

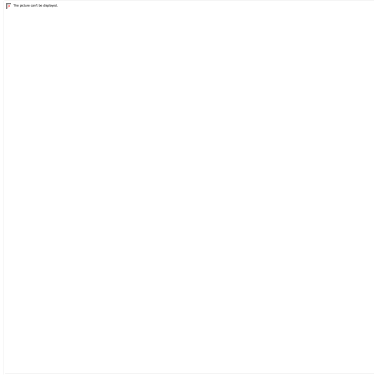


Pokročilá algoritmizace

Daniel Průša, Ondřej Drbohlav

2025

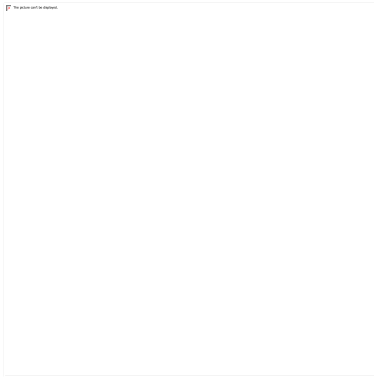
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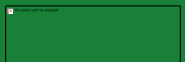
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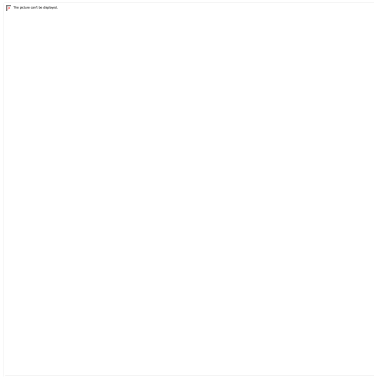
Co na to říkáte?



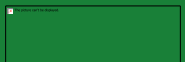
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Asymptotické odhady

- horní asymptotický odhad (velké omikron odhad):

$$f(n) \in O(g(n))$$

- význam:

f je shora asymptoticky ohraničená funkcí g (až na multiplikativní konstantu)

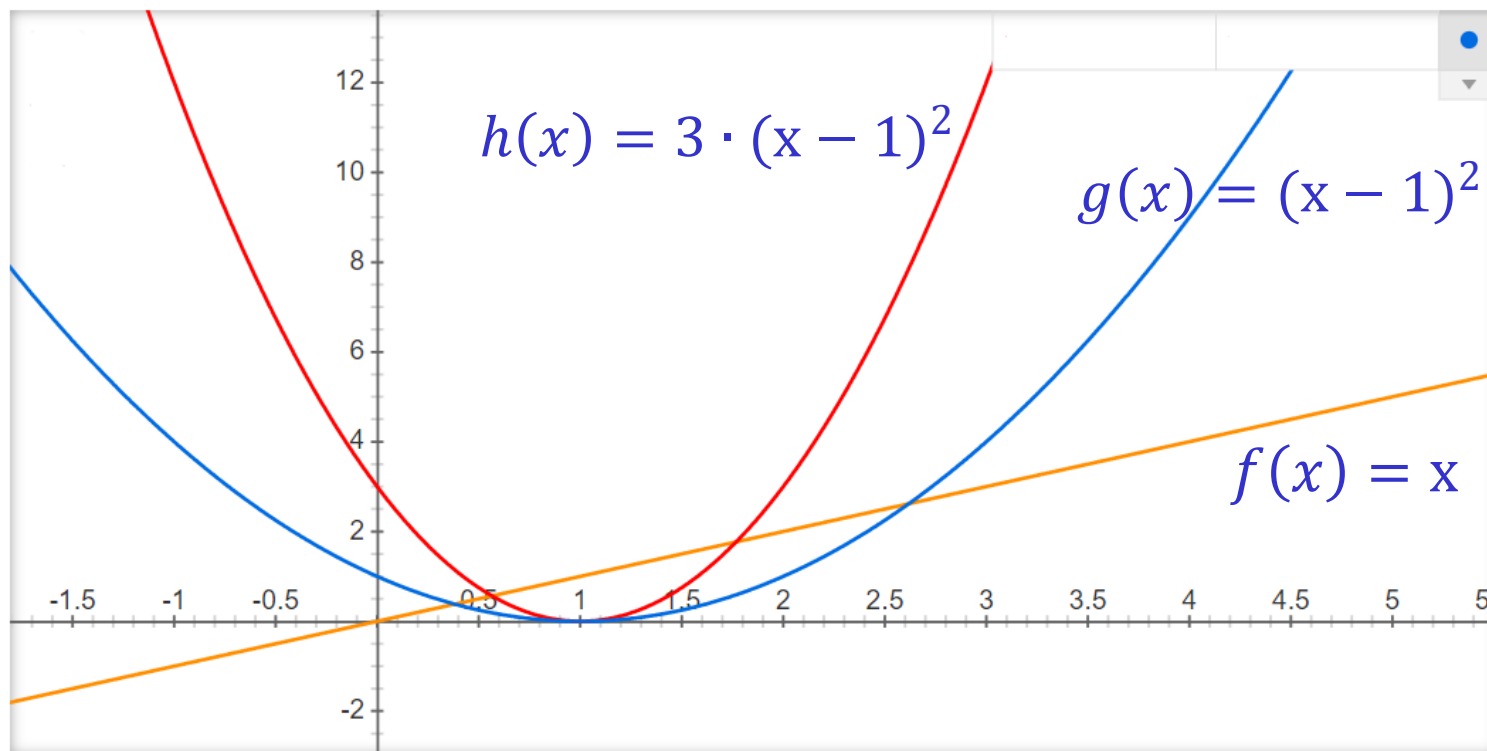
- definice:

$$(\exists c > 0)(\exists n_0)(\forall n > n_0) : f(n) \leq c \cdot g(n)$$

kde $c \in \mathbb{R}^{>0}$ $n_0, n \in \mathbb{N}$ $f, g \in \mathbb{N} \rightarrow \mathbb{R}^{\geq 0}$

Asymptotické odhady

- příklad $f(x) \in O(g(n))$, $h(x) \in O(g(n))$



$$(\exists c > 0)(\exists n_0)(\forall n > n_0) : f(n) \leq c \cdot g(n)$$

Asymptotické odhady

- horní asymptotický odhad pro více proměnných:

$$f(n_1, \dots, n_k) \in O(g(n_1, \dots, n_k))$$

- definice:

$$(\exists c > 0)(\exists n_0)(\forall n_1 > n_0) \cdots (\forall n_k > n_0) :$$

$$f(n_1, \dots, n_k) \leq c \cdot g(n_1, \dots, n_k)$$

kde $c \in \mathbb{R}^{>0}$ $n_0, n_1, \dots, n_k \in \mathbb{N}$ $f, g \in \mathbb{N} \rightarrow \mathbb{R}^{\geq 0}$

Asymptotické odhady

- dolní asymptotický odhad (velké omega odhad):

$$f(n) \in \Omega(g(n))$$

- význam:

f je zdola asymptoticky ohraničená funkcí g (až na konstantu)

- definice:

$$(\exists c > 0)(\exists n_0)(\forall n > n_0) : c \cdot g(n) \leq f(n)$$

kde $c \in \mathbb{R}^{>0}$ $n_0, n \in \mathbb{N}$ $f, g \in \mathbb{N} \rightarrow \mathbb{R}^{\geq 0}$

Asymptotické odhady

- optimální asymptotický odhad (velké théta odhad):

$$f(n) \in \Theta(g(n))$$

- význam:

f je asymptoticky ohraničená funkcí g z obou stran (až na konstantu)

- definice: $\Theta(g(n)) \stackrel{\text{def}}{=} O(g(n)) \cap \Omega(g(n))$

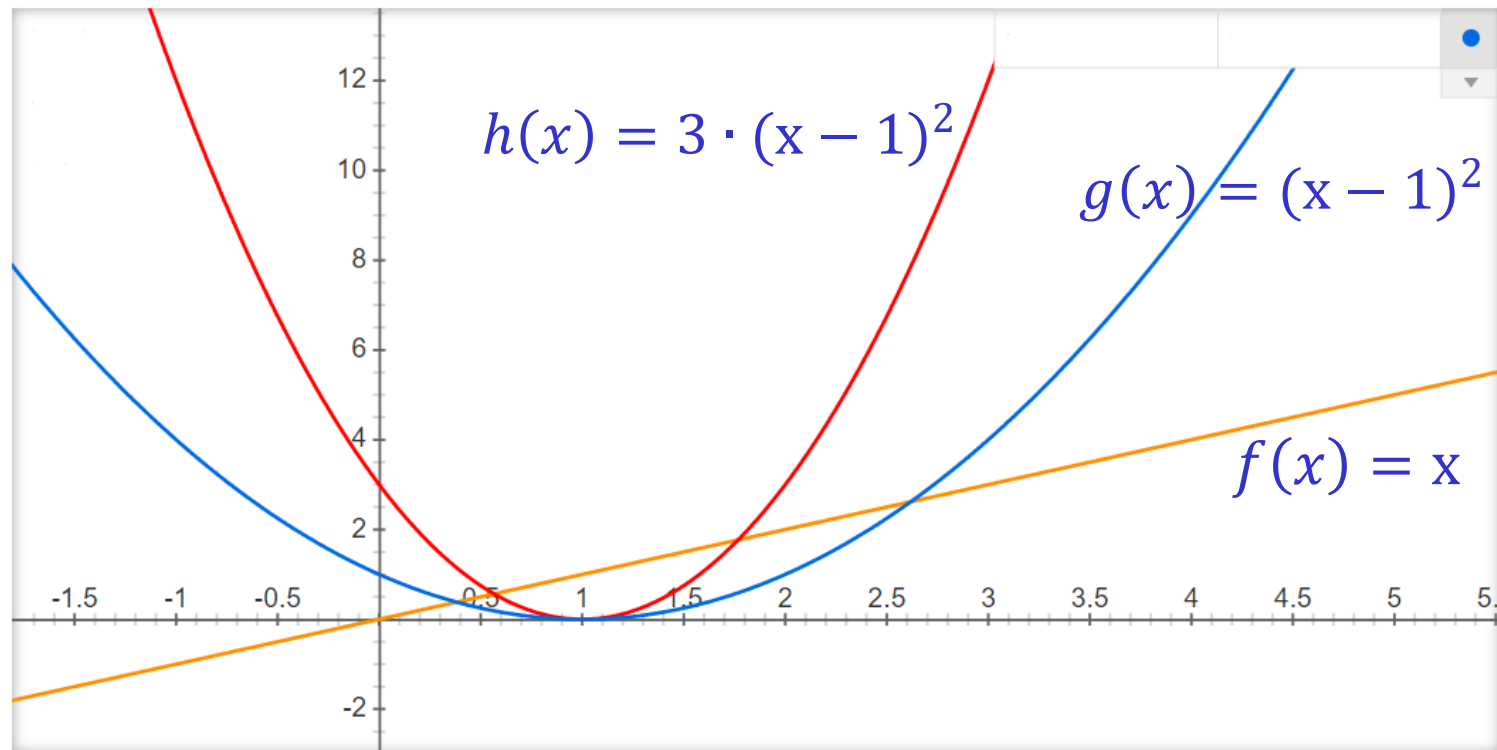
- nebo alternativně:

$$(\exists c_1, c_2 > 0)(\exists n_0)(\forall n > n_0): c_1 \cdot g(n) \leq f(n) \leq c_2 \cdot g(n)$$

$$\text{kde } c_1, c_2 \in \mathbb{R}^{>0} \quad n_0, n \in \mathbb{N} \quad f, g \in \mathbb{N} \rightarrow \mathbb{R}^{\geq 0}$$

Asymptotické odhady

- příklad $g(n) \in \Theta(h(n)), \quad g(n) \notin \Theta(f(n))$



Asymptotické odhady

- Platí $\log_a(n) \in \Theta(\log_b(n))$

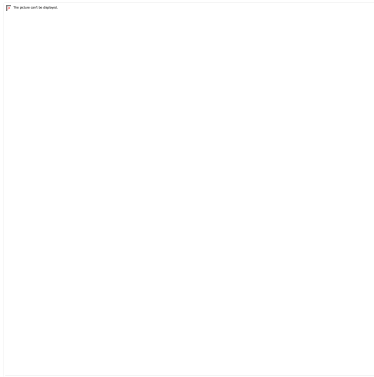
$$\log_a n = \frac{\log_b n}{\log_b a} = \underbrace{\frac{1}{\log_b a}}_{\text{konstanta}} \cdot \log_b n$$

vzoreček

Vlastnosti asymptotických odhadů

- Věta: Jsou-li funkce $f(n)$, $g(n)$ vždy kladné, pak pro limitu v ∞ platí
 - $\lim_{n \rightarrow \infty} \frac{f(n)}{g(n)} = 0$, pak $f(n) \in O(g(n))$, ale **neplatí** $f(n) \in \Theta(g(n))$
 - $\lim_{n \rightarrow \infty} \frac{f(n)}{g(n)} = a$, kde $0 < a < \infty$, pak $f(n) \in \Theta(g(n))$
 - $\lim_{n \rightarrow \infty} \frac{f(n)}{g(n)} = \infty$, pak $g(n) \in O(f(n))$, ale **neplatí** $g(n) \in \Theta(f(n))$
- Důsledek: Mějme pevně zvolené číslo $k \in \mathbb{N}$, pak platí
$$(\log(n))^k \in O(n)$$
- Důkaz lze provést pomocí L'Hopitalova pravidla.

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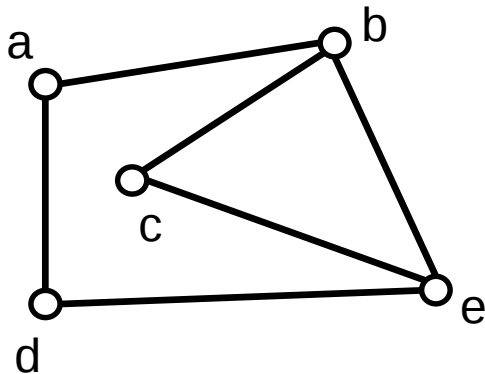


(Ne)orientovaný graf

$$G_1 = (V, E_1)$$

$$V = \{a, b, c, d, e\}$$

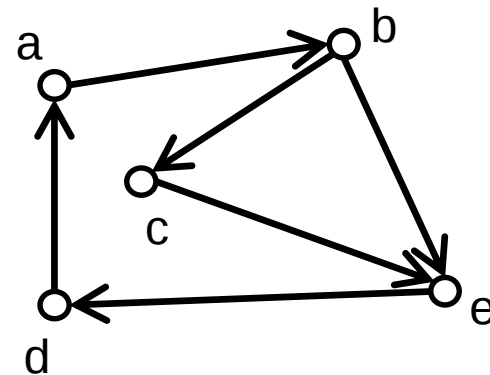
$$E_1 = \left\{ \{a, b\}, \{b, c\}, \{b, e\}, \right. \\ \left. \{e, c\}, \{d, e\}, \{a, d\} \right\}$$



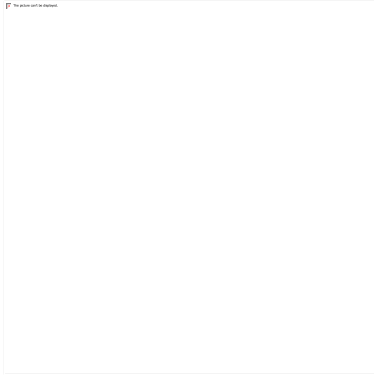
$$G_2 = (V, E_2)$$

$$V = \{a, b, c, d, e\}$$

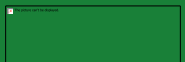
$$E_2 = \left\{ (a, b), (b, c), (b, e), \right. \\ \left. (c, e), (e, d), (d, a) \right\}$$



Znáte způsoby reprezentace grafu v paměti a průchody grafem?



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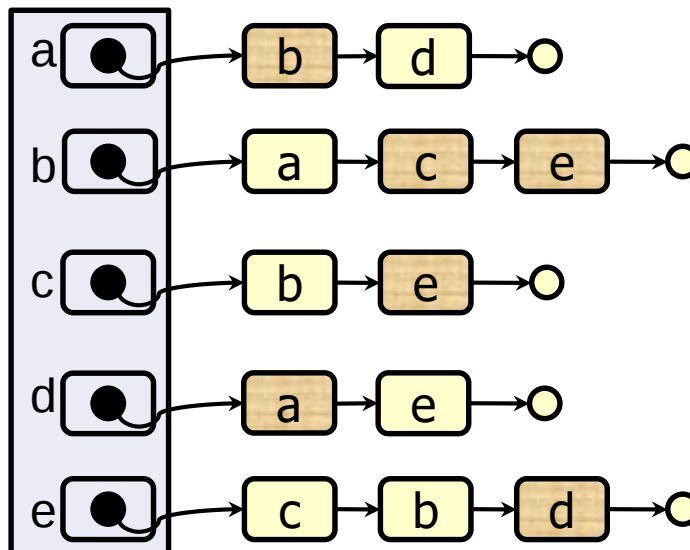


Reprezentace grafu v paměti

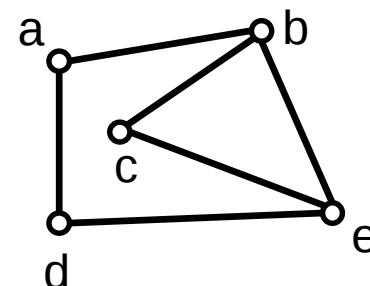
Matice sousednosti:

	a	b	c	d	e
a	0	1	0	1	0
b	1	0	1	0	1
c	0	1	0	0	1
d	1	0	0	0	1
e	0	1	1	1	0

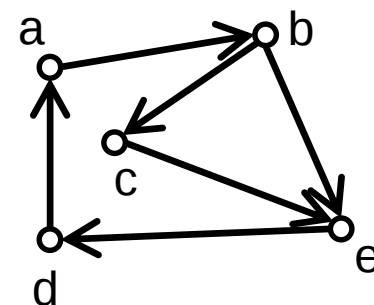
Seznam sousedů:



$G_1 = (V, E_1)$



$G_2 = (V, E_2)$



Prostorová složitost

$$\Theta(|V|^2)$$

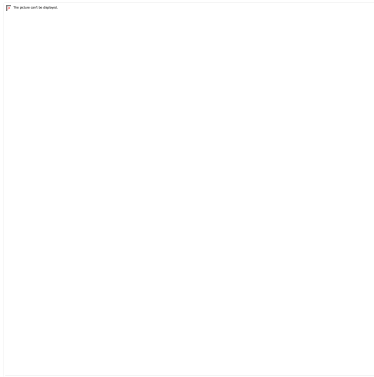
test existence hrany
v konstantním čase

$$\Theta(|V| + |E|)$$

výhodnější pro řídké grafy

Reprezentace grafu G_2
obsahuje pouze prvky
s pozadím 

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DFS - algoritmus

```
procedure dfs(start_vertex : Vertex)
var   to_visit : Stack = empty;
      visited : Vertices = empty;
{
    to_visit.push(start_vertex);
    while (size(to_visit) != 0) {
        v = to_visit.pop();
        if v not in visited then {
            visited.add(v);
            for all x in neighbors of v {
                to_visit.push(x);
            }
        }
    }
}
```

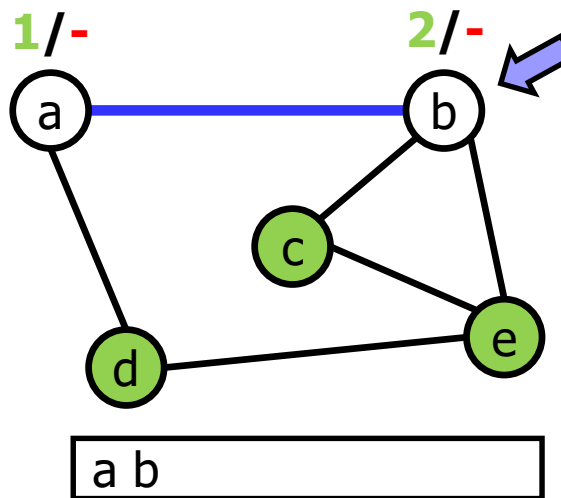
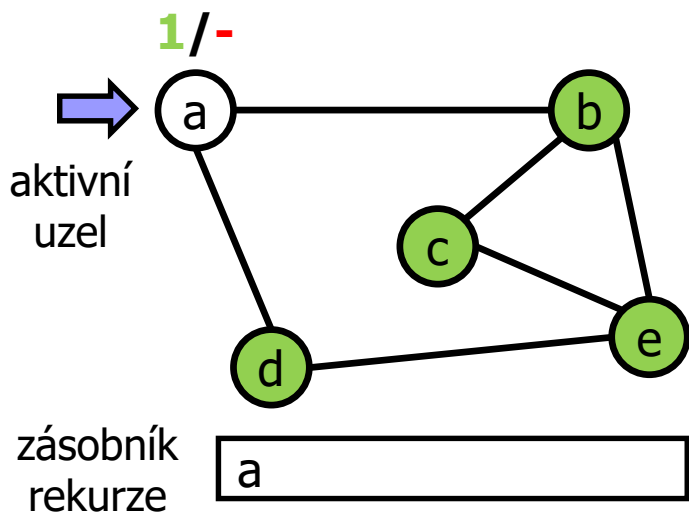
BFS - algoritmus

```
procedure bfs(start_vertex : Vertex)
var   to_visit : Queue = empty;
       visited : Vertices = empty;
{
    to_visit.push(start_vertex);
    while (size(to_visit) != 0) {
        v = to_visit.pop();
        if v not in visited then {
            visited.add(v);
            for all x in neighbors of v {
                to_visit.push(x);
            }
        }
    }
}
```

Průchod grafem do hloubky (DFS)

Depth-first search

čas otevření / uzavření uzlu



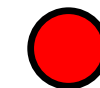
stavy uzlu:



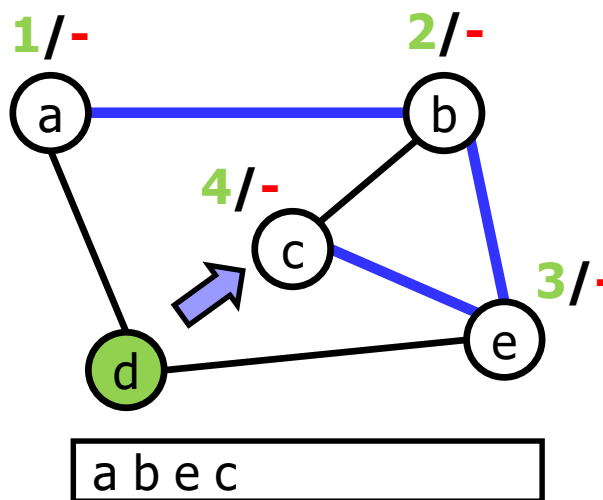
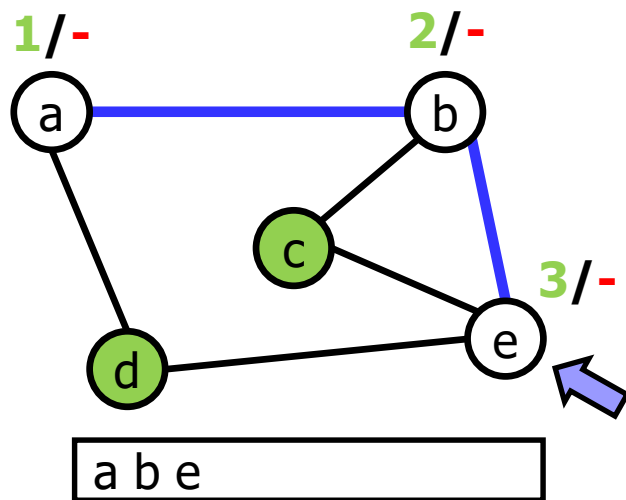
FRESH



OPEN

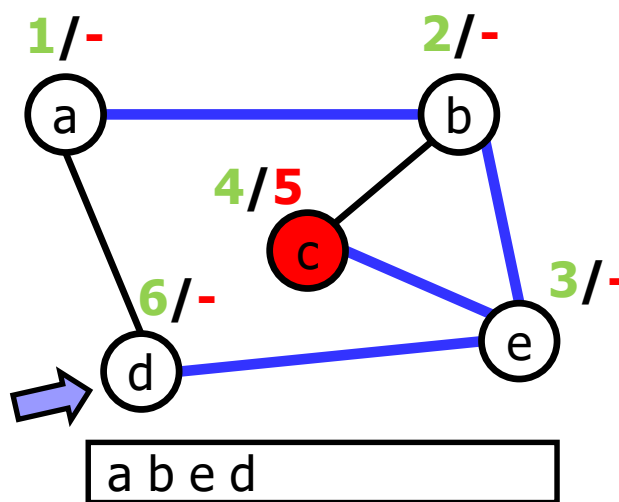
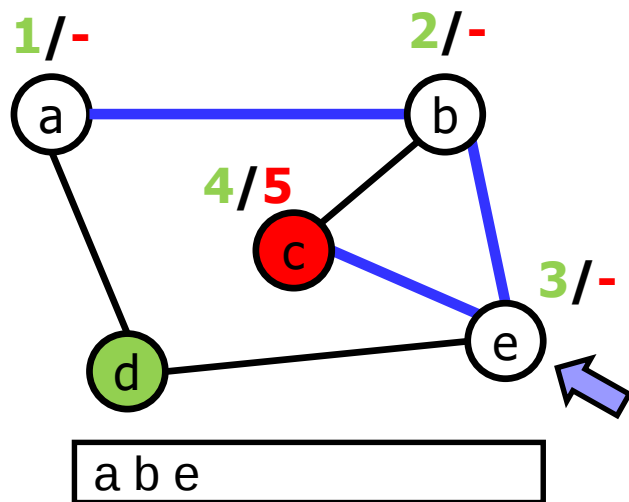


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Průchod grafem do hloubky (DFS)

Depth-first search



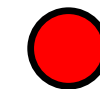
stavy uzlu:



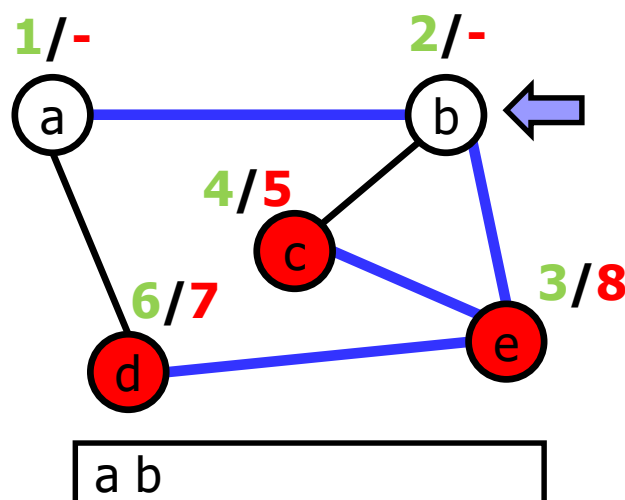
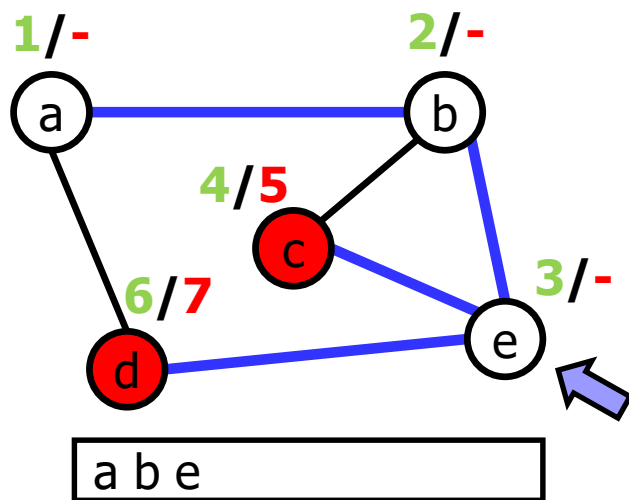
FRESH



OPEN

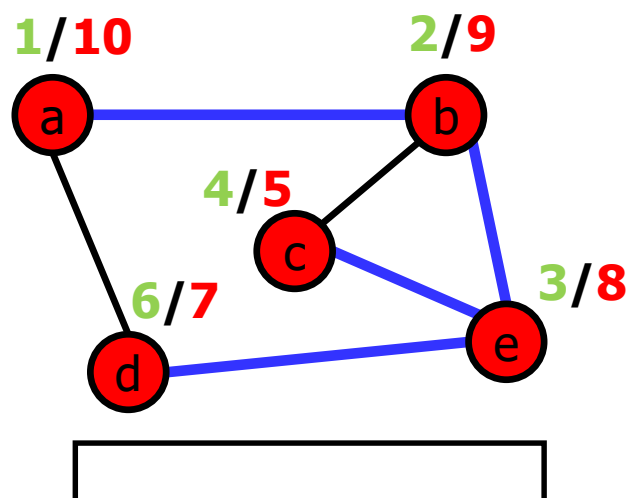
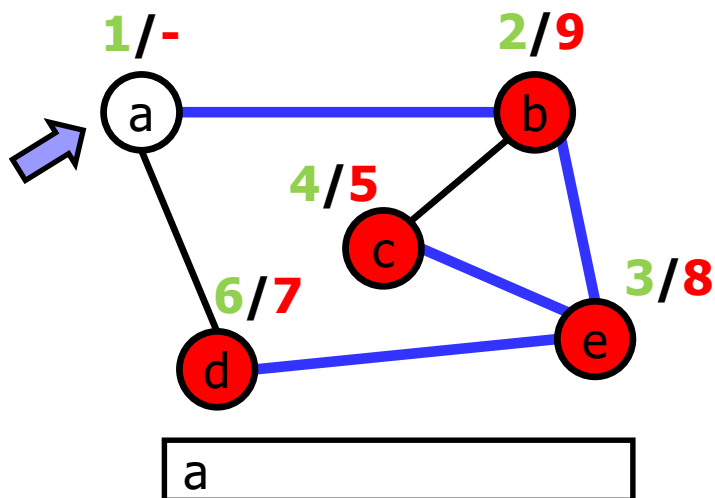


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Průchod grafem do hloubky (DFS)

Depth-first search



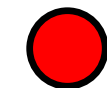
stavy uzlu:



FRESH

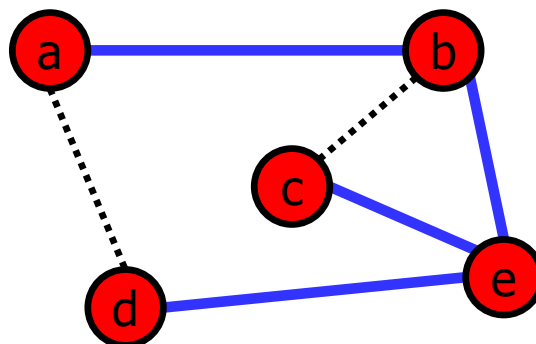


OPEN

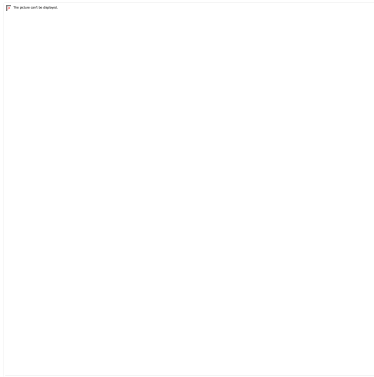


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DFS-strom:



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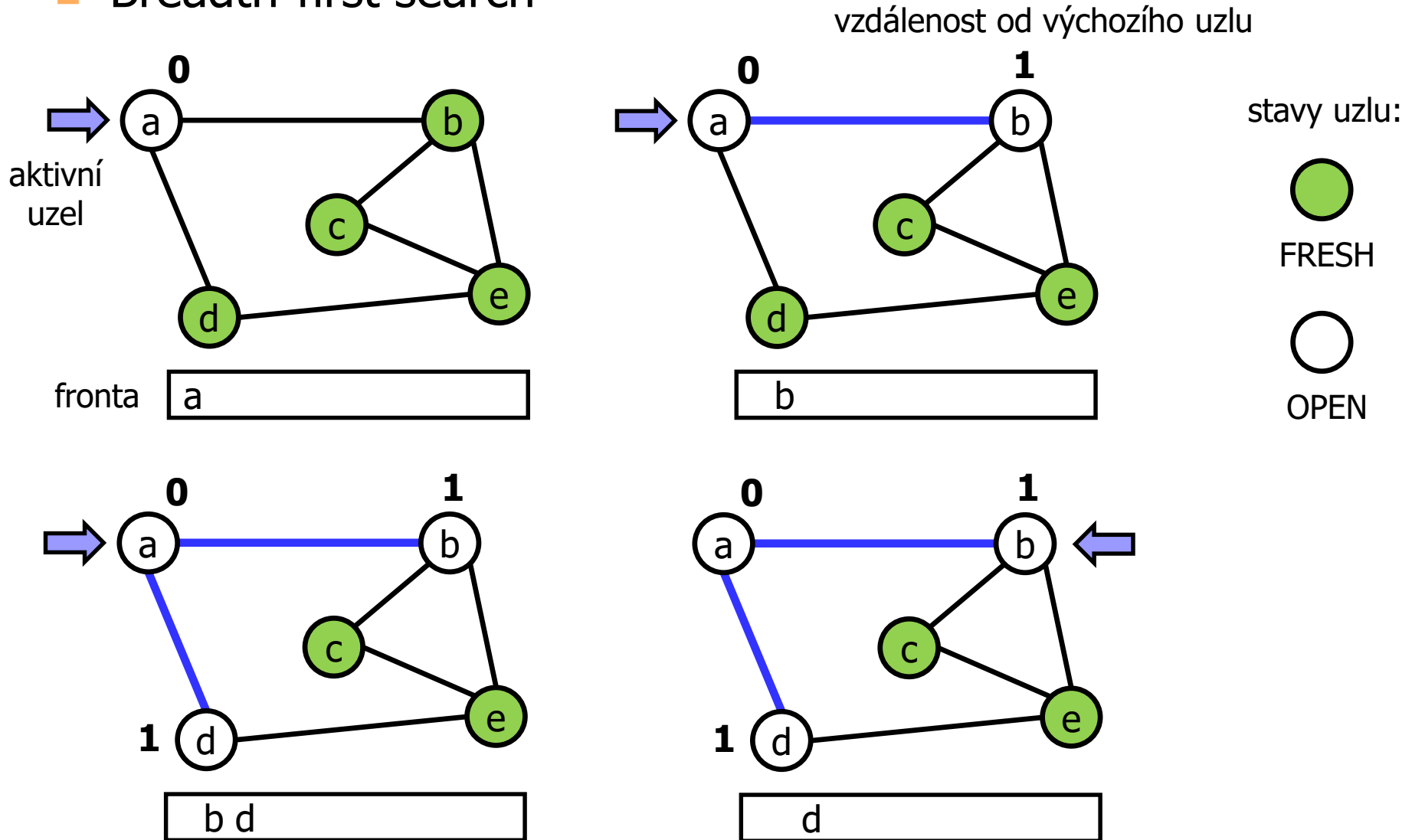


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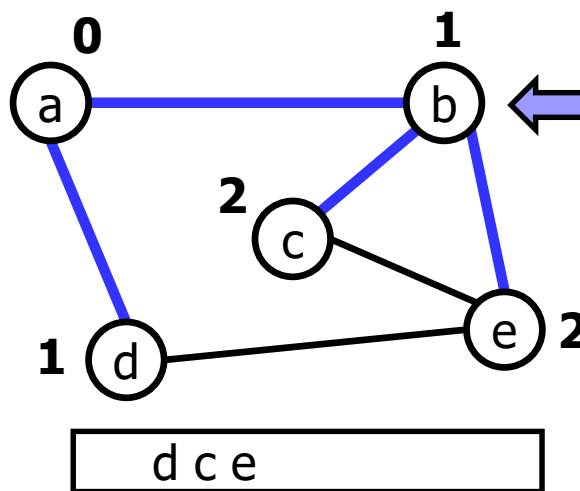
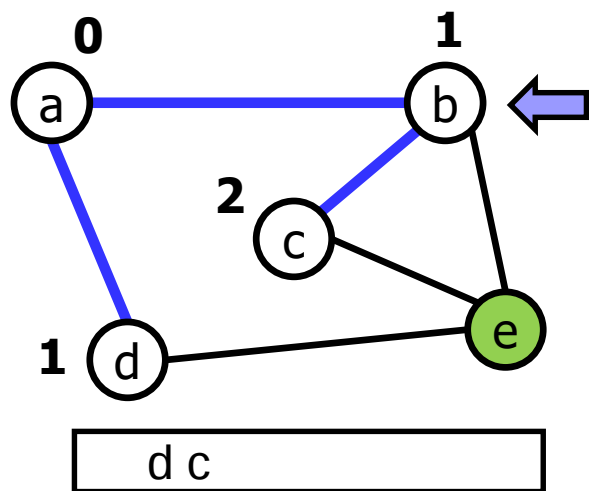
Průchod grafem do šířky (BFS)

■ Breadth-first search



Průchod grafem do šířky (BFS)

■ Breadth-first search



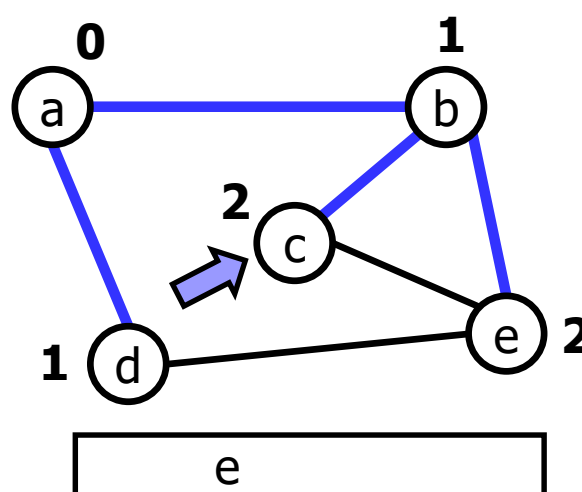
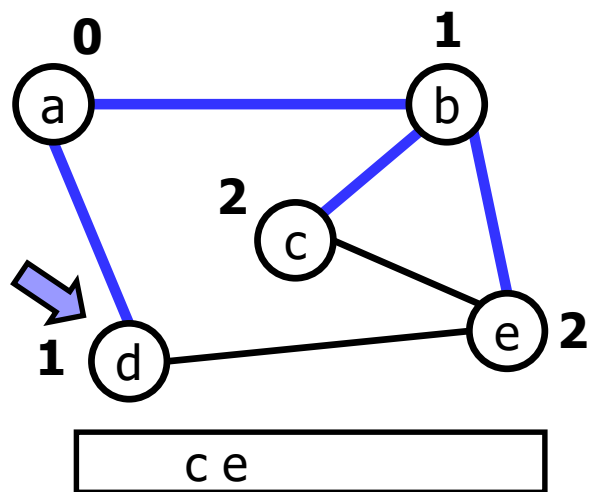
stavy uzlu:



FRESH

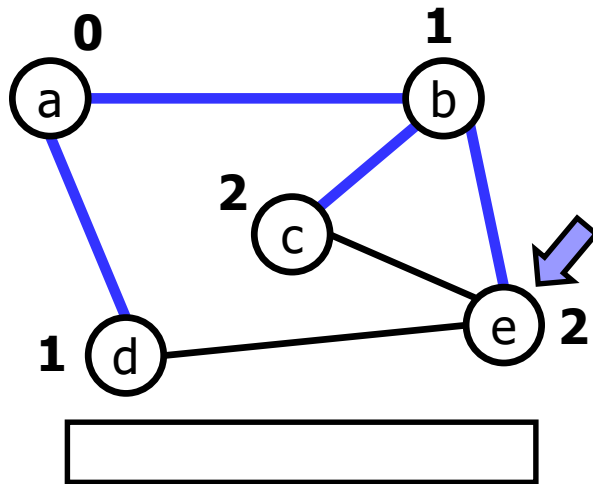


OPEN



Průchod grafem do šířky (BFS)

■ Breadth-first search



stavy uzlu:

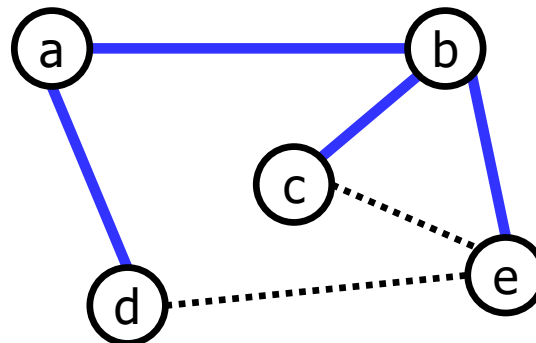


FRESH



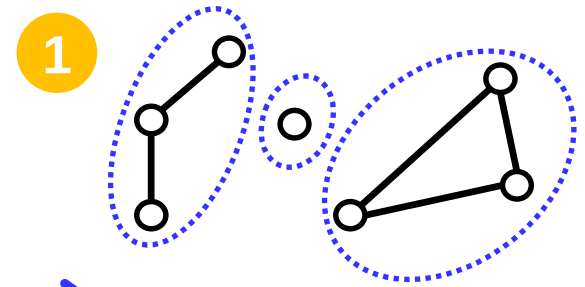
OPEN

BFS-strom:

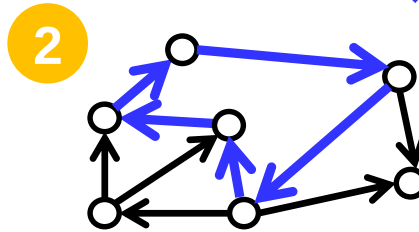


Aplikace průchodu grafem

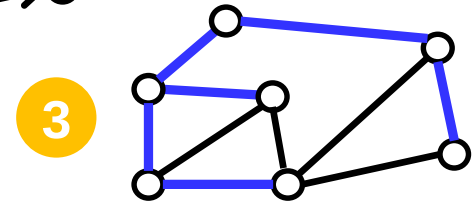
1. Detekce komponent souvislosti



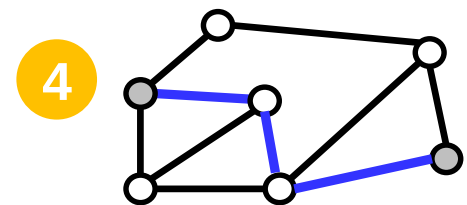
2. Detekce cyklu (jen DFS)
(pokud při DFS objevíme uzel ve stavu OPEN => cyklus)



3. Nalezení kostry

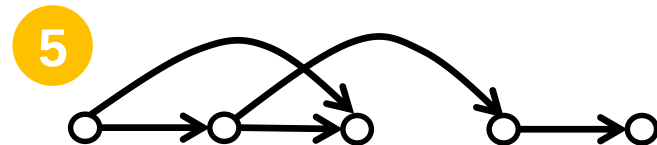


4. Hranově nejkratší cesta (jen BFS)



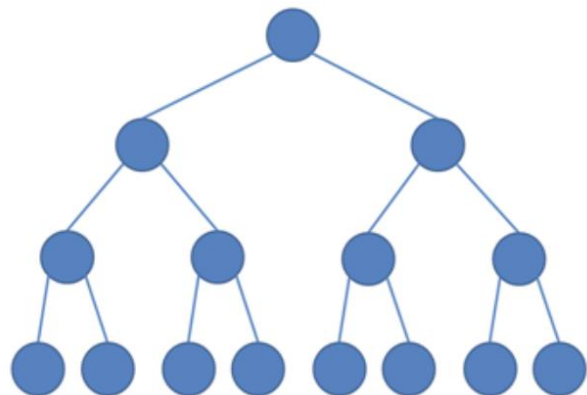
5. Topologické uspořádání (jen DFS)

(uzly uspořádáme sestupně podle časů jejich uzavření)



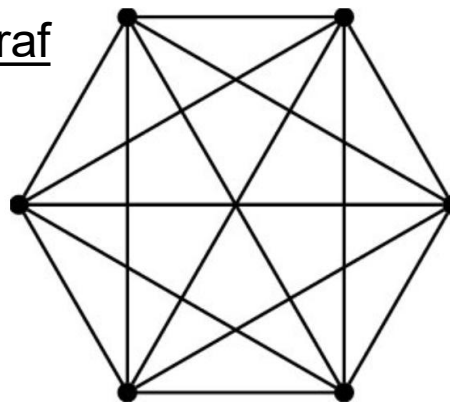
DFS vs. BFS z hlediska paměti

vyvážený strom



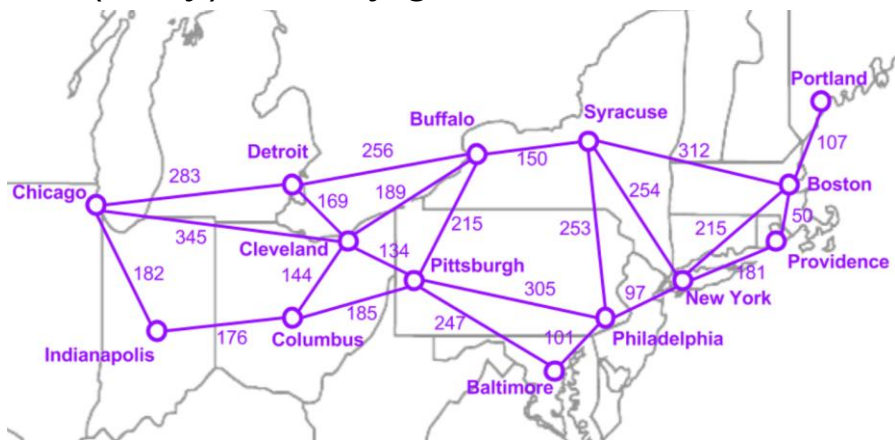
BFS: $\Theta(n)$ DFS: $\Theta(\log n)$

úplný graf



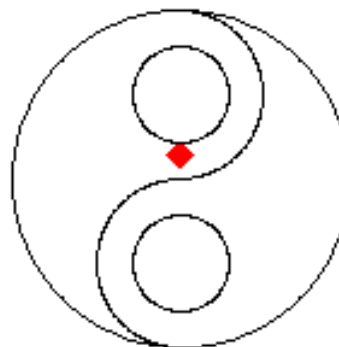
BFS: $\Theta(n)$ DFS: $\Theta(n)$

(řídský) rovinný graf

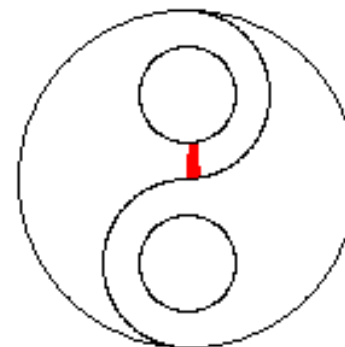


Flood fill algoritmus

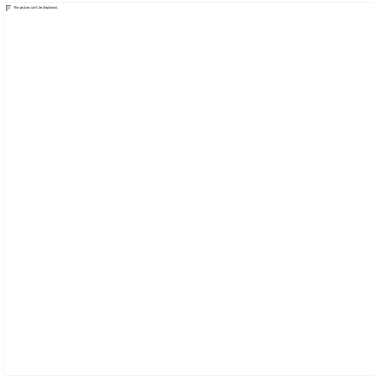
BFS



DFS



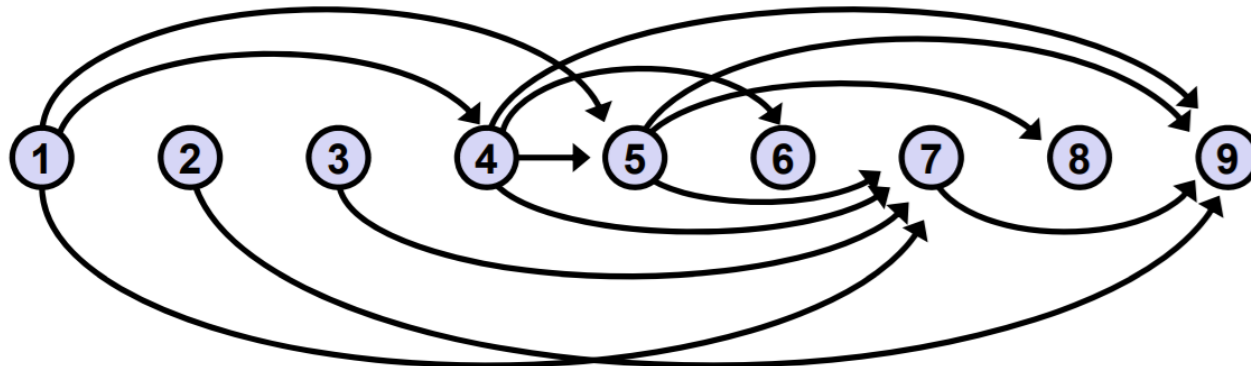
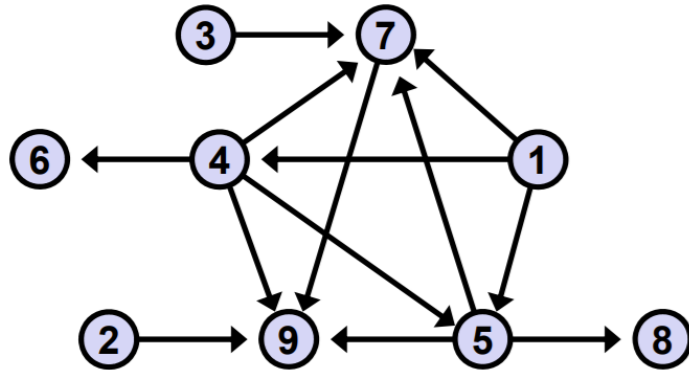
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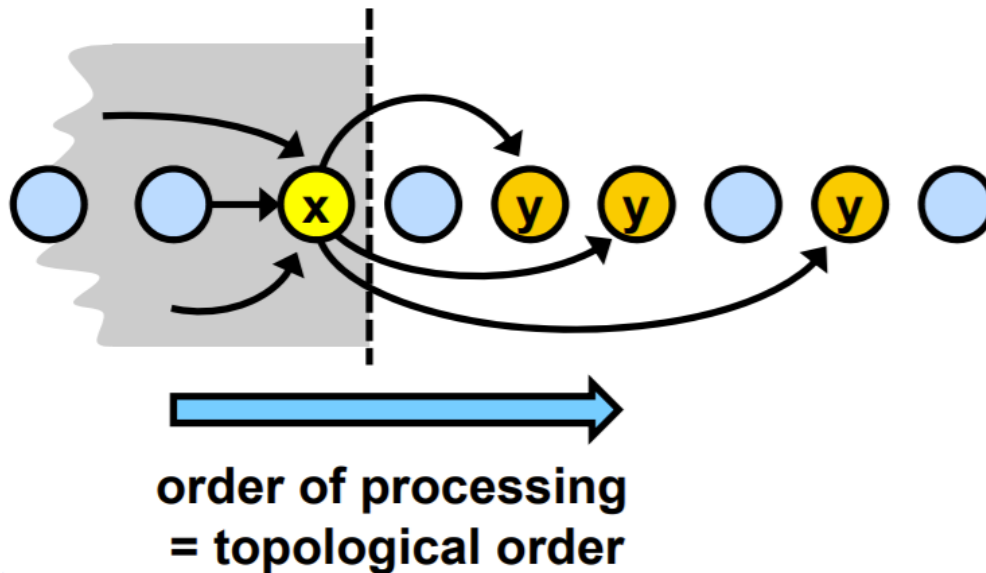


DAG, topologické uspořádání

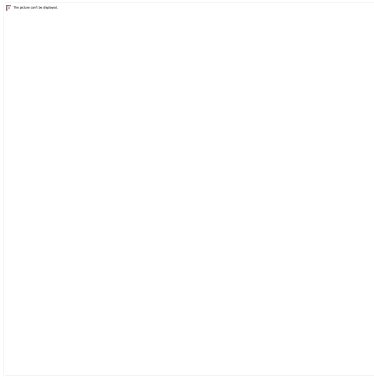


Nejdelší cesta v DAG

```
for each node x in  $V(G)$  {  
  for each edge  $e = (x, y)$  in  $E(G)$   
    if ( $y.\text{dist} < x.\text{dist} + e.\text{weight}$ ) {  
       $y.\text{dist} = x.\text{dist} + e.\text{weight}$   
       $y.\text{pred} = x$ ;  
    }  
}
```



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