



Universität Hamburg

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Transformer-based Algorithmics

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Artificial Intelligence (CHAI)**

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Topics for Today

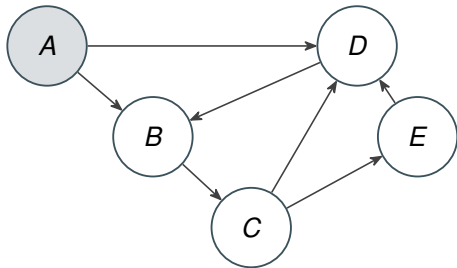
- Breadth-First Search (BFS)
- Depth-First Search (DFS)

Acknowledgement

- Some of the upcoming content is taken from the following lectures and corresponding exercises and has been translated and partially modified:
 - Prof. Dr. Ralf Möller: »[Algorithmen und Datenstrukturen – Vorlesung](#)«
 - Dr. Magnus Bender: »[Algorithmen und Datenstrukturen – Übung](#)«

Exercise 1 – Graph Algorithms

Consider the directed graph $G = (V, E)$ below.



- (a) Perform a **breadth-first search** on G starting from A . List the tree edges and the distance of each vertex. *Tie-breaking*: enqueue successors in lexicographic order ($A < B < \dots < E$).
- (b) Perform a **depth-first search** on G starting from A . State *dfsNum* and *finishTime* for each vertex and classify every edge as *tree*, *forward*, *back*, or *cross* edge. *Tie-breaking*: visit the lexicographically smallest successor first.

Breadth-First Search – Reminder

BFS in a Nutshell

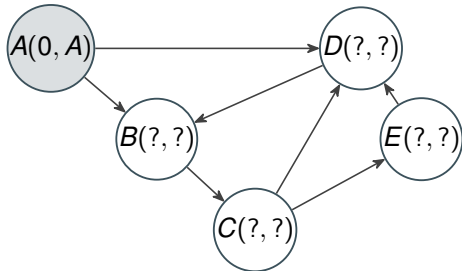
Maintains a **FIFO queue** of *discovered* vertices.

- (1) Mark the source s with $s.d = 0$, set $s.parent = s$, and enqueue s .
- (2) While the queue is non-empty: dequeue u and, for every outgoing neighbor v of u that is still unvisited, enqueue v and set $v.d = u.d + 1$, $v.parent = u$.

- Edges that lead to the discovery of a new vertex form the **BFS tree**; we will draw them in **red**.
- BFS computes **shortest-path distances** (in number of edges) from s to every reachable vertex.
- Runtime: $O(|V| + |E|)$.

Exercise 1 (a) – BFS from A

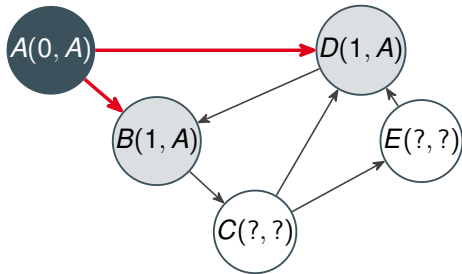
Vertex label: $v(v.d, v.parent)$. **Red** = tree edge. Gray = in queue, dark = processed.



Queue: [A] Enqueue source A with $d = 0$.

Exercise 1 (a) – BFS from A

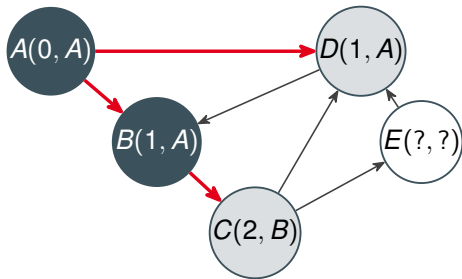
Vertex label: $v(v.d, v.parent)$. **Red** = tree edge. Gray = in queue, dark = processed.



Queue: $[B, D]$ Process A : discover B and D (lex. order).

Exercise 1 (a) – BFS from A

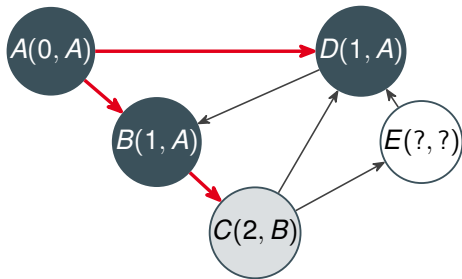
Vertex label: $v(v.d, v.parent)$. **Red** = tree edge. Gray = in queue, dark = processed.



Queue: $[D, C]$ Process B : discover C .

Exercise 1 (a) – BFS from A

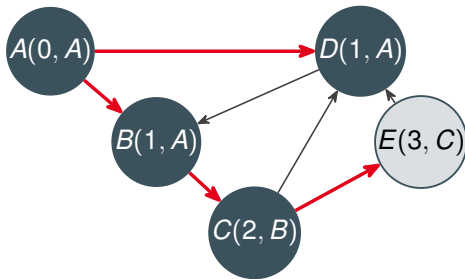
Vertex label: $v(v.d, v.parent)$. **Red** = tree edge. Gray = in queue, dark = processed.



Queue: [C] Process D: $D \rightarrow B$, but B already discovered.

Exercise 1 (a) – BFS from A

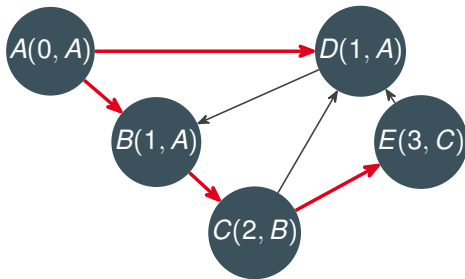
Vertex label: $v(v.d, v.parent)$. **Red** = tree edge. Gray = in queue, dark = processed.



Queue: $[E]$ Process C : discover E (skip D , already visited).

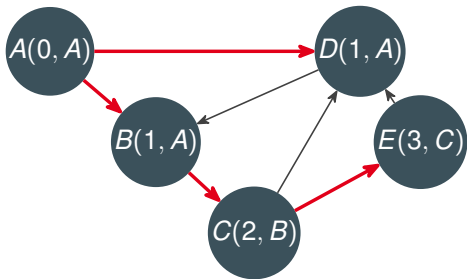
Exercise 1 (a) – BFS from A

Vertex label: $v(v.d, v.parent)$. **Red** = tree edge. Gray = in queue, dark = processed.



Queue: [] Process *E*: *D* already visited. **BFS done.**

Exercise 1 (a) – BFS Result



Tree edges: $A \rightarrow B$, $A \rightarrow D$, $B \rightarrow C$, $C \rightarrow E$.

BFS distances from A

v	A	B	C	D	E
$v.d$	0	1	2	1	3

Observation

Although the edge $C \rightarrow D$ exists, D is reached *directly* from A via $A \rightarrow D$ – BFS always finds a **shortest path** (in number of edges).

Depth-First Search – Reminder

DFS in a Nutshell

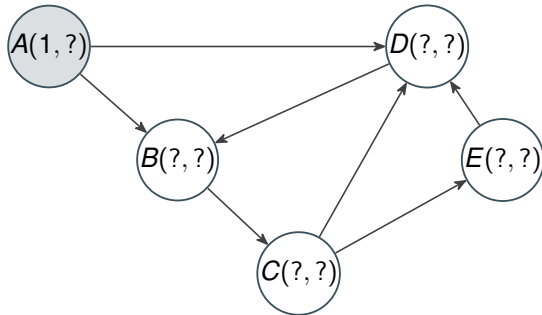
Recursive traversal with two counters: *dfsNum* (discovery order) and *finishTime* (completion order). For each outgoing neighbor v of u : recurse if v is unvisited; otherwise classify the edge $u \rightarrow v$ (see below).

Edge classification for $u \rightarrow v$:

- **Tree**: v was unvisited when u explored it.
- **Back**: v is still on the DFS stack (ancestor of u).
- **Forward**: v already finished, descendant of u ($u.dfsNum < v.dfsNum$).
- **Cross**: v already finished, $v.dfsNum < u.dfsNum$ (different subtree).

Exercise 1 (b) – DFS from A

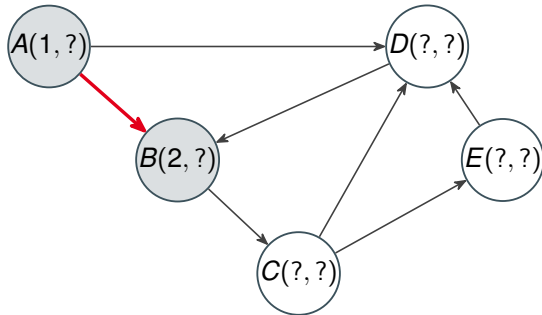
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Visit A ($dfsNum = 1$). Stack: [A].

Exercise 1 (b) – DFS from A

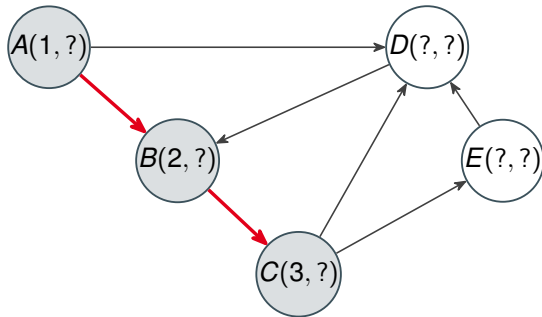
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Visit B via tree edge $A \rightarrow B$ ($dfsNum = 2$). Stack: $[A, B]$.

Exercise 1 (b) – DFS from A

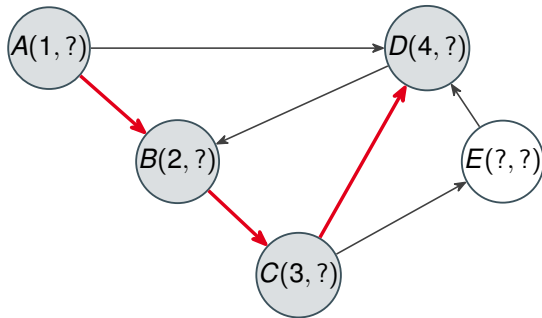
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Visit C via tree edge $B \rightarrow C$ ($dfsNum = 3$). Stack: $[A, B, C]$.

Exercise 1 (b) – DFS from A

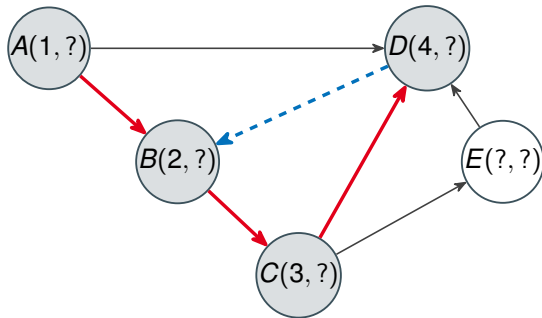
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Visit D via tree edge $C \rightarrow D$ ($dfsNum = 4$). Stack: $[A, B, C, D]$.

Exercise 1 (b) – DFS from A

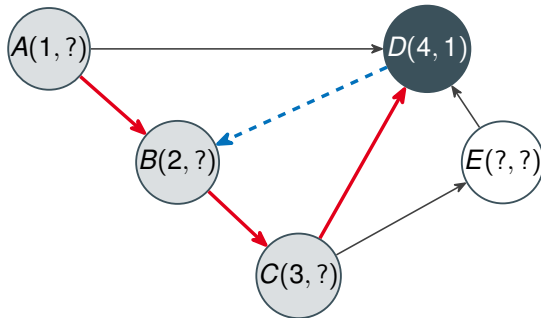
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Edge $D \rightarrow B$: B is on the stack $\Rightarrow$ **back edge**.

Exercise 1 (b) – DFS from A

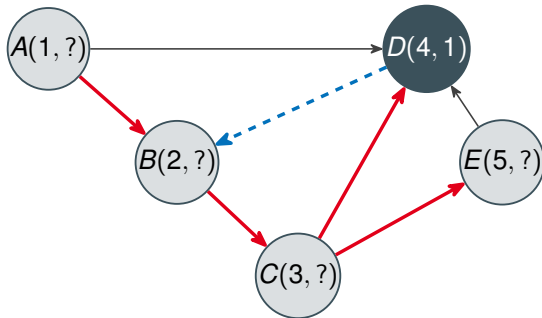
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Finish D ($finishTime = 1$). Stack: $[A, B, C]$.

Exercise 1 (b) – DFS from A

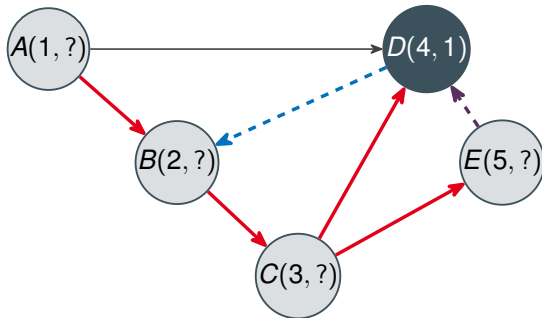
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Back at C : **visit** E via tree edge $C \rightarrow E$ ($dfsNum = 5$). Stack: $[A, B, C, E]$.

Exercise 1 (b) – DFS from A

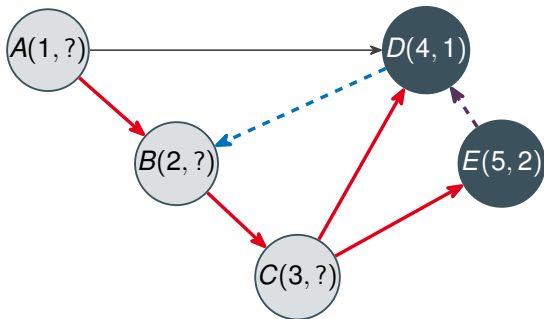
Vertex label: $v(dfsNum, finishTime)$. — tree - - back - - forward - - cross



Edge $E \rightarrow D$: D finished and $D.dfsNum < E.dfsNum \Rightarrow$ **cross edge**.

Exercise 1 (b) – DFS from A

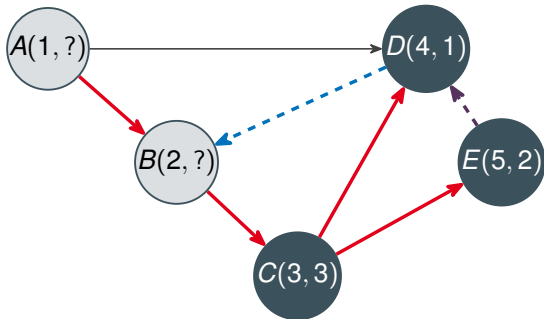
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Finish E ($finishTime = 2$).

Exercise 1 (b) – DFS from A

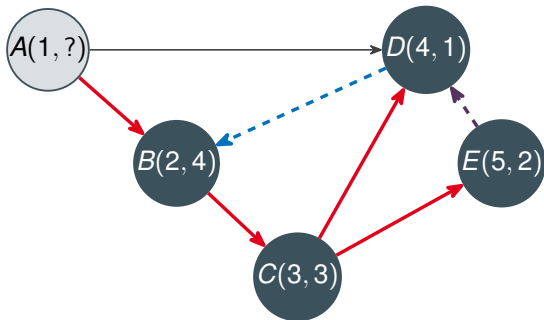
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Finish C ($finishTime = 3$).

Exercise 1 (b) – DFS from A

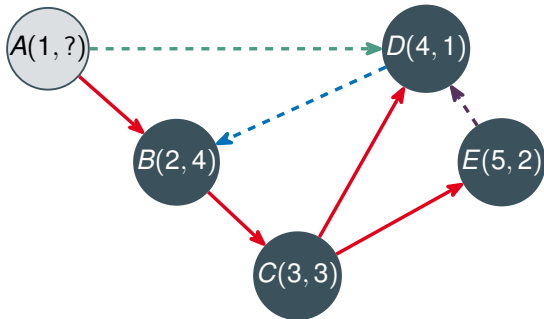
Vertex label: $v(\text{dfsNum}, \text{finishTime})$. — tree - - back - - forward - - cross



Finish B ($\text{finishTime} = 4$).

Exercise 1 (b) – DFS from A

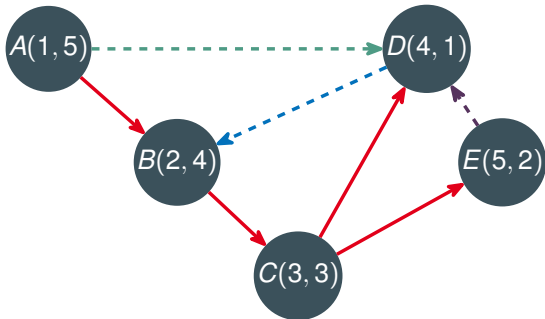
Vertex label: $v(dfsNum, finishTime)$. — tree — back — forward — cross



Back at A: edge $A \rightarrow D$, D finished and $A.dfsNum < D.dfsNum \Rightarrow$ **forward edge**.

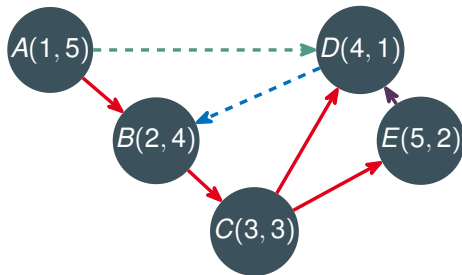
Exercise 1 (b) – DFS from A

Vertex label: $v(\text{dfsNum}, \text{finishTime})$. — tree — back — forward — cross



Finish A ($\text{finishTime} = 5$). **DFS done.**

Exercise 1 (b) – DFS Result



v	A	B	C	D	E
<i>dfsNum</i>	1	2	3	4	5
<i>finish</i>	5	4	3	1	2

Edge classification

- **Tree**: $A \rightarrow B$, $B \rightarrow C$, $C \rightarrow D$, $C \rightarrow E$
- **Back**: $D \rightarrow B$
- **Forward**: $A \rightarrow D$
- **Cross**: $E \rightarrow D$

Observation

The *back edge* $D \rightarrow B$ proves that G contains a **cycle**: $B \rightarrow C \rightarrow D \rightarrow B$.