

# Path Detection: A Quantum Computing Primitive

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JOINT CENTER FOR  
QUANTUM INFORMATION  
AND COMPUTER SCIENCE

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# Things Quantum Computers are Good at:

- Factoring
  - Exponential speed-up over known classical algorithms
  - Can be used to break most commonly used public key crypto systems
- Simulating chemistry
  - Exponential speed-up over known classical algorithms
  - Useful for drug development, better carbon sequestration

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- New primitive: ***st*-connectivity**

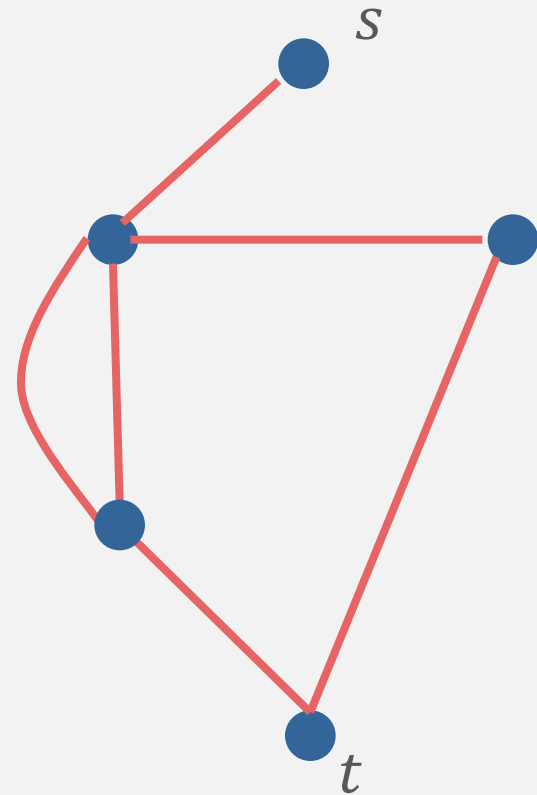
# Outline:

- A. Introduction to st-connectivity
- B. st-connectivity makes a good algorithmic primitive
  - 1. Applies to a wide range of problems
  - 2. Easy to understand (without knowing quantum mechanics)



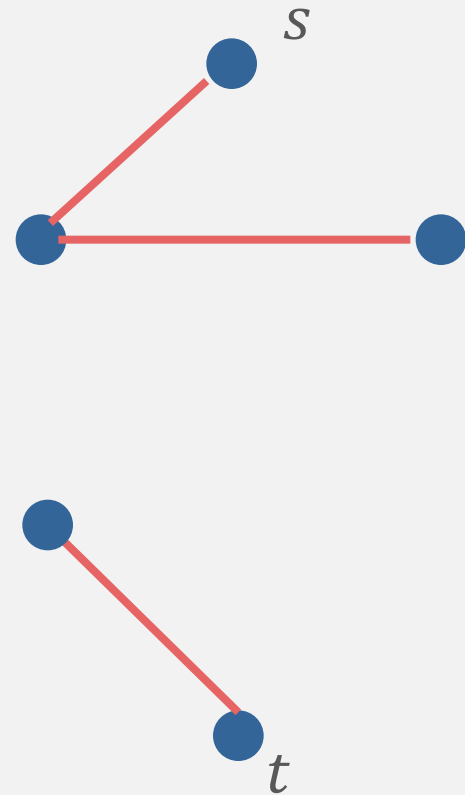
# *st*-connectivity

*st* – connectivity:  
is there a path from *s* to *t*?

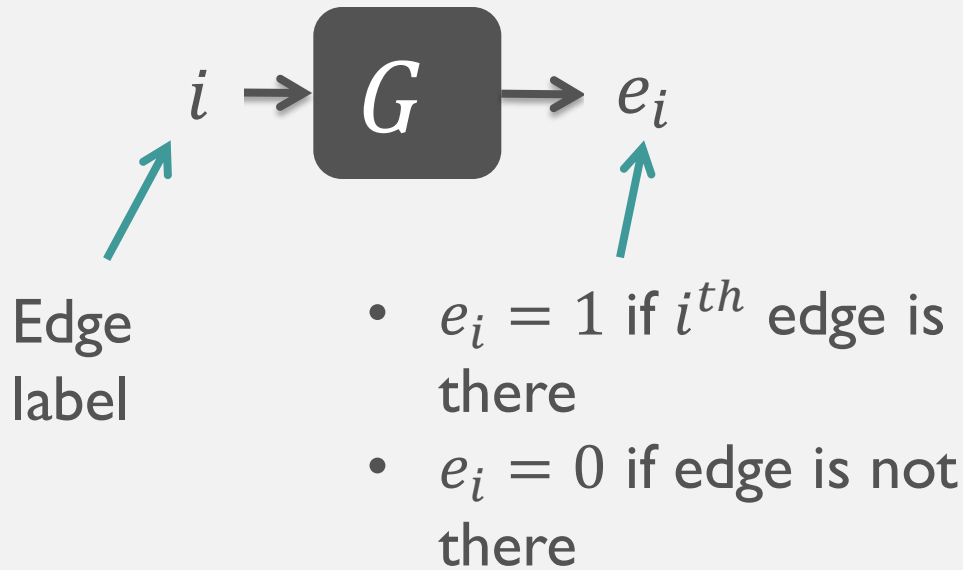


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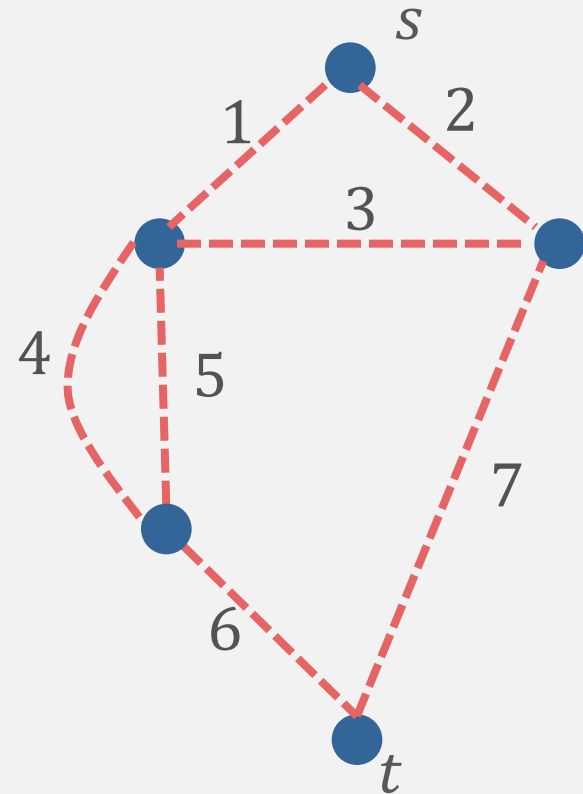
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# Black Box Model



Let  $\mathcal{H}$  be the set of graphs  $G$  that the black box might contain.



# Figure of Merit

- Query Complexity
  - Number of uses (queries) of the black box
  - All other operations are free
  - Always a lower bound on time complexity (situation when other operations are not free)
  - Often (but not always) a good proxy for time complexity
- Under mild assumption, for our algorithm,  
quantum query complexity  $\cong$  quantum time complexity
- In query model it is easier to *prove*
  - Quantum-to-classical speed-ups
  - Optimality

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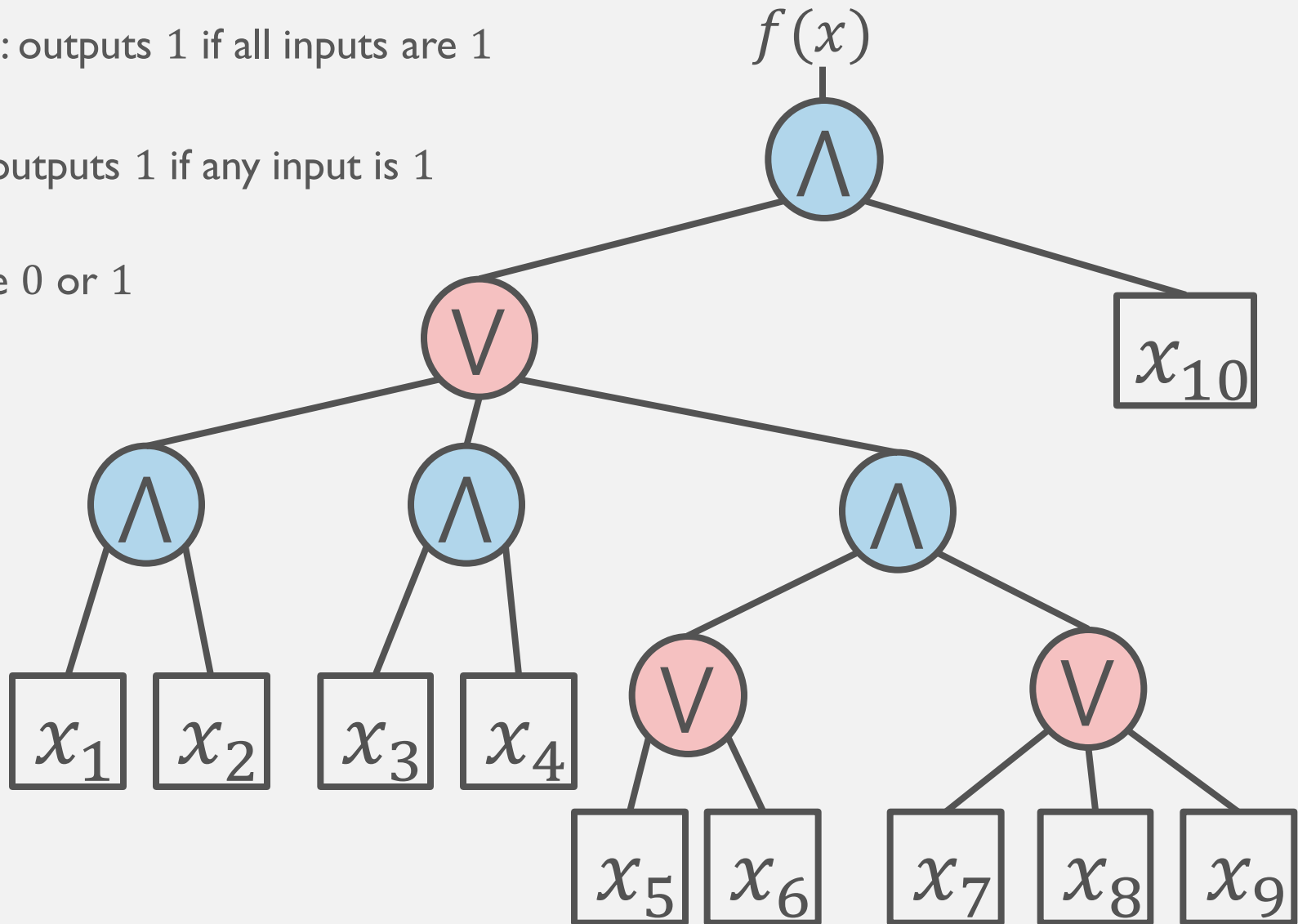
- A. Introduction to st-connectivity
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  - 1. Applies to a wide range of problems
    - Evaluating Boolean formulas reduces to st-connectivity
  - 2. Easy to understand (without knowing quantum mechanics)

# Boolean Formulas

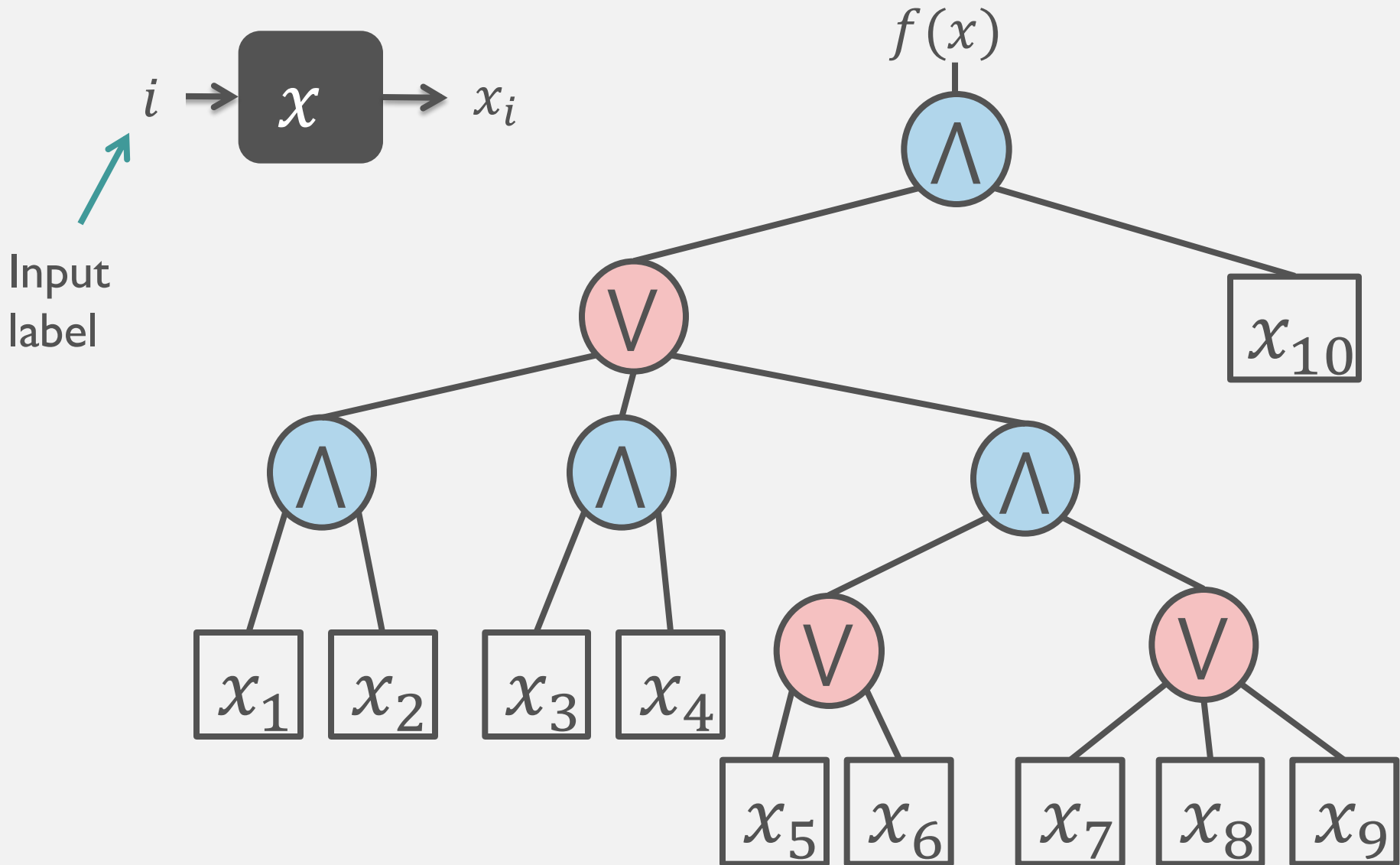
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$\bigvee$  *OR*: outputs 1 if any input is 1

$x_i$  Value 0 or 1



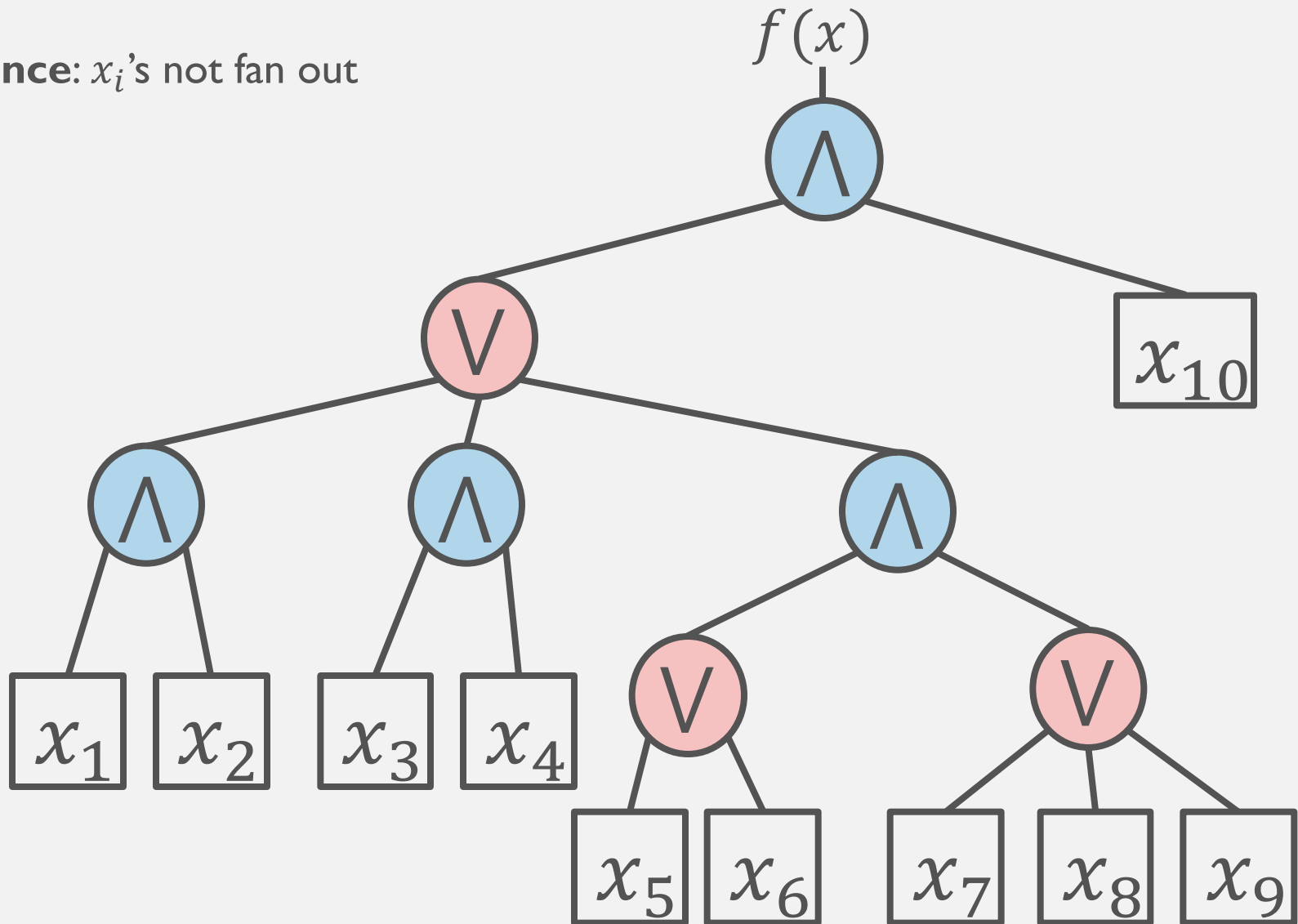
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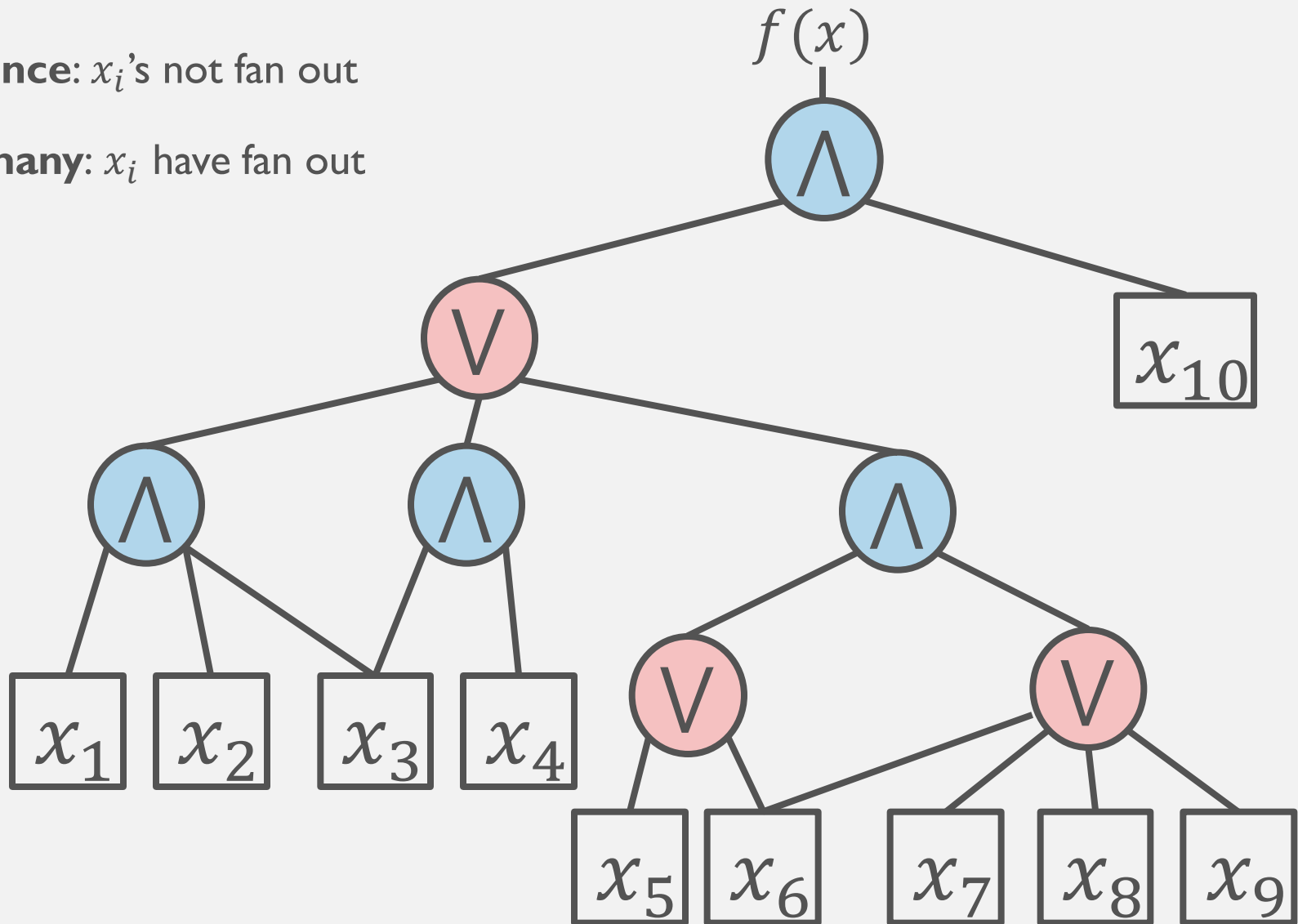
Read-once:  $x_i$ 's not fan out



# Boolean Formulas

**Read-once:**  $x_i$ 's not fan out

**Read-many:**  $x_i$  have fan out

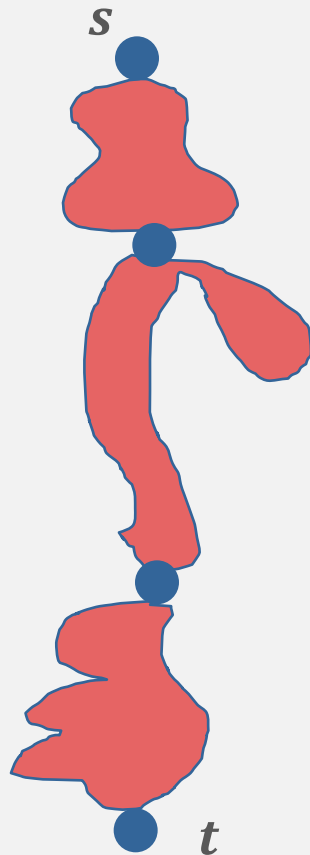


# Boolean Formula Applications

- Logic
- Designing electrical circuits
- Game theory (deciding who will win a game)
- Combinatorics and graph problems
- Linear programming
- Testing potential solution to an NP-complete problem

# Application to Boolean Formulas

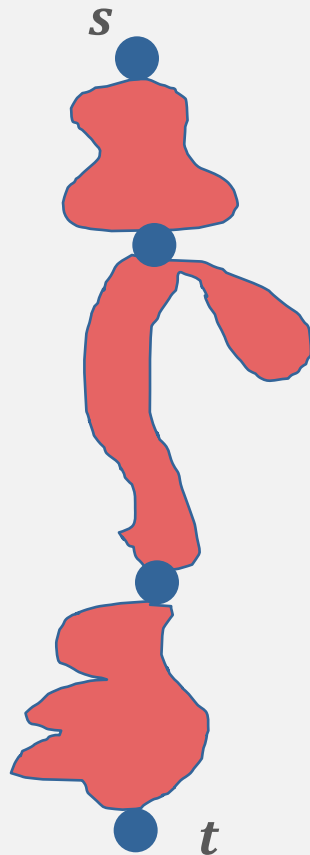
$\wedge$  *AND*: outputs 1 if all input subformulas have value 1



$s$  and  $t$  are connected if all subgraphs are connected

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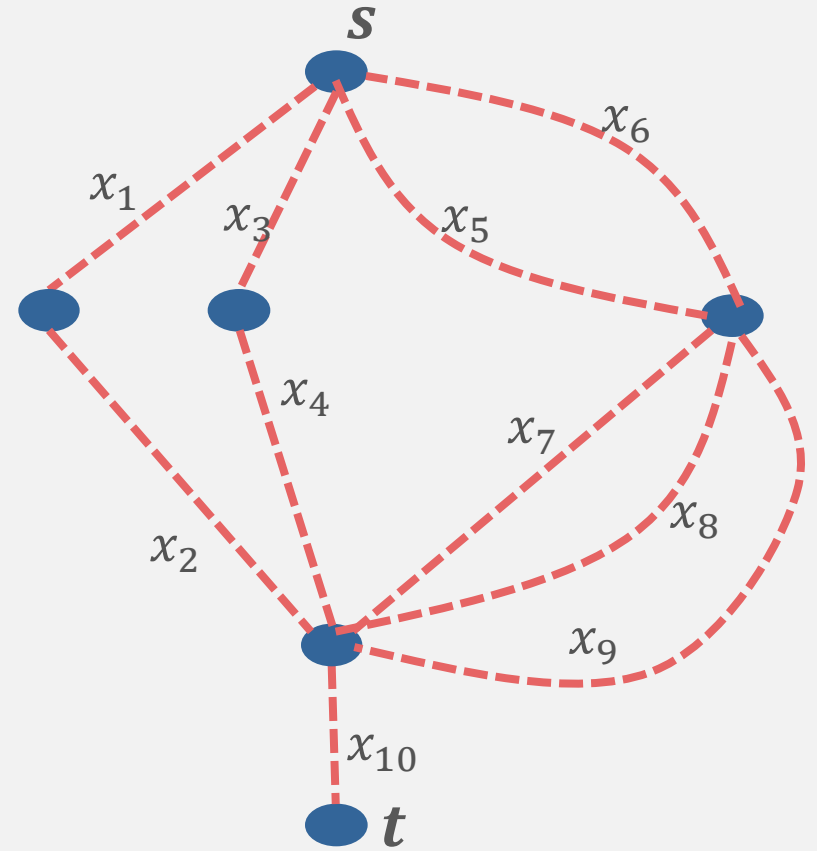
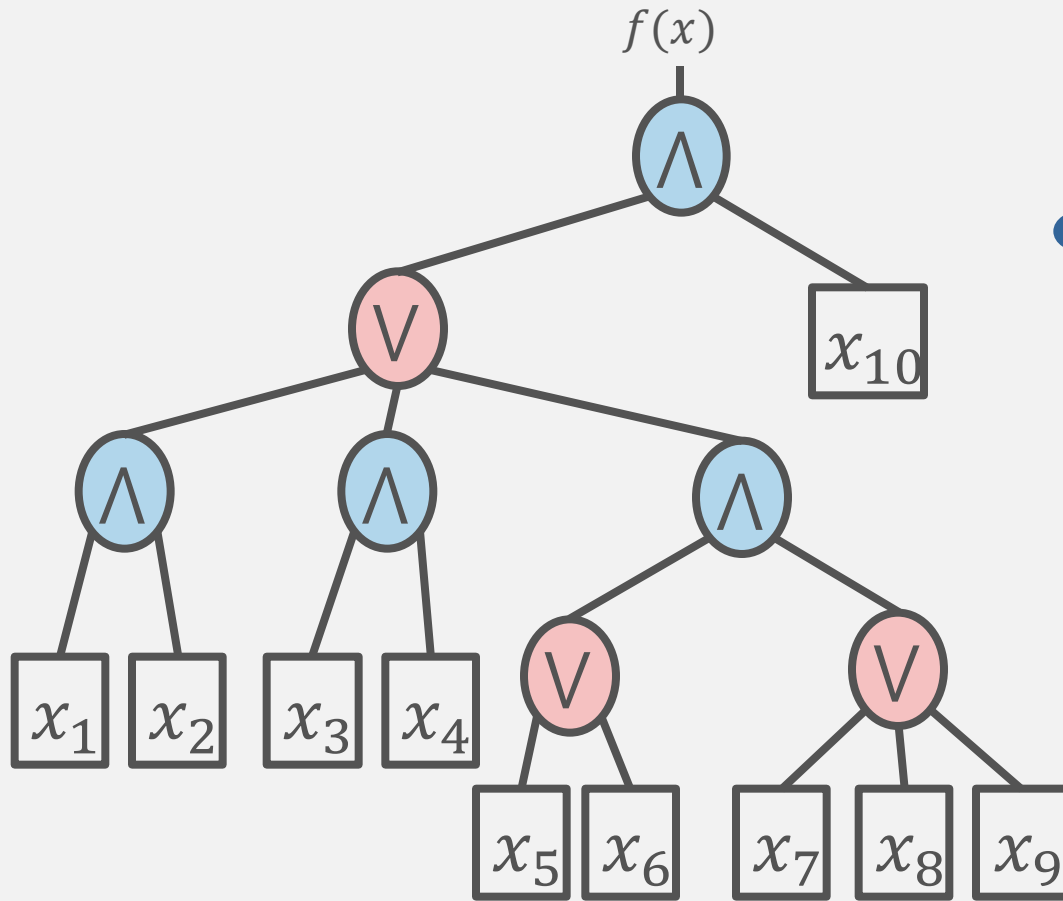
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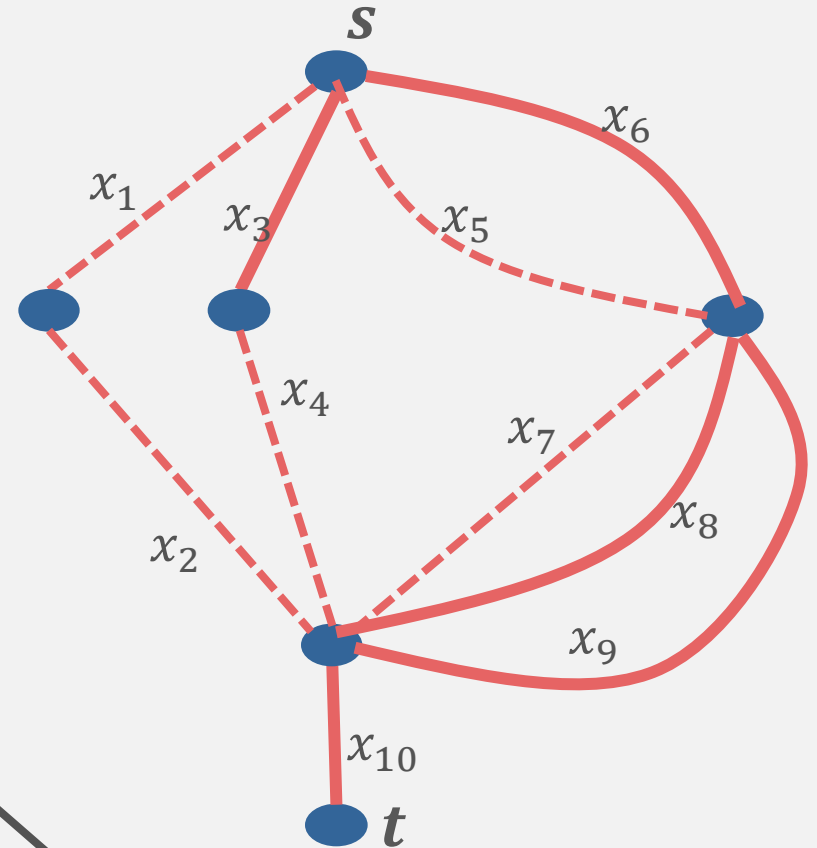
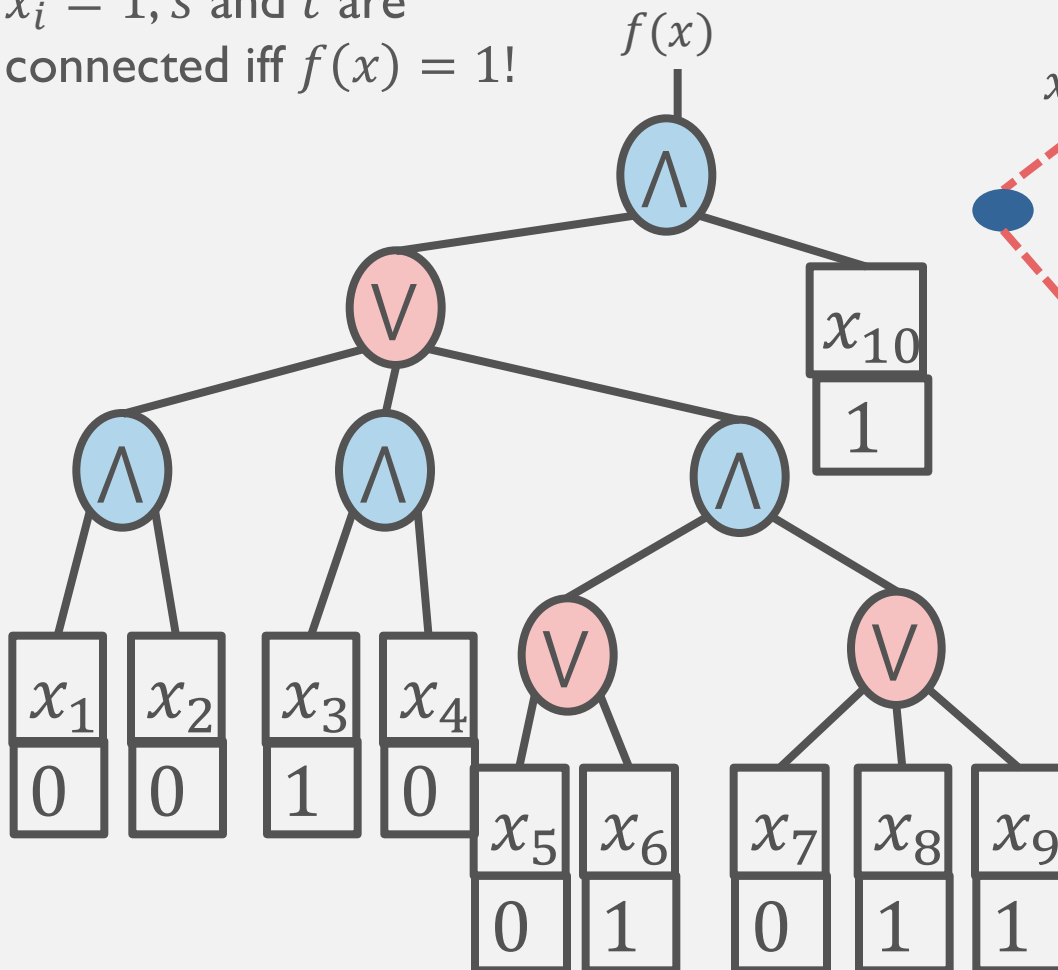
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# Application to Boolean Formulas

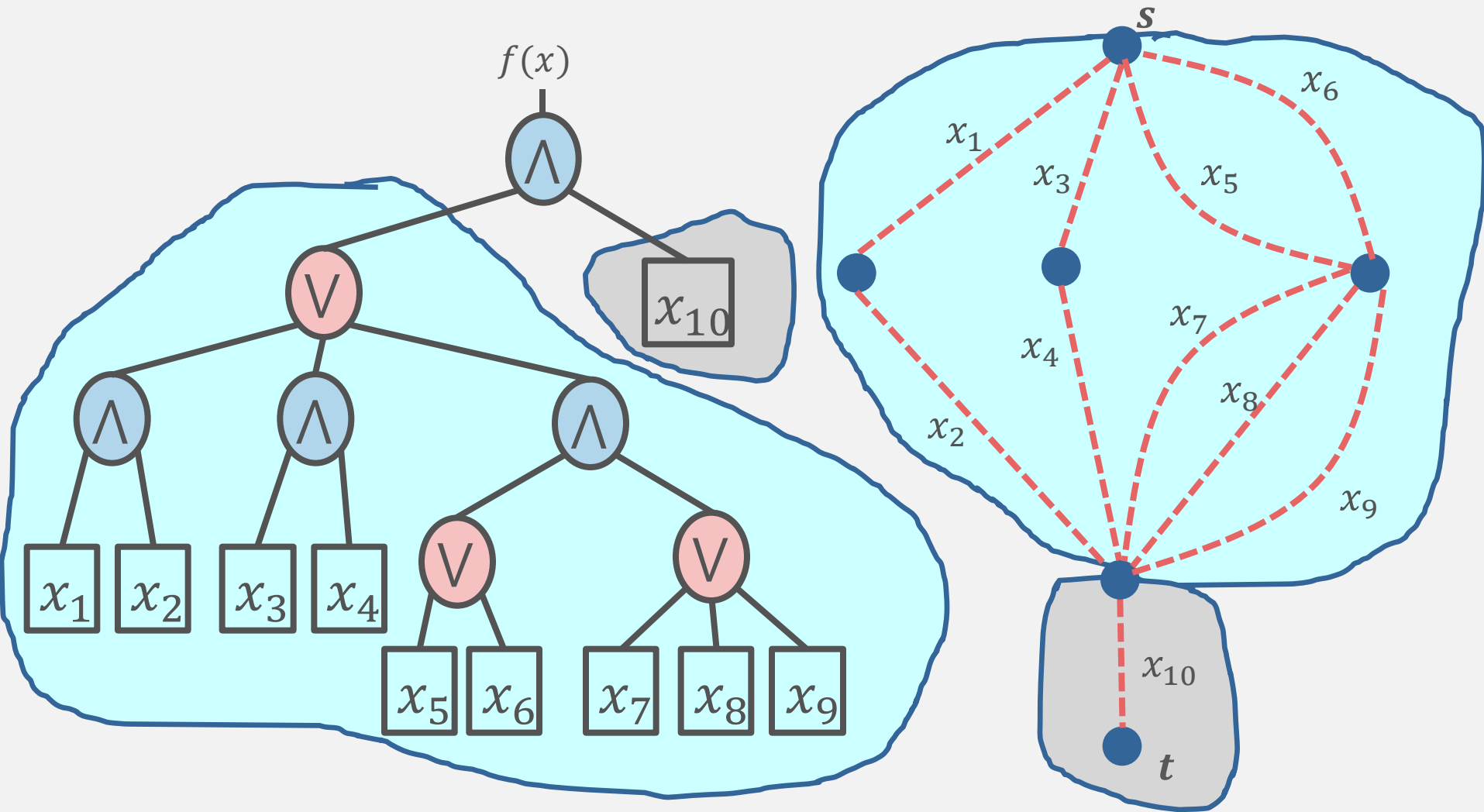


# Application to Boolean Formulas

- If we put edges where  $x_i = 1$ ,  $s$  and  $t$  are connected iff  $f(x) = 1$ !

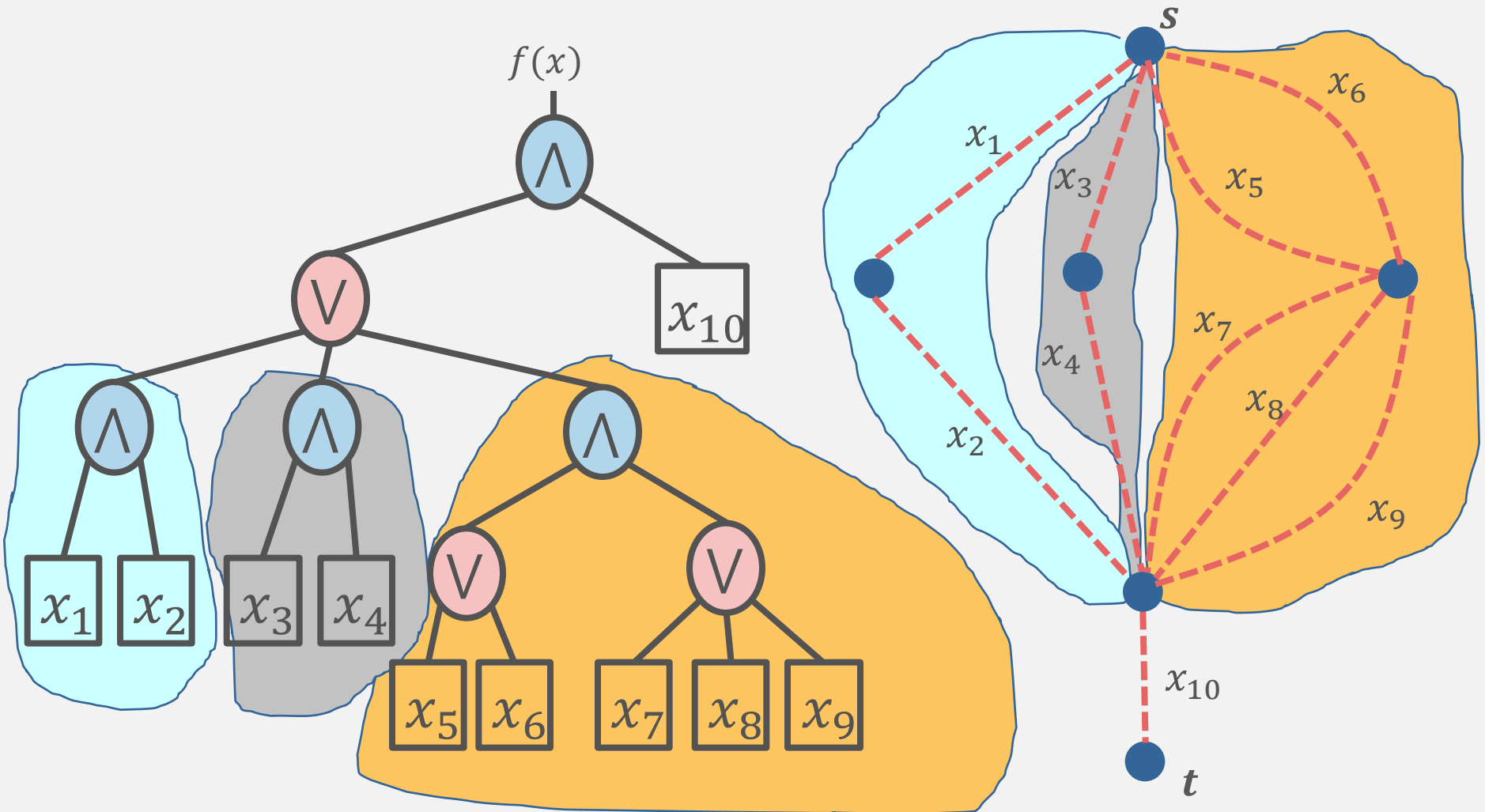


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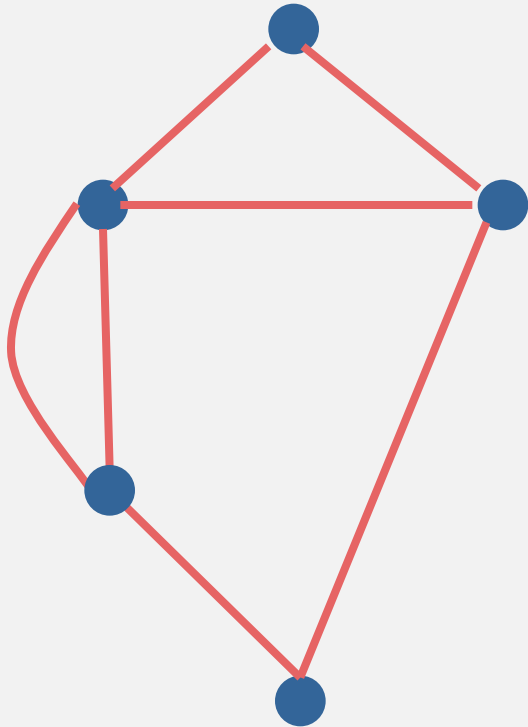


# Outline:

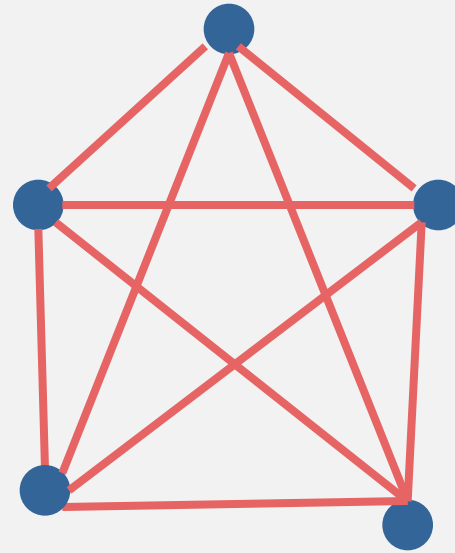
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# Planar Graph

Planar



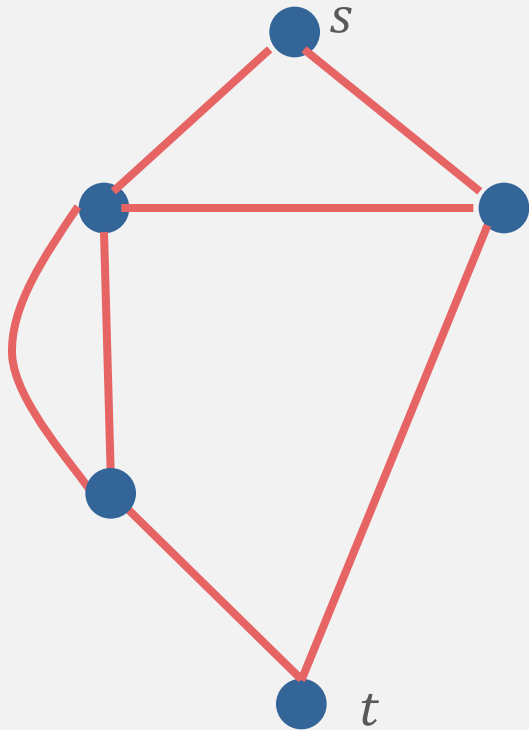
Not Planar



# Planar Graph including $(s, t)$ Edge

Can add an edge from  $s$  to  $t$  and graph is still planar

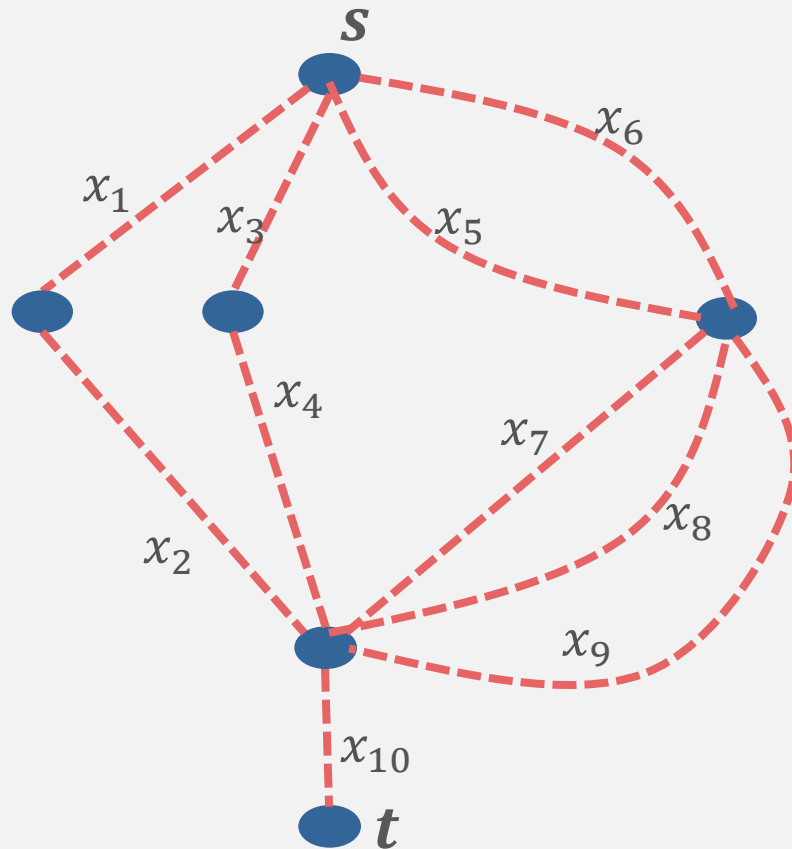
YES



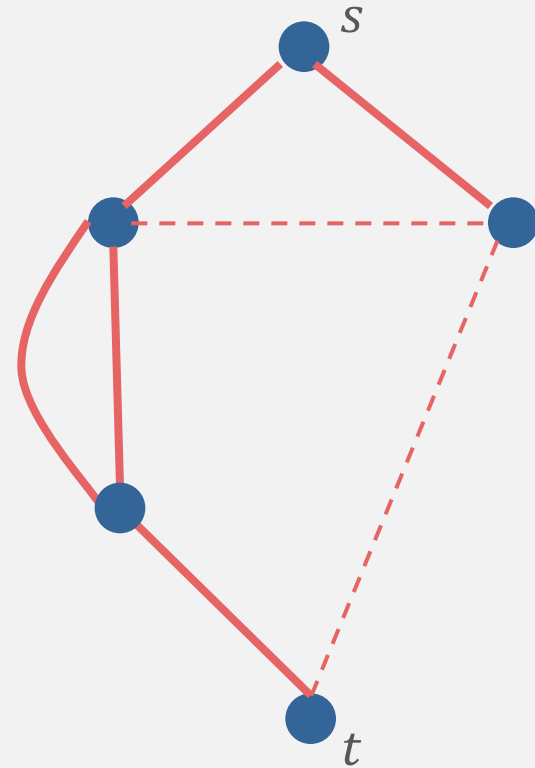
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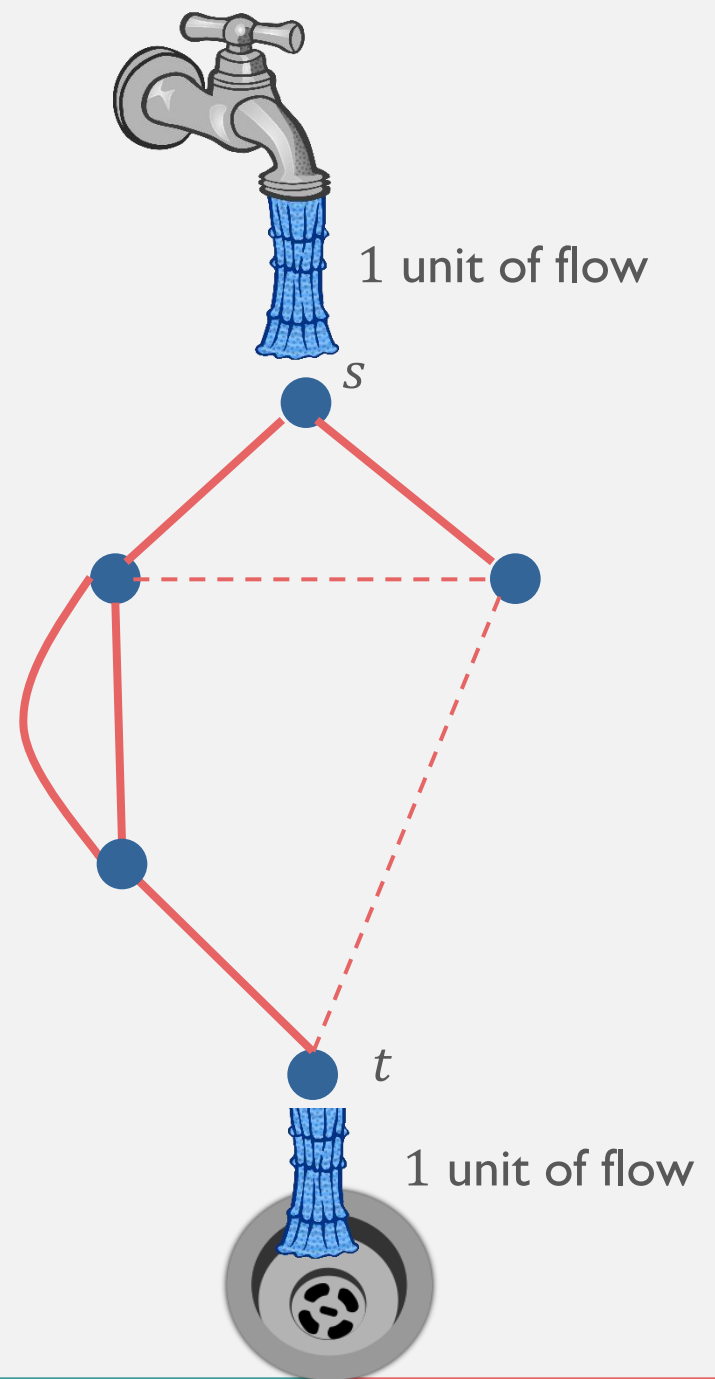
Graph created during reduction from Boolean formula problem has this property by construction.



# Effective Resistance



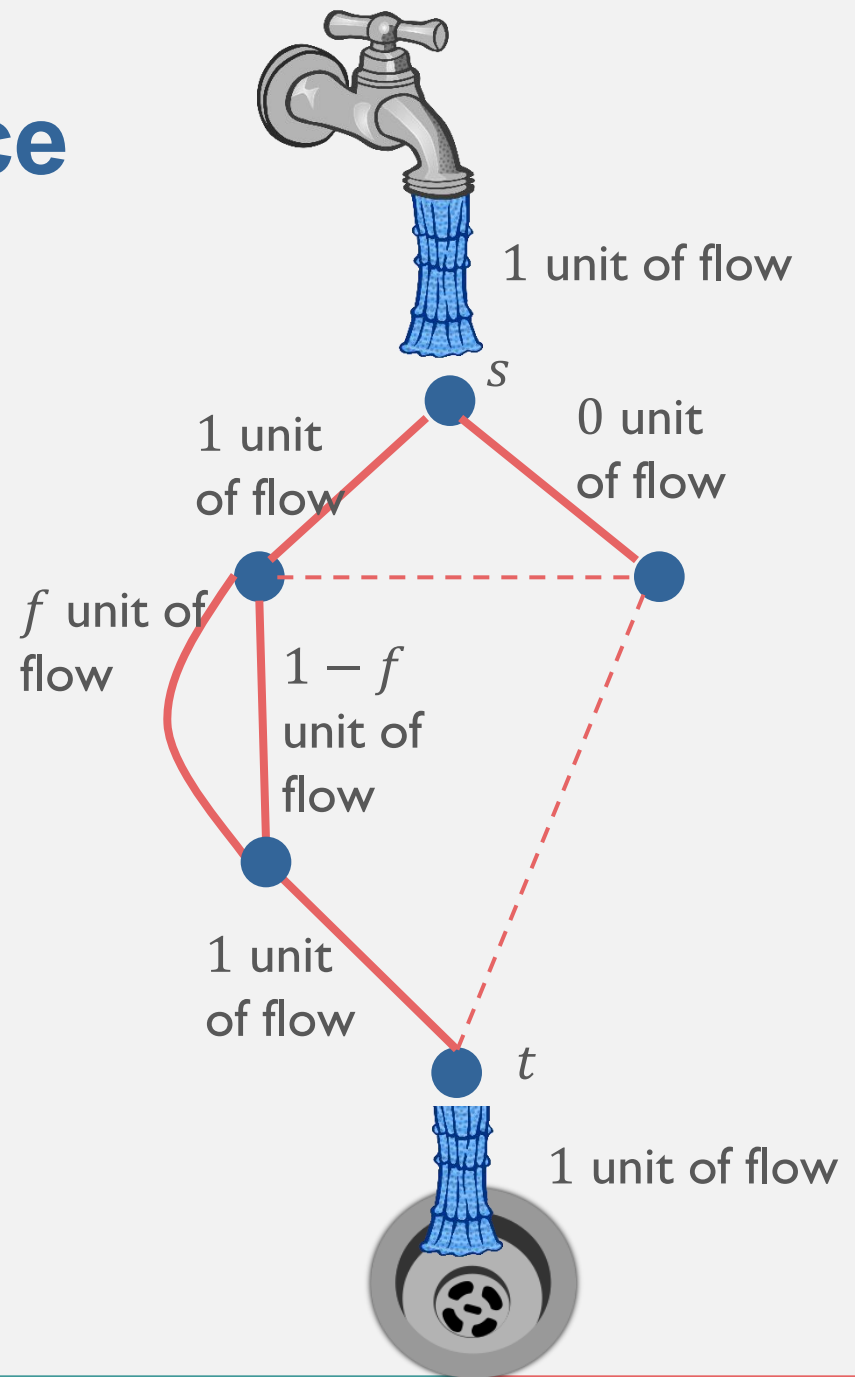
# Effective Resistance



# Effective Resistance

Valid flow:

- 1 unit in at  $s$
- 1 unit out at  $t$
- At all other nodes, zero net flow

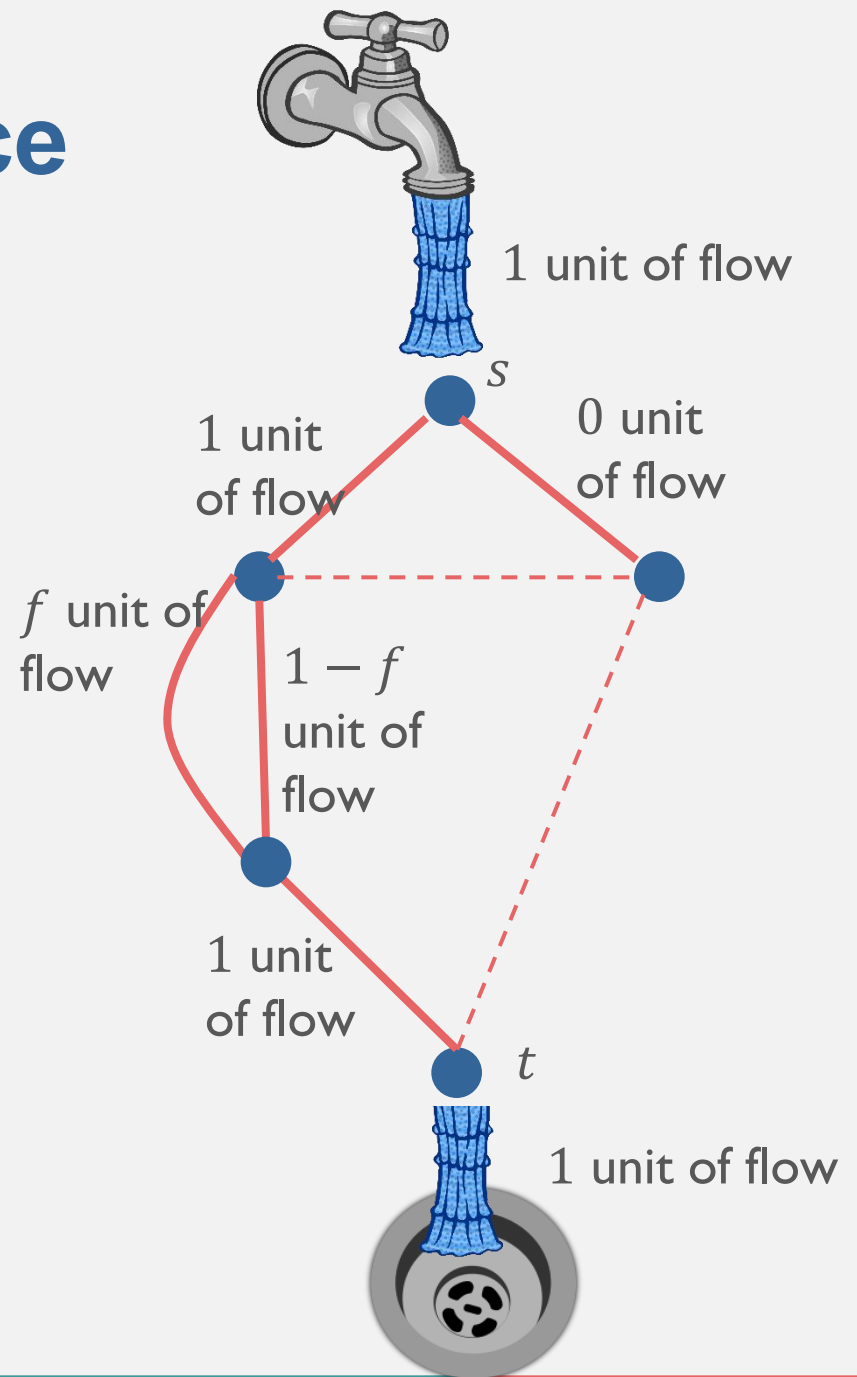




# Effective Resistance

Flow energy:

$$\sum_{edges} (flow\ on\ edge)^2$$



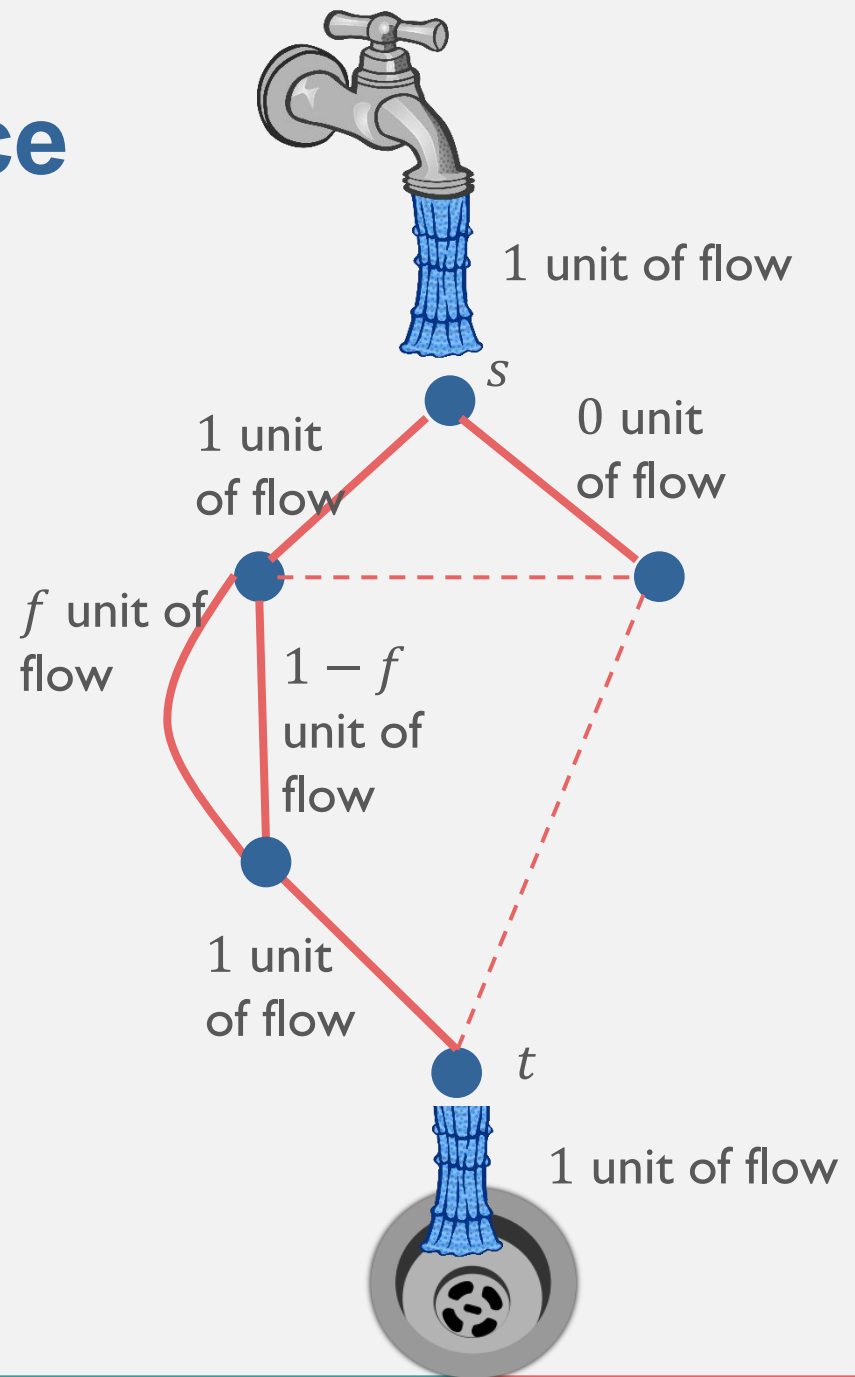
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Effective Resistance:  $R_{s,t}(G)$

Smallest energy of any valid flow from  $s$  to  $t$  on  $G$ .



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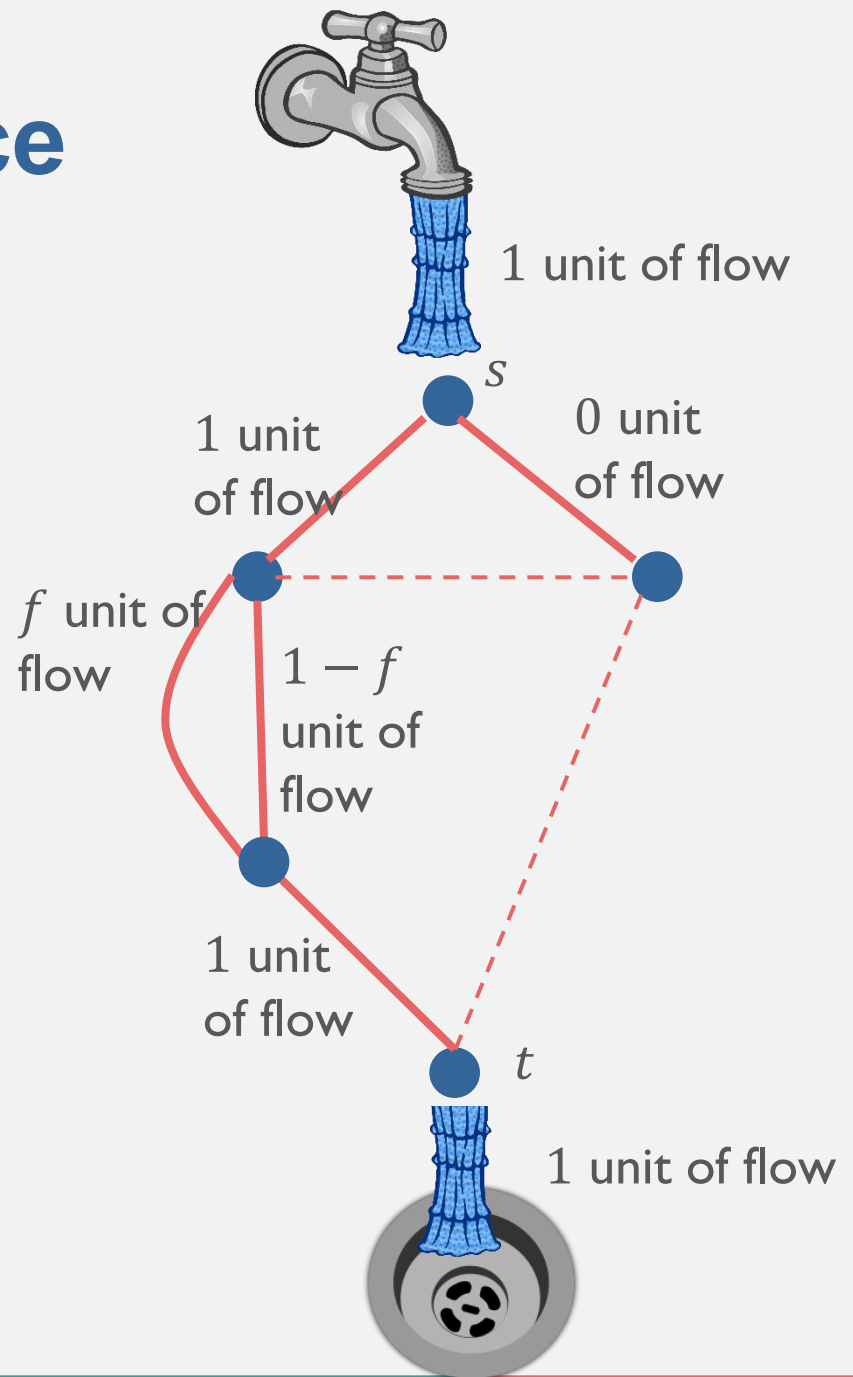
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Effective Resistance:  $R_{s,t}(G)$

Smallest energy of any valid flow from  $s$  to  $t$  on  $G$ .

Properties of  $R_{s,t}(G)$

- Small if many short paths from  $s$  to  $t$
- Large if few long paths from  $s$  to  $t$
- Infinite if  $s$  and  $t$  not connected



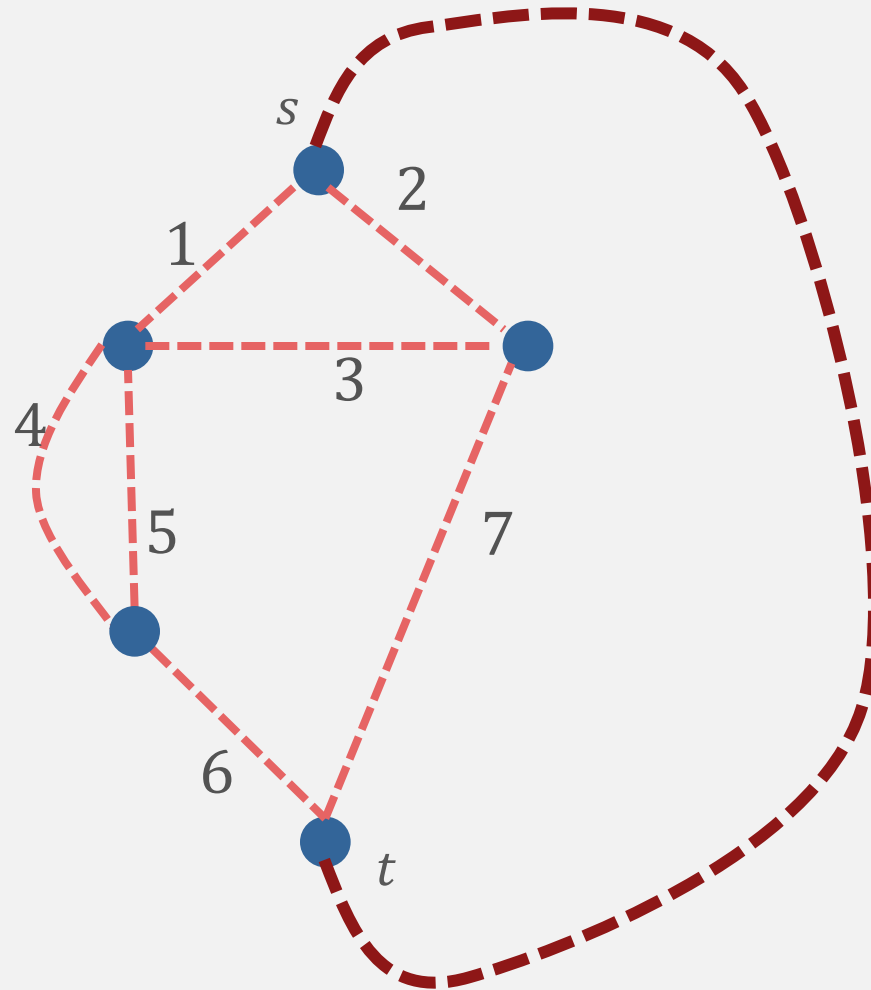
# Algorithm Performance:

Planar graph<sup>†</sup> st-connectivity algorithm complexity =

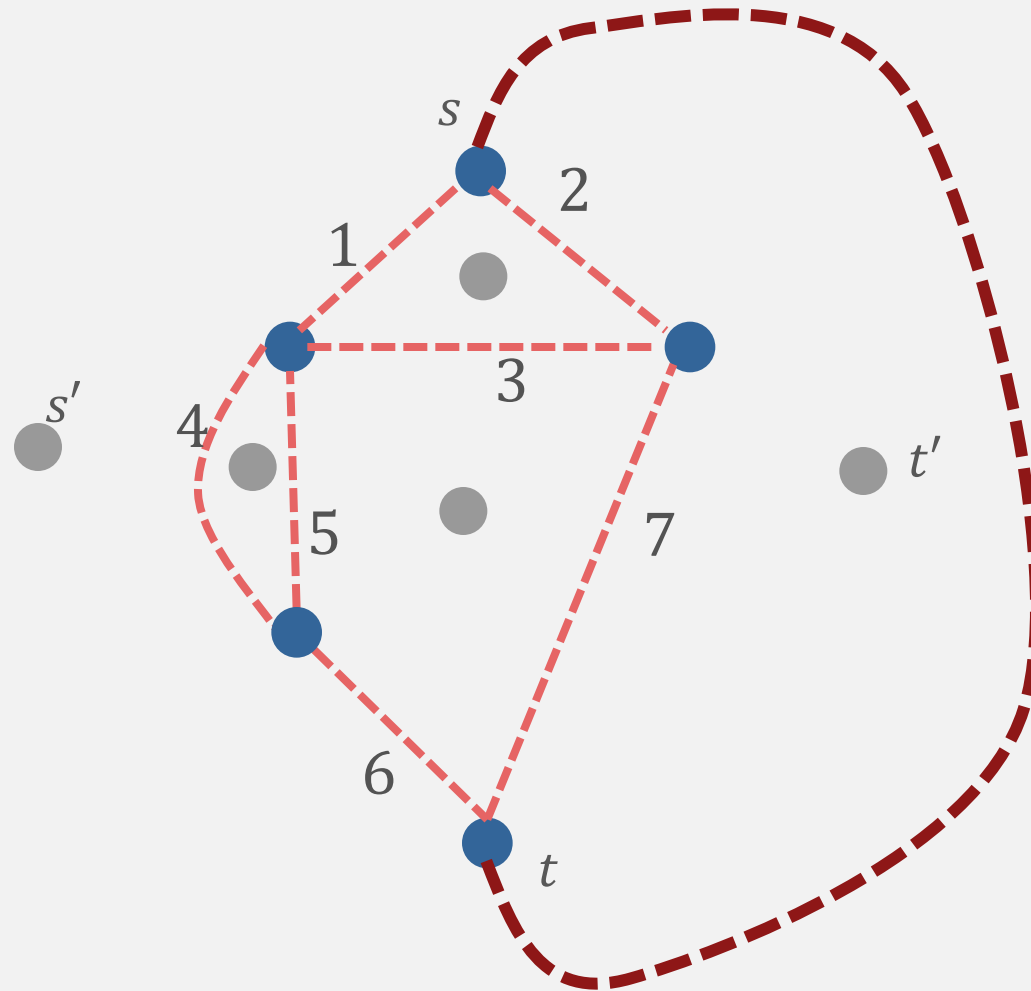
$$O \left( \sqrt{\max_{G \in \mathcal{H}: \text{connected}} R_{s,t}(G)} \sqrt{\max_{G \in \mathcal{H}: \text{not connected}} R_{s',t'}(G')} \right)$$

<sup>†</sup> with  $(s, t)$  added also planar

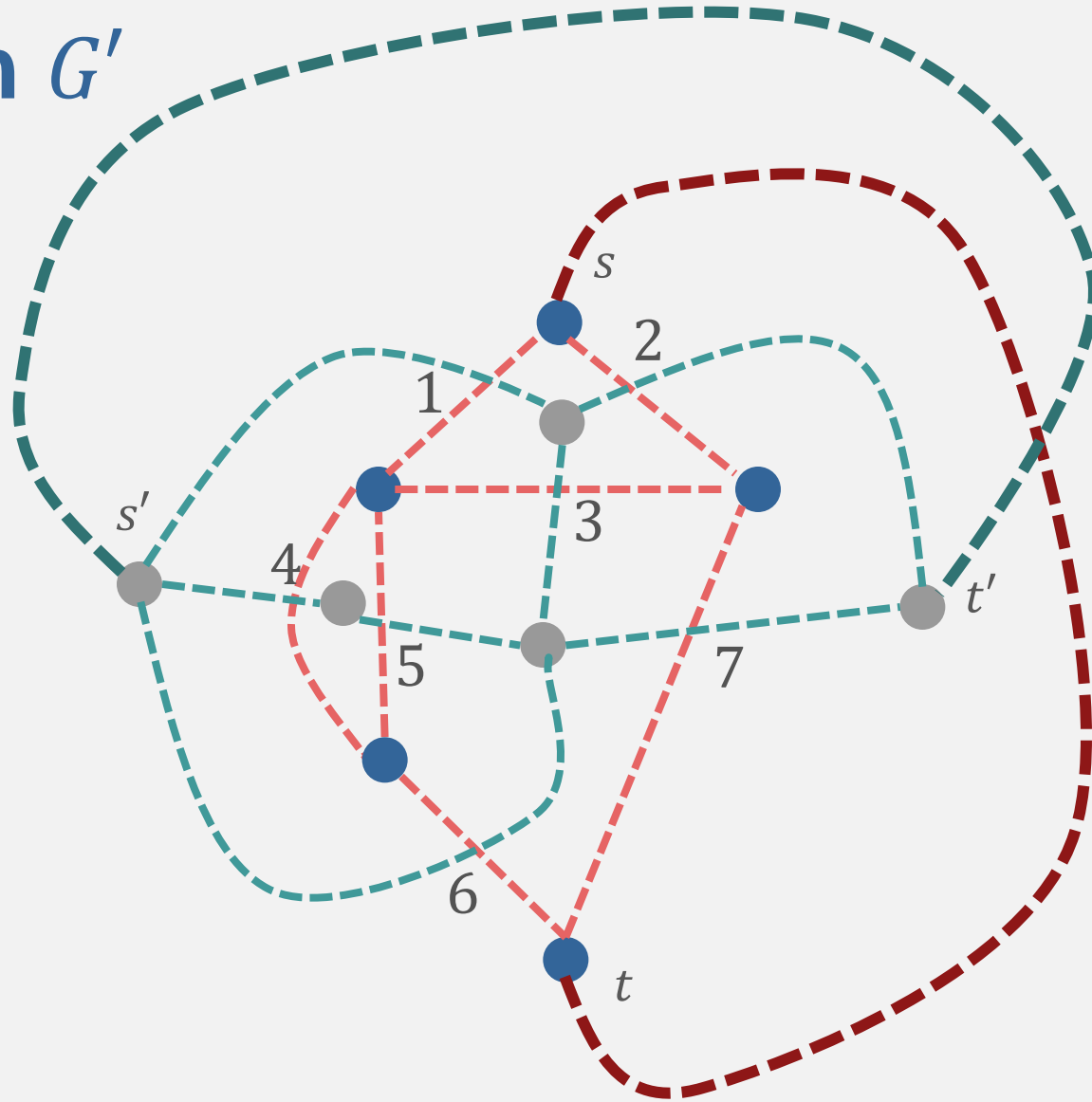
# Graph $G'$



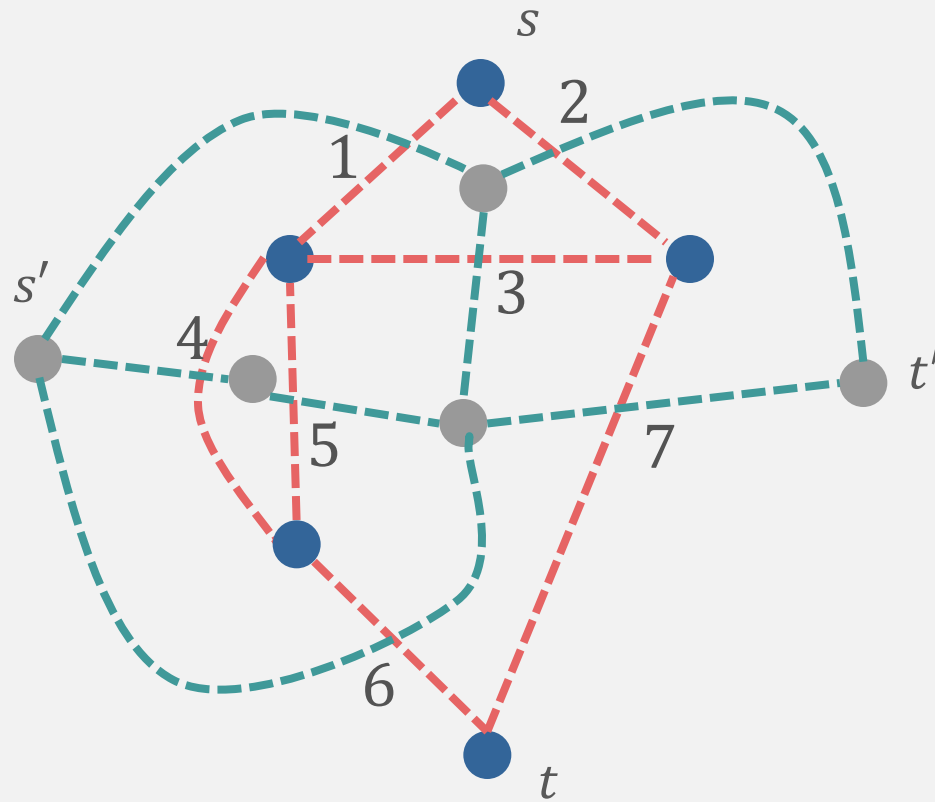
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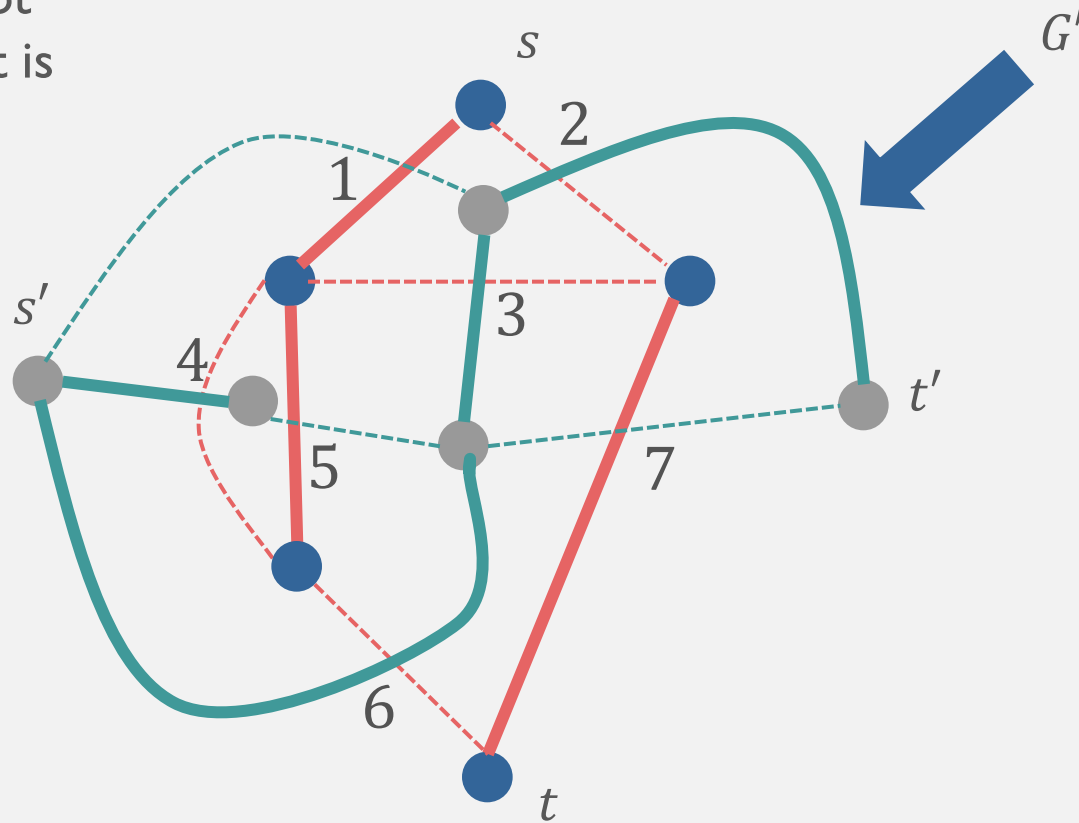
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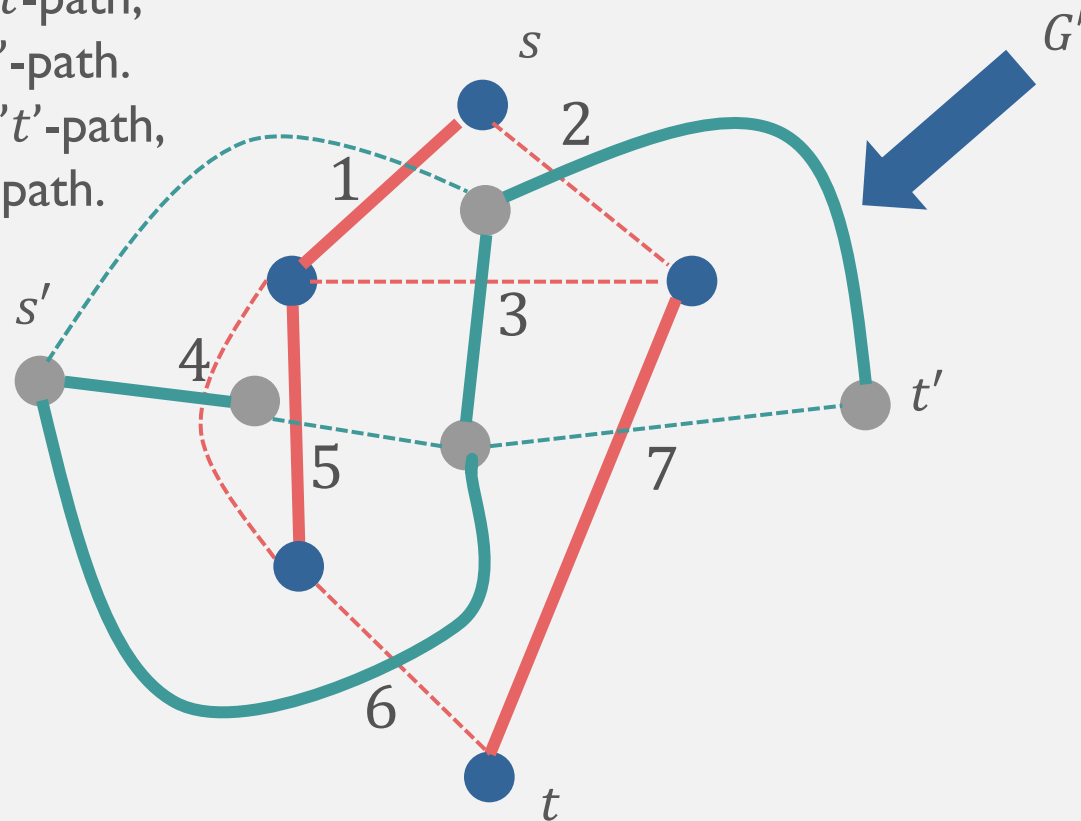
# Graph $G'$

- If an edge is not present in  $G$ , it is present in  $G'$



# Graph $G'$

- If there is an  $st$ -path, there is no  $s't'$ -path.
- If there is an  $s't'$ -path, there is no  $st$ -path.



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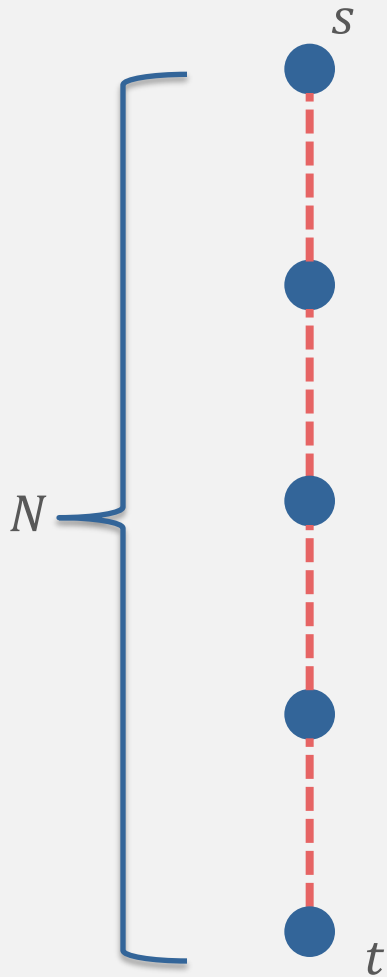
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# Example

What is quantum complexity of deciding  $AND(x_1, x_2, \dots, x_N)$ , promised

- All  $x_i = 1$ , or
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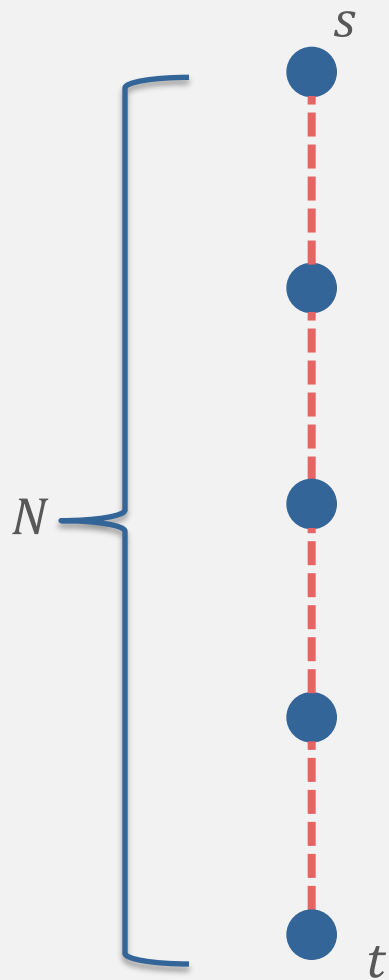
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What is quantum complexity of deciding if

- $s$  and  $t$  are connected, or
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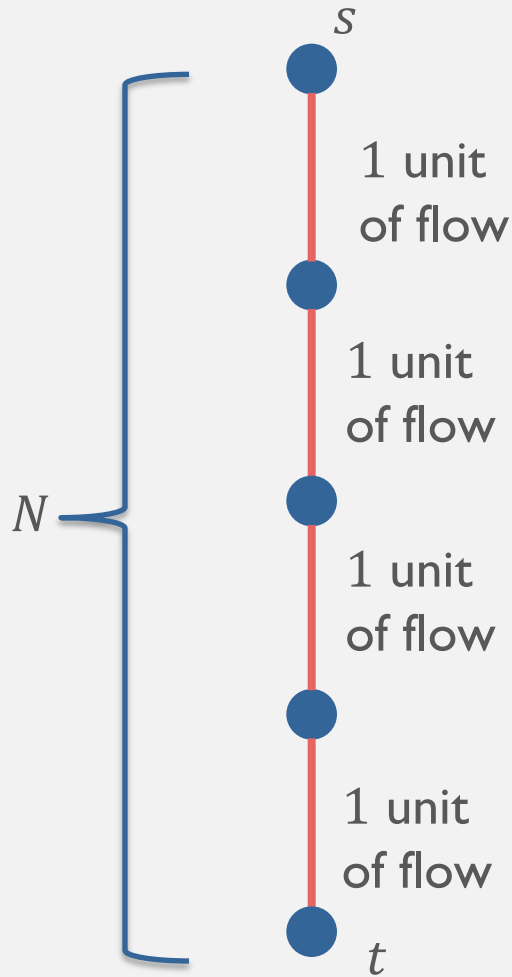


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$$\sqrt{\max_{G \in \mathcal{H}: \text{connected}} R_{s,t}(G)} \quad \sqrt{\max_{G \in \mathcal{H}: \text{not connected}} R_{s',t'}(G')}$$

# Example



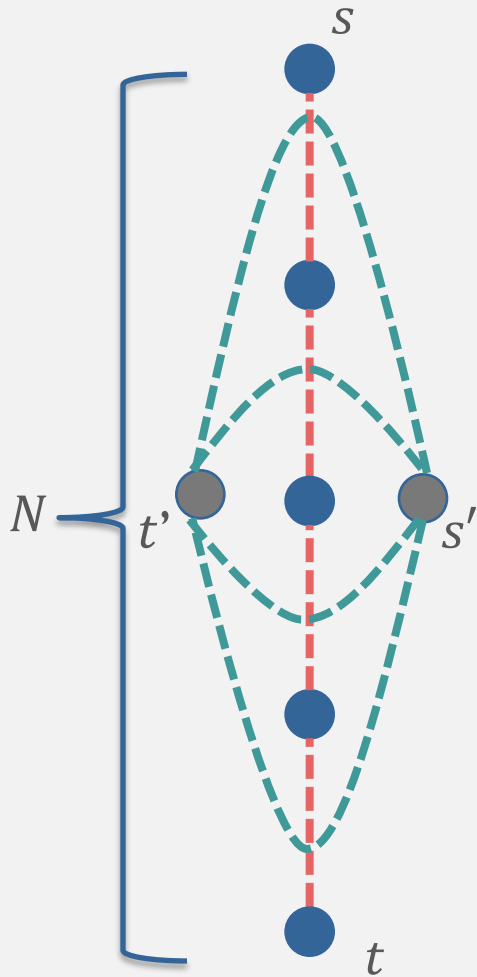
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$$\max_{G \in \mathcal{H}: \text{connected}} R_{s,t}(G) = N$$

# Example



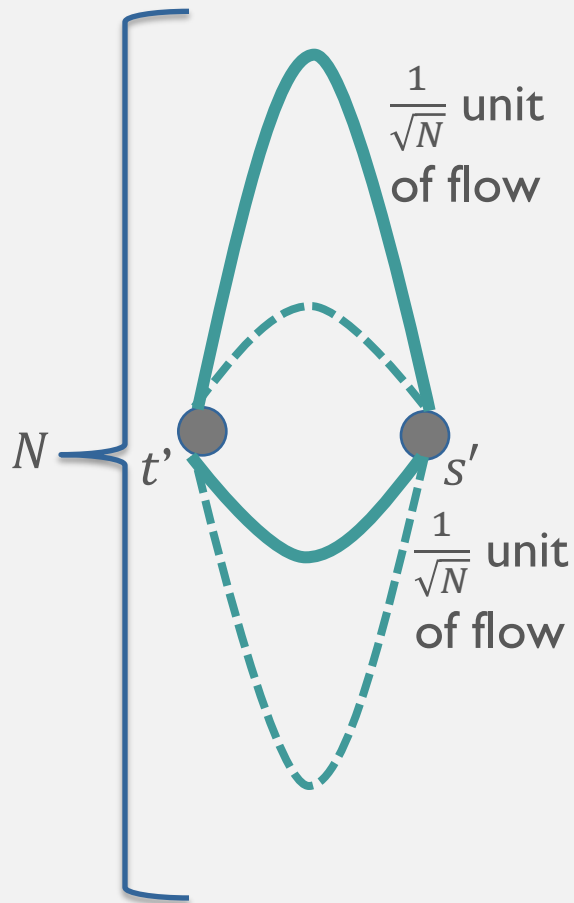
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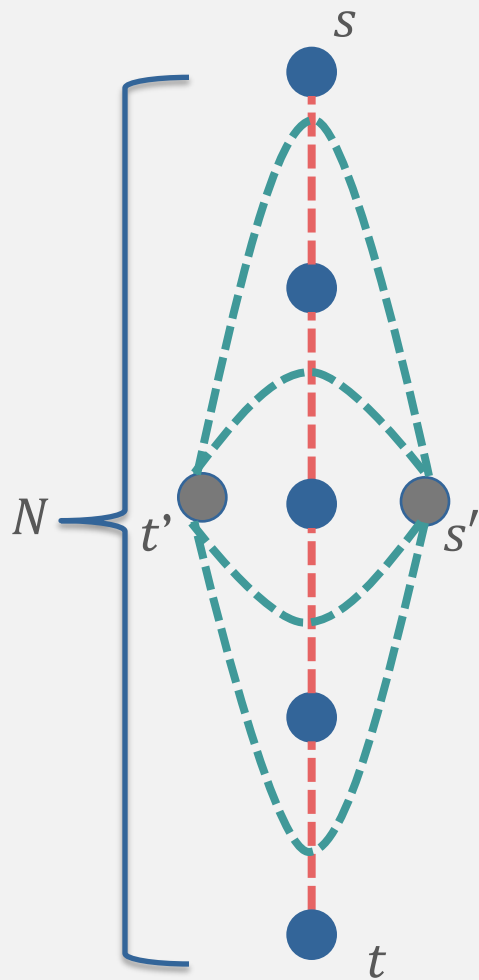
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$$\max_{G \in \mathcal{H}: \text{not connected}} R_{s,t}(G') = 1/\sqrt{N}$$

# Example



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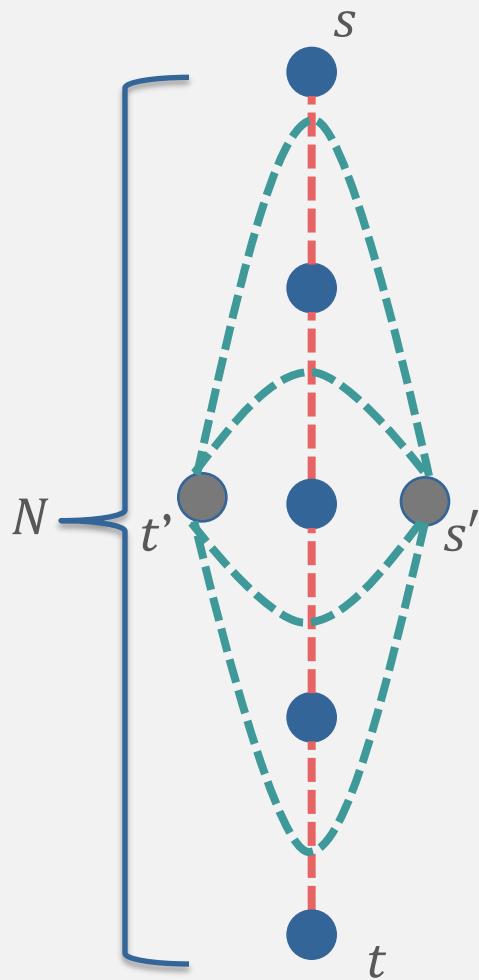
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$\downarrow$   
 $N$

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 $1/\sqrt{N}$

Quantum complexity is  $O(N^{1/4})$

# Example



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$\downarrow$   $\downarrow$   
 $N$   $1/\sqrt{N}$

Quantum complexity is  $O(N^{1/4})$

Randomized classical complexity is  $\Omega(N^{1/2})$

# Algorithm Performance:

Planar graph<sup>†</sup> st-connectivity algorithm complexity =

$$O \left( \sqrt{\max_{G \in \mathcal{H}: \text{connected}} R_{s,t}(G, w)} \sqrt{\max_{G \in \mathcal{H}: \text{not connected}} R_{s',t'}(G', w^{-1})} \right)$$

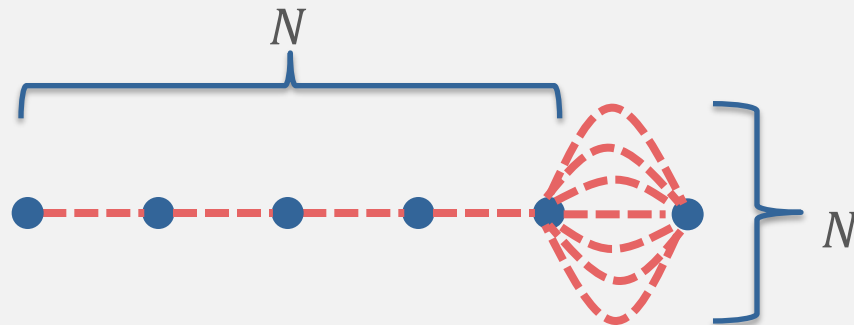
<sup>†</sup> with  $(s, t)$  added also planar

# Performance

- Improvement over previous quantum  $st$  –connectivity algorithm
  - Find a family of graphs with  $N$  edges such that our algorithm uses  $O(1)$  queries, previous best algorithm uses  $O(N^{1/4})$  queries

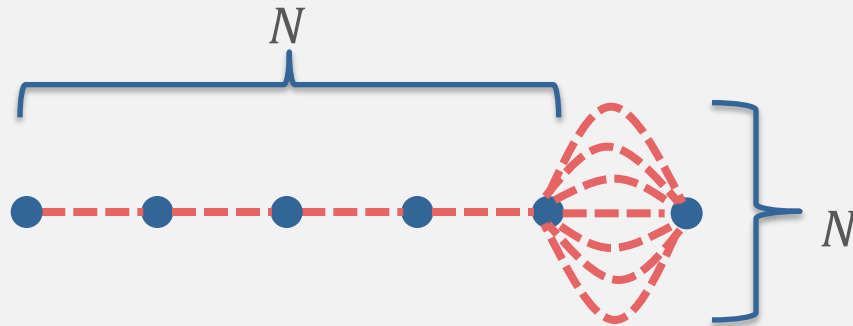
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- Series-parallel graphs, our algorithm uses  $O(N^{1/2})$  queries, previous best algorithm uses  $O(N)$  queries

# Performance

- Comparison to previous Boolean formula algorithm
  - Match celebrated result that  $O(\sqrt{N})$  queries required for total read-once Boolean formulas, but proof is simple!
  - Extend super-polynomial quantum to classical speed-up for families of NAND-trees [ZKH'12, K'13]



# Update

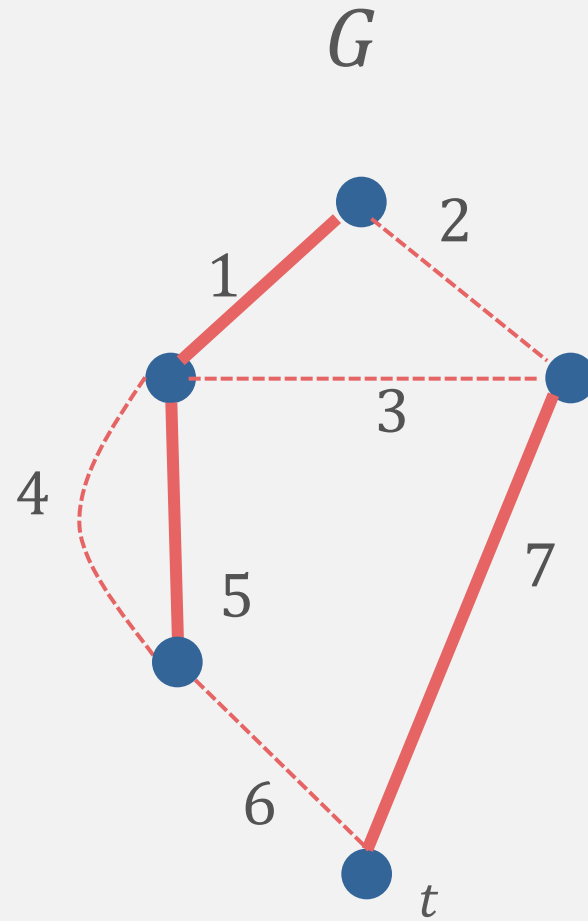
Non-planar st-connectivity algorithm complexity =

$$O \left( \sqrt{\max_{G \in \mathcal{H}: \text{connected}} R_{s,t}(G, w)} \sqrt{\max_{G \in \mathcal{H}: \text{not connected}} C_{s,t}(G'', w)} \right)$$

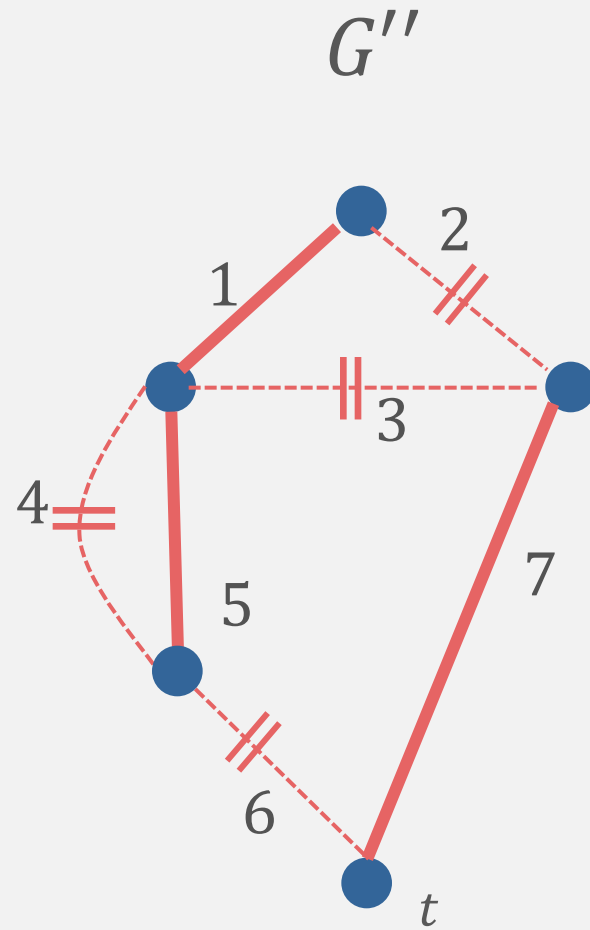


Effective capacitance

# Update



# Update



# Open Questions

- When is our algorithm optimal for Boolean formulas? (Especially partial/read-many formulas)
- Are there other problems that reduce to st-connectivity?
- What is the classical time/query complexity of st-connectivity in the black box model?
- Does our reduction from formulas to connectivity give good classical algorithms too?
- Can we use this graph dual idea to improve other quantum algorithms?

arXiv:1704.00765, with Stacey Jeffery

# Other interests

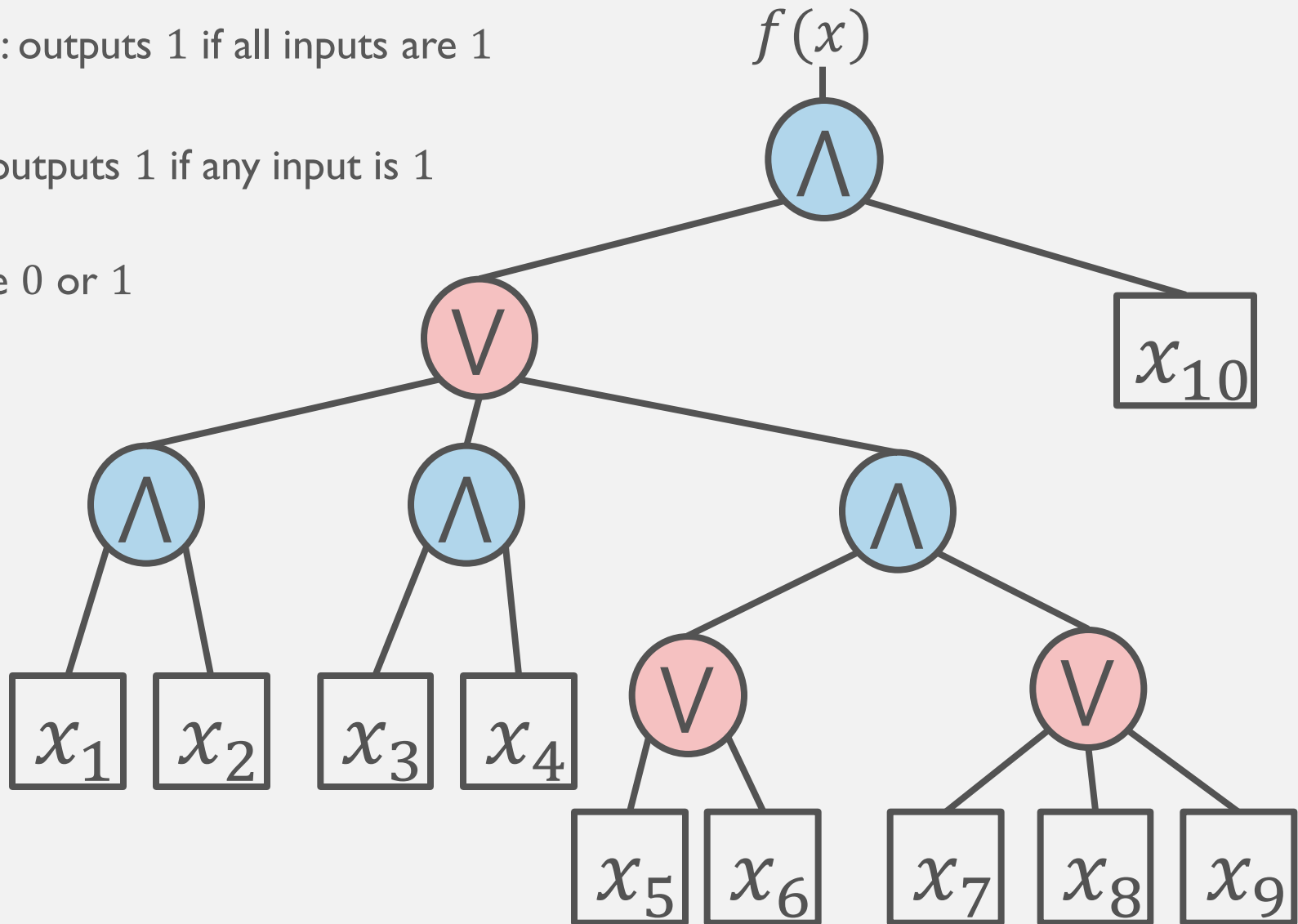
- Statistical inference and machine learning applied to quantum characterization problems
- Quantum complexity theory, especially quantum versions of NP

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$x_i$  Value 0 or 1

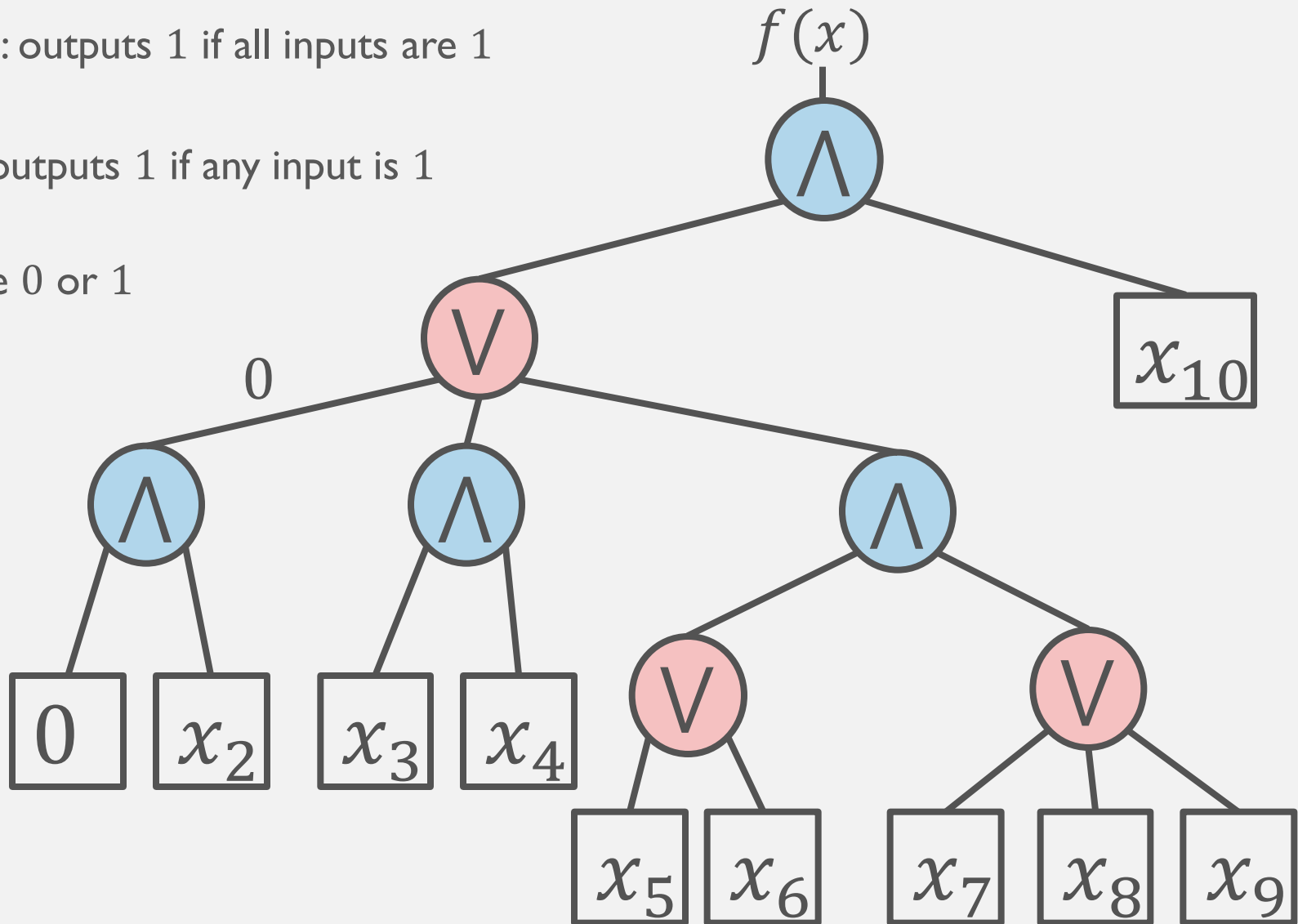


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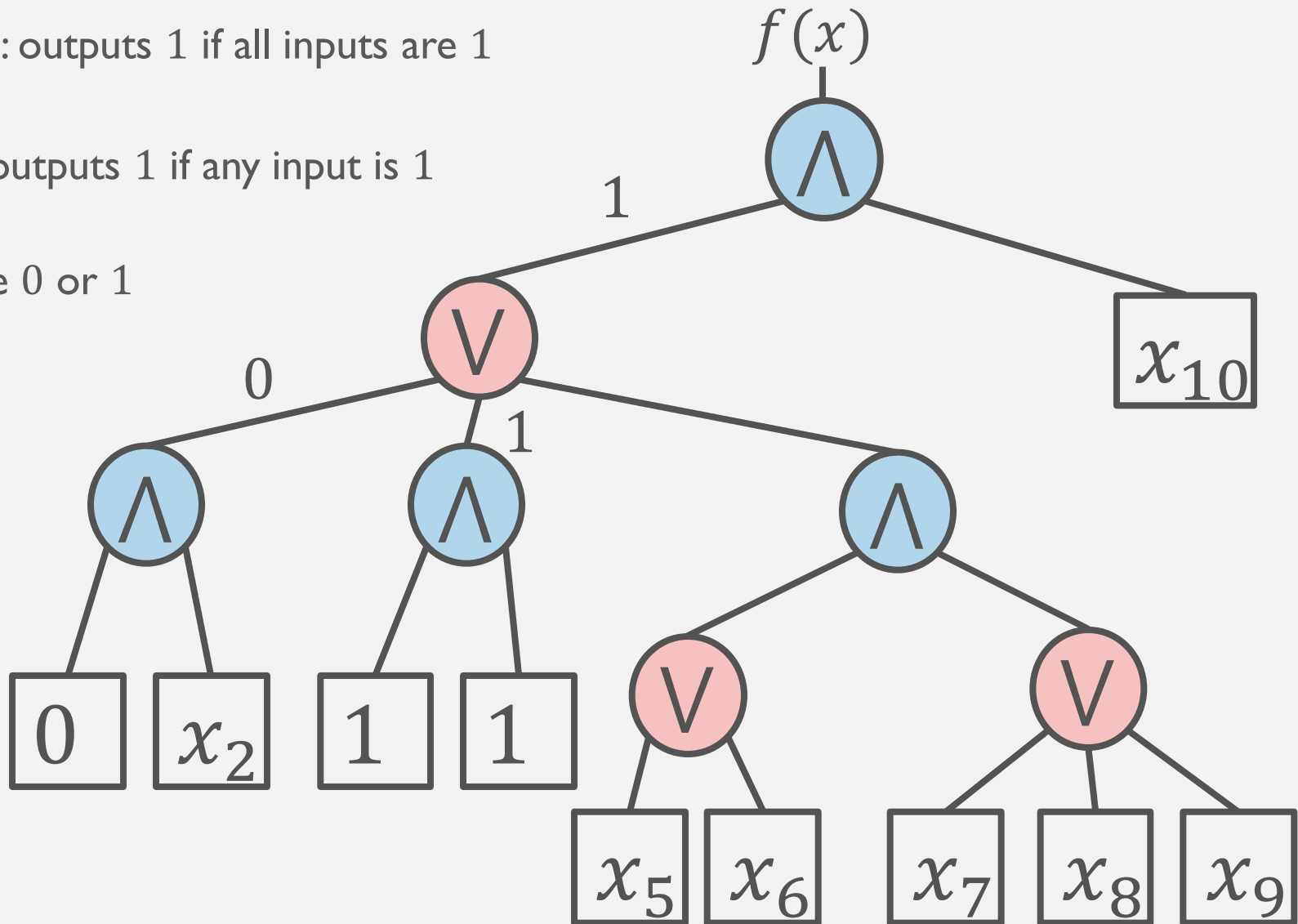


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