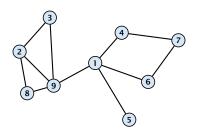




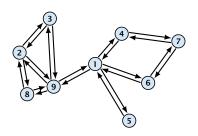
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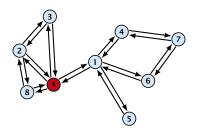
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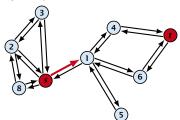
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- Let  $(S, V \setminus S)$  be a minimum global mincut. The above algorithm will output a cut of capacity  $cap(S, V \setminus S)$  whenever  $|\{s,t\} \cap S| = 1$ .





- Given a graph G = (V, E) and an edge  $e = \{u, v\}$ .
- ▶ The graph G/e is obtained by "identifying" u and v to form a new node.
- Resulting parallel edges are replaced by a single edge, whose capacity equals the sum of capacities of the parallel edges.

#### Example 1



Edge-contractions do no decrease the size of the mincut.

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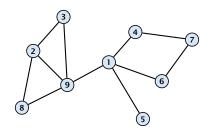


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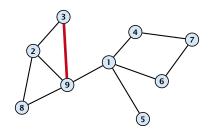


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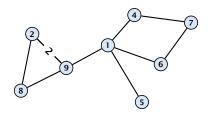
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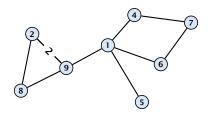
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#### Example 1



Edge-contractions do no decrease the size of the mincut.

We can perform an edge-contraction in time O(n).

- 1: **for**  $i = 1 \rightarrow n 2$  **do**
- 2: choose  $e \in E$  randomly with probability c(e)/c(E)
- 3:  $G \leftarrow G/e$
- 4: **return** only cut in *G*



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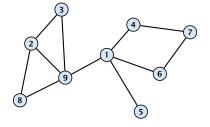


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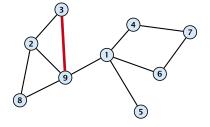


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- What is the probability that this algorithm returns a mincut?

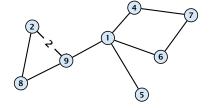




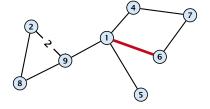




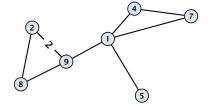




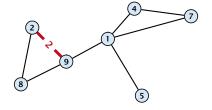




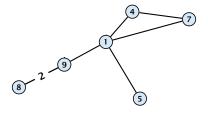




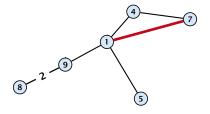




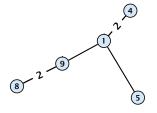




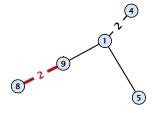




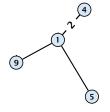




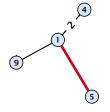
















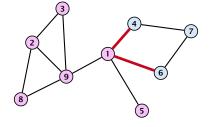




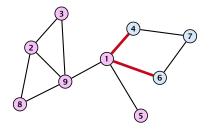












What is the probability that this algorithm returns a mincut?



# What is the probability that a given mincut A is still possible after round i?

▶ It is still possible to obtain cut A in the end if so far no edge in  $(A, V \setminus A)$  has been contracted.



# What is the probability that we select an edge from A in iteration i?

- Let  $\min = \operatorname{cap}(A, V \setminus A)$  denote the capacity of a mincut.
- Let cap(v) be capacity of edges incident to vertex  $v \in V_{n-i+1}$ .
- ▶ Clearly,  $cap(v) \ge min$ .
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Algorithm 2 RecursiveMincut(G = (V, E, c))

1: for i = 1 \rightarrow n - n/\sqrt{2} do

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3: G \leftarrow G/e

4: if |V| = 2 return cut-value;

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Running time



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$$T(n) = 2T\left(\frac{n}{\sqrt{2}}\right) + \mathcal{O}(n^2)$$

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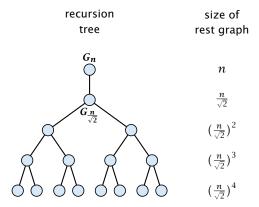
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The probability of contracting an edge from the mincut during one iteration through the for-loop is only

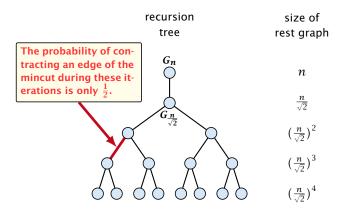
$$\frac{t(t-1)}{n(n-1)} \le \frac{t^2}{n^2} = \frac{1}{2} ,$$

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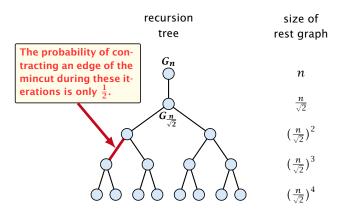


We can estimate the success probability by using the following game on the recursion tree. Delete every edge with probability  $\frac{1}{2}$ . If in the end you have a path from the root to at least one lead node you are successful.





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Let for an edge e in the recursion tree, h(e) denote the height (distance to leaf level) of the parent-node of e (end-point that is higher up in the tree). Let h denote the height of the root node.

Call an edge e alive if there exists a path from the parent-node of e to a descendant leaf, after we randomly deleted edges. Note that an edge can only be alive if it hasn't been deleted.

#### Lemma 3

The probability that an edge e is alive is at least  $\frac{1}{h(e)+1}$ .



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▶ An edge e with h(e) = 1 is alive if and only if it is not deleted. Hence, it is alive with proability at least  $\frac{1}{2}$ .



- An edge e with h(e) = 1 is alive if and only if it is not deleted. Hence, it is alive with proability at least ½.
- Let  $p_d$  be the probability that an edge e with h(e) = d is alive. For d > 1 this happens for edge  $e = \{c, p\}$  if it is not deleted **and** if one of the child-edges connecting to c is alive.



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$$= p_{d-1} - \frac{p_{d-1}^{2}}{2}$$



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$$p_{d} = \frac{1}{2} \left( 2p_{d-1} - p_{d-1}^{2} \right) \left[ \Pr[A \vee B] = \Pr[A] + \Pr[B] - \Pr[A \wedge B] \right]$$
$$= p_{d-1} - \frac{p_{d-1}^{2}}{2}$$

 $x - x^2/2$  is monotonically increasing for  $x \in [0, 1]$ 



- ▶ An edge e with h(e) = 1 is alive if and only if it is not deleted. Hence, it is alive with proability at least  $\frac{1}{2}$ .
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## Proof.

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$$\frac{x - x^2/2 \text{ is monotonically}}{\text{increasing for } x \in [0, 1]} \ge \frac{1}{d} - \frac{1}{2d^2} \ge \frac{1}{d} - \frac{1}{d(d+1)}$$

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## 15 Global Mincut

### Lemma 4

One run of the algorithm can be performed in time  $O(n^2 \log n)$  and has a success probability of  $\Omega(\frac{1}{\log n})$ .

Doing  $\Theta(\log^2 n)$  runs gives that the algorithm succeeds with high probability. The total running time is  $O(n^2 \log^3 n)$ .



## 15 Global Mincut

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