

L16

4102

3.22.2016

abhi shelat

connecting houses



connecting houses



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connecting houses



connecting houses

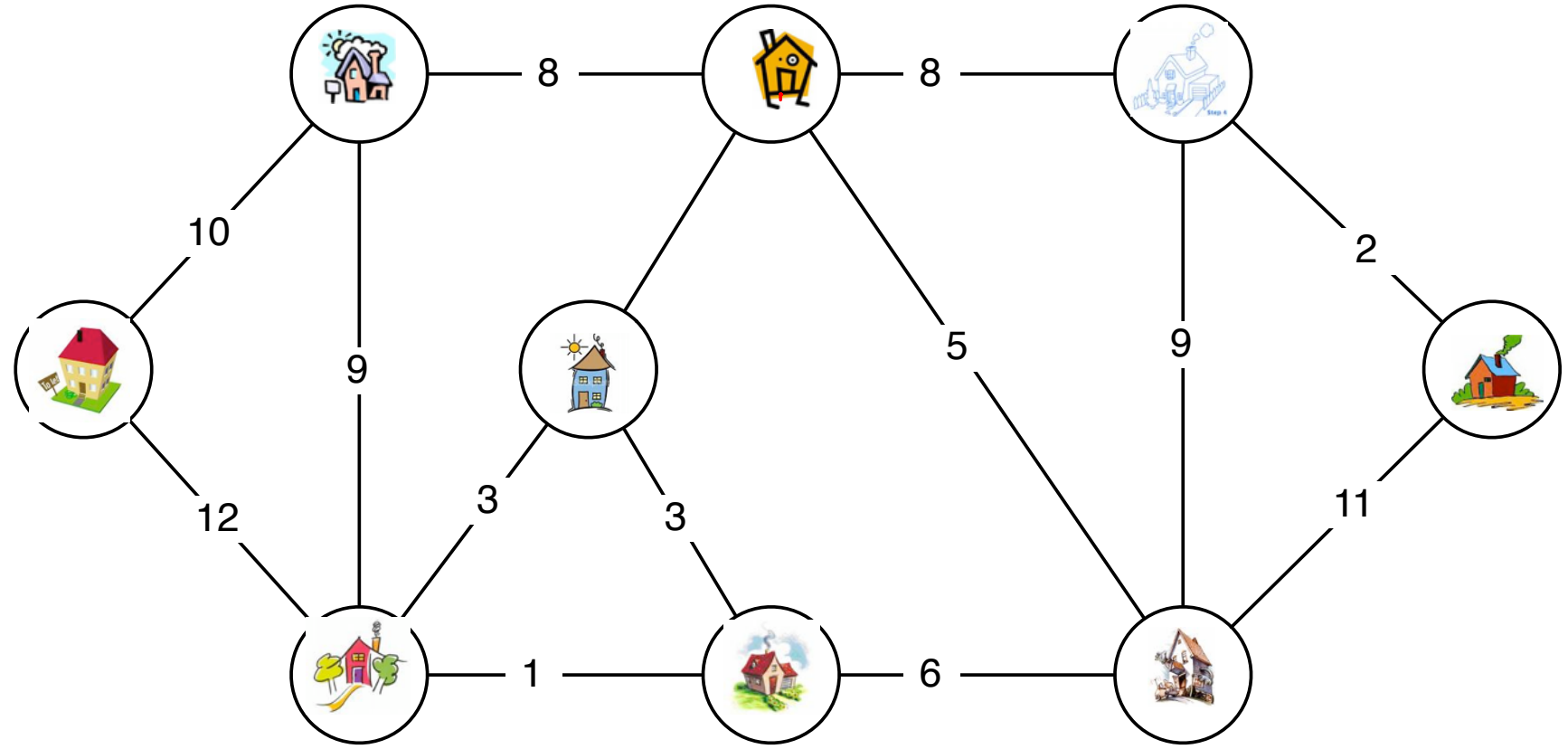


connecting houses



connecting houses





graphs

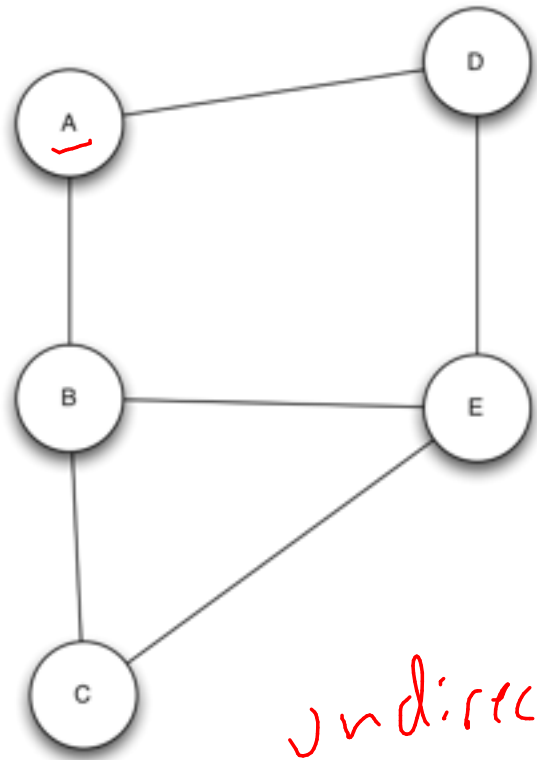
clrs [ch 22]



$$G = (\underbrace{V}_{\text{vertices}}, \underbrace{E}_{\text{edges}})$$

$$\underline{w(e)}: E \rightarrow \mathbb{N}$$

weights for each edge



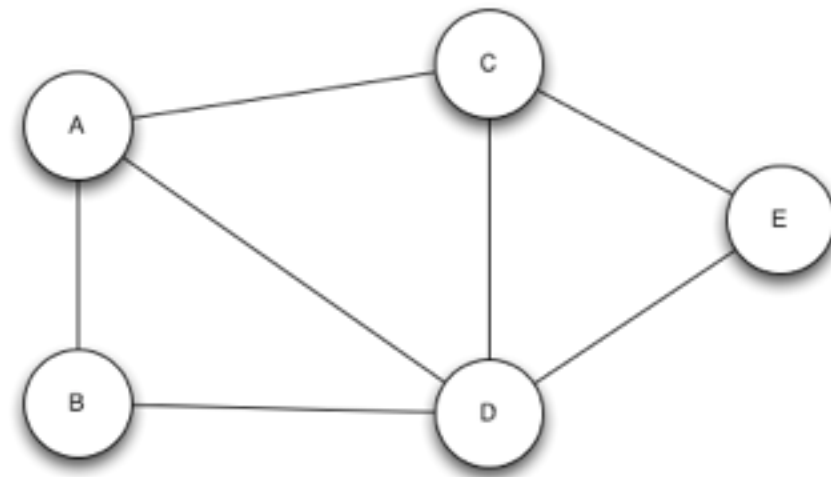
undirected.

$$V = \{A, B, C, D, E\}$$

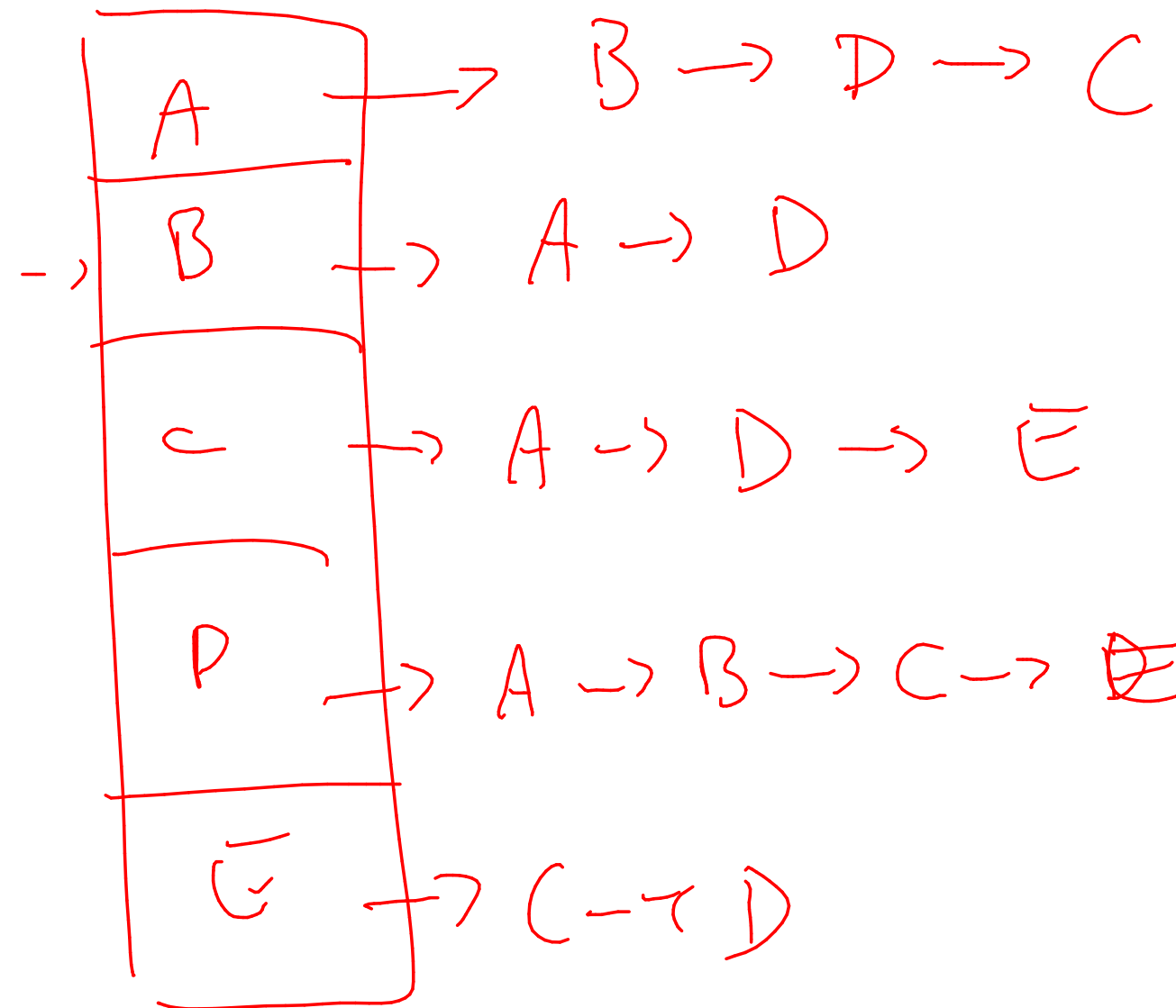
$$E = \{ (A,B), (A,D), (B,C), (B,E), (C,E), (D,E), (B,A), (D,A), \dots \}$$

representation

$$G = (V, E)$$



adjacency list



space: $|V| + |E|$

time list neighbors: $\text{degree}(u)$

time check ~~an~~ edge:

↳ $\text{degree}(A)$

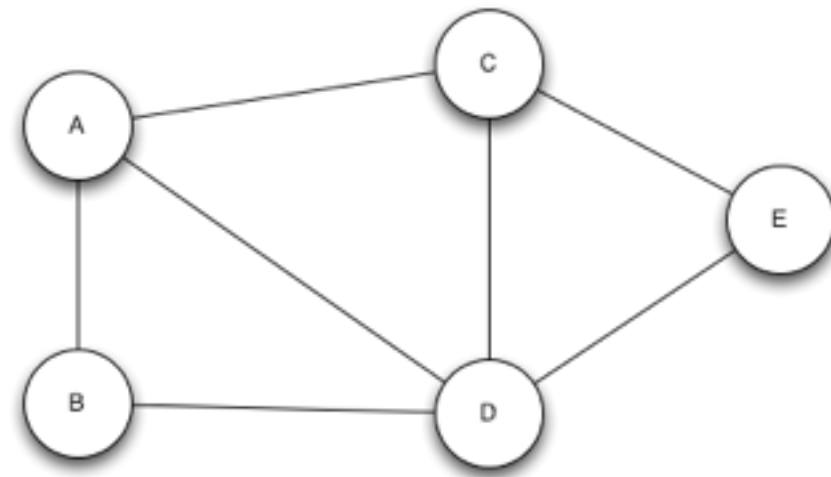
$(A, E) \text{ ?? } \in E \text{ ??}$

u

representation

$$G = (V, E)$$

adjacency matrix



space: V^2
time list neighbors: V
time check an edge: $O(1)$

→

	A	B	C	D	E
A		1	1	1	
B	1			1	
C	1			1	1
D	1	1	1		1
E			1		1

definition: path

- › a sequence of nodes $\underline{v_1}, v_2, \dots, v_k$
with the property that $(\underline{v_i}, \underline{v_{i+1}}) \in E$ for all $i=1, \dots, k-1$

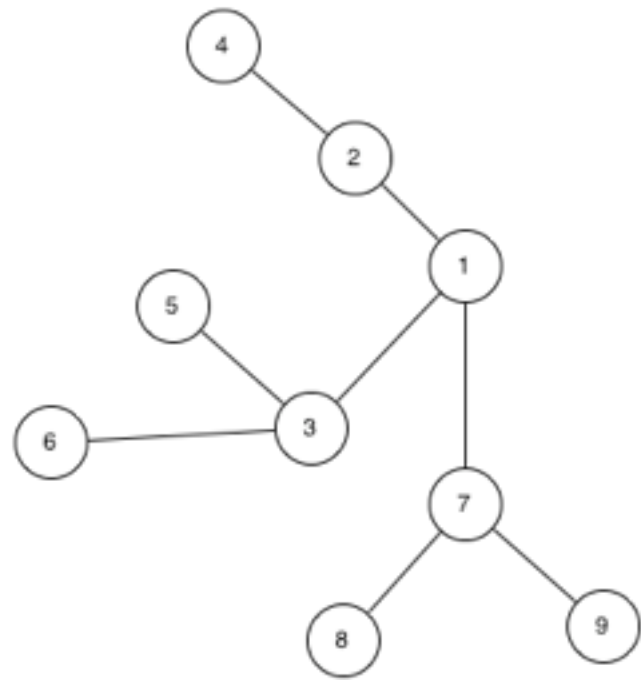
simple path: is a path in which each vertex appears at most once

cycle: is a path of length > 2 such that $v_1 = v_k$.

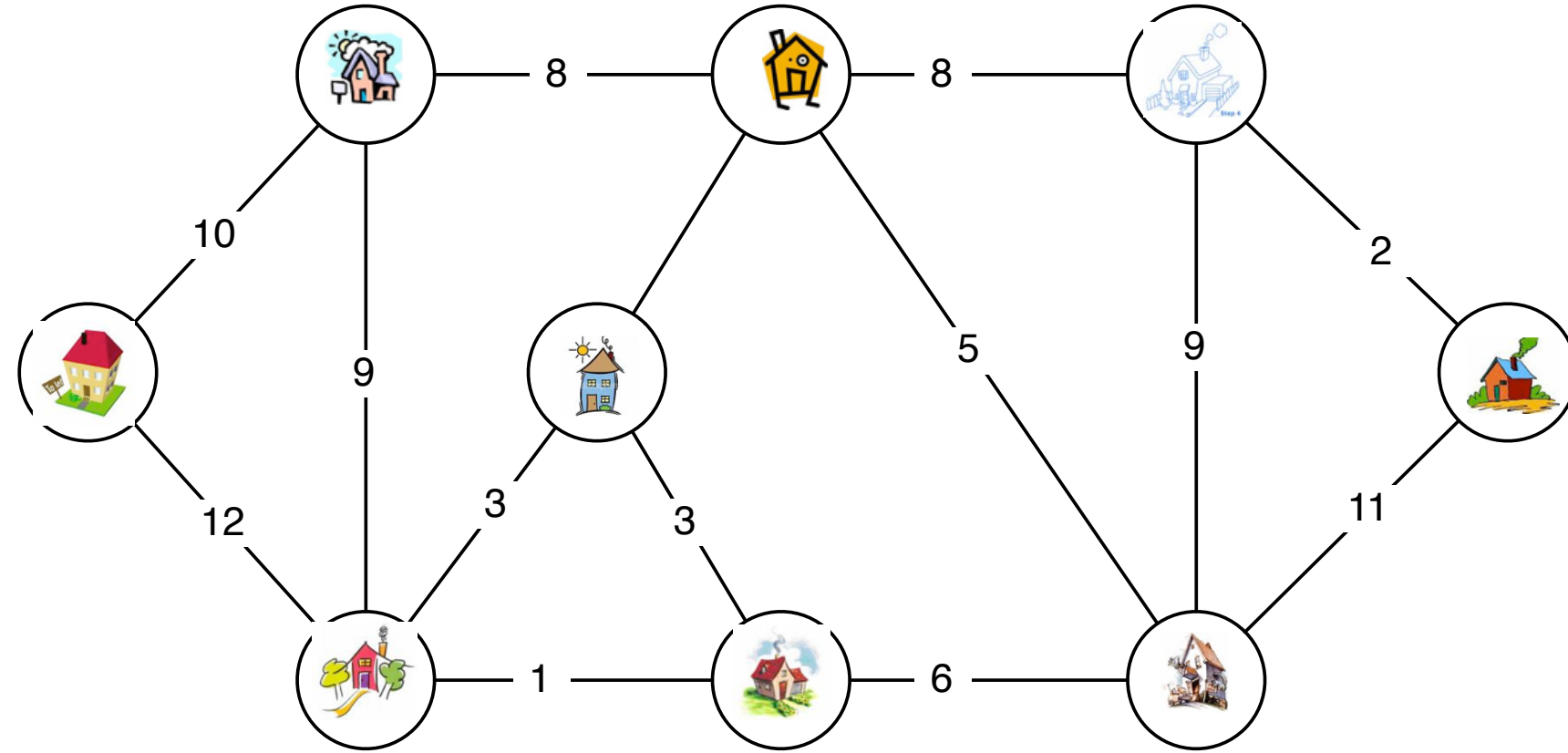
definition: tree

connected graph: is a graph $G=(V,E)$ such that for any pair $u,v \in V$, there exists a path from u to v .

a **tree** is connected graph with no cycles.



$$G = (\underline{V}, \underline{E}, \underline{w})$$



connects all V

we want: a tree that spans G , and
has minimal cost.

minimum spanning tree

looking for a set of edges that $T \subseteq E$

(a) connects all vertices

(b) has the least cost $\min \sum_{(u,v) \in T} w(u,v)$

minimum spanning tree

looking for a set of edges that $T \subseteq E$

(a) connects all vertices

(b) has the least cost $\min \sum_{(u,v) \in T} w(u,v)$

* how many edges does solution have? $V-1$ edges.

* does solution have a cycle? No

strategy

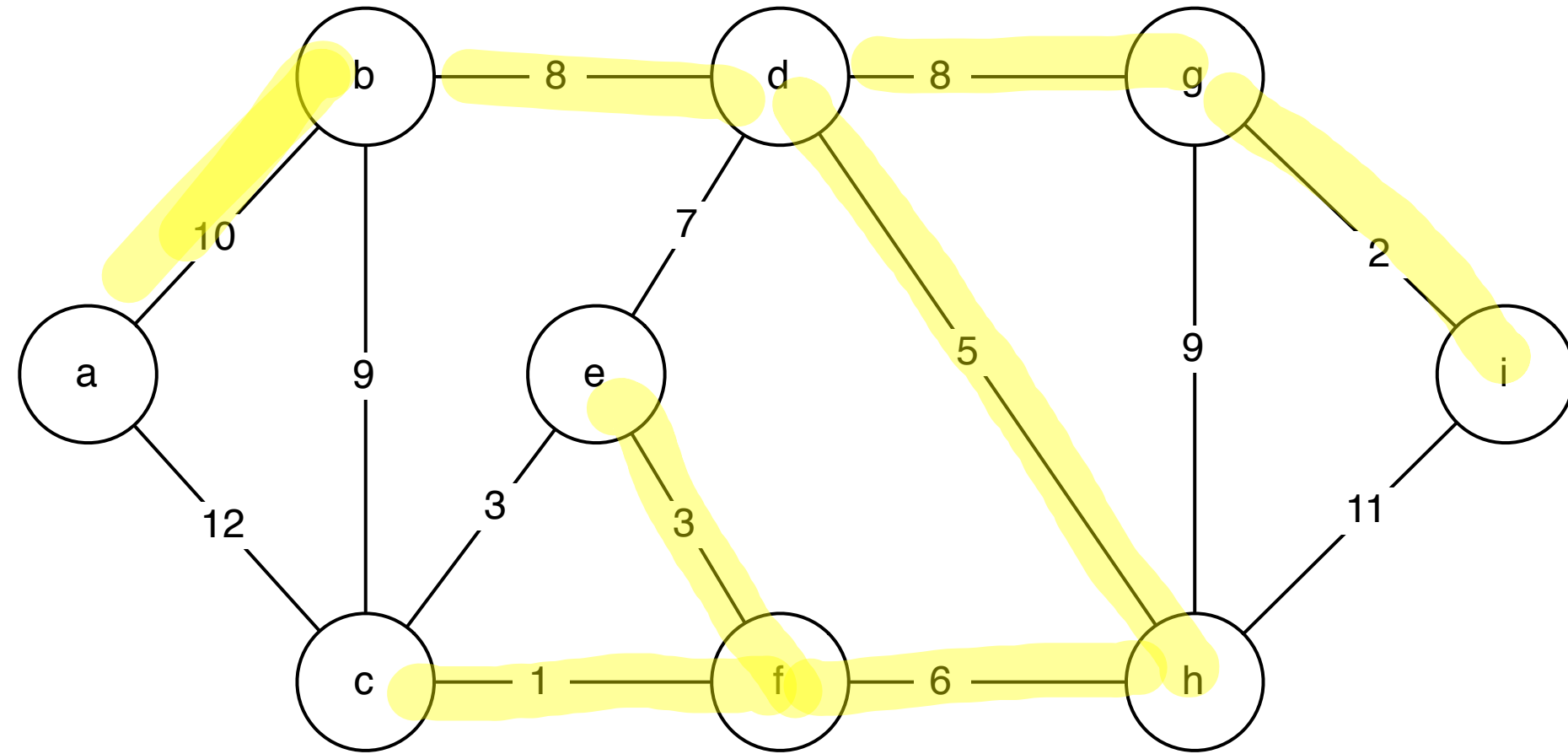
start with an empty set of edges A

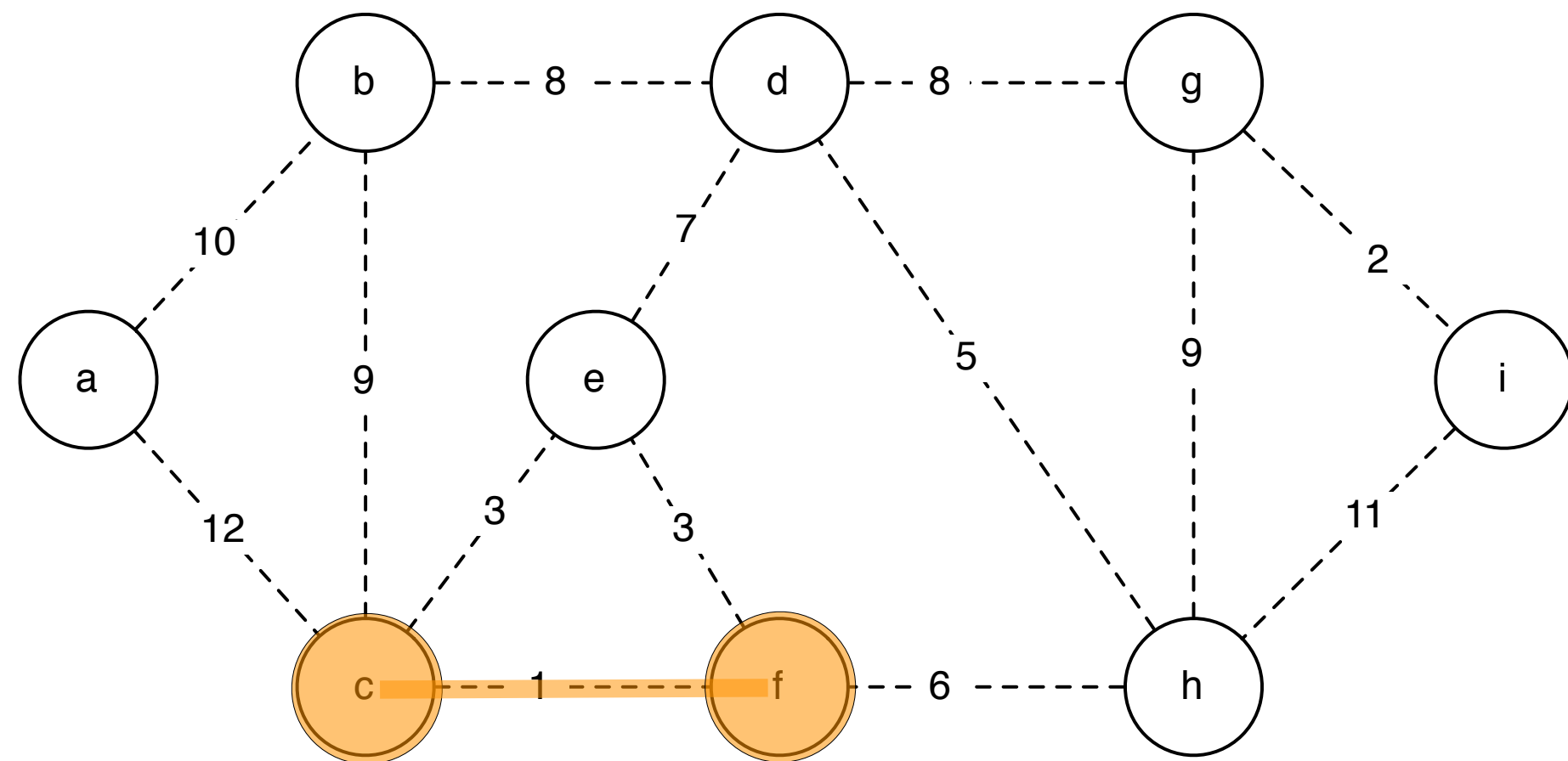
repeat for v-1 times:

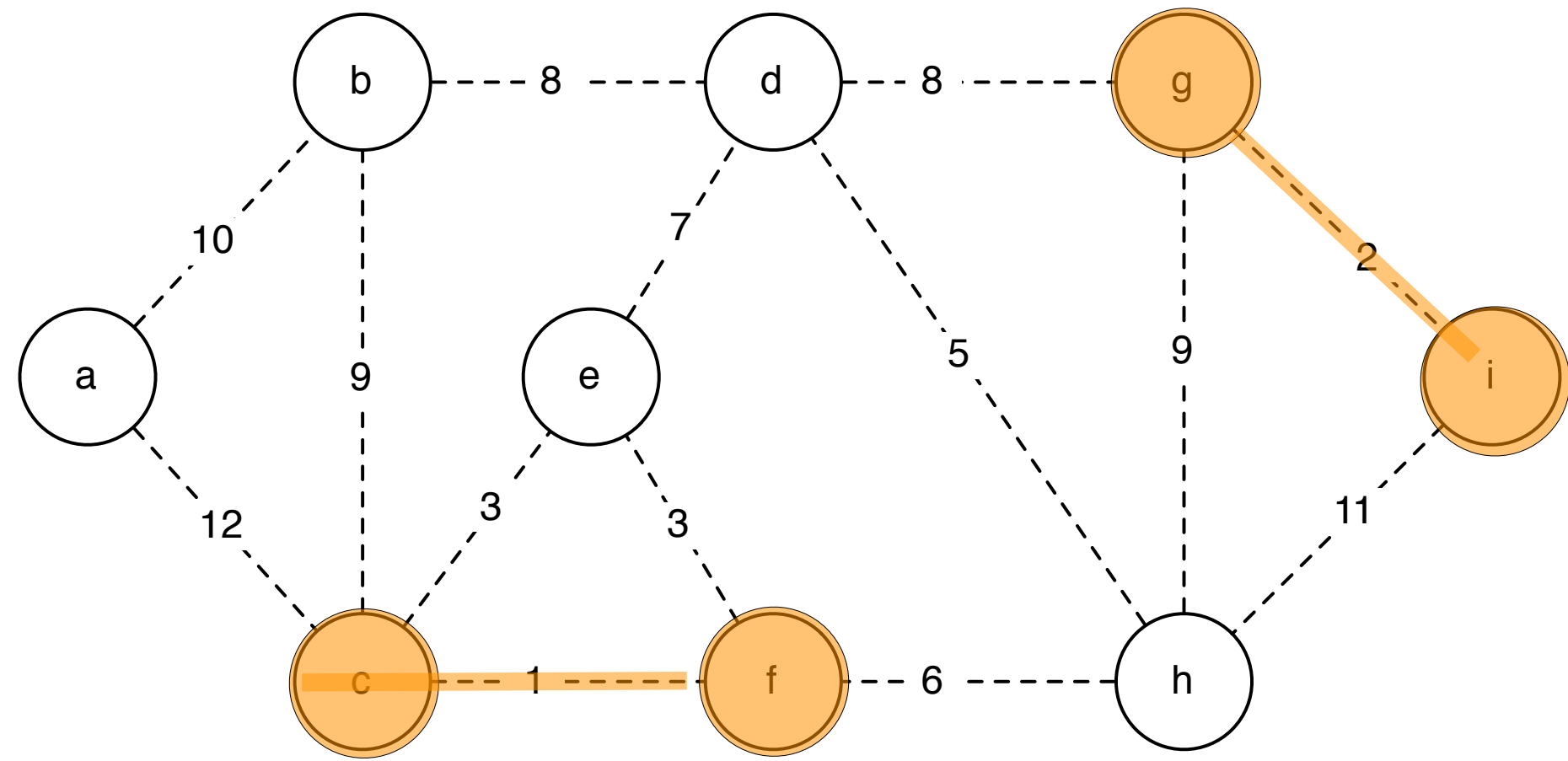
add lightest edge that does not create a cycle

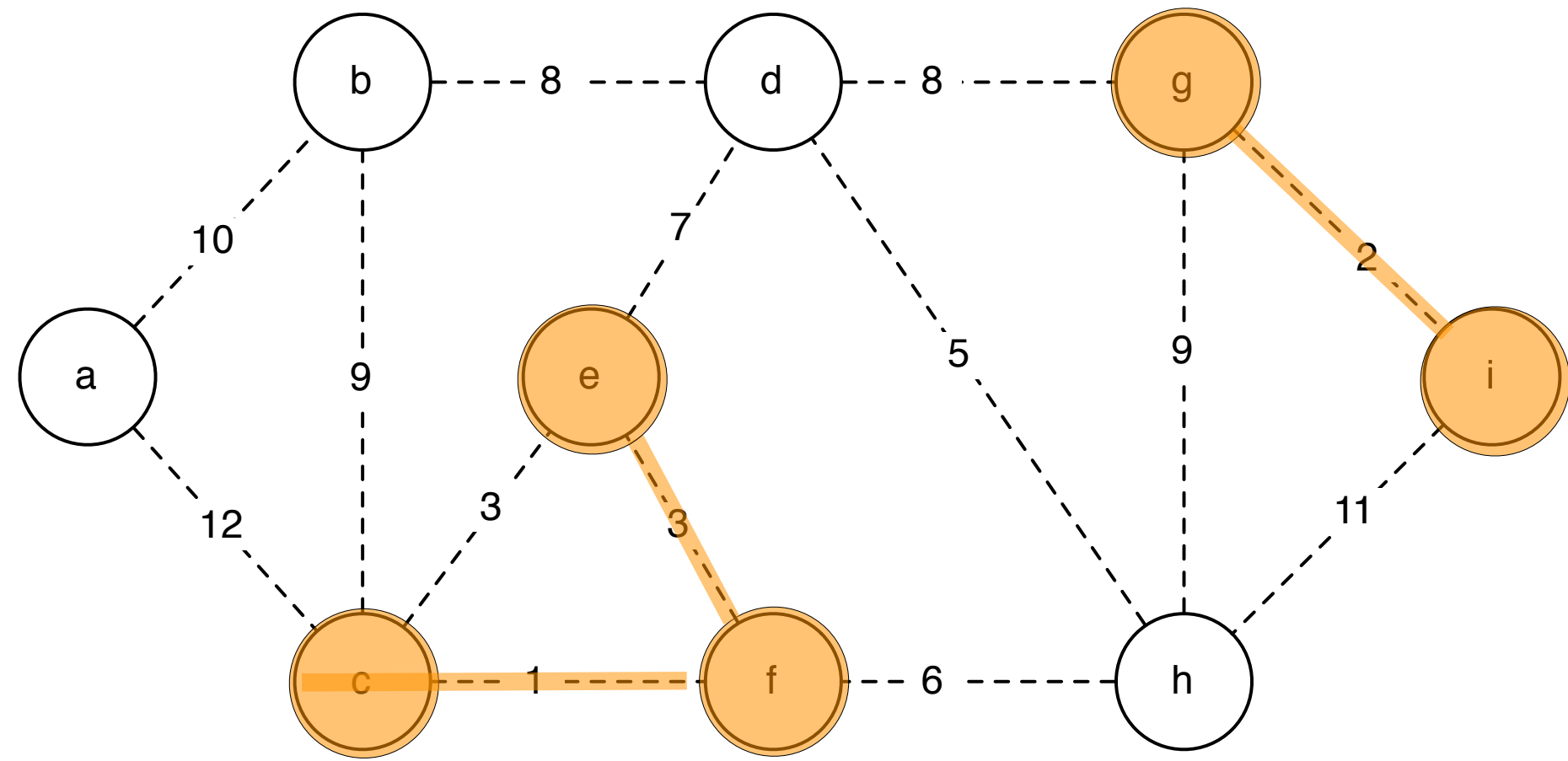
example

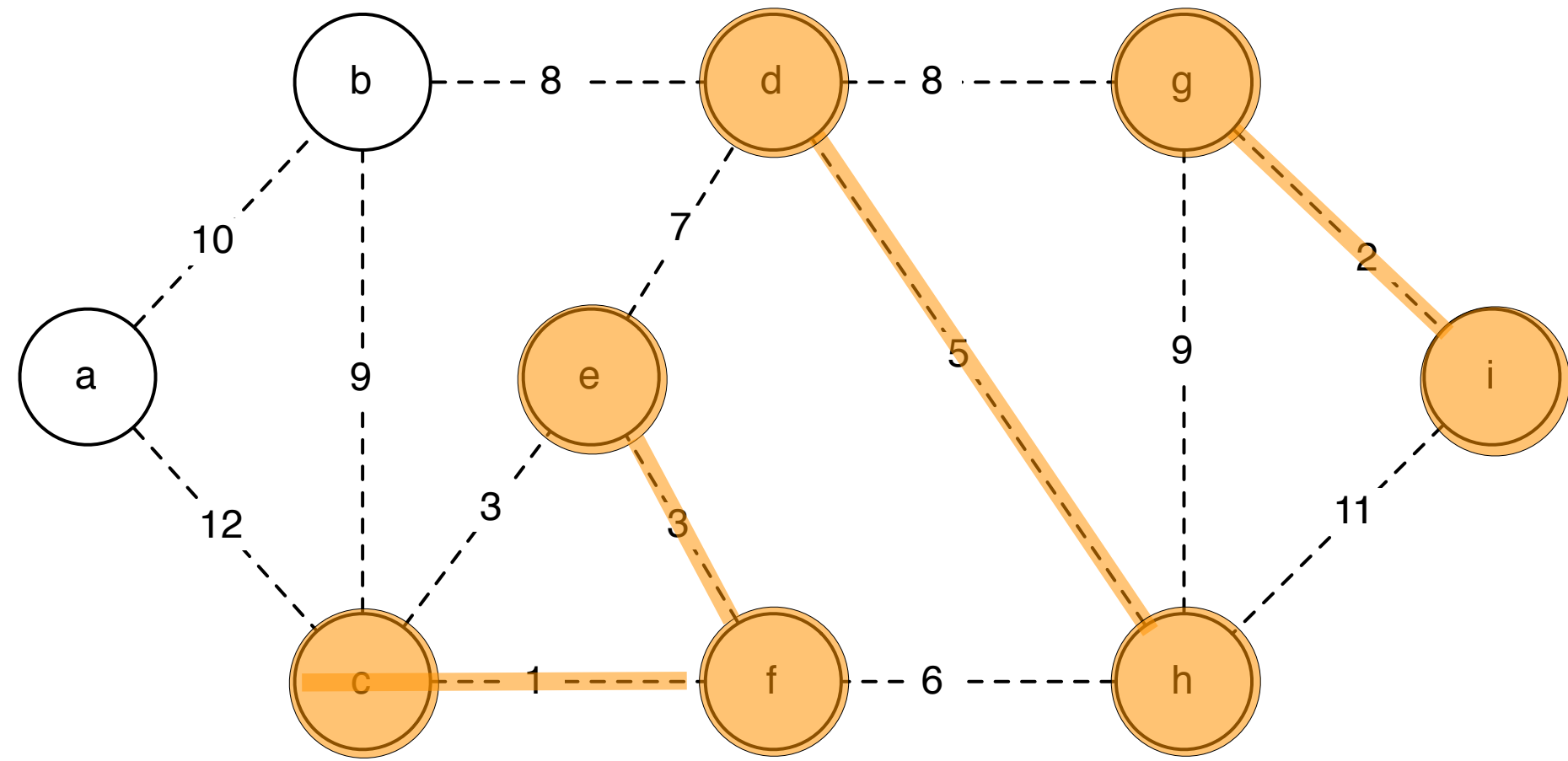
$$A = \emptyset$$

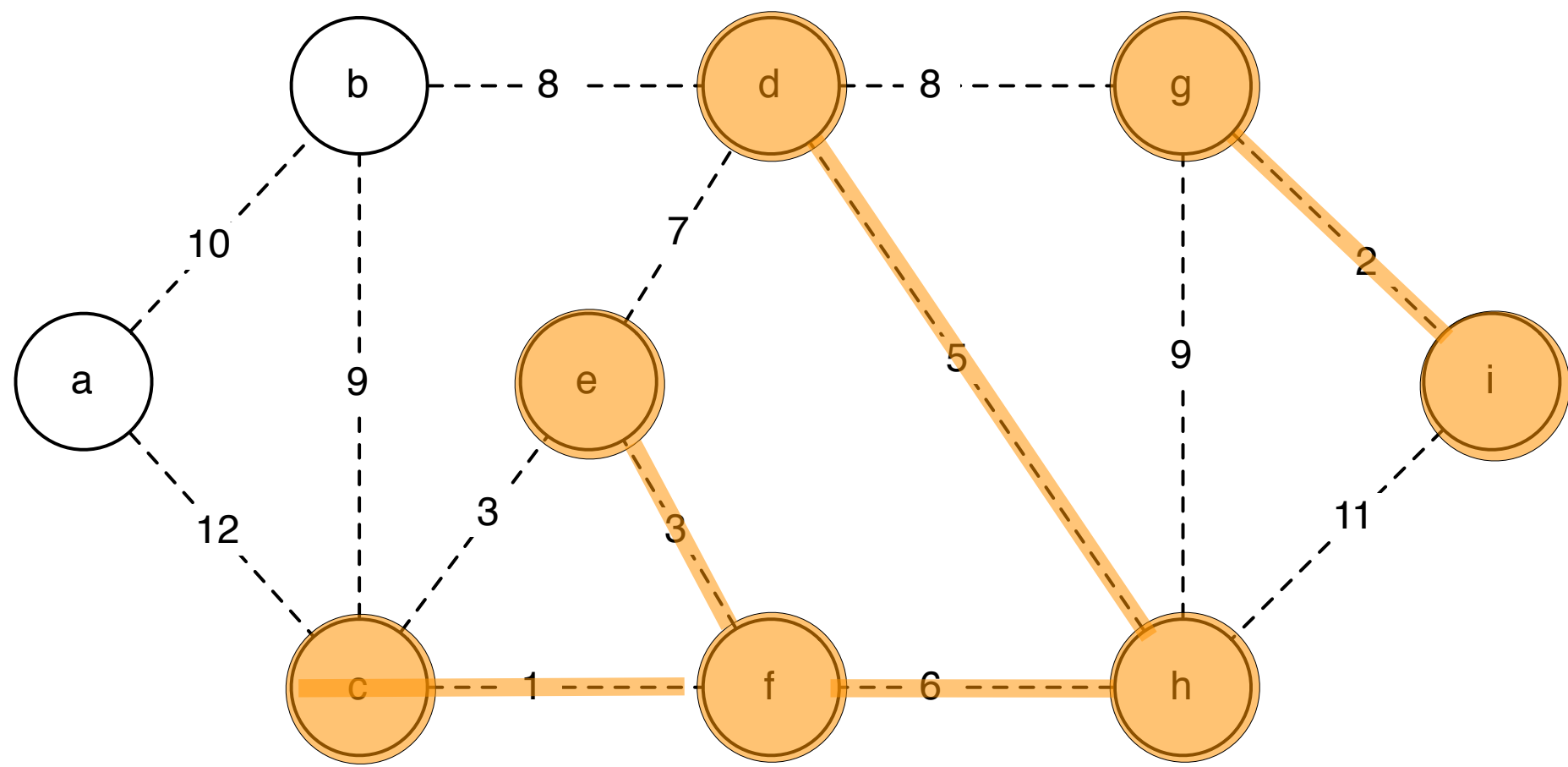


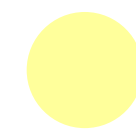
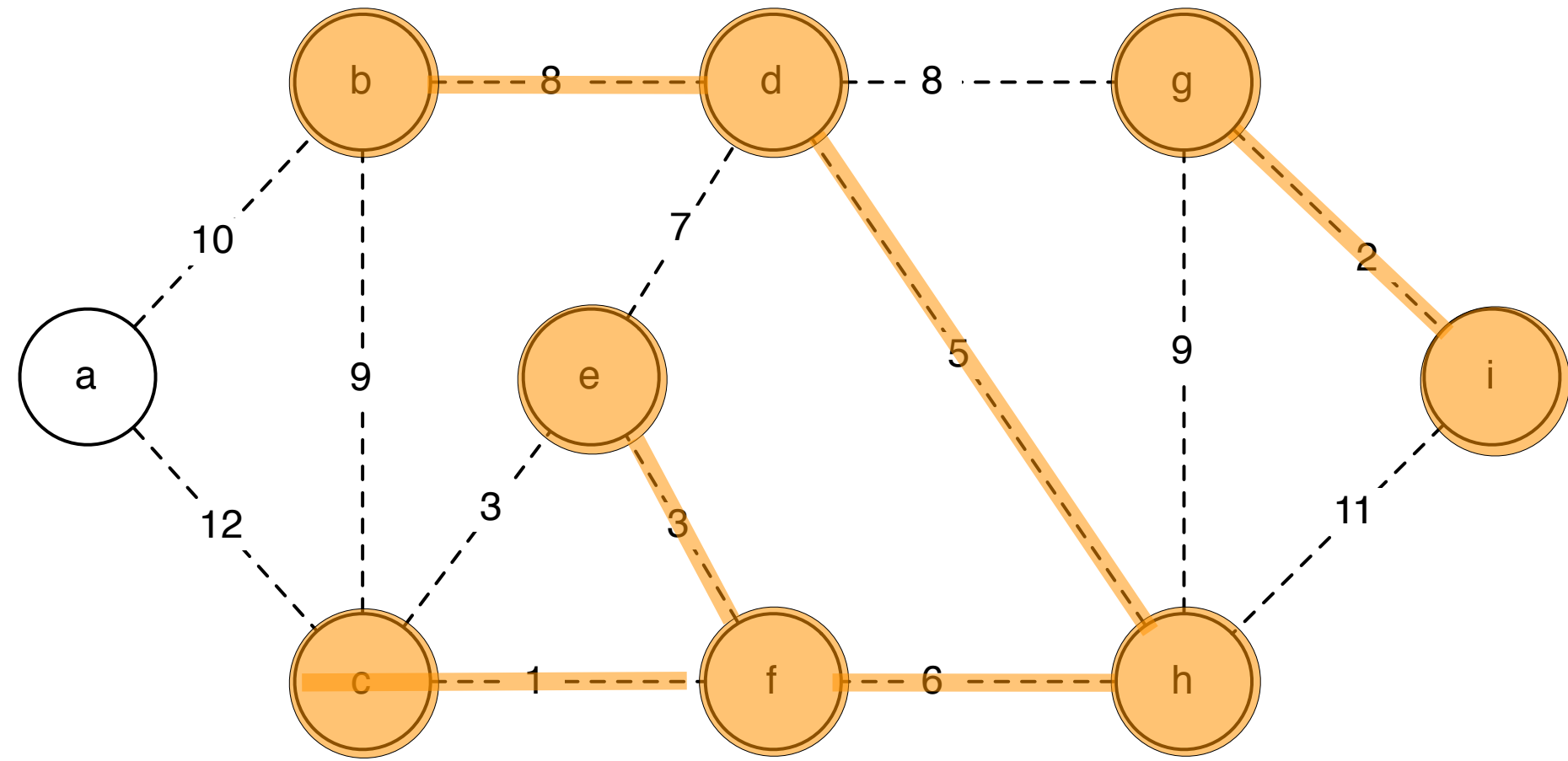


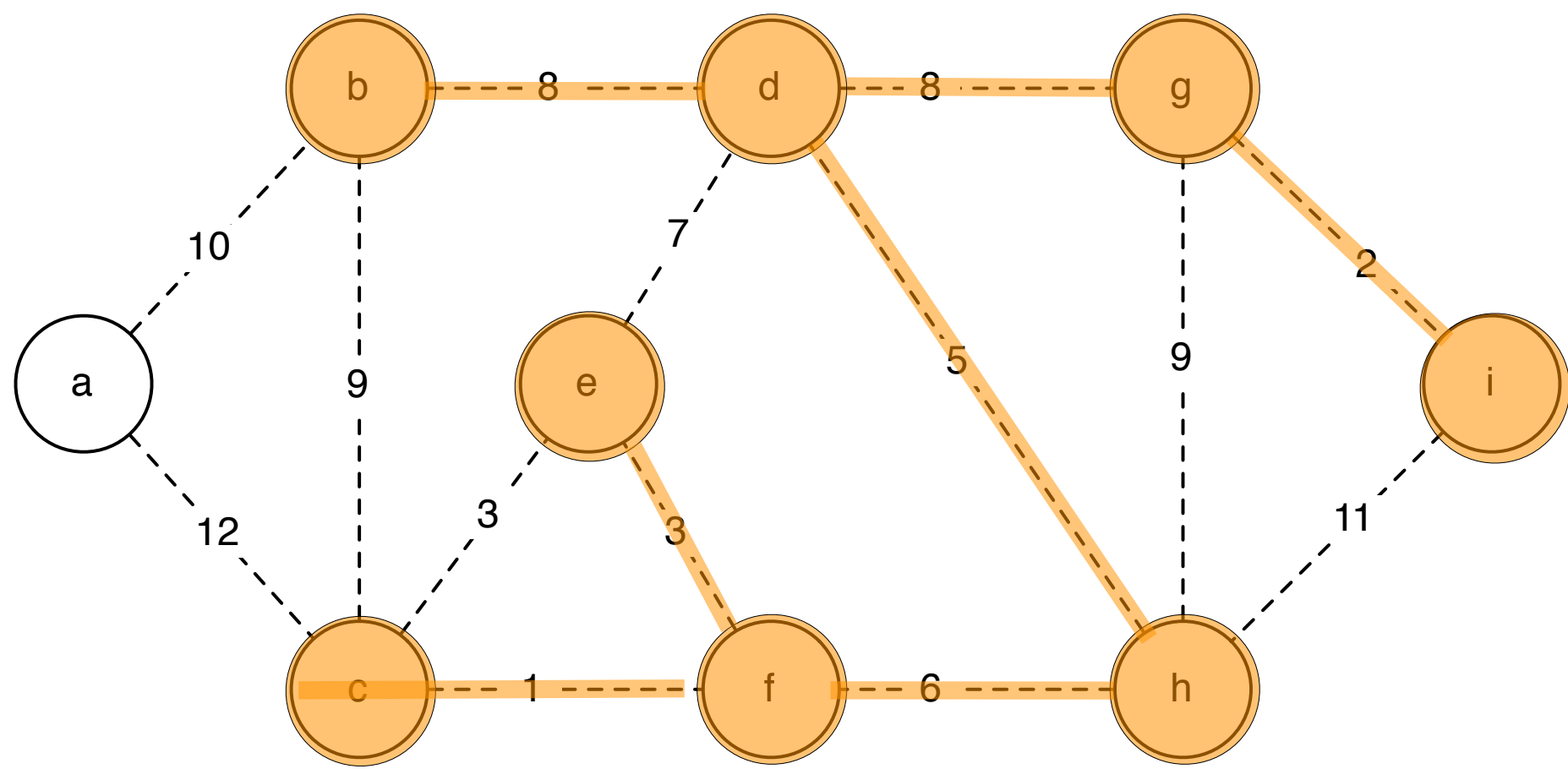


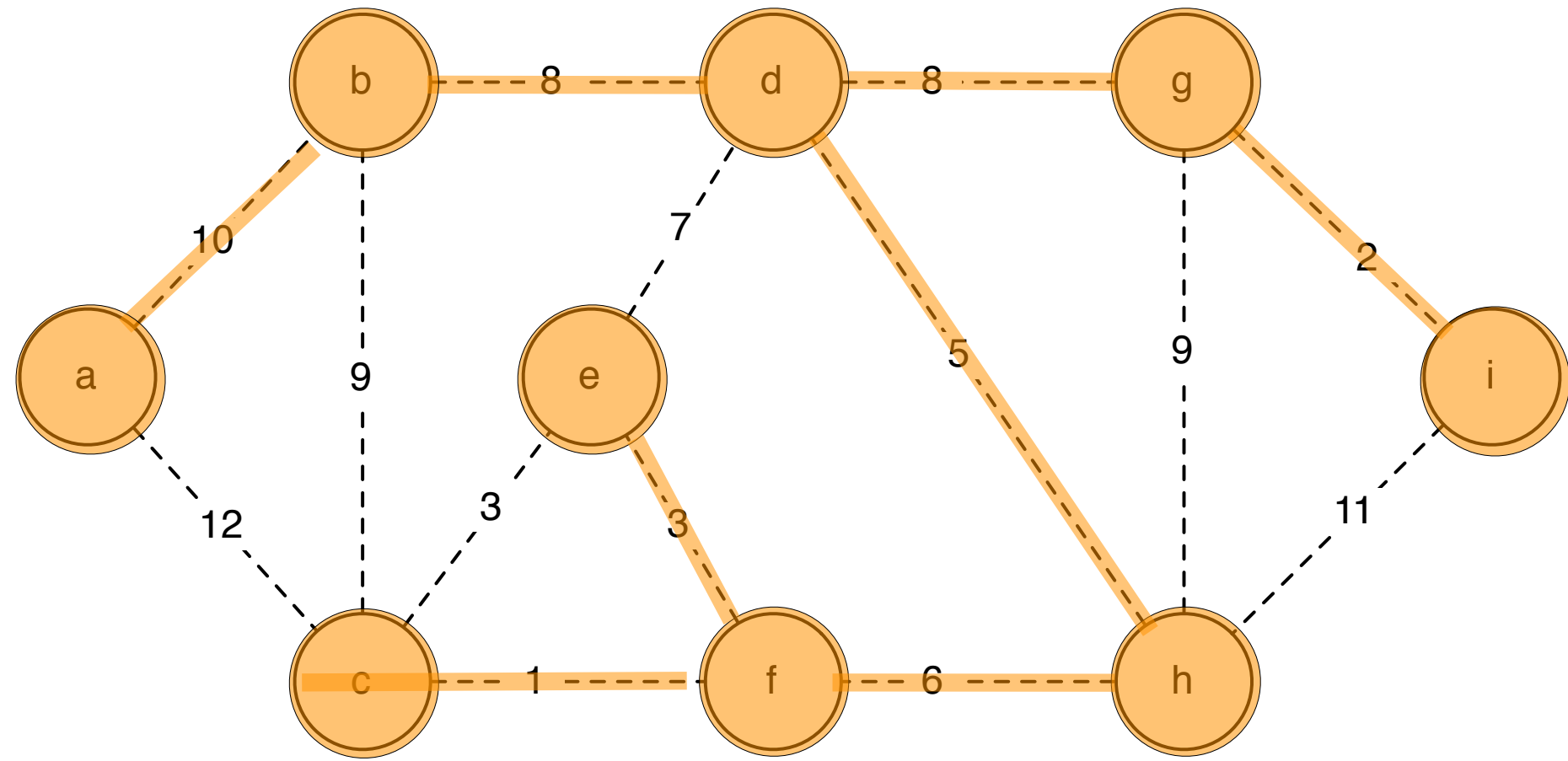




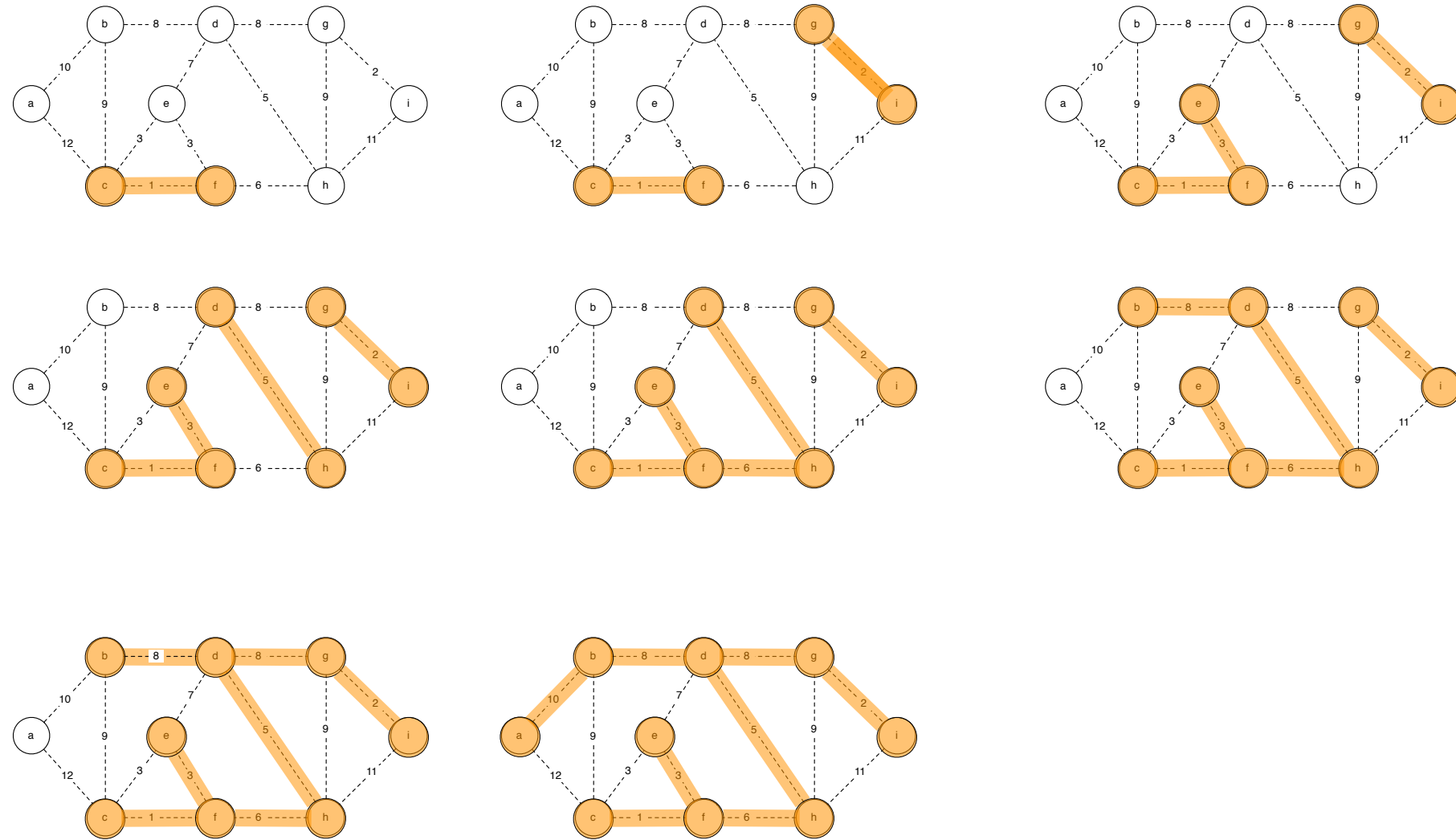








Kruskal's algorithm



why does this work?

1 $T \leftarrow \emptyset$

2 **repeat** $V - 1$ times:

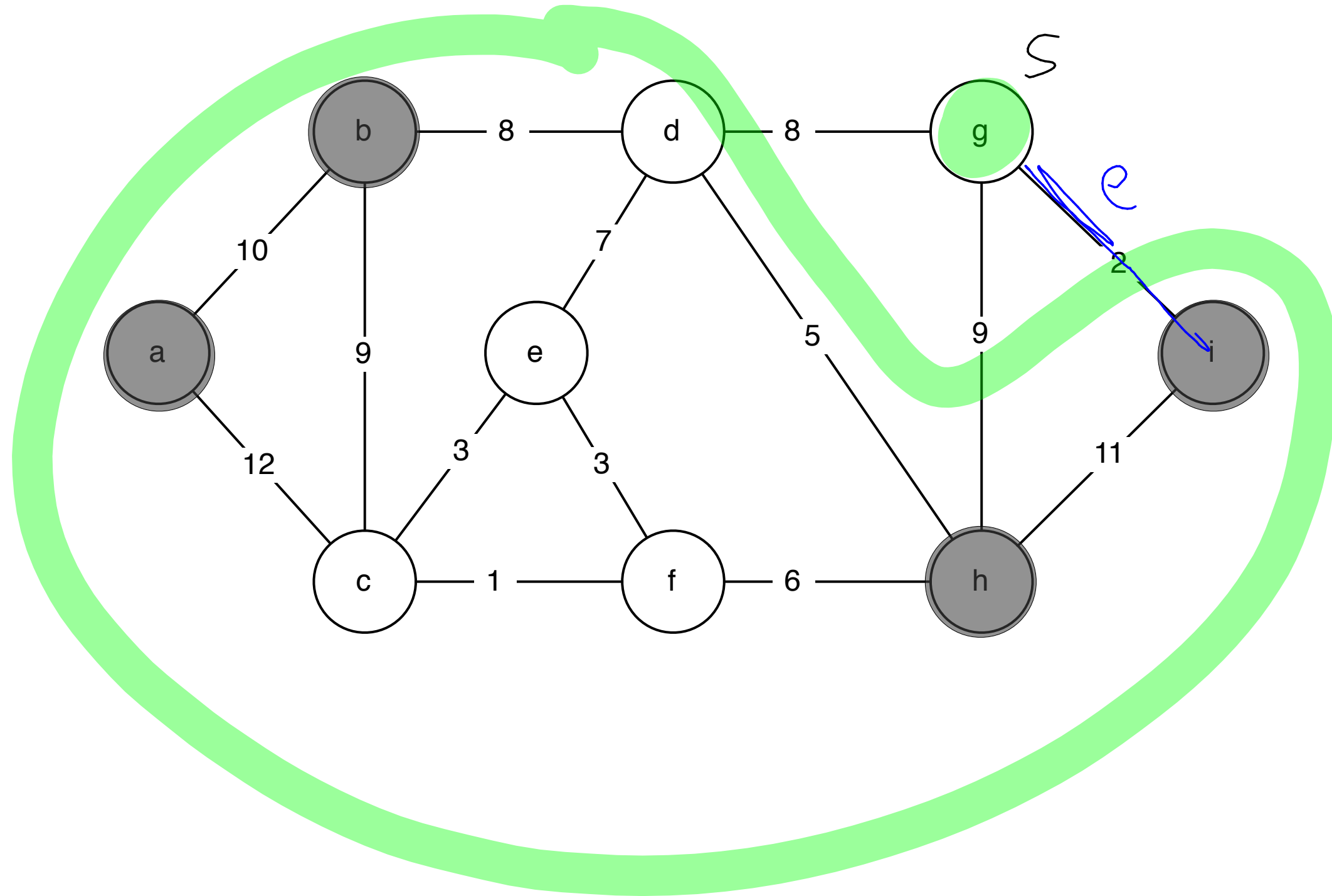
3 add to T the lightest edge $e \in E$ that does not create a cycle

definition: cut

Cut: a cut of $G=(V, E)$ is a partition of V
into 2 sets $(S, V-S)$.

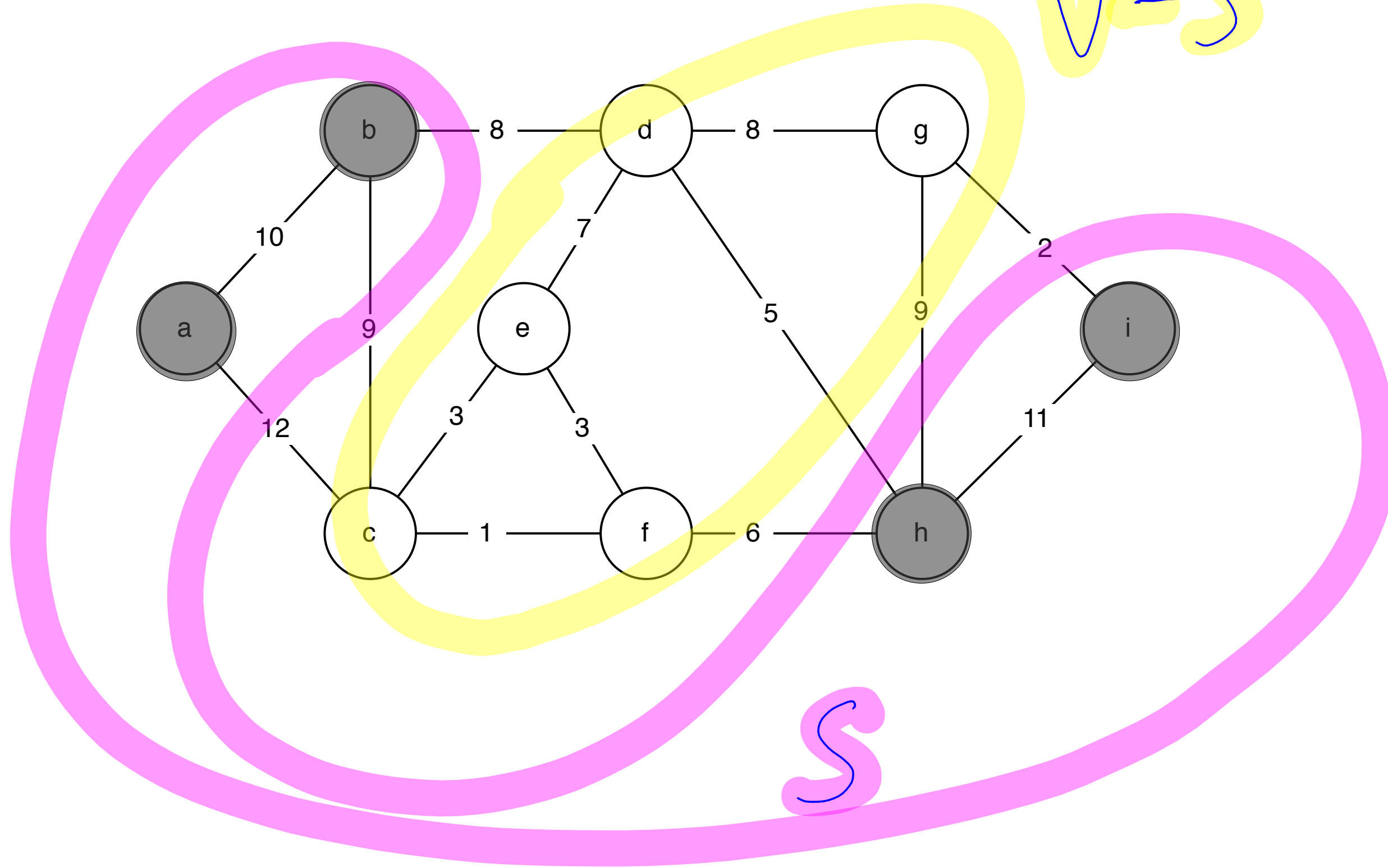
example of a cut

$$A = \emptyset$$



example of a cut

$V-S$



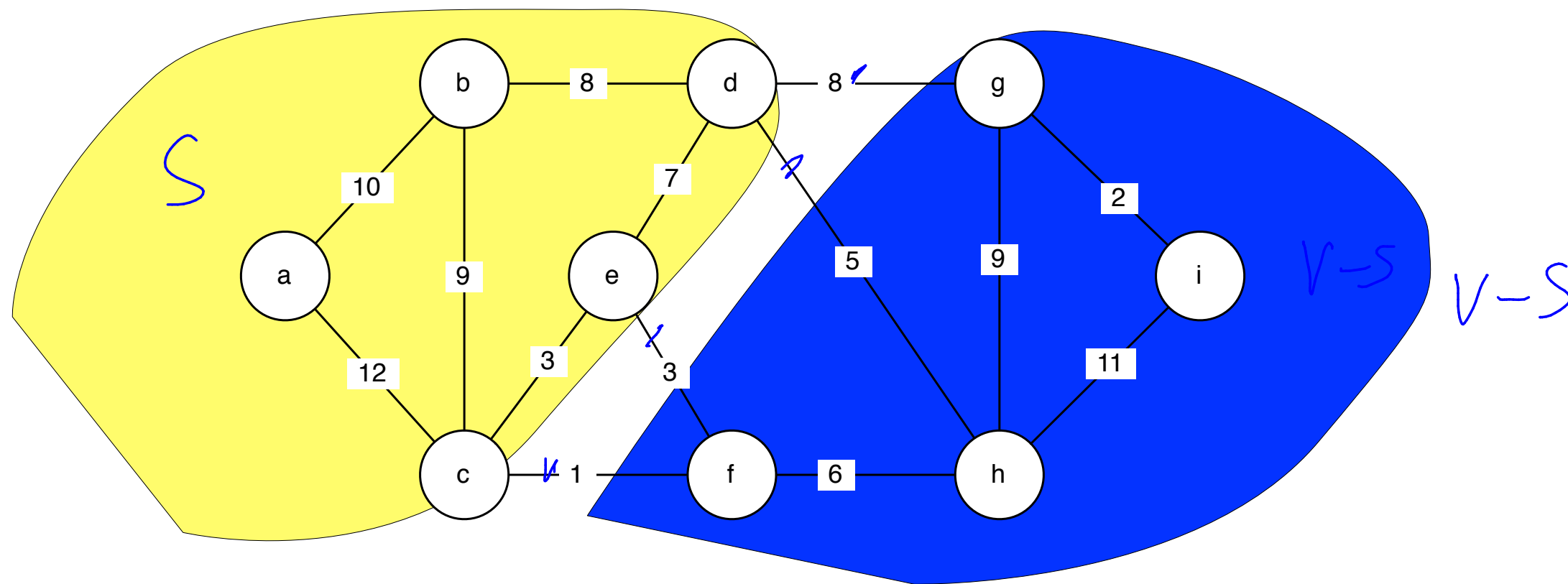
definition: crossing a cut

An edge $e = (u, v)$ crosses a cut $(S, V - S)$ if
 $u \in S$ and $v \in V - S$.

definition: crossing a cut

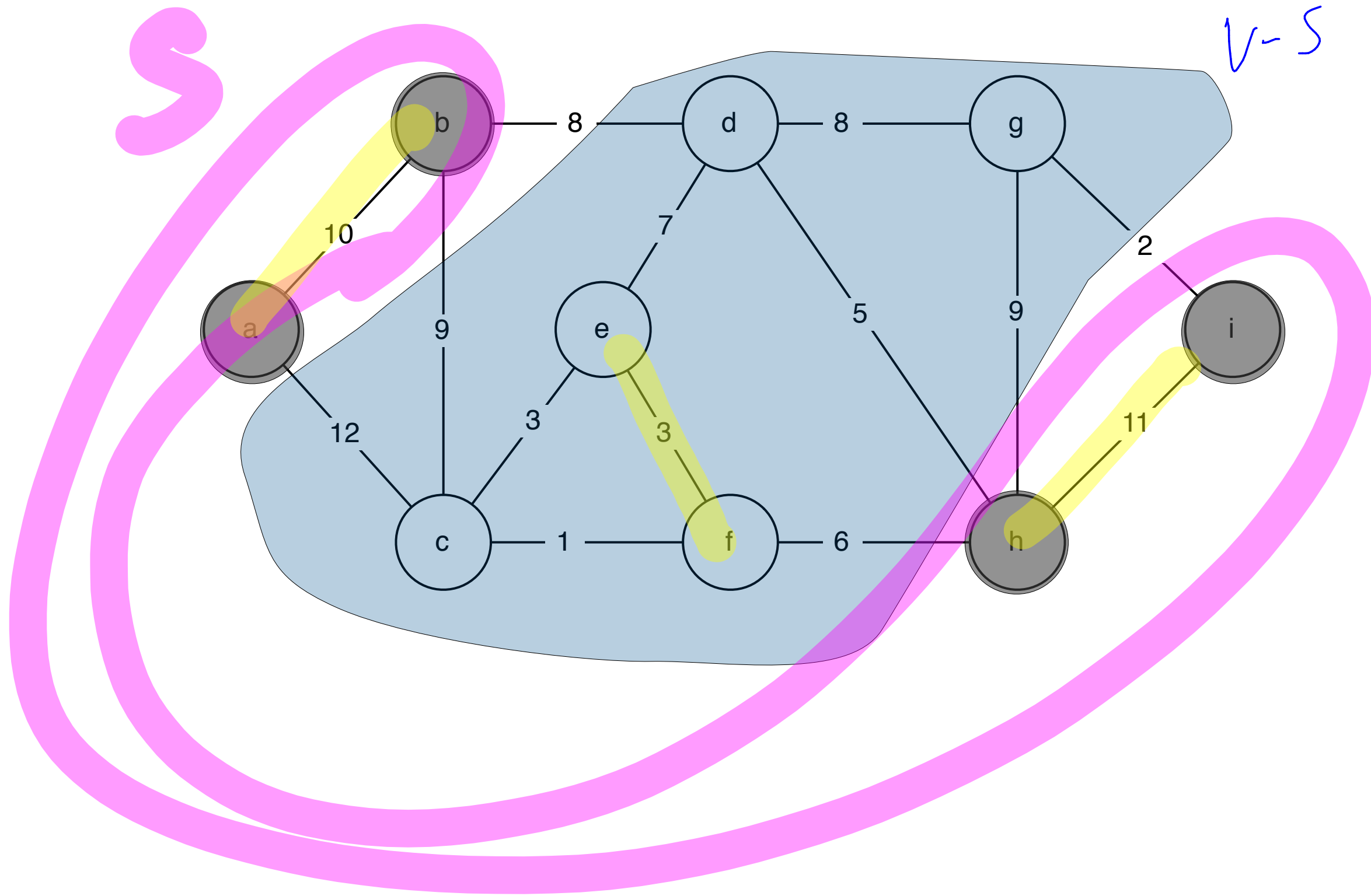
an edge $e = (u, v)$ **crosses** a graph cut $(S, V-S)$ if

$$u \in S \quad v \in V - S$$



$e = (d, g)$ crosses
 $(S, V-S)$

example of a crossing



$A = \left\{ \begin{array}{l} (e, f) \\ (a, b) \\ (h, i) \end{array} \right\}$

definition: respect

Respect: A set A respects the cut $(S, V-S)$
if no edge $e \in A$ crosses $(S, V-S)$.

Cut theorem

Let A be a subset of edges of some MST T .

Let $(S, V-S)$ be a cut that A respects and

let e be the lightest edge that crosses $(S, V-S)$.

\Rightarrow Then $A \cup \{e\}$ is a subset of some MST.

Cut theorem

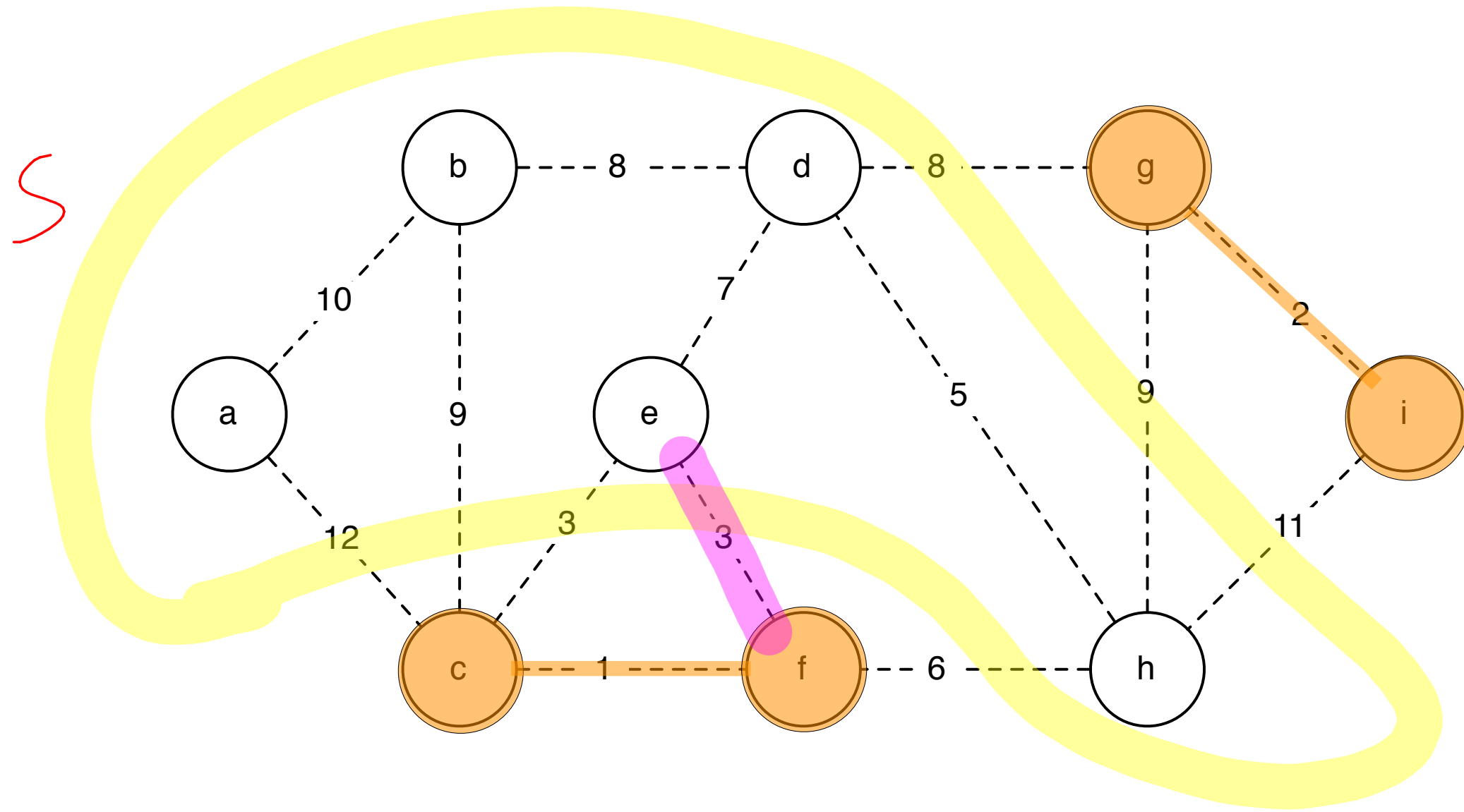
Suppose the set of edges A is part of an m.s.t.

Let $(S, V - S)$ be any cut that respects A .

Let edge e be the min-weight edge across $(S, V - S)$

Then: $A \cup \{e\}$ is part of an m.s.t.

example of theorem



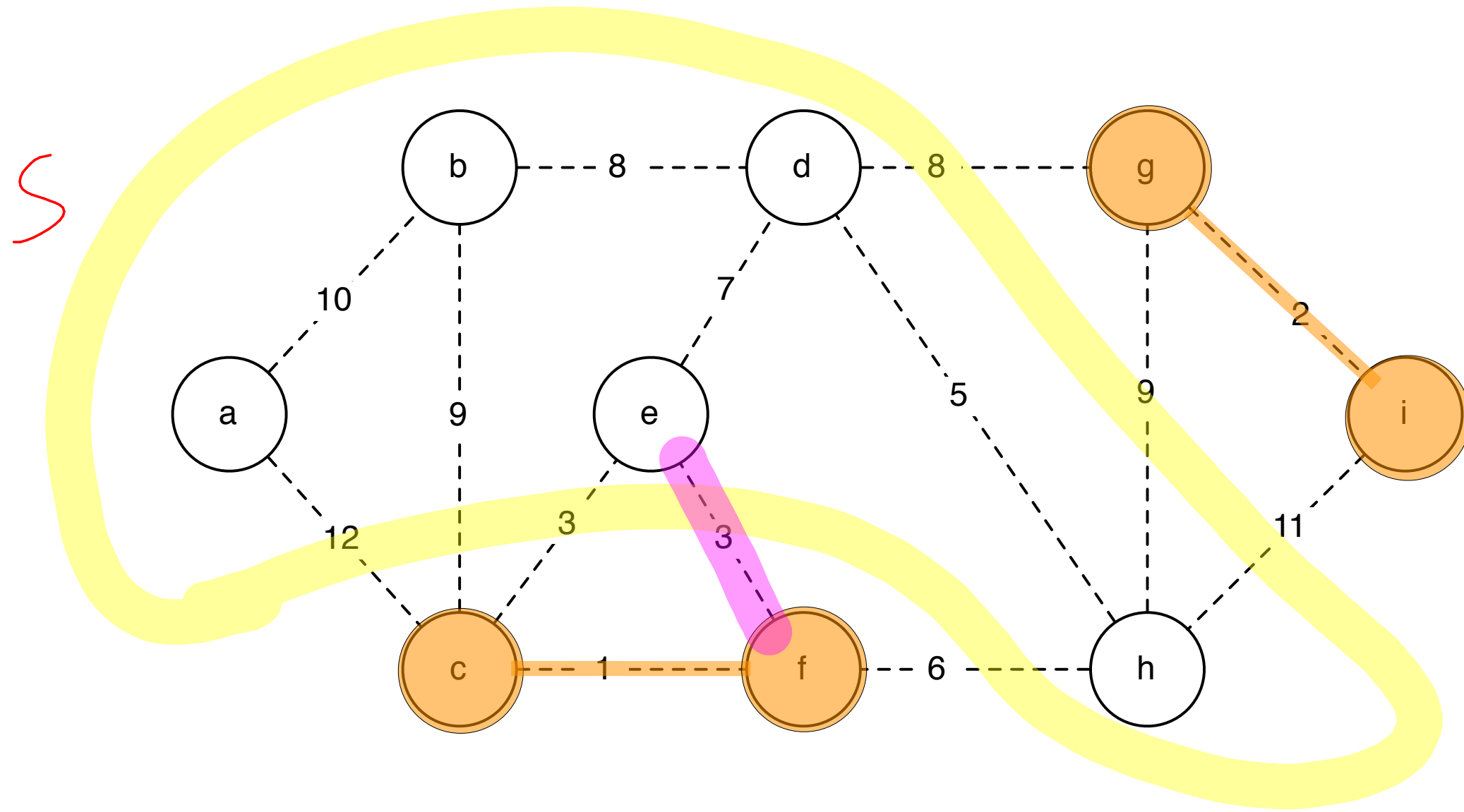
A is the set of orange
links (edges)

→ A respects S.

→ e is the lightest
edge that crosses
S.

⇒ $A \cup \{e\}$ is part of
some MST.

example of theorem

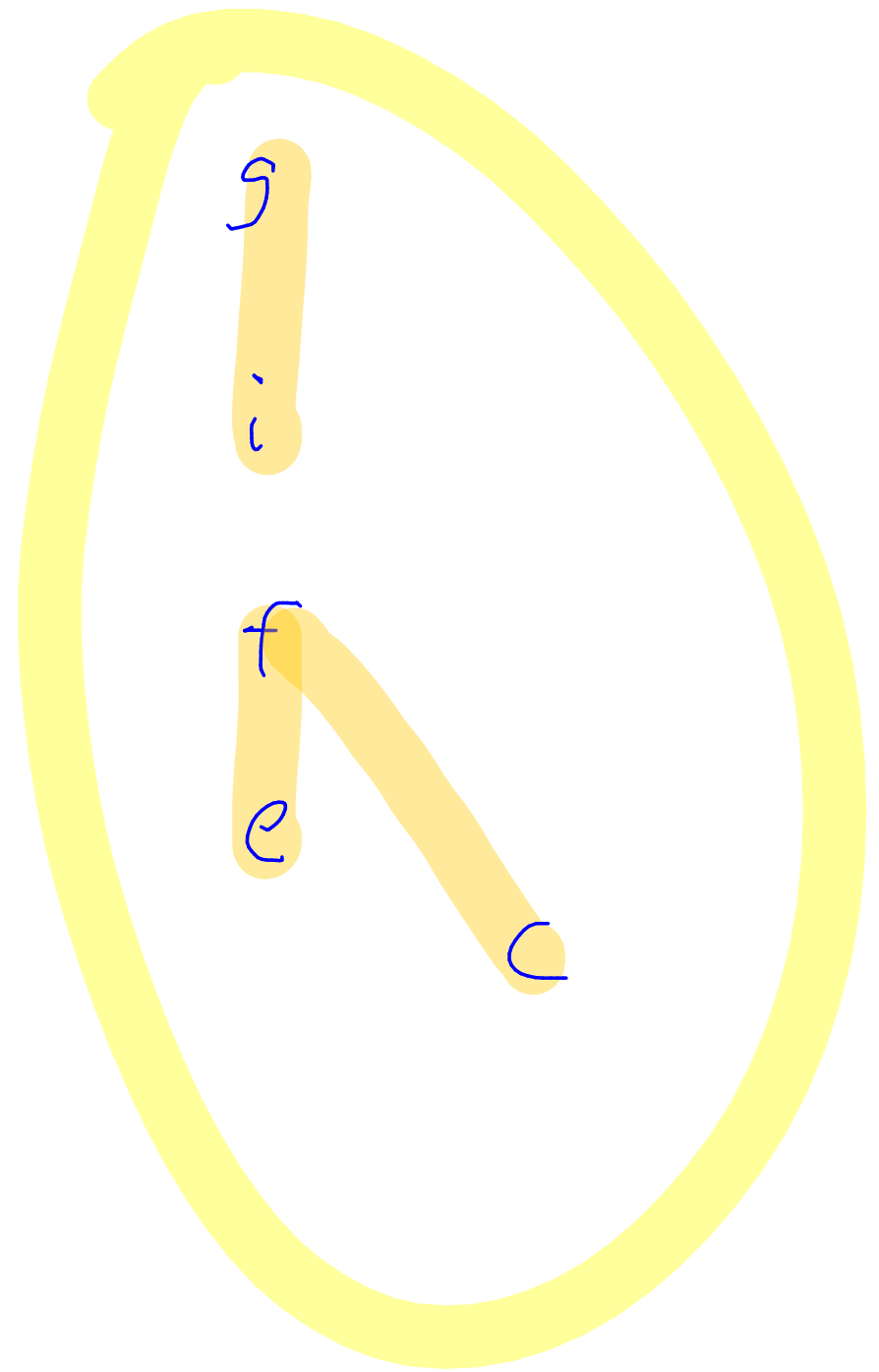
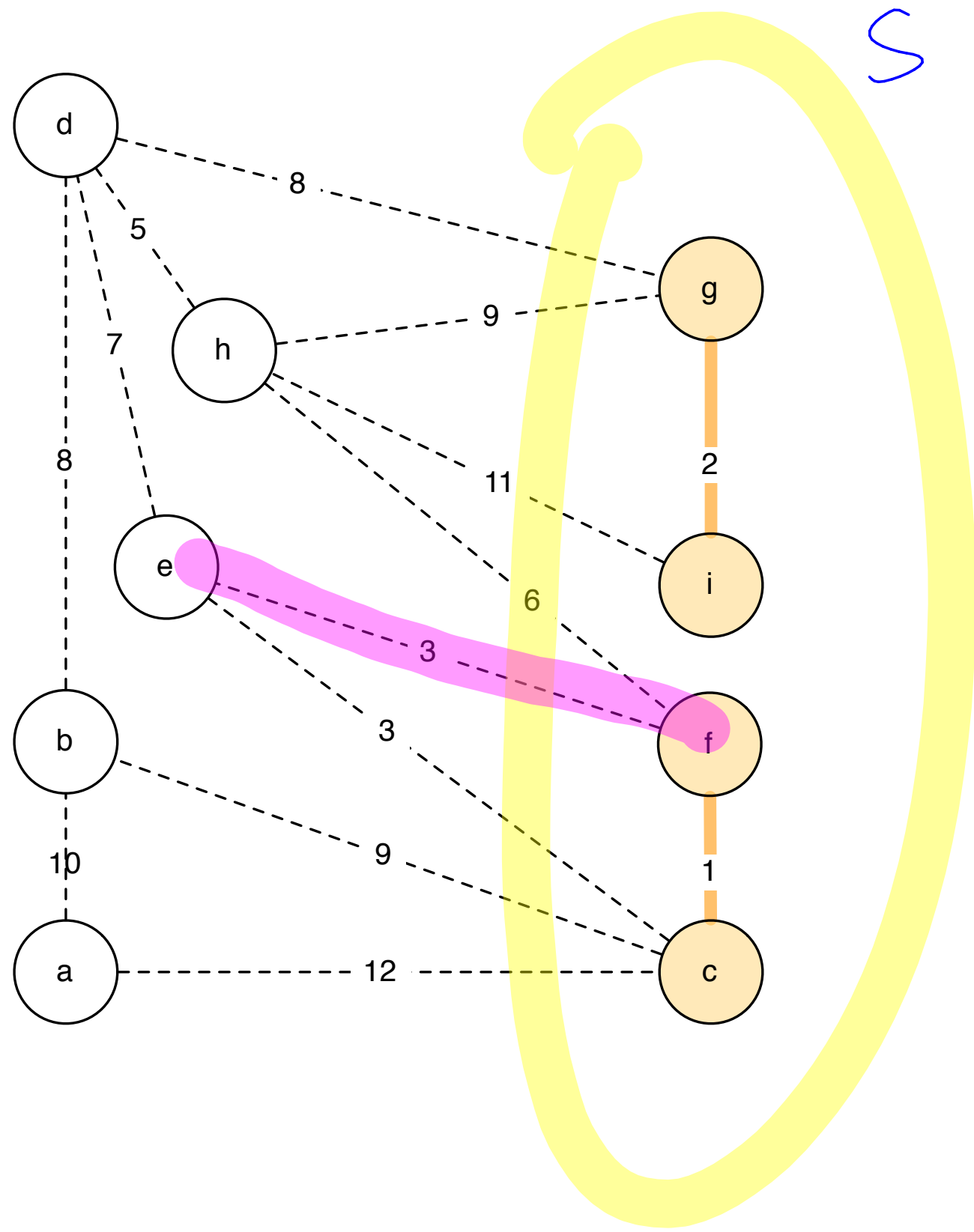


A is the set of orange
links (edges)

→ A respects S.

→ e is the lightest
edge that crosses
S.

⇒ $A \cup \{e\}$ is part of
some MST.



proof of cut theorem

Theorem 2 Suppose the set of edges A is part of a minimum spanning tree T of $G = (V, E)$. Let $(S, V - S)$ be any cut that respects A and let e be the edge with the minimum weight that crosses $(S, V - S)$. Then the set $A \cup \{e\}$ is part of a minimum spanning tree.

Proof: if $A \cup \{e\}$ is already part of T , then the thm holds already.

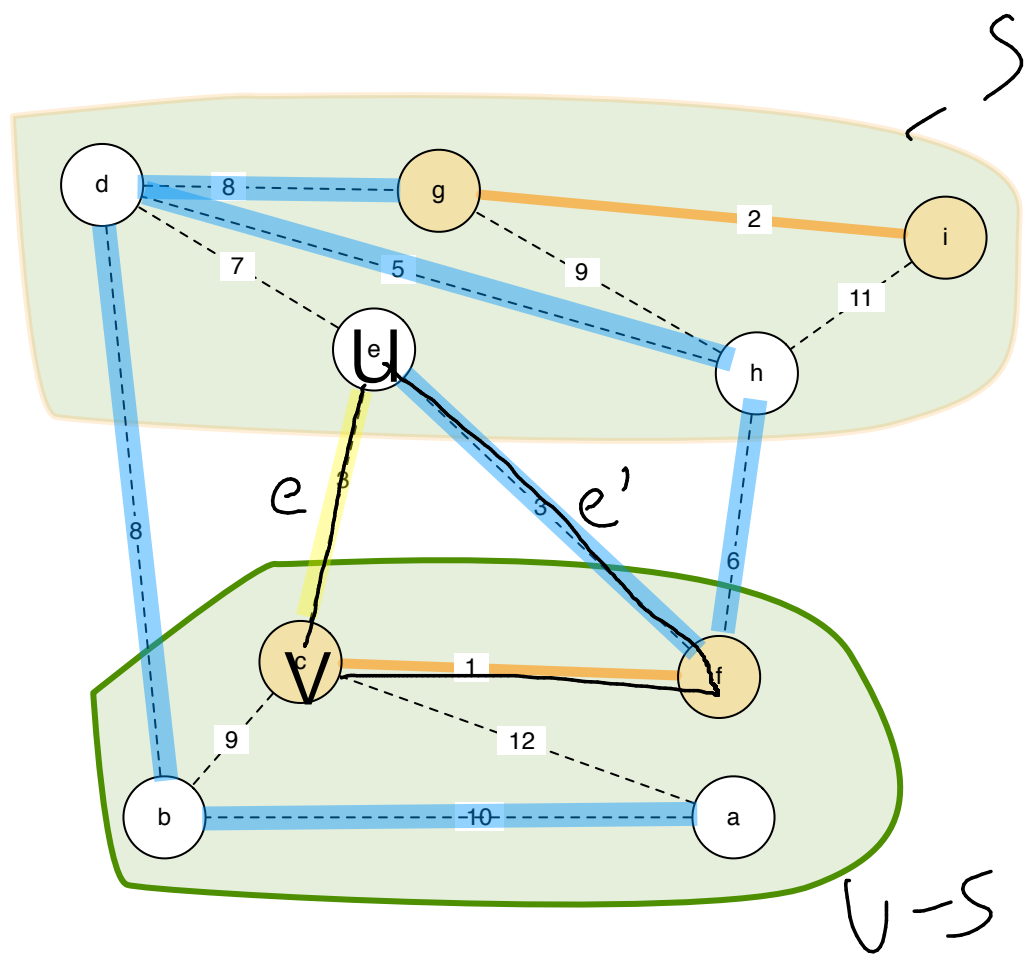
Otherwise, we will construct a T' for which $A \cup \{e\} \subseteq T'$.

Let $e = (u, v)$. Add e to T . Since T was already an MST, T must contain some path from v to u . Let e' be the first edge on this path that crosses $(S, V - S)$.

e' must exist b/c. Define $T' = T \cup \{e\} - \{e'\}$.

proof of cut thm

Blue edges are T . $A = \text{orange}$.



$$wt(T') = wt(T) - \underline{wt(e')} + wt(e)$$

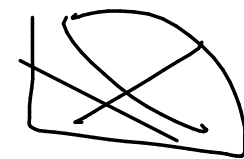
Since e was the lightest edge that crosses $(S, V-S)$,

$$wt(e) \leq wt(e')$$

$$\Rightarrow wt(T') \leq wt(T)$$

\Rightarrow must be equal b/c T was an MST.

$|T'| = V-1$, so T' is also an MST.



correctness

KRUSKAL

KRUSKAL-PSEUDOCODE(G)

1 $A \leftarrow \emptyset$

2 **repeat** $V - 1$ times:

3 add to A the lightest edge $e \in E$ that does not create a cycle

Proof: By induction. At Step i , $A \subseteq T$ b/c A is empty.

Suppose at iteration i of loop 2, A is part of some MST.

Since e does not create a cycle in A , there are 3 cases to consider. $e = (u, v)$.

correctness

KRUSKAL-PSEUDOCODE(G)

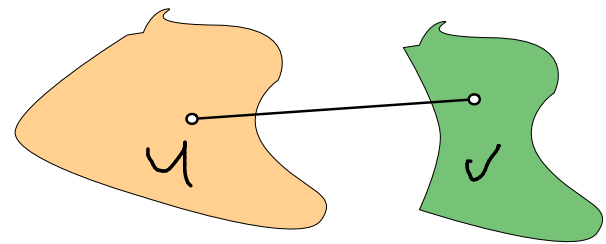
- 1 $A \leftarrow \emptyset$
- 2 **repeat** $V - 1$ times:
- 3 add to A the lightest edge $e \in E$ that does not create a cycle

Proof: by induction. in step 1, A is part of some MST.

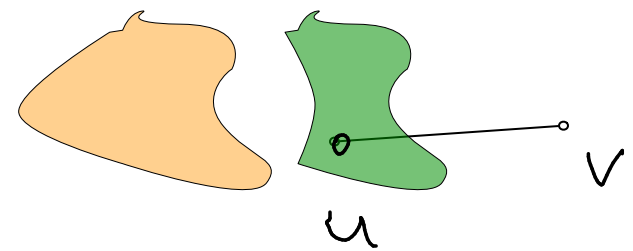
Suppose that after k steps, A is part of some MST (line 2).

In line 3, we add an edge $e=(u,v)$.

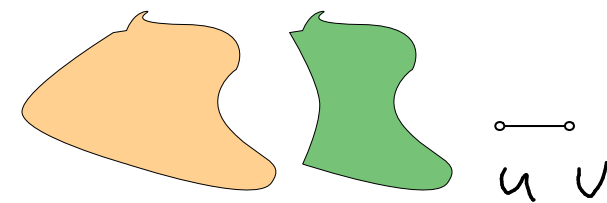
both u , and v are
in A .



one endpoint
is covered by
 A .

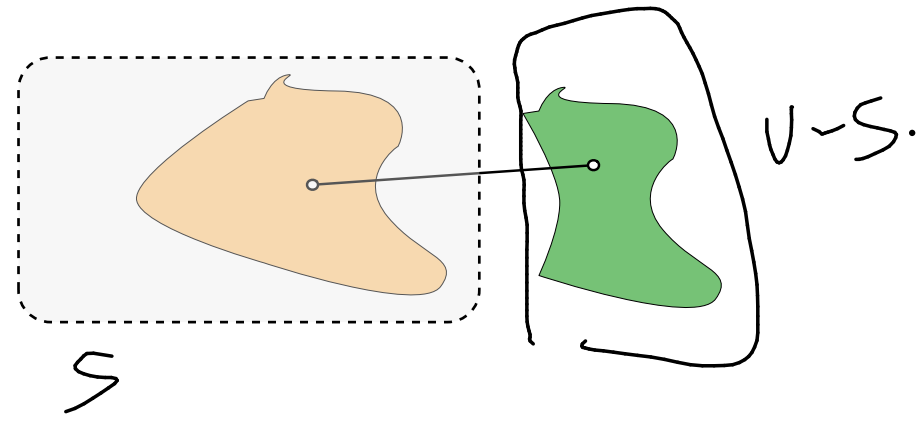


Neither endpoint u, v
is covered by A .



3 cases for edge e .

Case 1: $e=(u,v)$ and both u,v are in A .

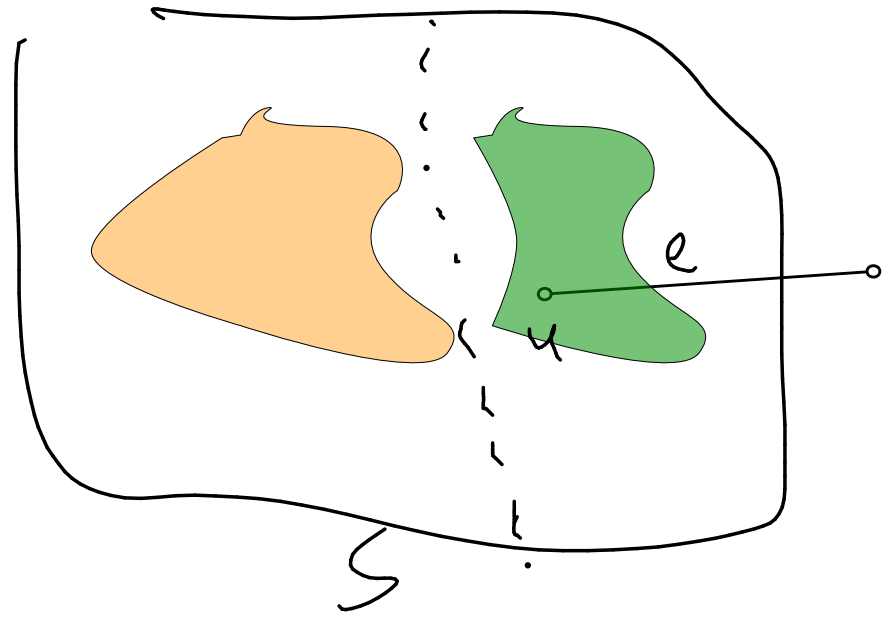


Notice that A respects $(S, V-S)$
and e is the lightest edge to
cross this cut.

\Rightarrow By the cut thm, $A \cup \{e\}$ is
part of some MST.

3 cases for edge e .

Case 2: $e=(u,v)$ and only u is in A .



Define S to contain A .

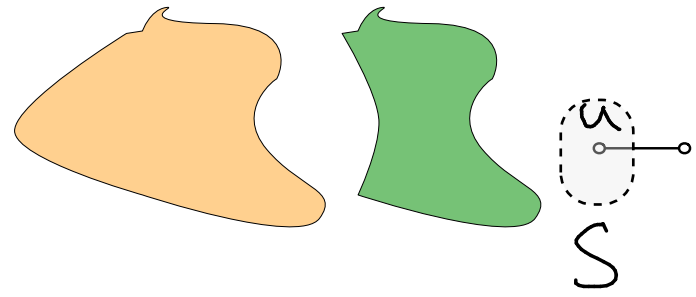
A respects $(S, V-S)$, and the

same argument follows.

orange & green = depiction of
the set of
edges A

3 cases for edge e .

Case 3: $e=(u,v)$ and neither u nor v are in A .



as before, all conditions for the
cut then hold.

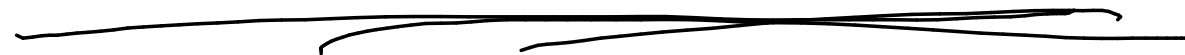
analysis?

KRUSKAL-PSEUDOCODE(G)

1 $A \leftarrow \emptyset$

2 **repeat** $V - 1$ times:

3 add to A the lightest edge $e \in E$ that does not create a cycle



GENERAL-MST-STRATEGY($G = (V, E)$)

1 $A \leftarrow \emptyset$

2 **repeat** $V - 1$ times:

3 Pick a cut $(S, V - S)$ that respects A ↙

4 Let e be min-weight edge over cut $(S, V - S)$

5 $A \leftarrow A \cup \{e\}$

Prim's algorithm

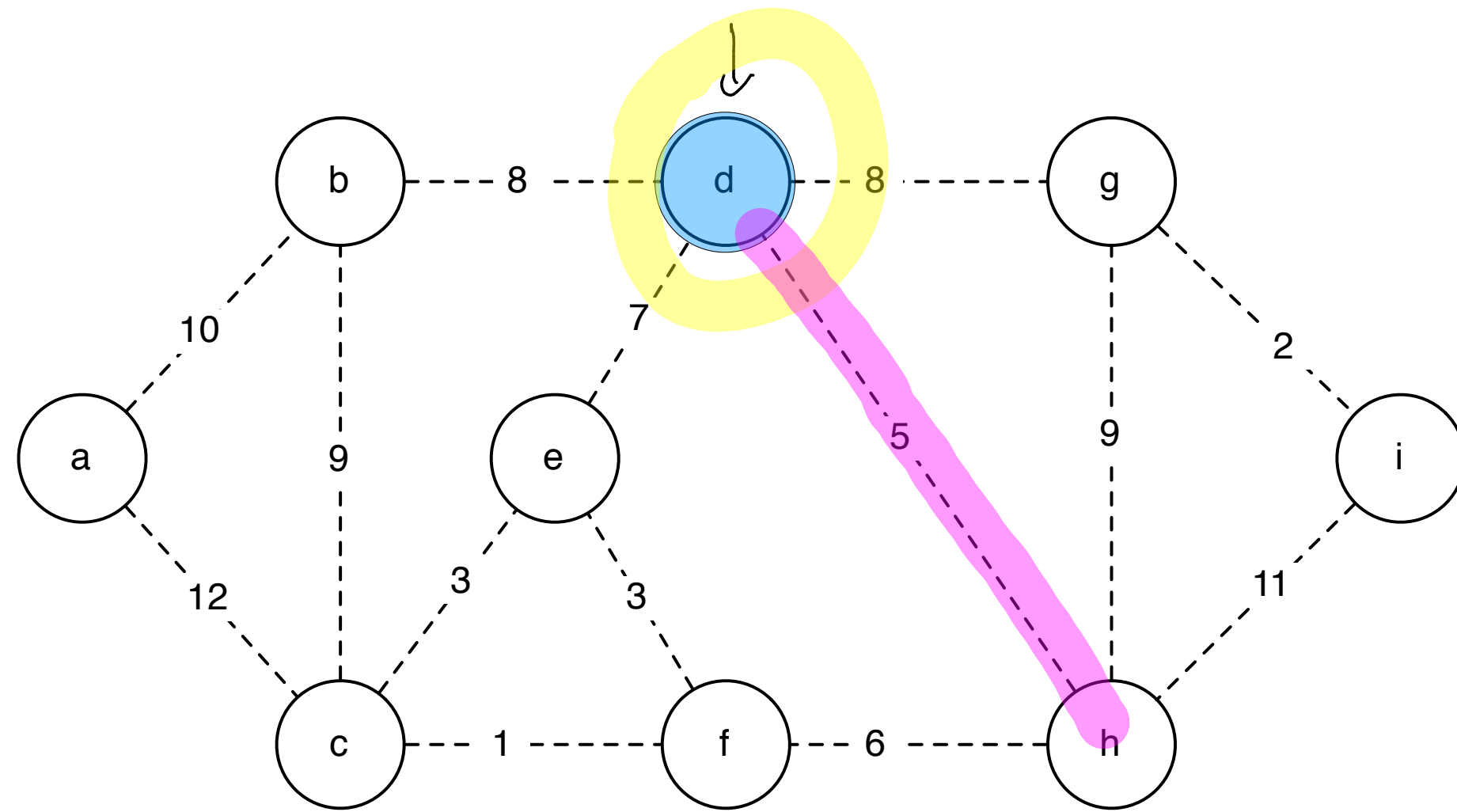
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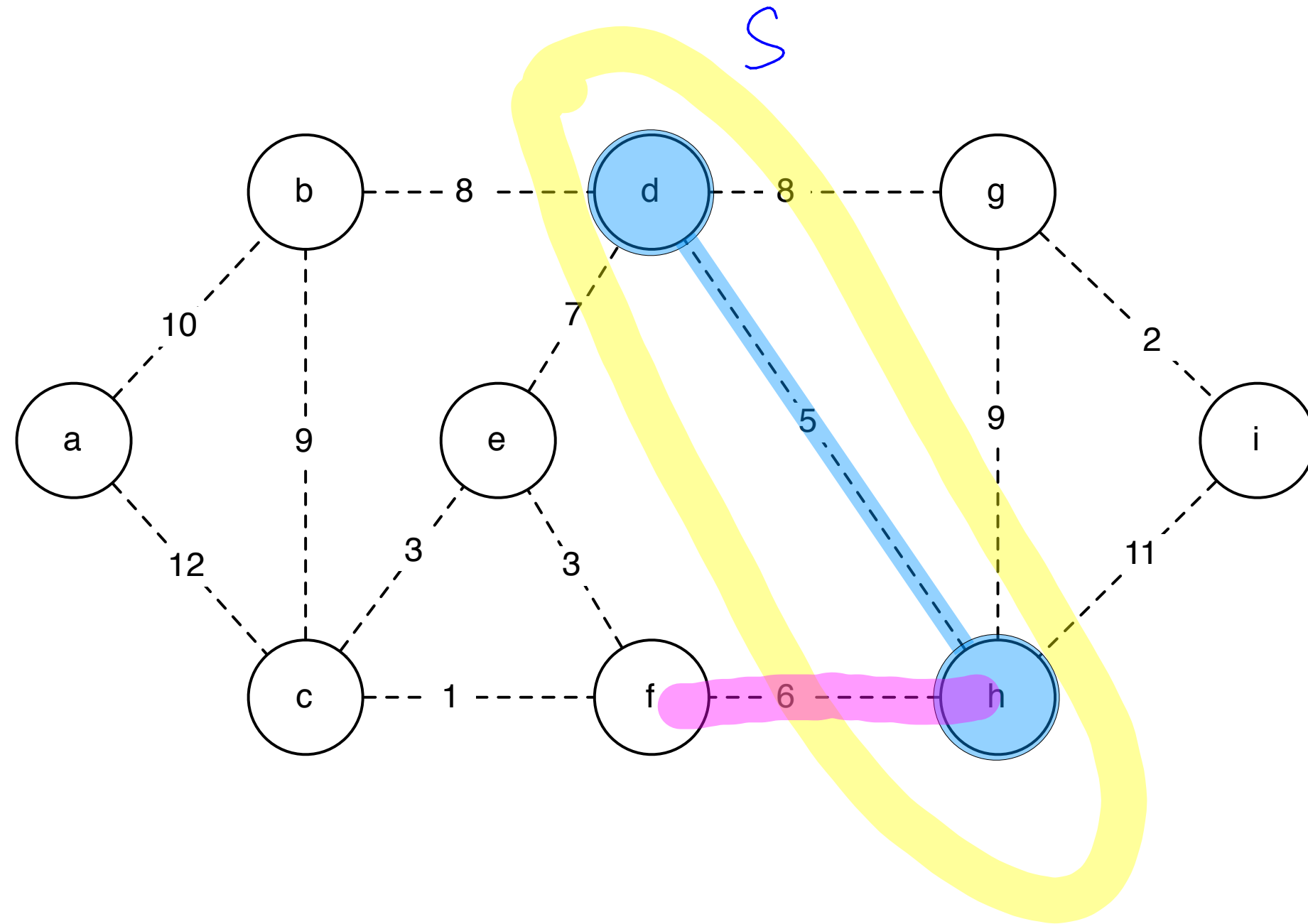
A is a subtree

edge e is lightest edge that grows the subtree

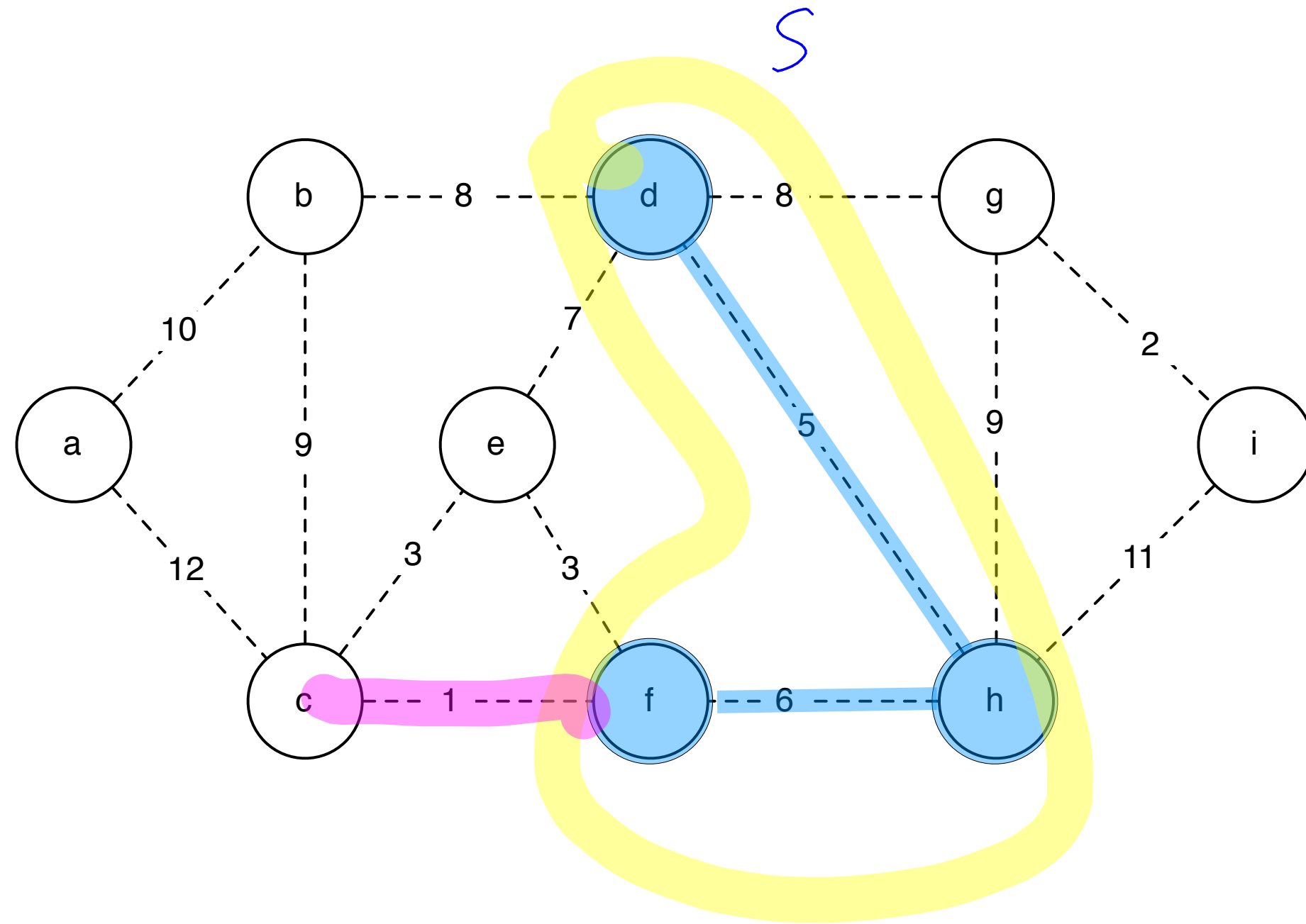
prim



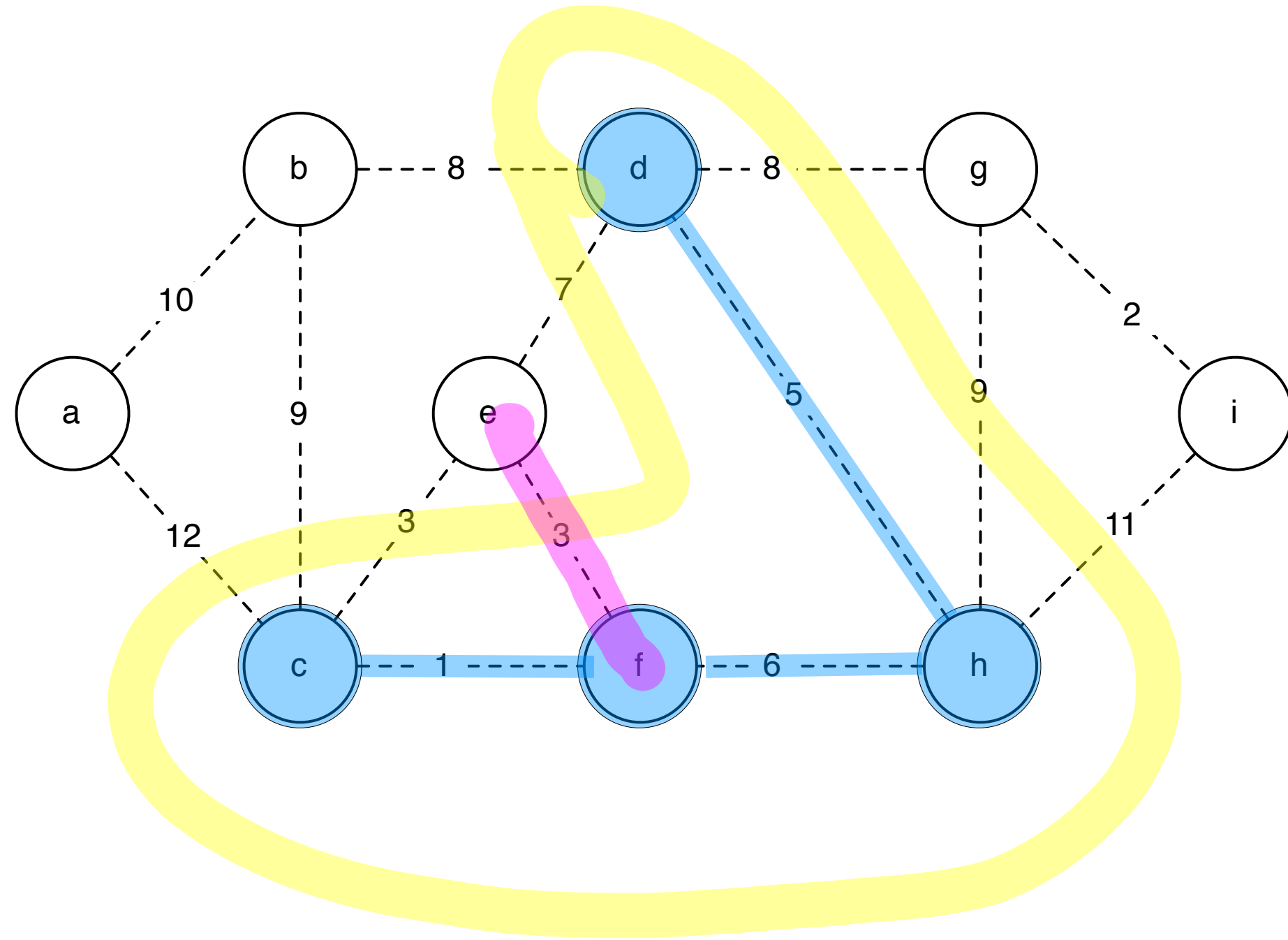
prim



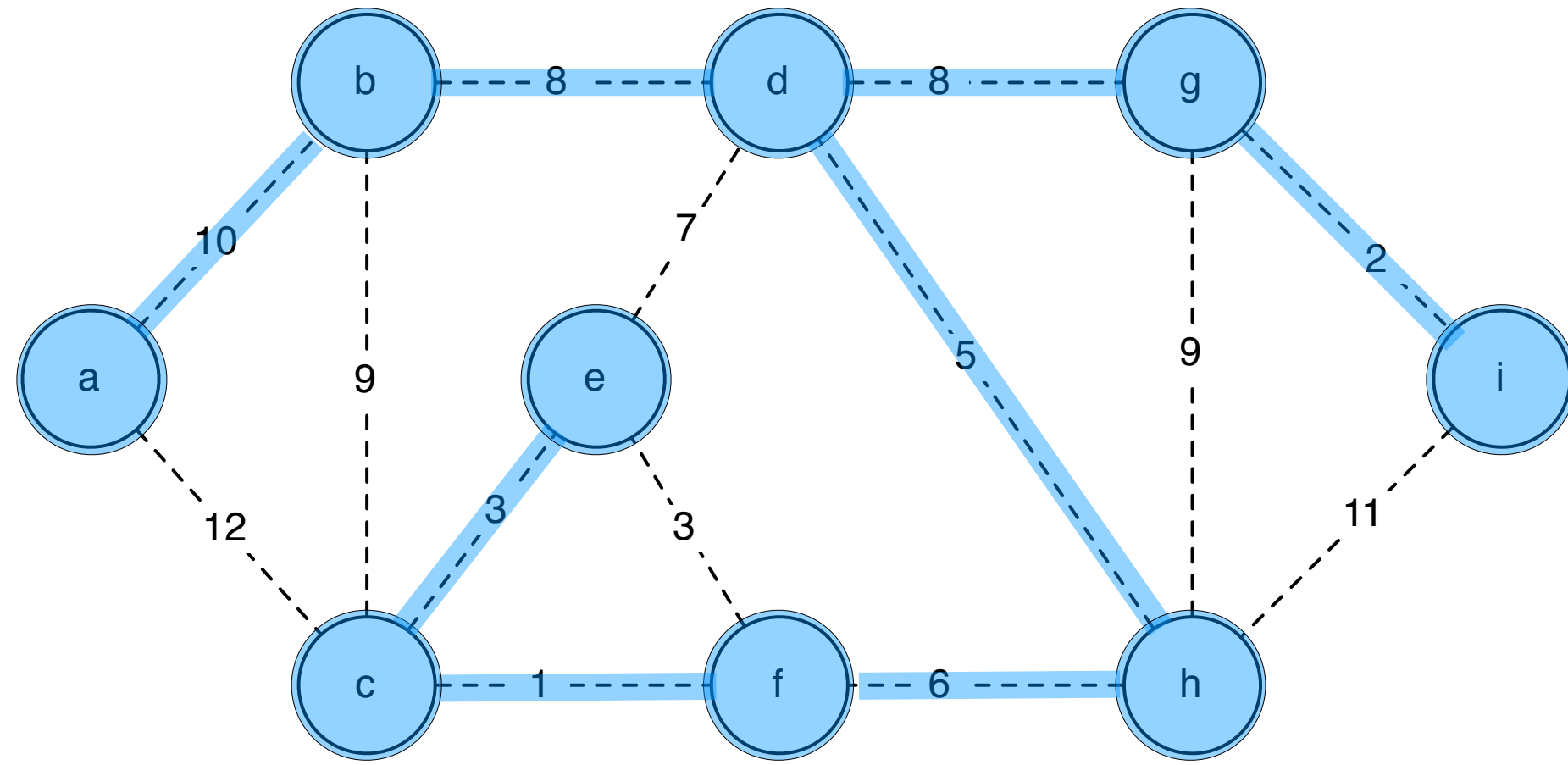
prim



prim



prim



implementation

idea:

implementation

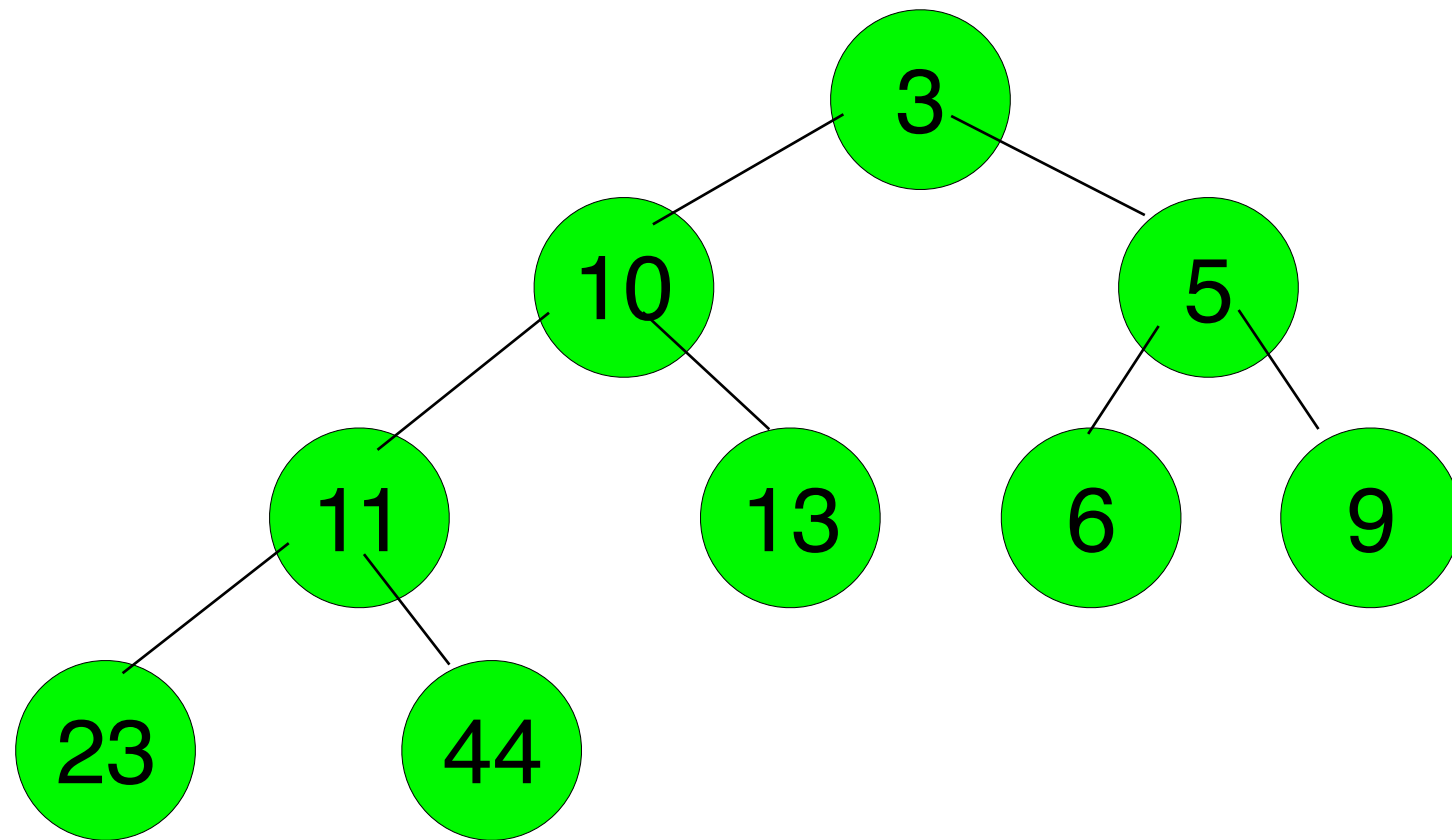
new data structure

binary heap

full tree, key value \leq to key of children

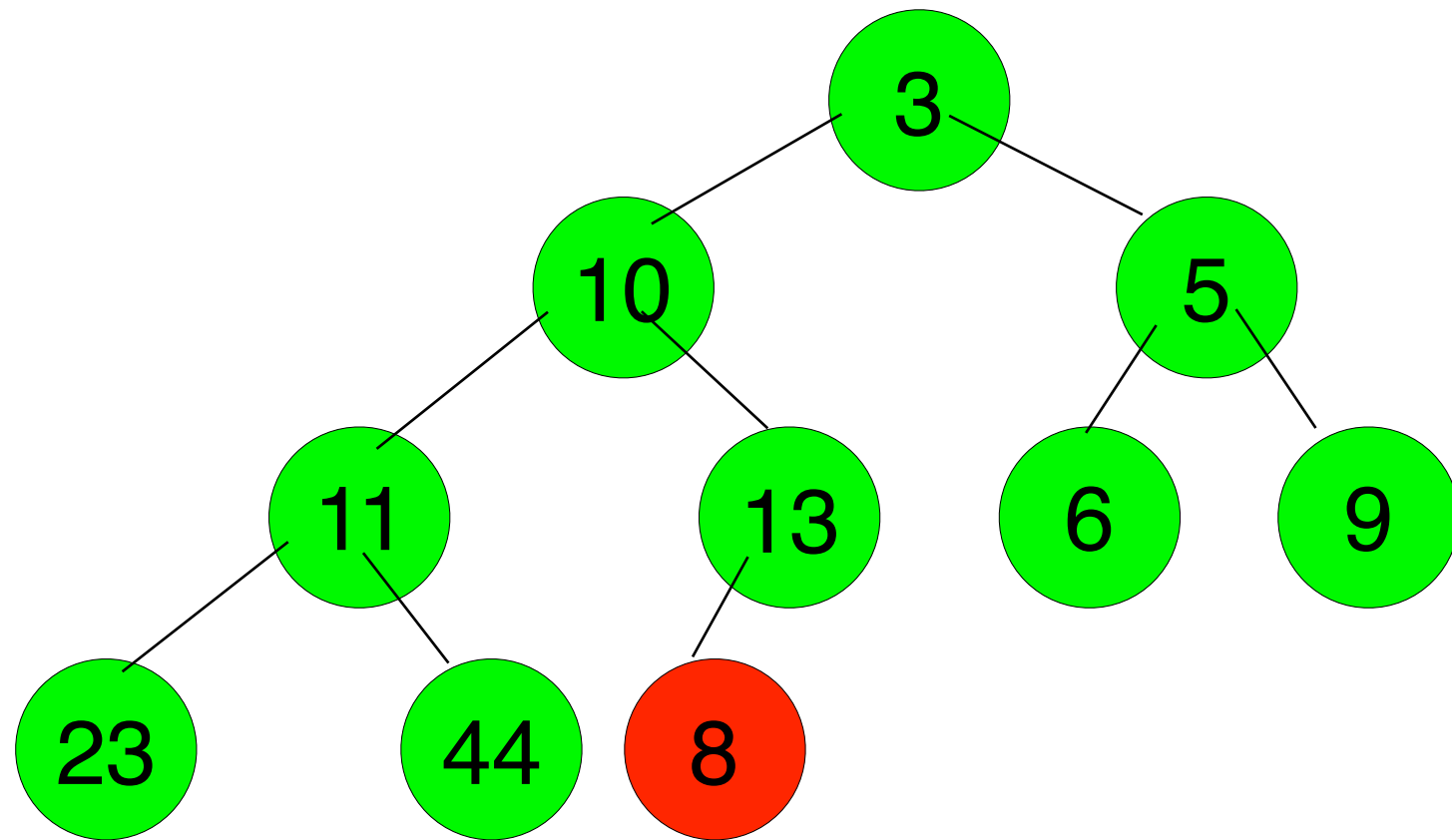
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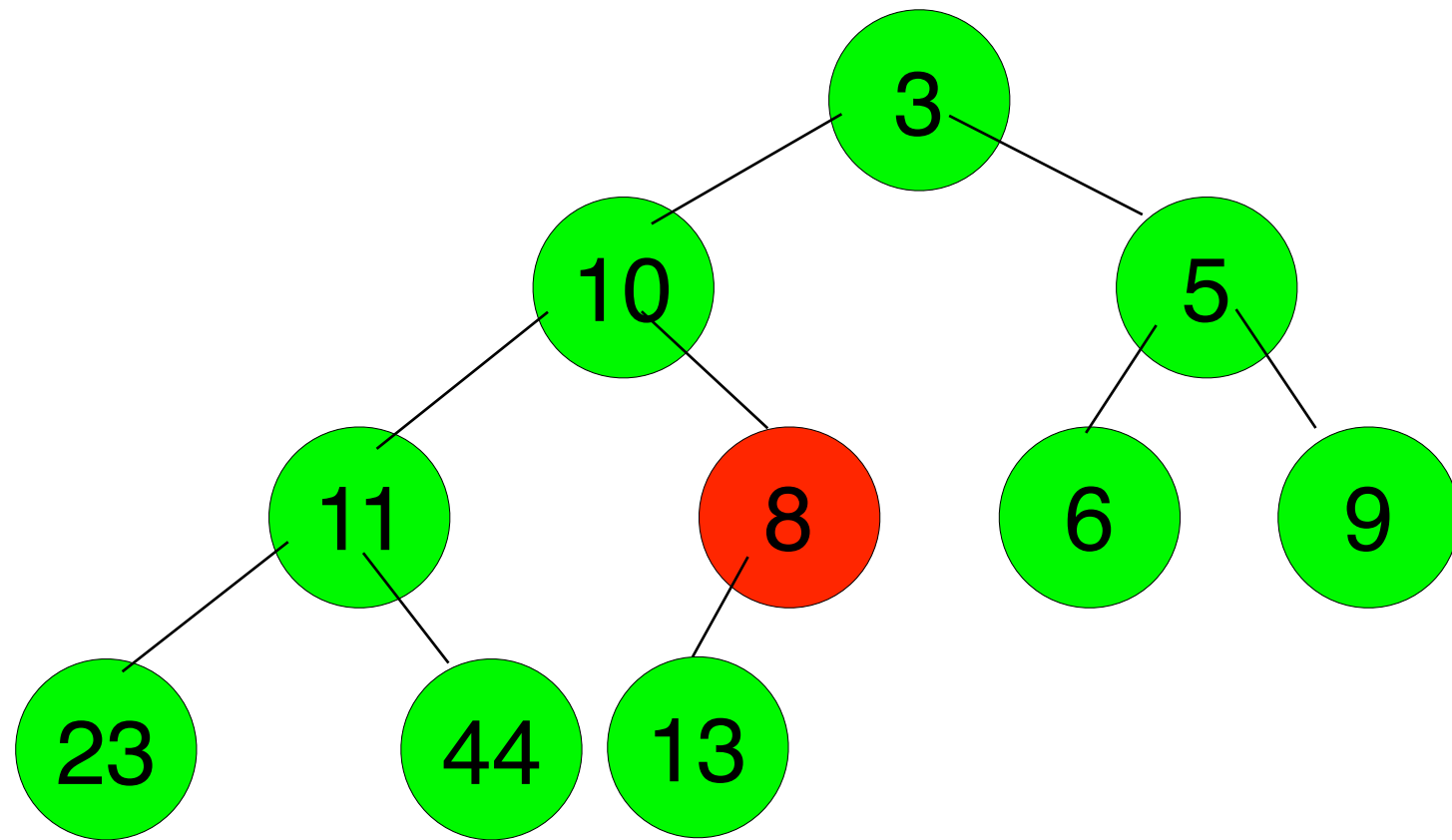
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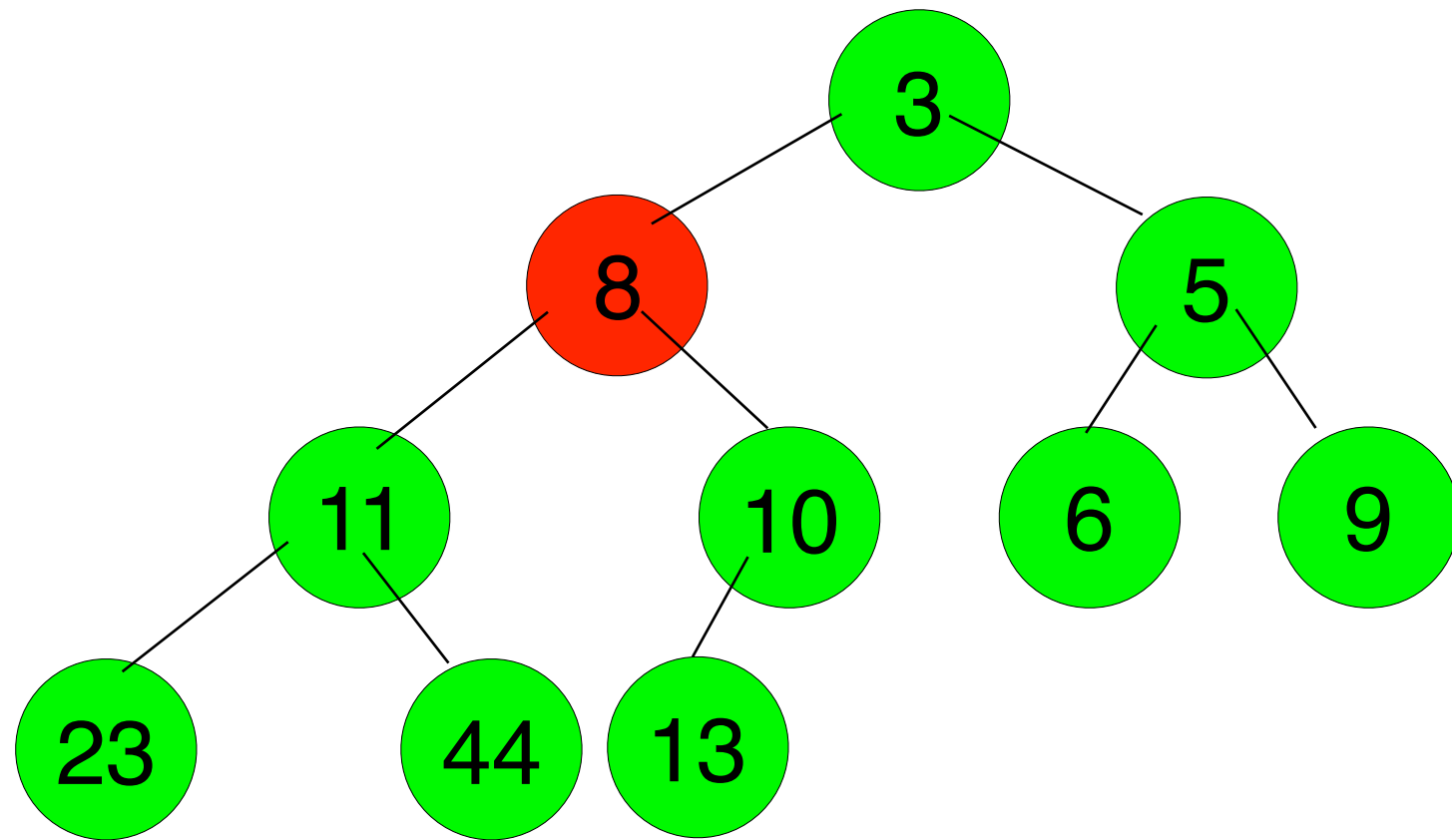
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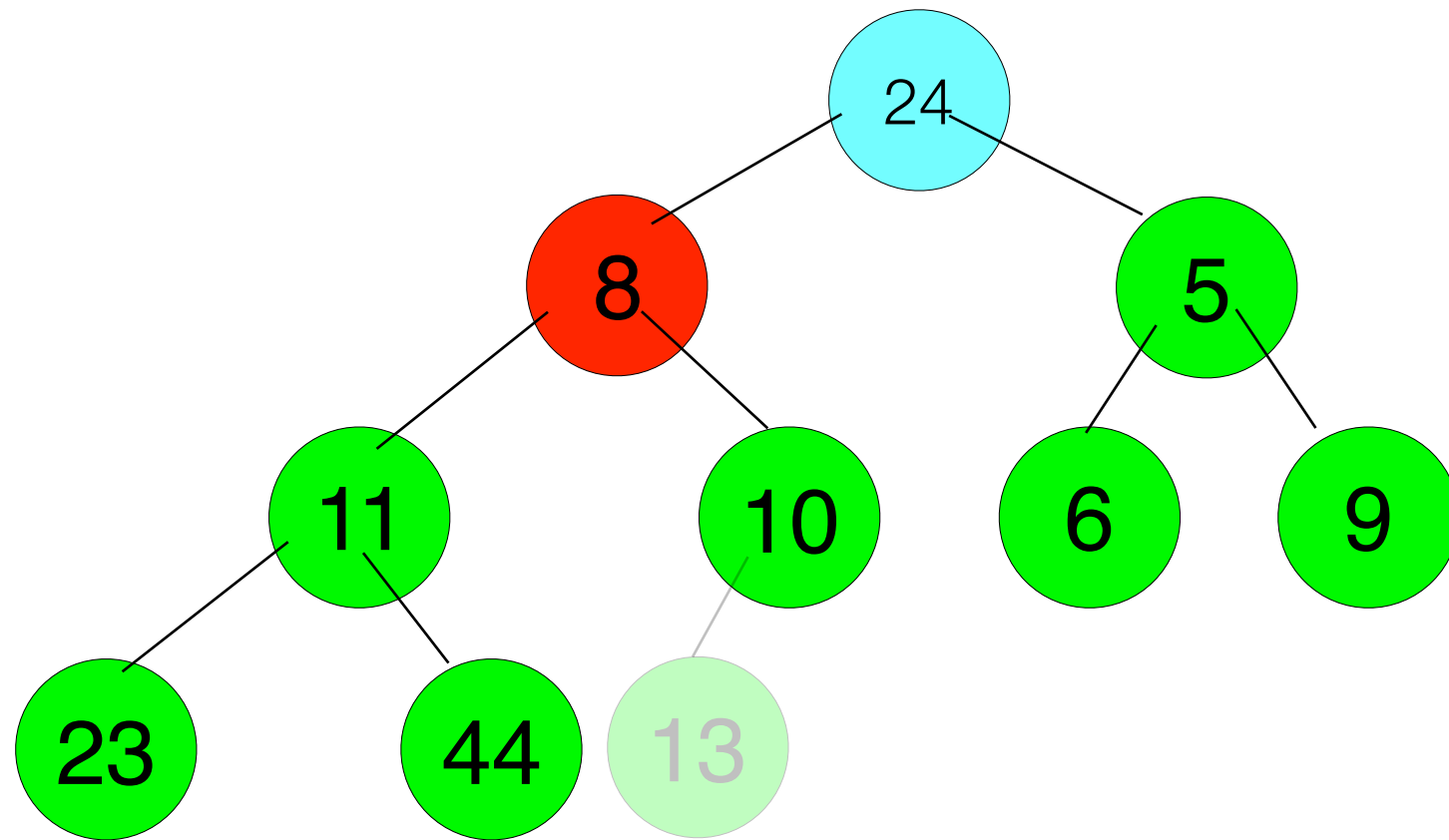
how to extractmin?



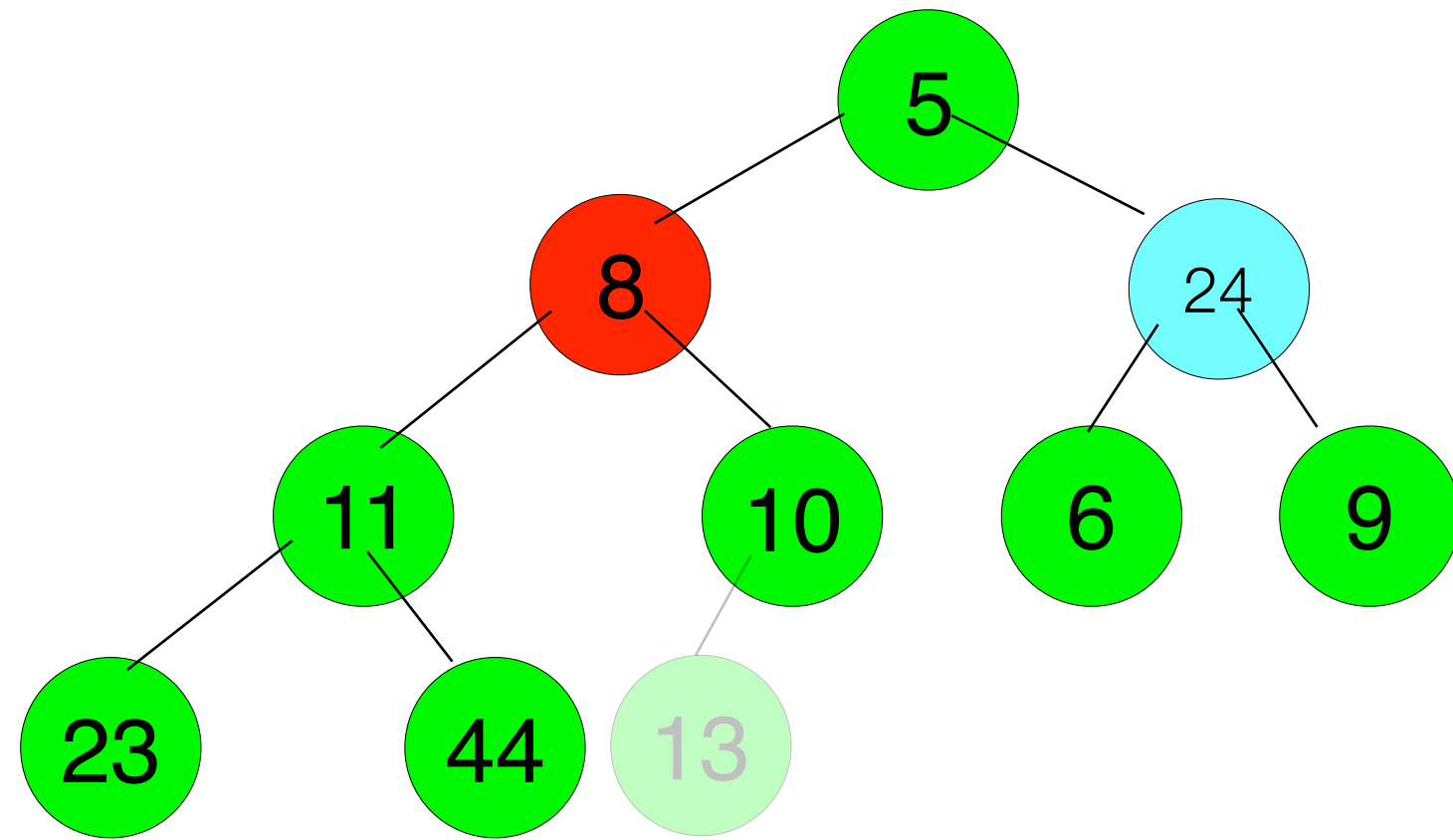
binary heap

full tree, key value \leq to key of children

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binary heap

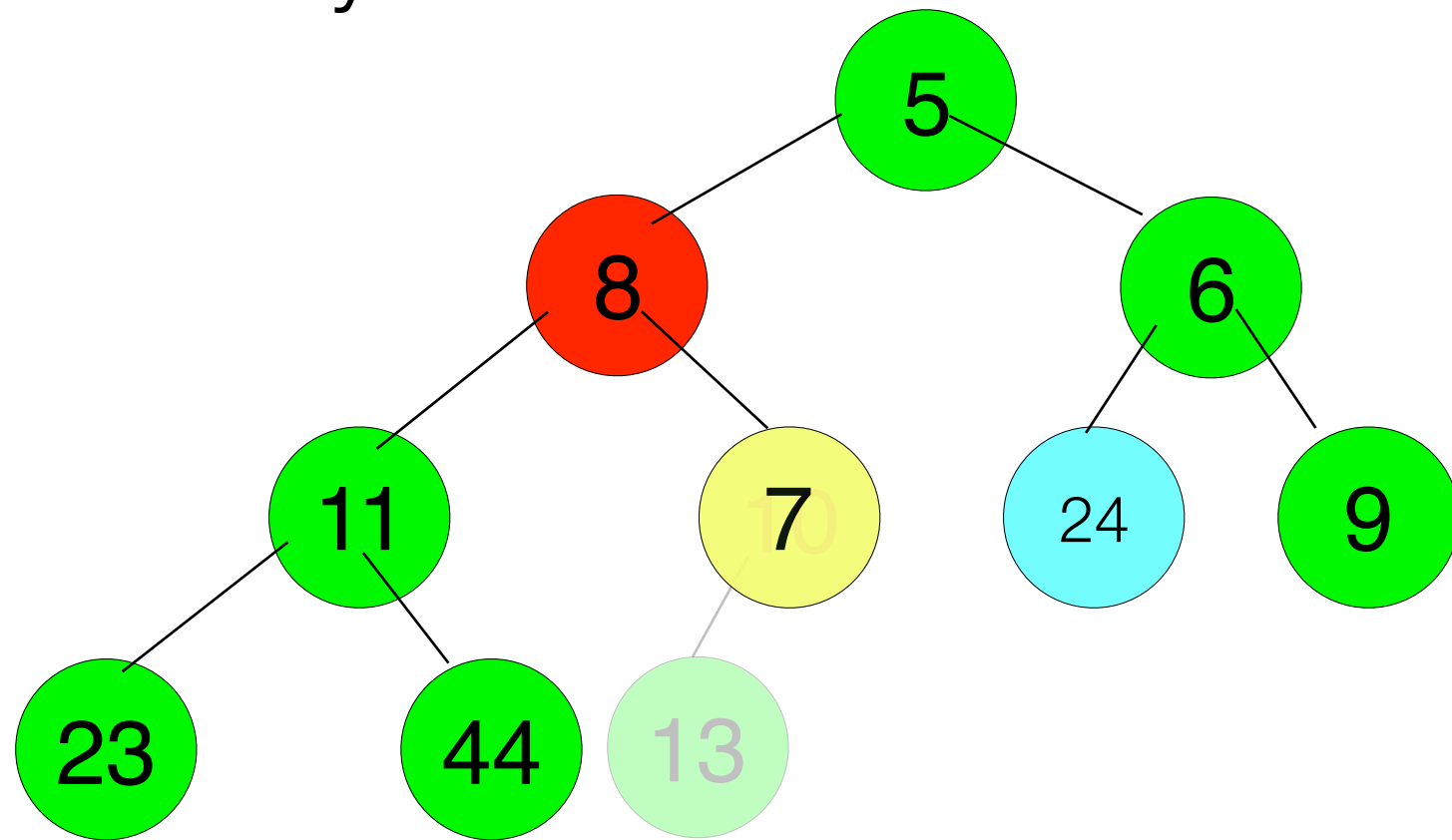


binary heap

full tree, key value \leq to key of children

how to extractmin?

how to decreasekey?

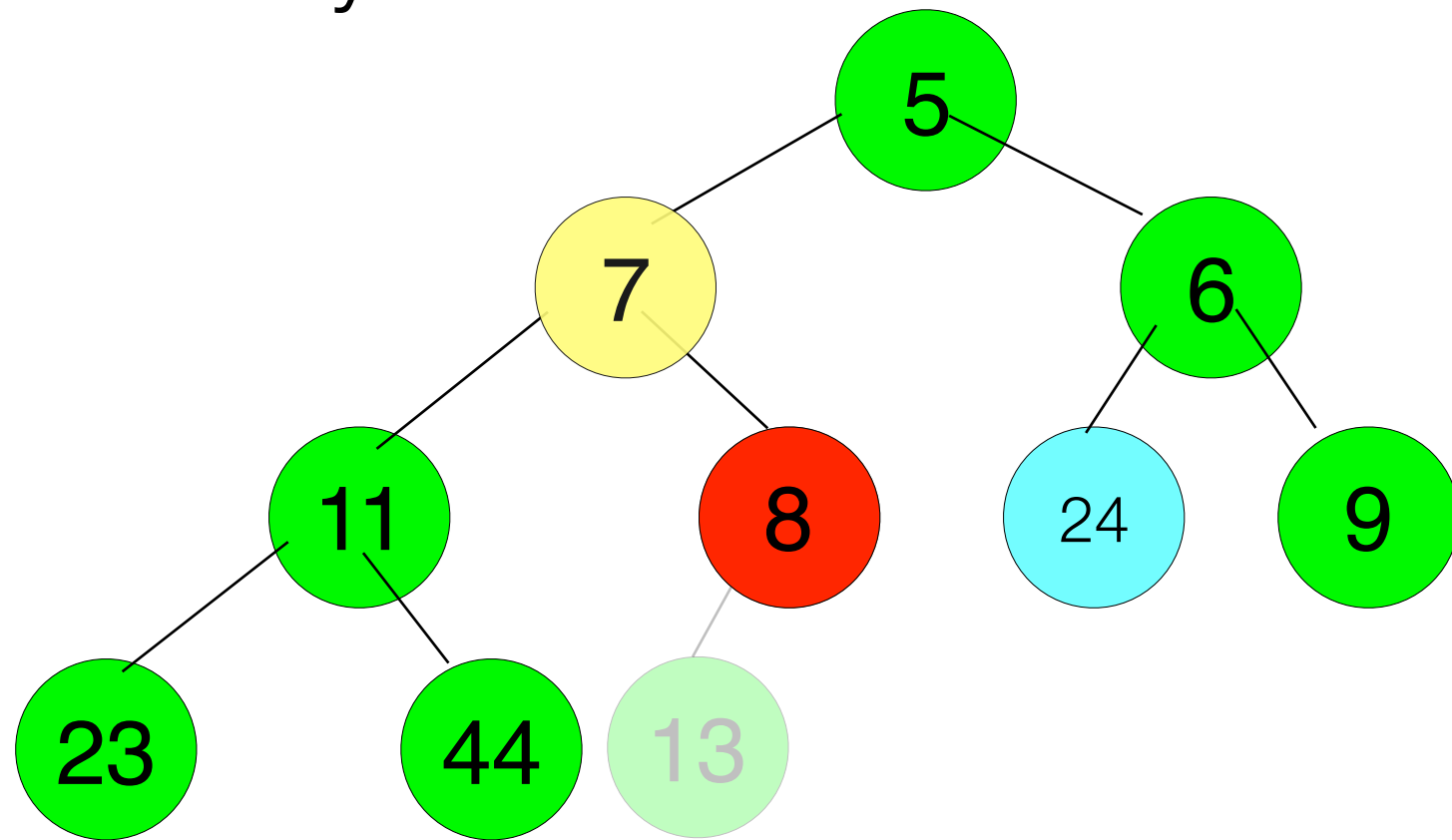


binary heap

full tree, key value \leq to key of children

how to extractmin?

how to decreasekey?



implementation

use a priority queue to keep track of light edges

insert:

makequeue:

extractmin:

decreasekey:

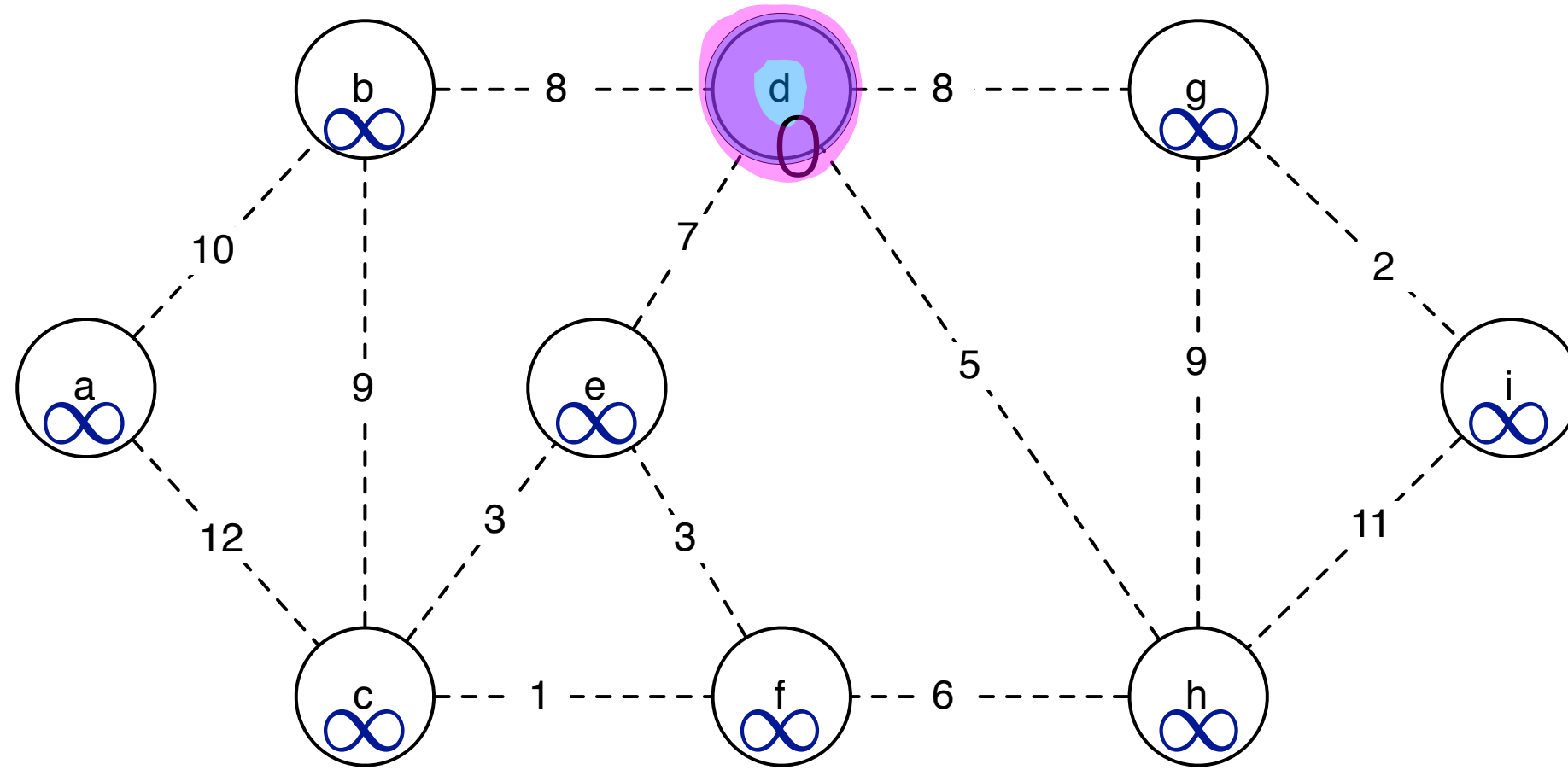
Prim's algorithm

implementation

PRIM($G = (V, E)$)

```
1   $Q \leftarrow \emptyset$      $\triangleright$   $Q$  is a Priority Queue
2  Initialize each  $v \in V$  with key  $k_v \leftarrow \infty$ ,  $\pi_v \leftarrow \text{NIL}$ 
3  Pick a starting node  $r$  and set  $k_r \leftarrow 0$ 
4  Insert all nodes into  $Q$  with key  $k_v$ .
5  while  $Q \neq \emptyset$ 
6      do  $u \leftarrow \text{EXTRACT-MIN}(Q)$ 
7          for each  $v \in \text{Adj}(u)$ 
8              do if  $v \in Q$  and  $w(u, v) < k_v$ 
9                  then  $\pi_v \leftarrow u$ 
10                      $\text{DECREASE-KEY}(Q, v, w(u, v))$      $\triangleright$  Sets  $k_v \leftarrow w(u, v)$ 
```

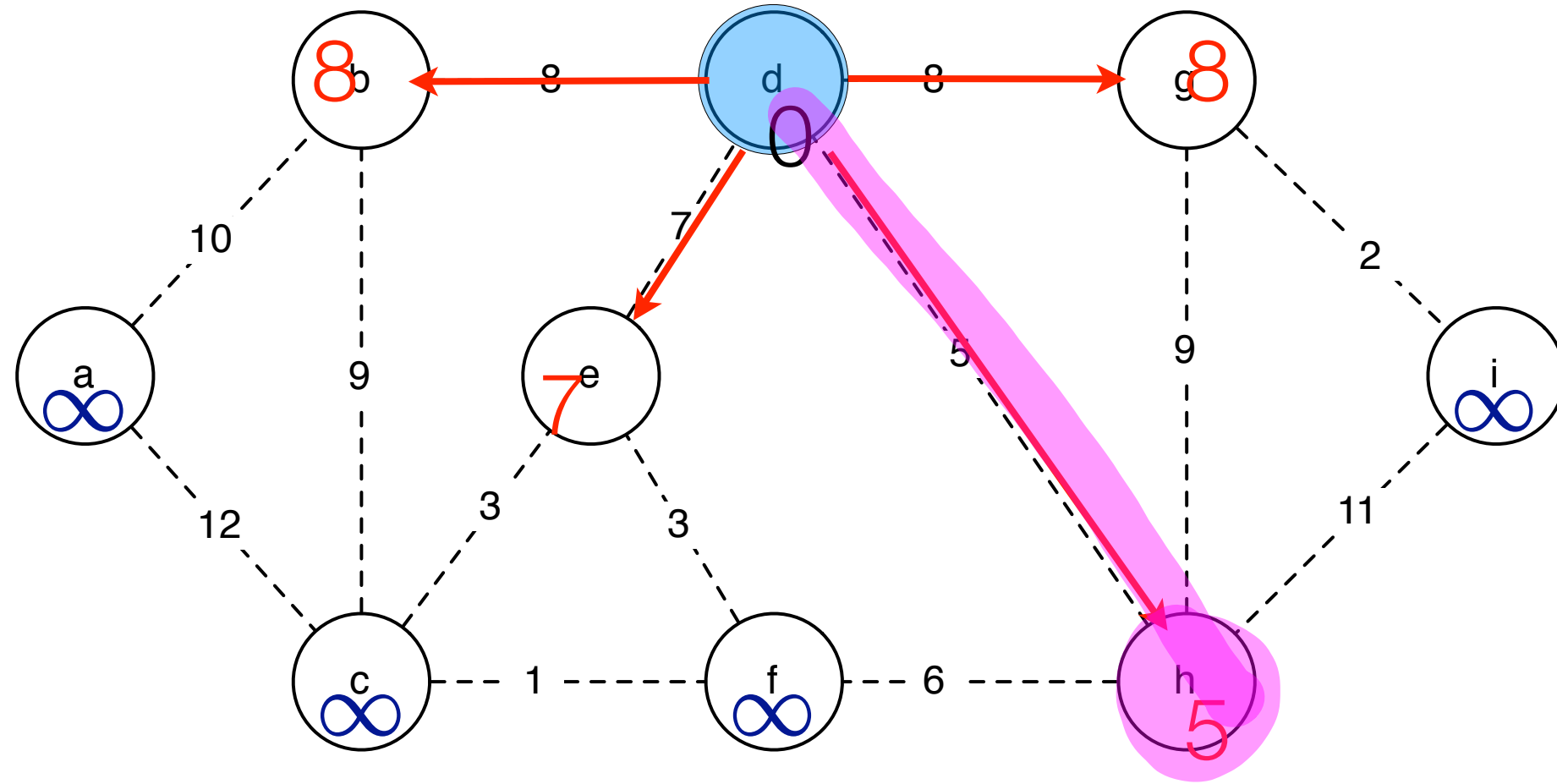
prim



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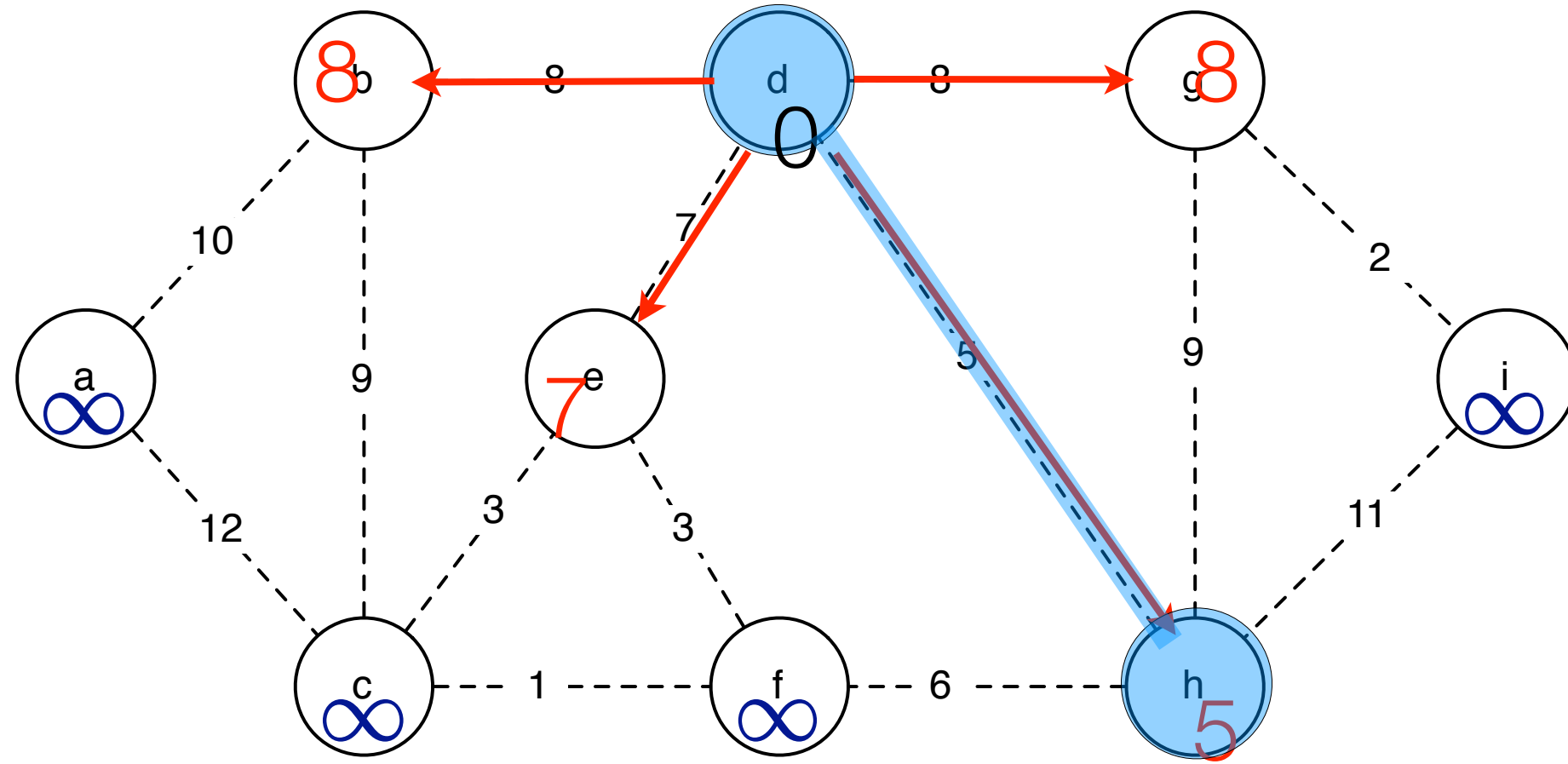
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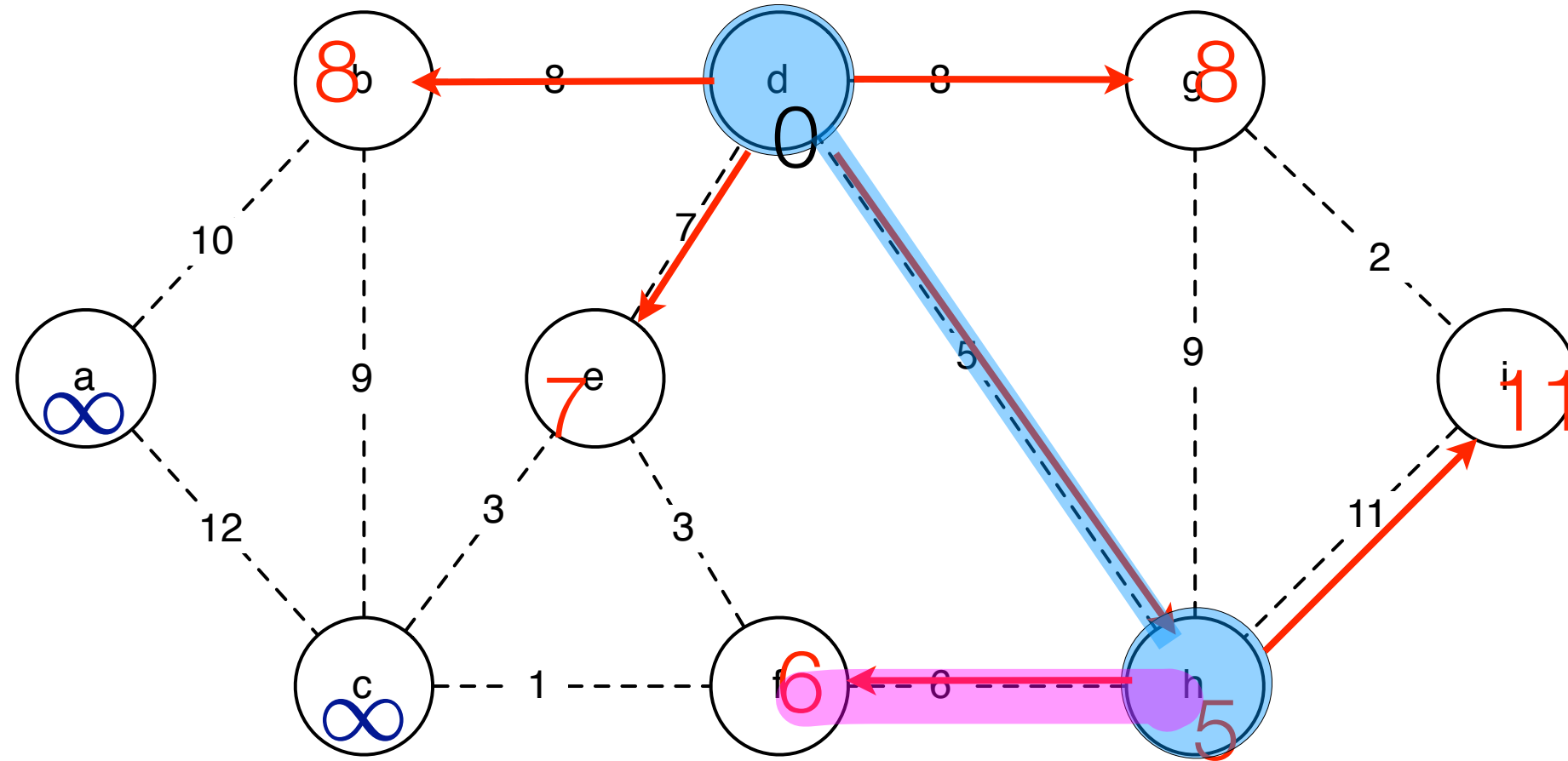
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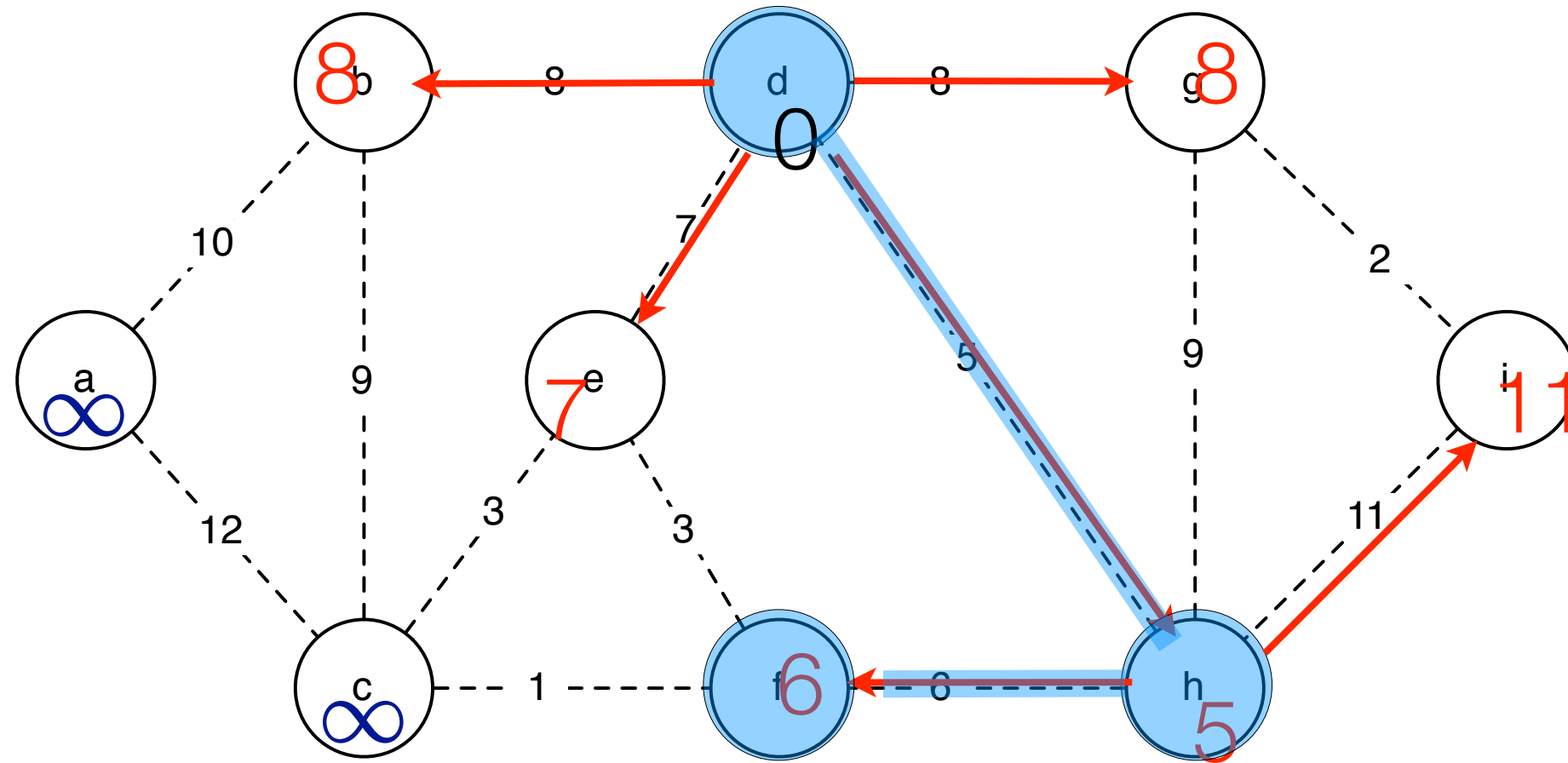
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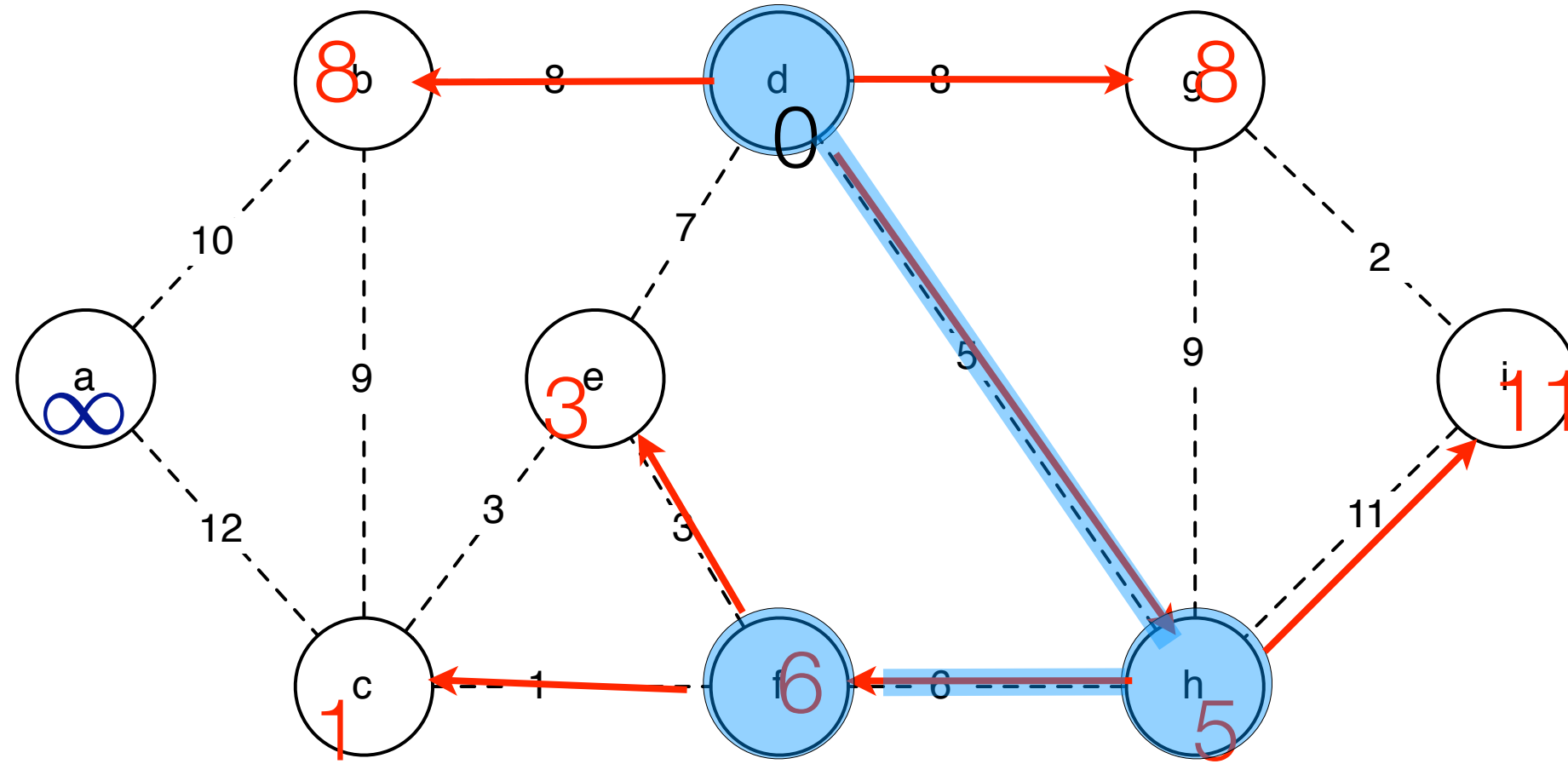
prim



PRIM($G = (V, E)$)

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running time

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$\log(u)$

$\log V$

E

$$O(E \log V + V \log V)$$

implementation

PRIM($G = (V, E)$)

```
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10                      $\text{DECREASE-KEY}(Q, v, w(u, v))$      $\triangleright$  Sets  $k_v \leftarrow w(u, v)$ 
```

$$O(V \log V + E \log V) = O(E \log V)$$

implementation

use a priority queue to keep track of light edges

	priority queue	fibonacci heap	
insert:	$O(\log n)$	$\log n$	
makequeue:	n	n	
extractmin:	$O(\log n)$	$\log n$	amortized
decreasekey:	$O(\log n)$	$O(1)$	amortized

faster implementation

PRIM($G = (V, E)$)

```
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```

$$O(E + V \log V)$$

Research in mst

FREDMAN-TARJAN 84:	<u>$E + V \log V$</u>
GABOW-GALIL-SPENCER-TARJAN 86:	<u>$E \log(\log^* V)$</u>
CHAZELLE 97	<u>$E\alpha(V) \log \alpha(V)$</u>
CHAZELLE 00	<u>$E\alpha(V)$</u>
PETTIE-RAMACHANDRAN 02:	(optimal)
KARGER-KLEIN-TARJAN 95: (randomized)	E
Euclidean mst:	$V \log V$

Ackerman function

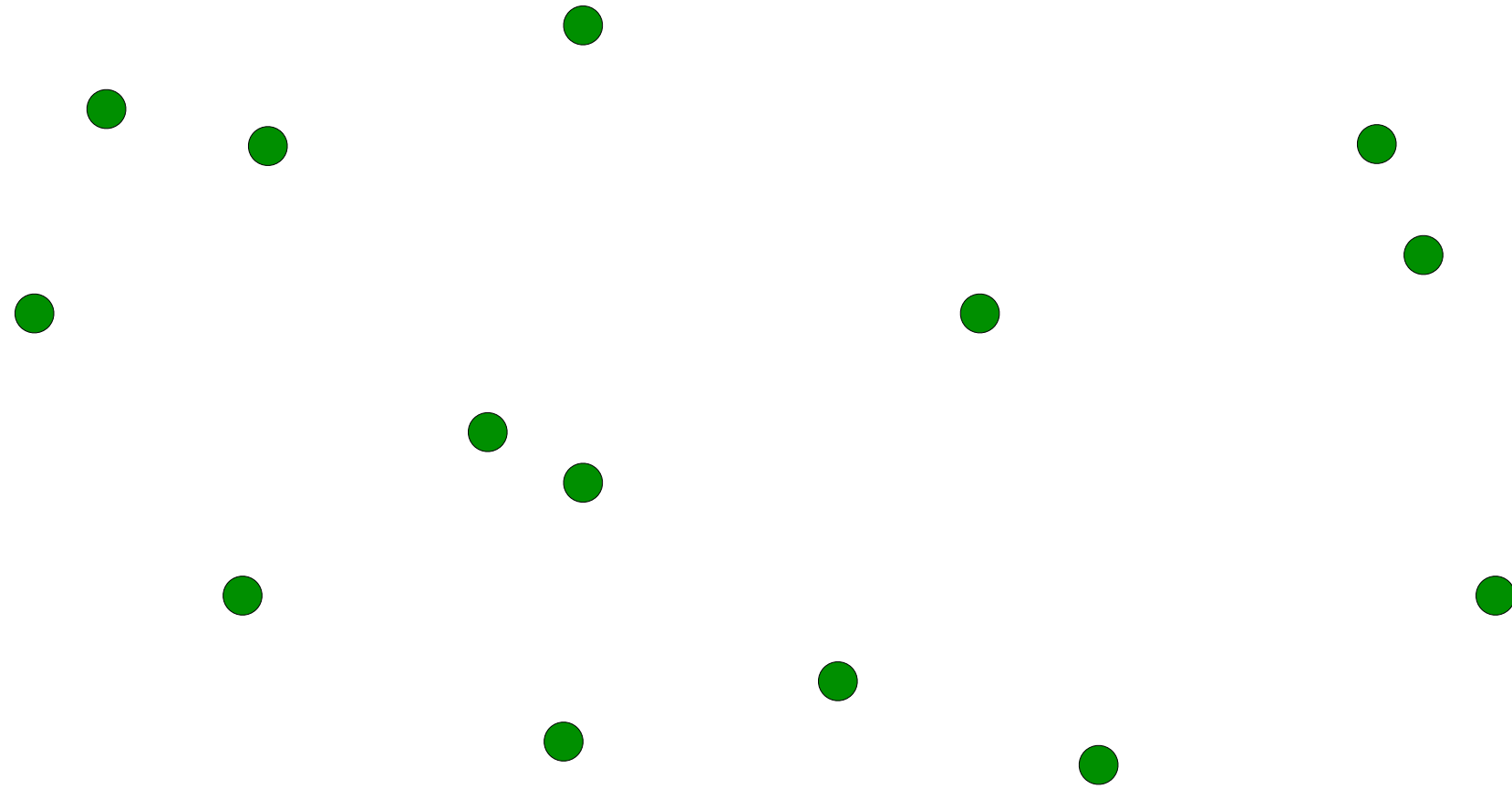
$$A(m, n) = \begin{cases} n + 1 & m = 0 \\ A(m - 1, 1) & m > 0, n = 0 \\ A(m - 1, A(m, n - 1)) & m, n > 0 \end{cases}$$

$$A(4, 2) =$$

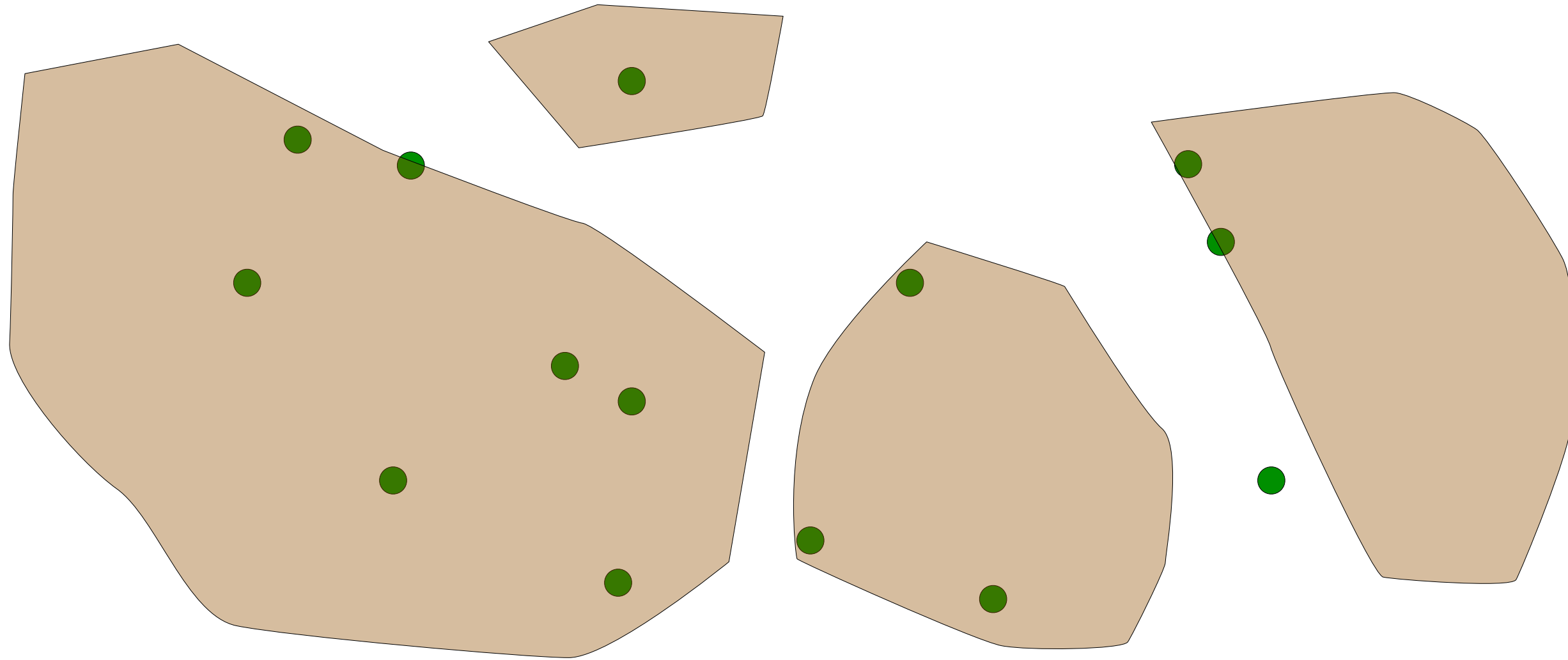
inverse ackerman

$$\alpha(n) =$$

application of mst



application of mst



application of mst

