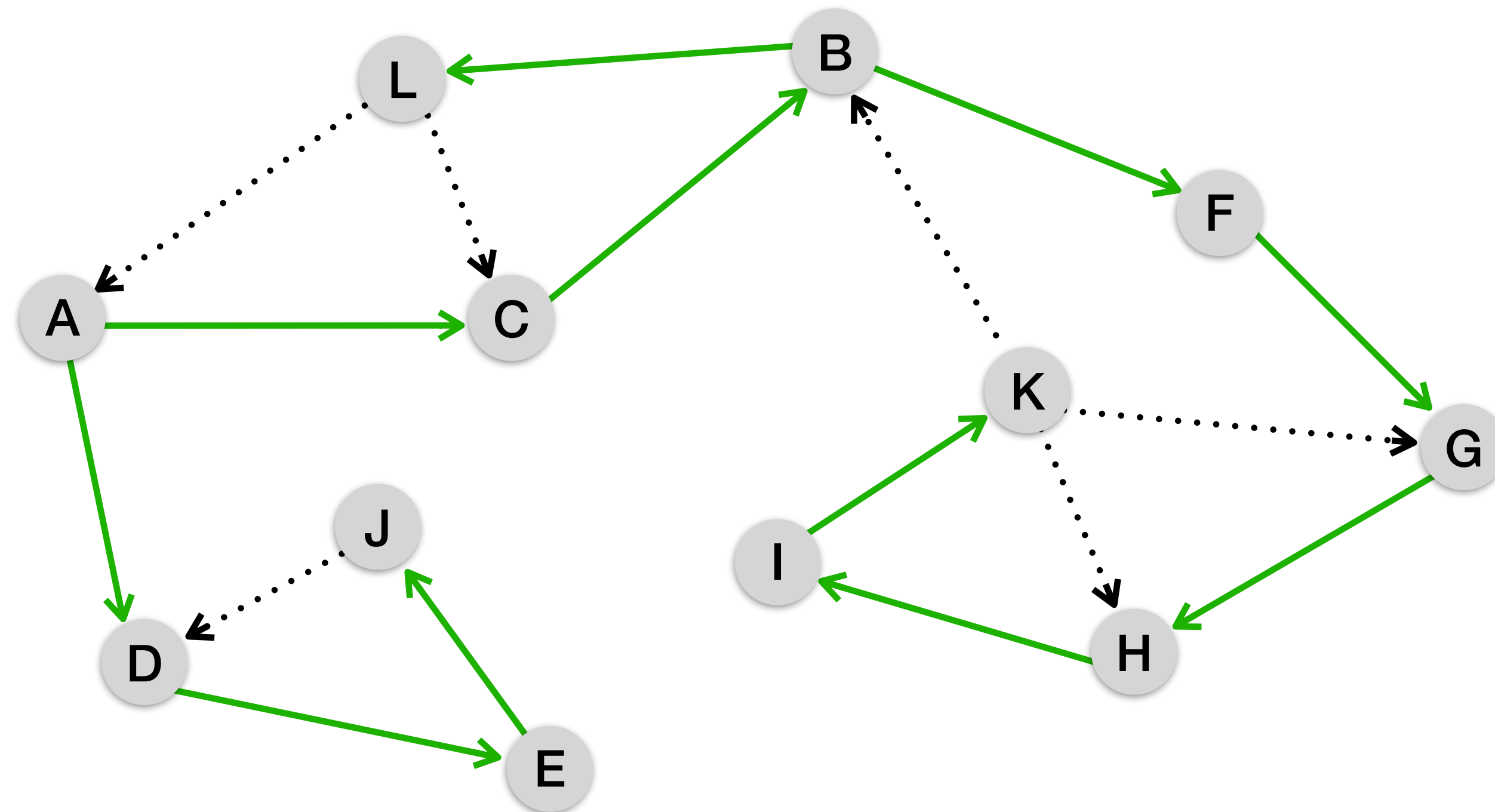
- Given an undirected graph $G = (V, E)$, find the bridges and cut vertices.
- Naive: remove edges/vertices and check for connectedness.
- As we will see, there is a more efficient approach using DFS.

DFS recap

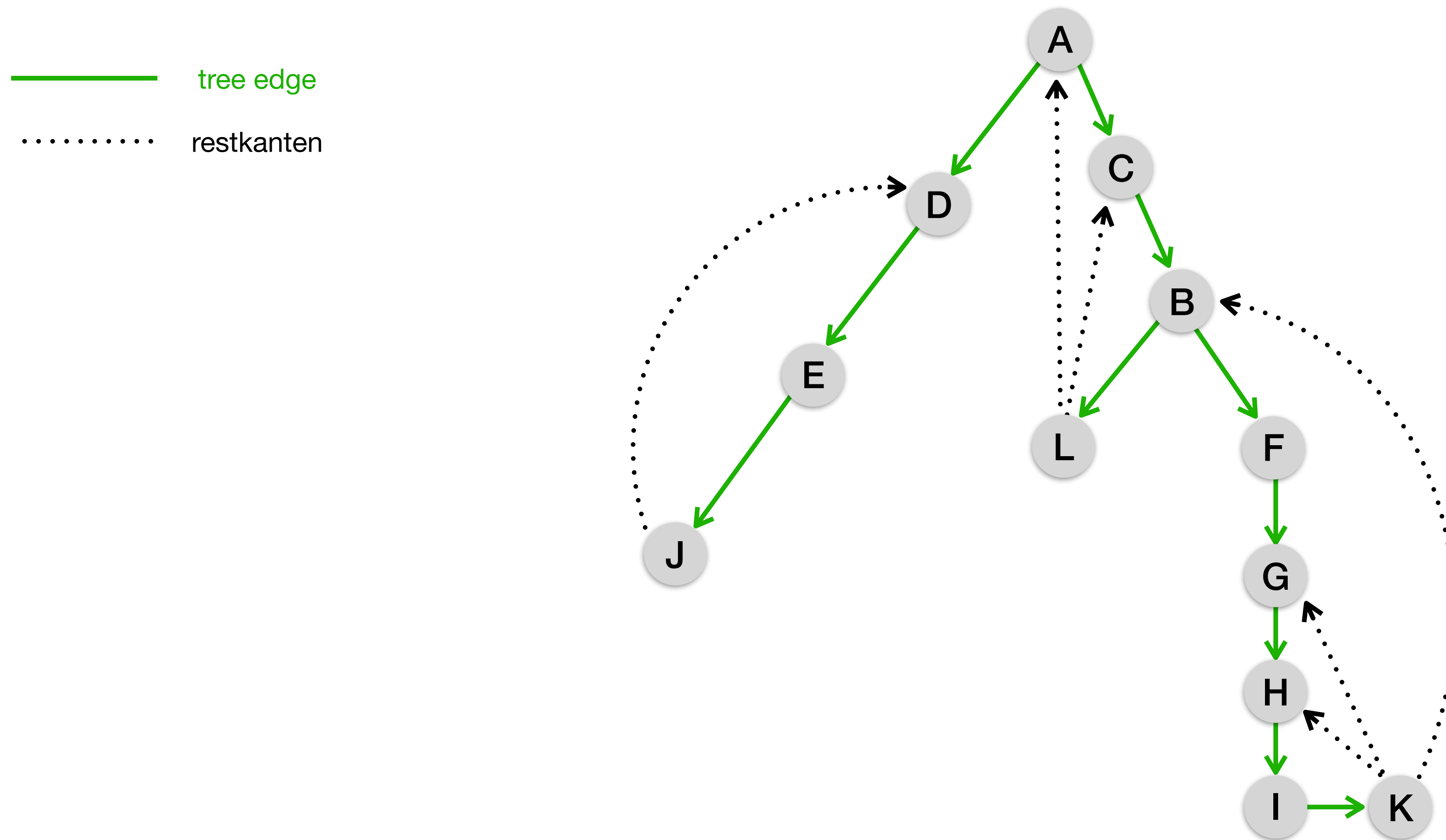


DFS recap

— tree edge
..... restkanten



DFS recap



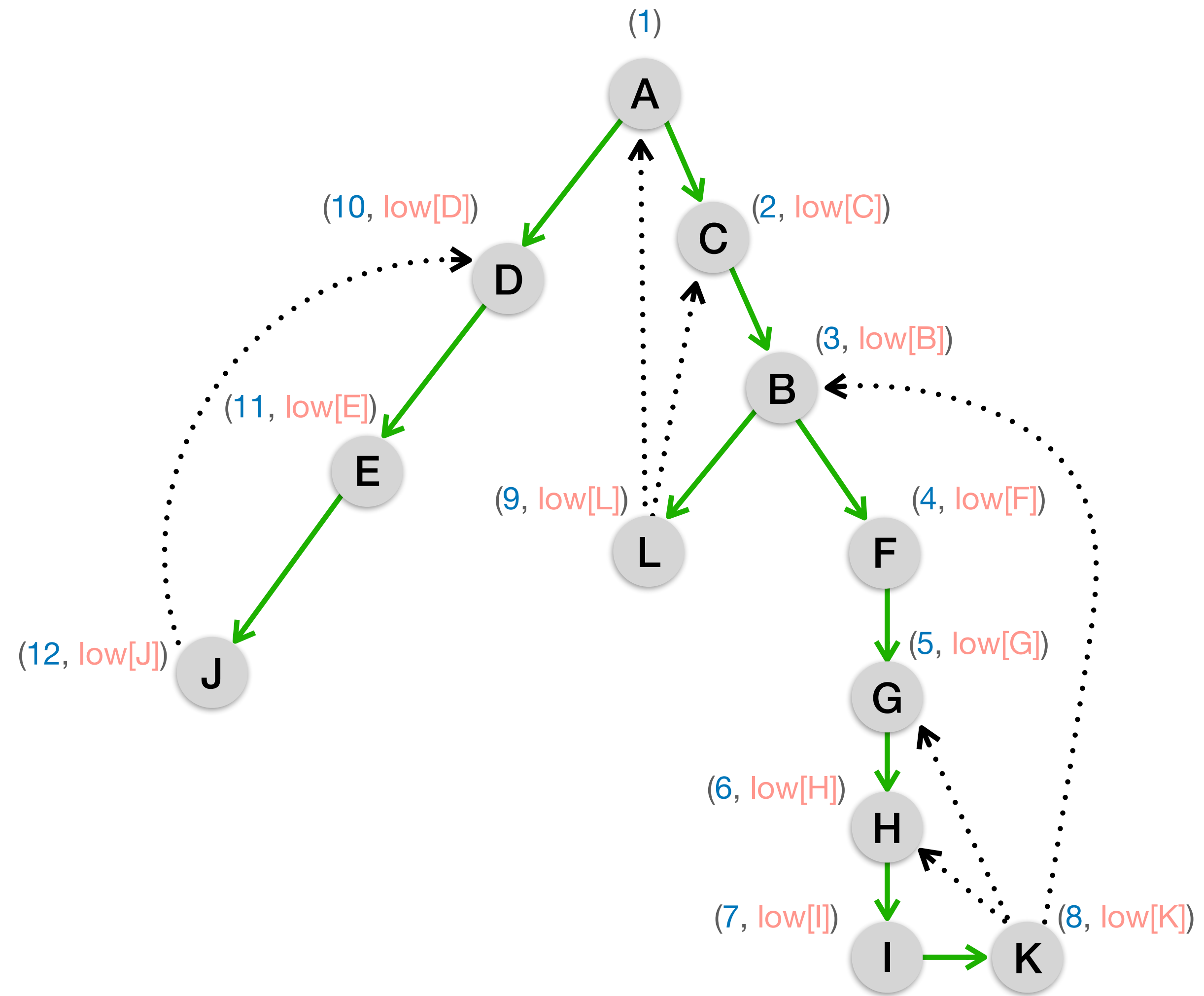
DFS for finding bridges/cut vertices

- We extend traditional DFS by maintaining the following information throughout iteration:
 - $\text{dfs}[v]$... the time DFS “entered” vertex v ($\text{dfs}[r] = 1$, where r is the root of the DFS tree).
 - $\text{low}[v]$... the lowest entry time $\text{dfs}[w]$ we can reach from v through a directed path consisting of an arbitrary number of tree edges and a single restkante.
- The root will be treated separately, so we don’t define $\text{low}[r]$, where r is the root of the DFS tree.

— tree edge
 restkanten

$(\text{dfs}[v], \text{low}[v])$

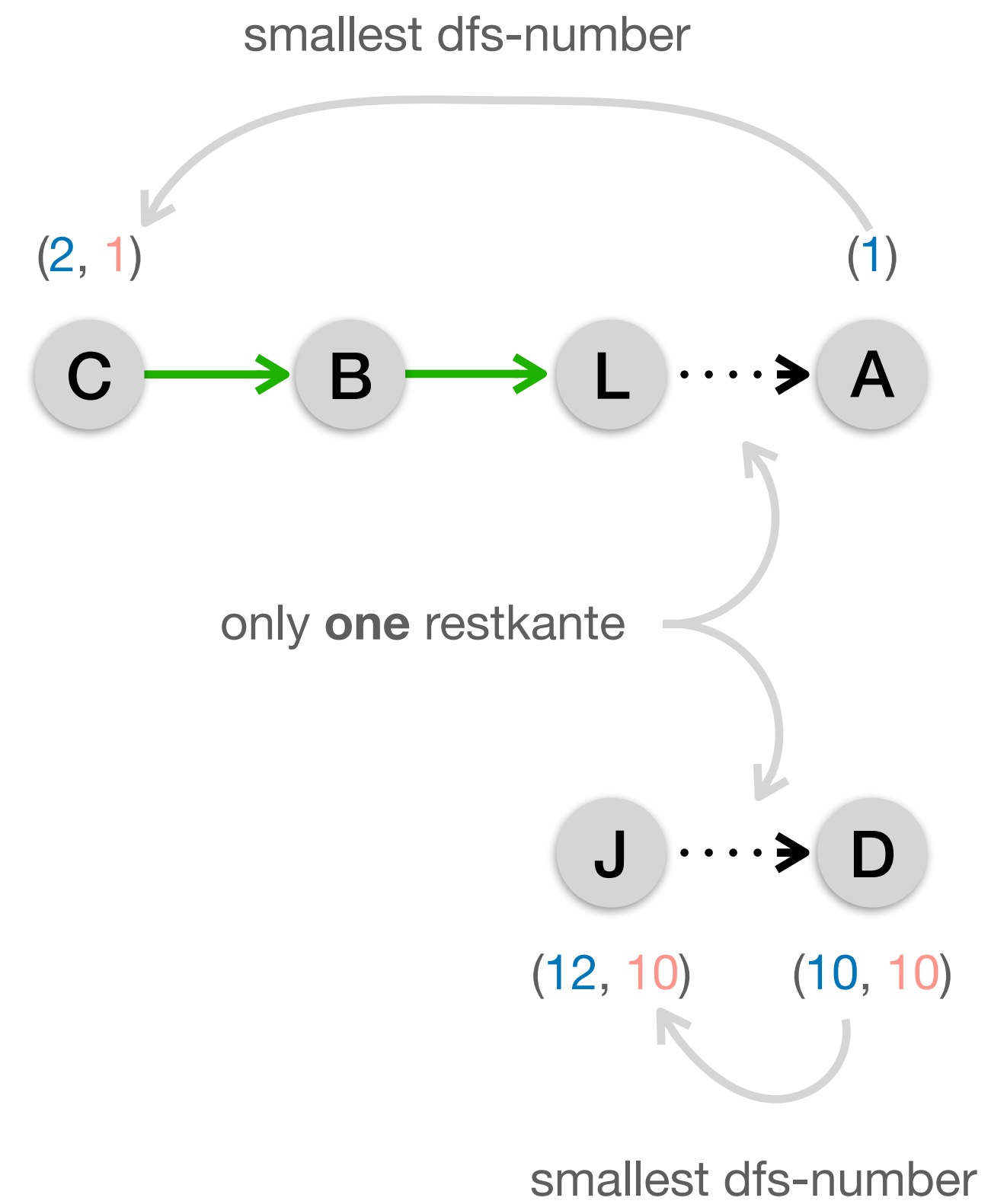
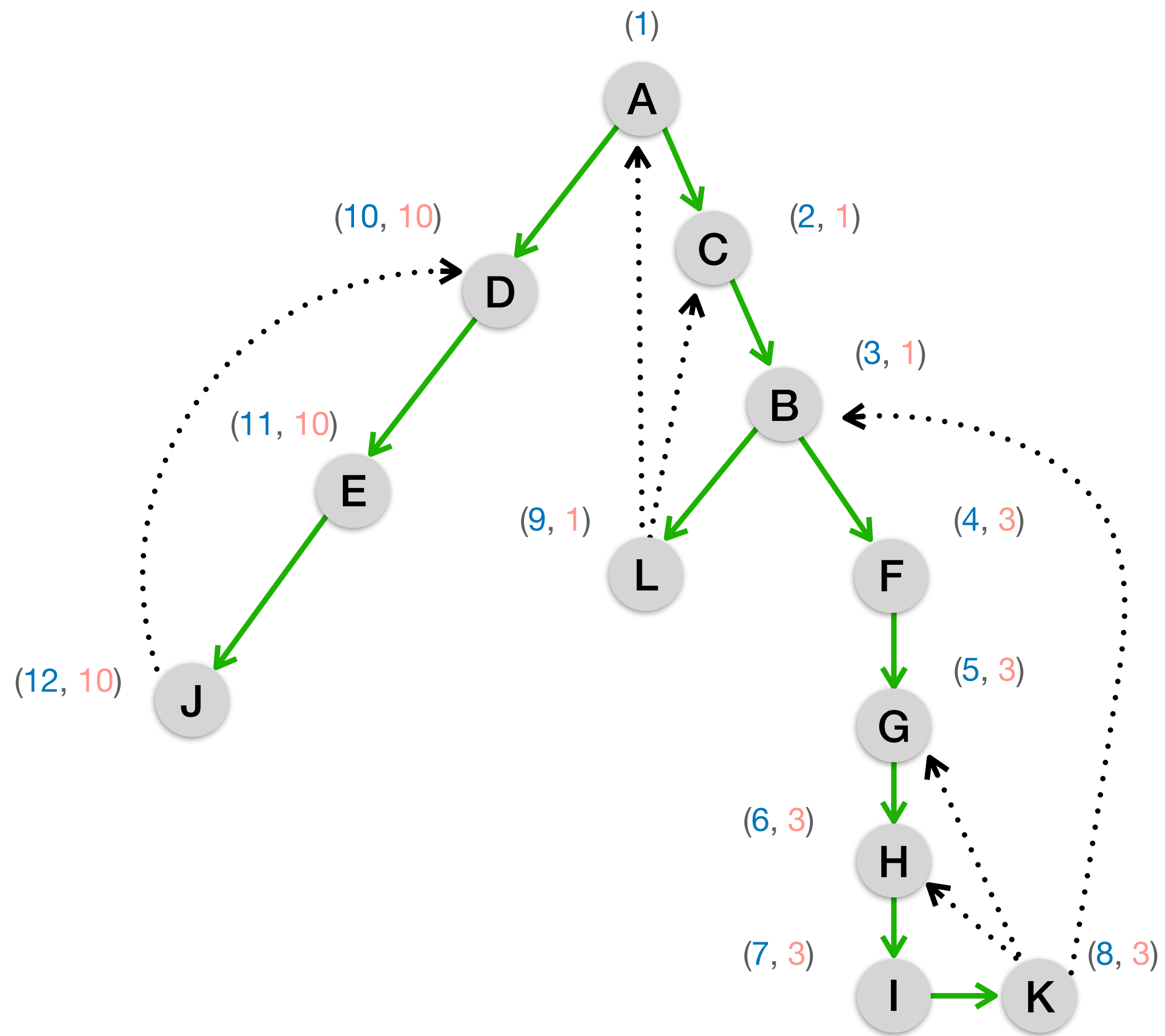
v



————— tree edge
 restkanten

$(\text{dfs}[v], \text{low}[v])$

v



Proof

Let $v \in V$ such that v is **not the root** of the DFS tree.

We show that v is a cut vertex if and only if v has a neighbor u such that $\text{low}[u] \geq \text{dfs}[v]$.

(\Rightarrow)

Proof

Assume that v is a cut vertex. Then $G[V \setminus \{v\}]$ has at least 2 connected components Z_1 and Z_2 . Without loss of generality, assume $s \in Z_1$.

Every path from s to a vertex in Z_2 must include v , we have
 $1 = \text{dfs}[s] < \text{dfs}[v] < \text{dfs}[w] \quad \forall w \in Z_2$.

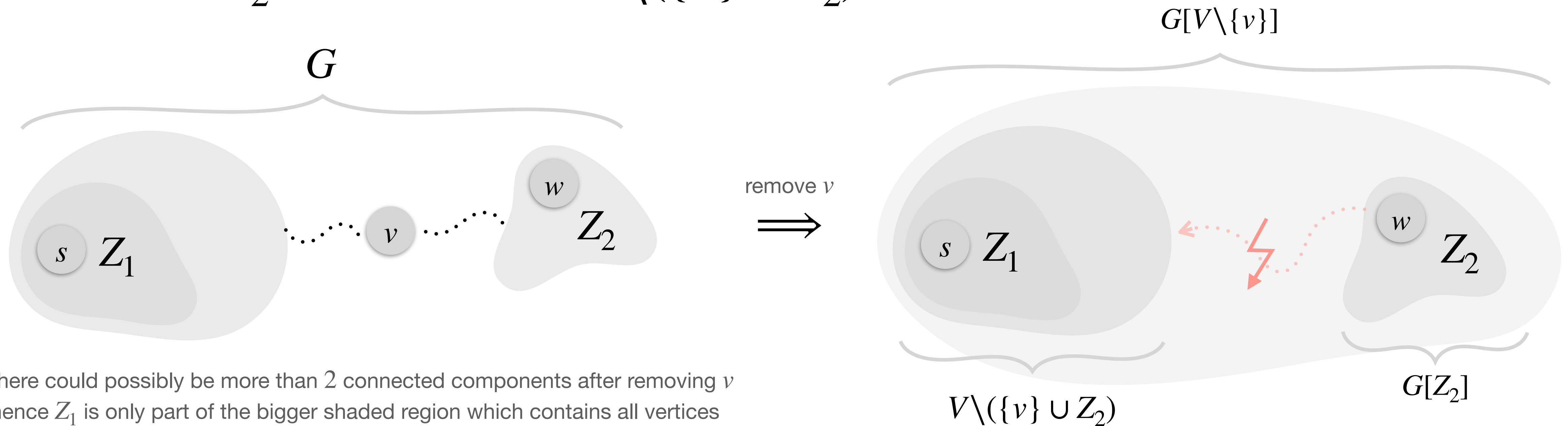
Since $G[Z_2]$ is a connected component in $G[V \setminus \{v\}]$, there cannot be an edge from $w \in Z_2$ to a vertex $u \in V \setminus (\{v\} \cup Z_2)$.

(\Rightarrow)

Proof

...

Since $G[Z_2]$ is a connected component in $G[V \setminus \{v\}]$, there **cannot be an edge** from $w \in Z_2$ to a vertex $u \in V \setminus (\{v\} \cup Z_2)$.



there could possibly be more than 2 connected components after removing v hence Z_1 is only part of the bigger shaded region which contains all vertices that are not in Z_2 or v itself.

if there was such an **edge**, then u would be connected to Z_2 and therefore element of Z_2 but $V \setminus (\{v\} \cup Z_2)$ doesn't contain vertices from Z_2 .

(\Rightarrow)

Proof

...

Since $G[Z_2]$ is a connected component in $G[V \setminus \{v\}]$, there cannot be an edge from $w \in Z_2$ to a vertex in $u \in V \setminus (\{v\} \cup Z_2)$.

Thus $\text{low}[w]$ is at least $\text{dfs}[v]$ for all $w \in Z_2$. Since v is connected to Z_2 , it has at least one neighbor $w \in Z_2$ such that $\text{low}[w] \geq \text{dfs}[v]$.

DiskMath Recap

Contraposition:

$P \rightarrow Q$ is equivalent to $\neg Q \rightarrow \neg P$

Here:

v is a cut vertex $\Leftrightarrow v$ has a neighbor u such that $\text{low}[u] \geq \text{dfs}[v]$

\Leftrightarrow

v is **not** a cut vertex $\Rightarrow v$ **has no** neighbor u such that $\text{low}[u] \geq \text{dfs}[v]$

using contraposition

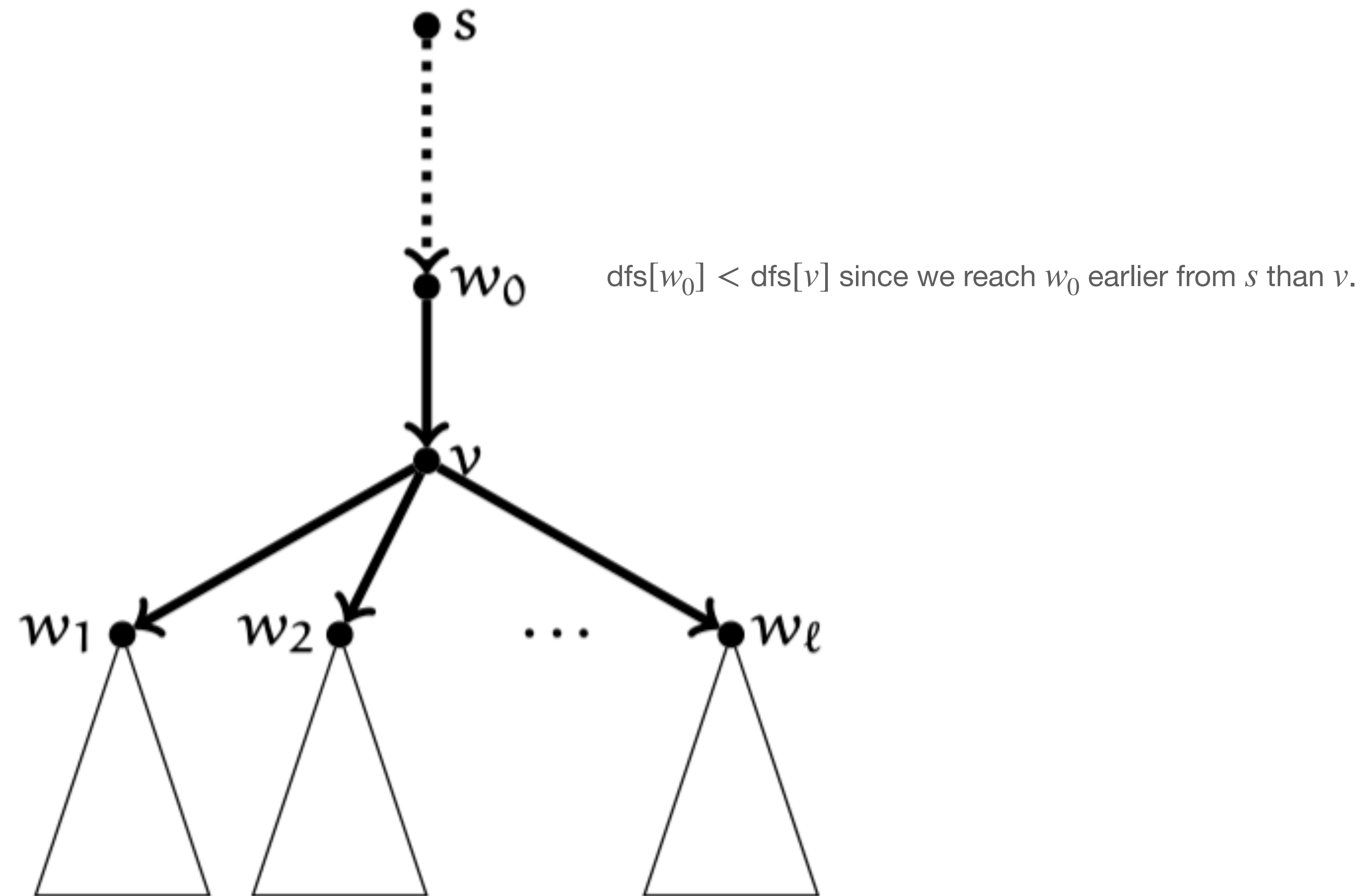
(\Leftarrow)

Proof

Assume v is not a cut vertex.

Let T be the DFS tree rooted at s and let w_0, \dots, w_l be all the neighbors of v in G . Without loss of generality, assume $\text{dfs}[w_0] < \text{dfs}[v]$.

Proof



by construction of the DFS algorithm, the subtrees rooted at w_1, \dots, w_ℓ cannot be connected.

but they have to be connected in G , otherwise v would be a cut vertex.

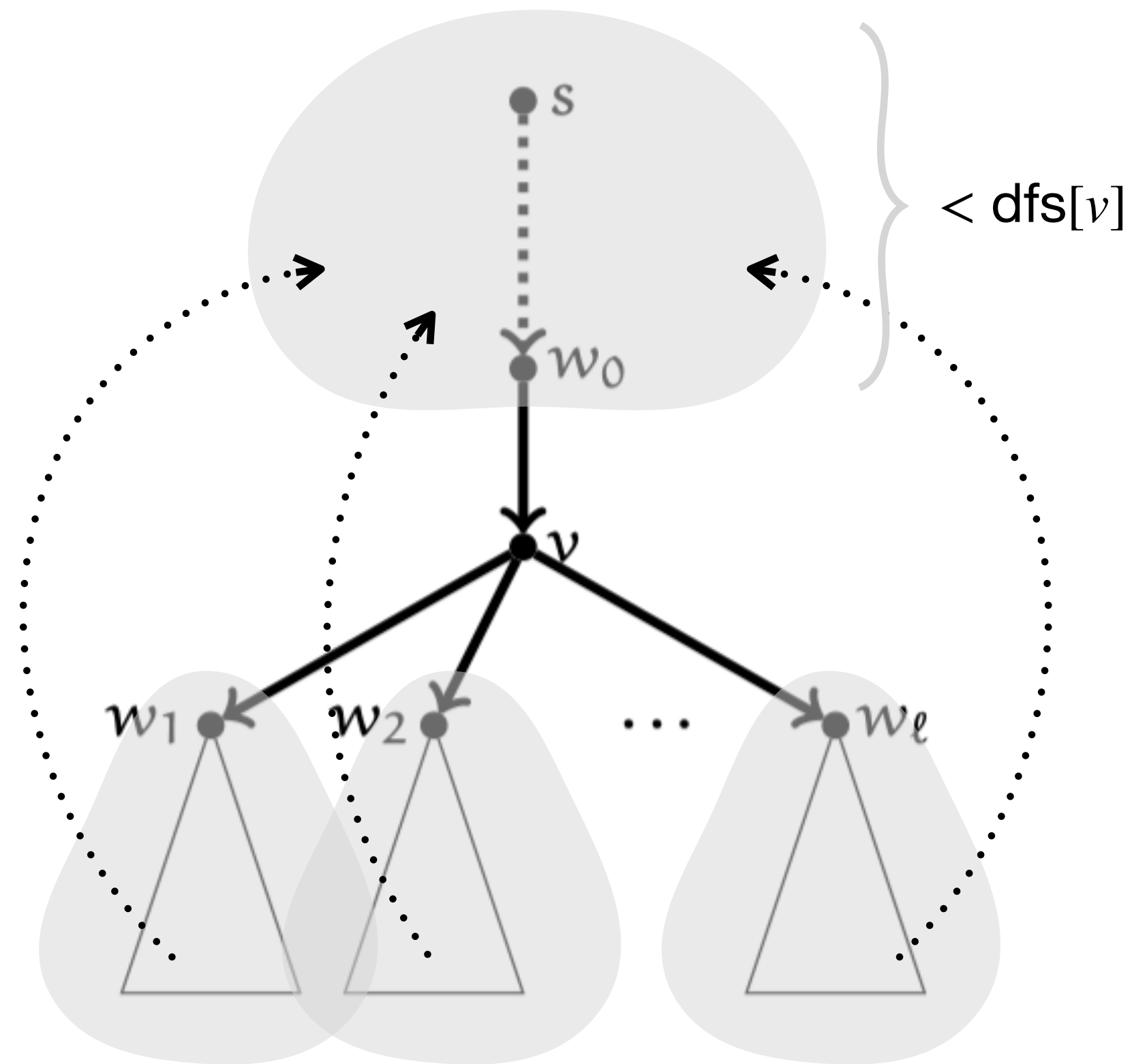
using contraposition

(\Leftarrow)

Proof

...

For every neighbor w_1, \dots, w_l there exists a path using a restkante to a vertex with smaller dfs-number.



using contraposition

(\Leftarrow)

Proof

...

For every neighbor w_1, \dots, w_l there exists a path using a restkante to a vertex with smaller dfs-number.

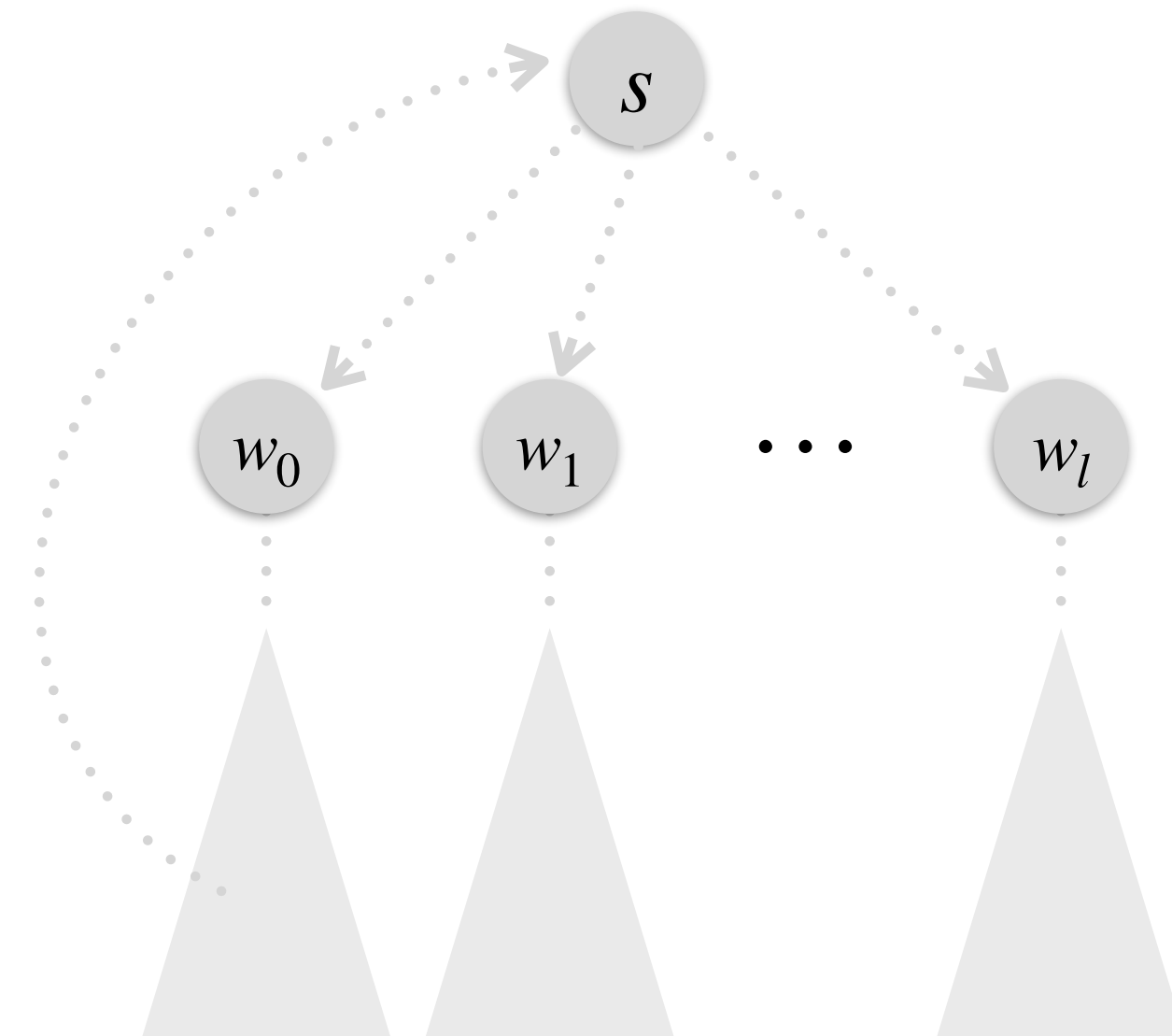
Thus $\text{low}[w]$ is greater than $\text{dfs}[v]$ for all neighbors w of v , meaning that there is no neighbor w of v such that $\text{low}[v] \geq \text{dfs}[u]$.

What about the root?

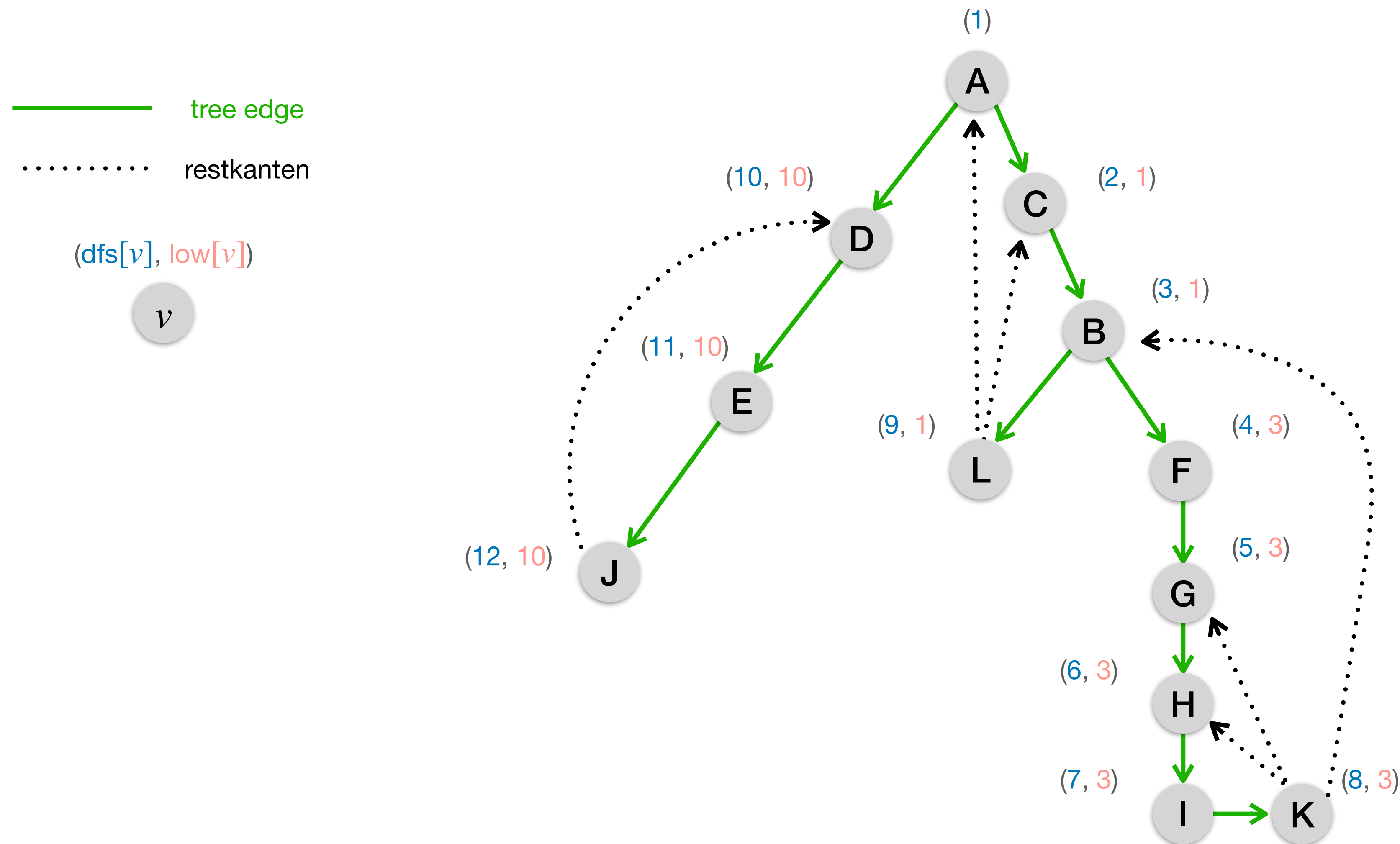
Let T be the DFS tree **rooted at** s . If $\deg(s) \geq 2$ then s is a cut vertex.

Proof. Assume $\deg(s) = l \geq 2$. By construction of the DFS algorithm, the subtrees rooted at w_1, \dots, w_l cannot be connected. Even if there was a restkante from a subtree to s , after removing s the vertices contained in the subtrees become disconnected in $G[V \setminus \{s\}]$.

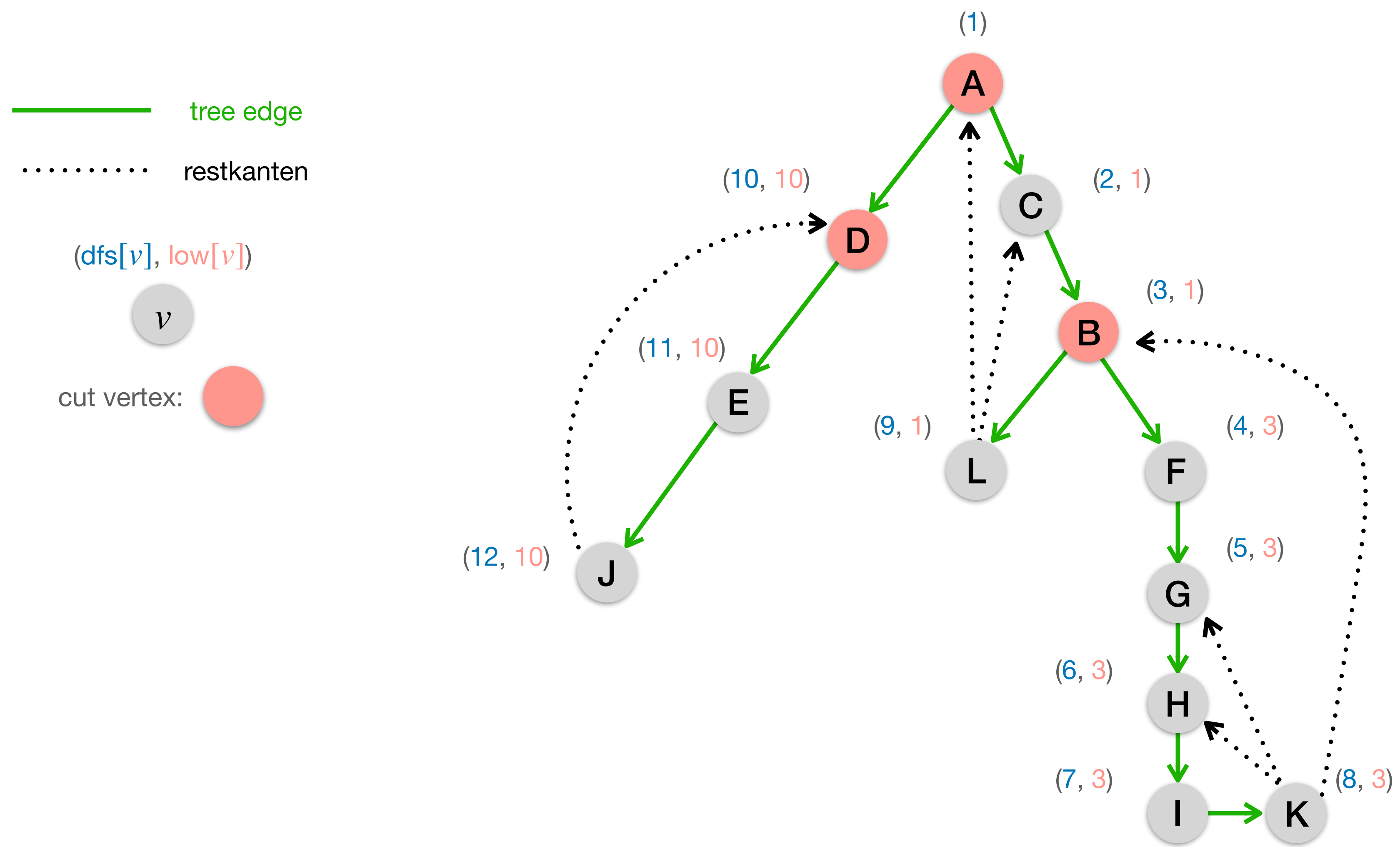
Thus s is a cut vertex.



Identify the cut vertices



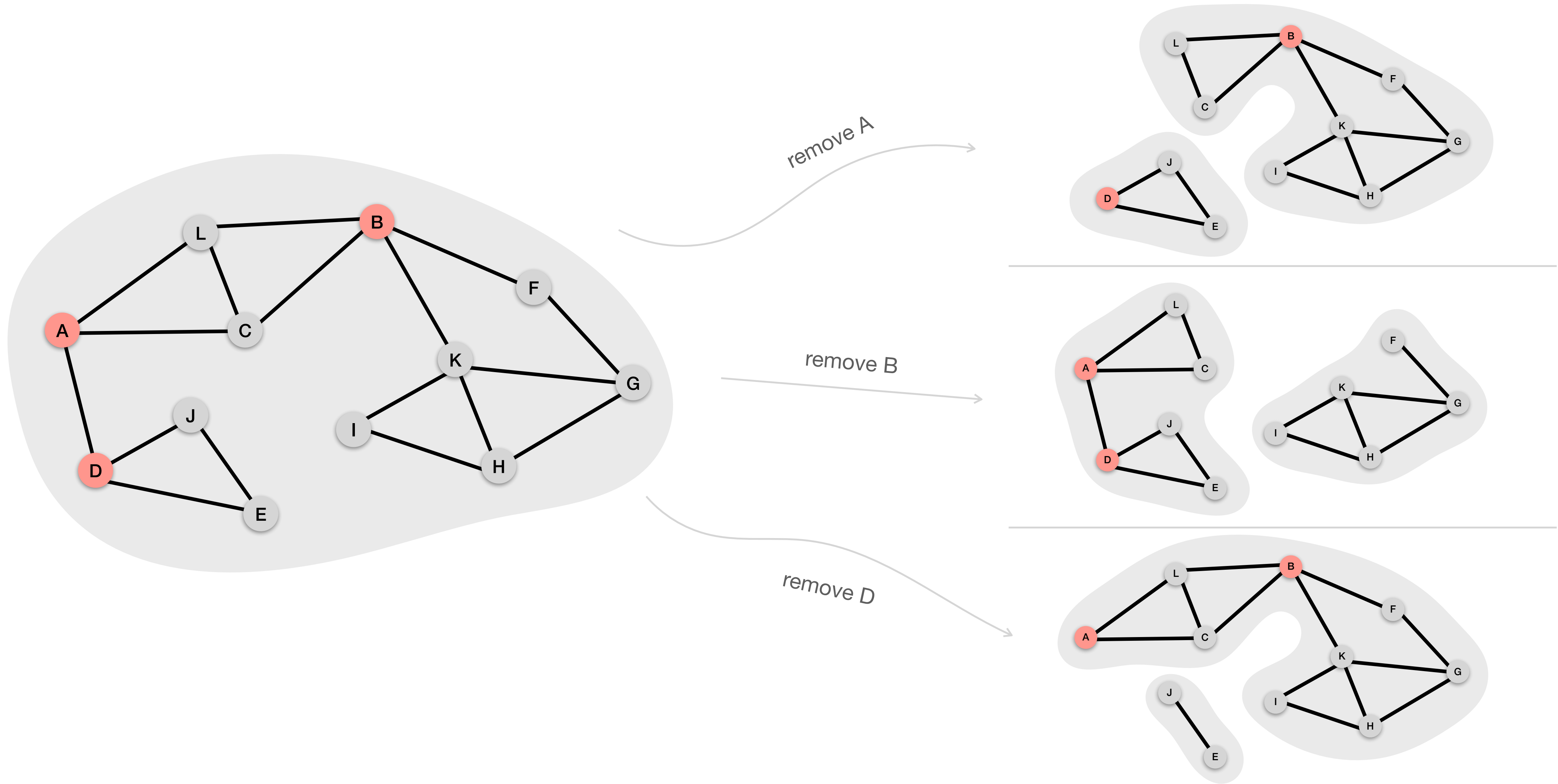
Identify the cut vertices



A since it is the root and $\deg(A) \geq 2$ in the DFS tree.

D since E is a neighbor of D and $low[E] = 10 \geq dfs[D] = 10$.

B since F is a neighbor of B and $low[F] = 3 \geq dfs[B] = 3$.



Pseudocode

DFS-VISIT(G, v)

```
1: num  $\leftarrow$  num + 1
2: dfs[v]  $\leftarrow$  num
3: low[v]  $\leftarrow$  dfs[v]
4: isArtVert[v]  $\leftarrow$  FALSE
5: for all  $\{v, w\} \in E$  do
6:   if dfs[w] = 0 then
7:      $T \leftarrow T + \{v, w\}$ 
8:     val  $\leftarrow$  DFS-VISIT( $G, w$ )
9:     if val  $\geq$  dfs[v] then
10:      isArtVert[v]  $\leftarrow$  TRUE
11:     low[v]  $\leftarrow$  min{low[v], val}
12:   else dfs[w]  $\neq$  0 and  $\{v, w\} \notin T$ 
13:     low[v]  $\leftarrow$  min{low[v], dfs[w]}
14: return low[v]
```

DFS(G, s)

```
1:  $\forall v \in V: \text{dfs}[v] \leftarrow 0$ 
2: num  $\leftarrow 0$ 
3:  $T \leftarrow \emptyset$ 
4: DFS-VISIT( $G, s$ )
5: if s hat in  $T$  Grad mindestens zwei then
6:   isArtVert[s]  $\leftarrow$  TRUE
7: else
8:   isArtVert[s]  $\leftarrow$  FALSE
```

Result (cut vertices)

Satz 1.27. Für zusammenhängende Graphen $G = (V, E)$, die mit Adjazenzlisten gespeichert sind, kann man in Zeit $O(|E|)$ alle Artikulationsknoten berechnen.

Note that DFS normally runs in $O(|V| + |E|)$ but since we assume G is connected, we know that $|E| \geq |V| - 1$ thus $|V| + |E| \leq 2 \cdot |E| \leq O(|E|)$.

What about bridges?

- First, notice that if G (connected) contains a bridge $e \in E$, any spanning tree of G must contain e .
- Hence the DFS tree must contain e , as it is a spanning tree of G .
- We reuse our Lemma from earlier:

Lemma: Let $G = (V, E)$ be a connected graph. If $\{u, v\} \in E$ is a bridge, then u and v are cut vertices unless they have degree 1.

What about bridges?

Lemma: Let $G = (V, E)$ be a connected graph. If $\{u, v\} \in E$ is a bridge, then u and v are cut vertices unless they have degree 1.

Let $e = (v, w)$ be an edge in the DFS tree T , then e is a bridge if and only if $\text{low}[w] > \text{dfs}[v]$.