

The Complexity of the Network Design Problem



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Outline

- ❖ Introduction
- ❖ P and NP
- ❖ Network Design Problem (NDP)
- ❖ KNAPSACK and NDP
- ❖ SNDP is NP-complete
- ❖ Proof of SNDP
- ❖ Conclusion

Introduction



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Introduction

- ❖ Why we use computer?
- ❖ Solve computational problems!
- ❖ pure theoretical CS
- ❖ applied Mathematics



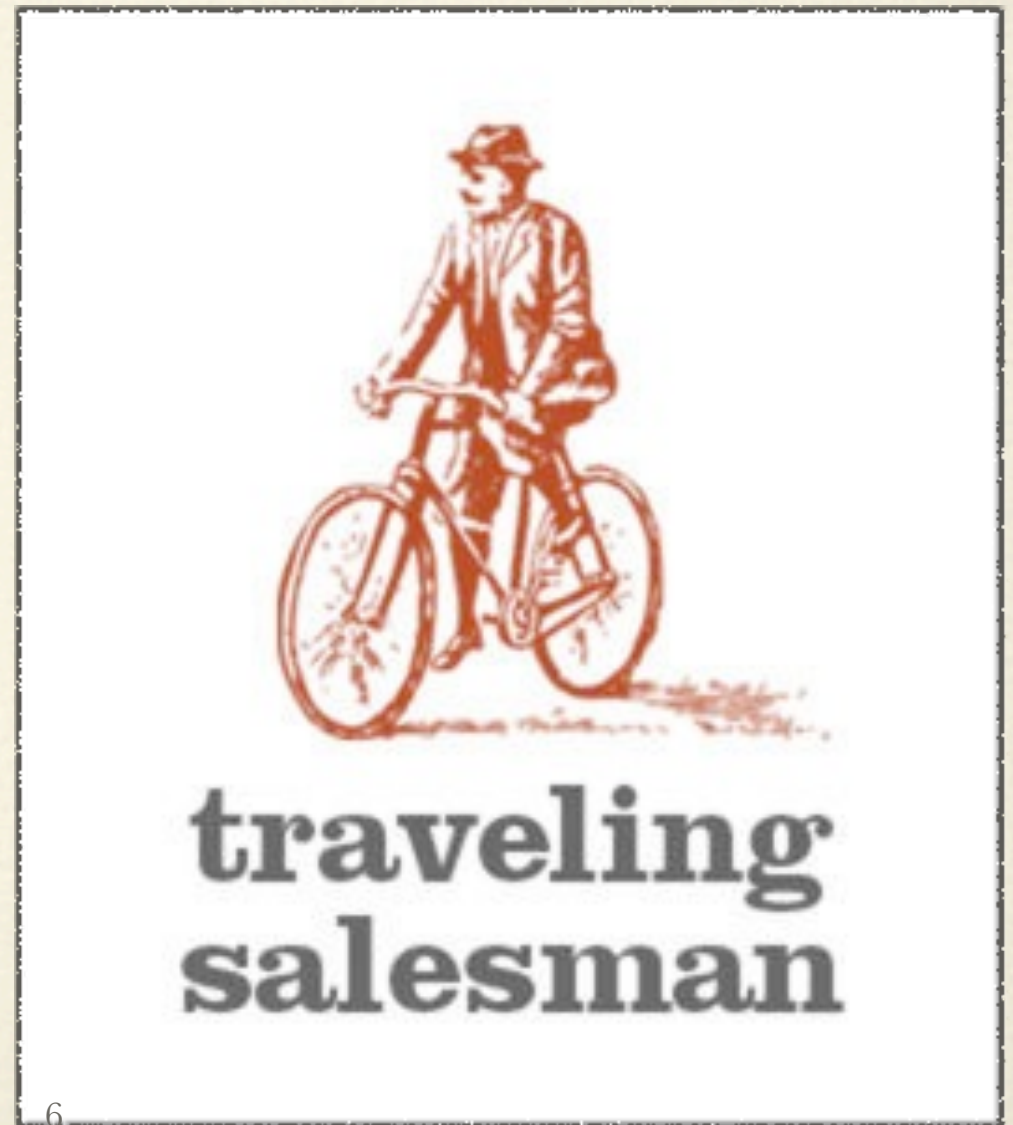
Introduction

- ❖ For some specific purposes:
- ❖ Optimization-define energy/cost/profit..... functions
- ❖ Maximize/minimize them



Introduction

- ❖ Opt. Examples:
- ❖ Shortest path
- ❖ Traveling salesman
- ❖ Texture synthesis
- ❖ Photo cuts



Introduction

❖ Opt. Examples:

We just met this man in midterm!

❖ Shortest path

❖ Traveling salesman

❖ Texture synthesis

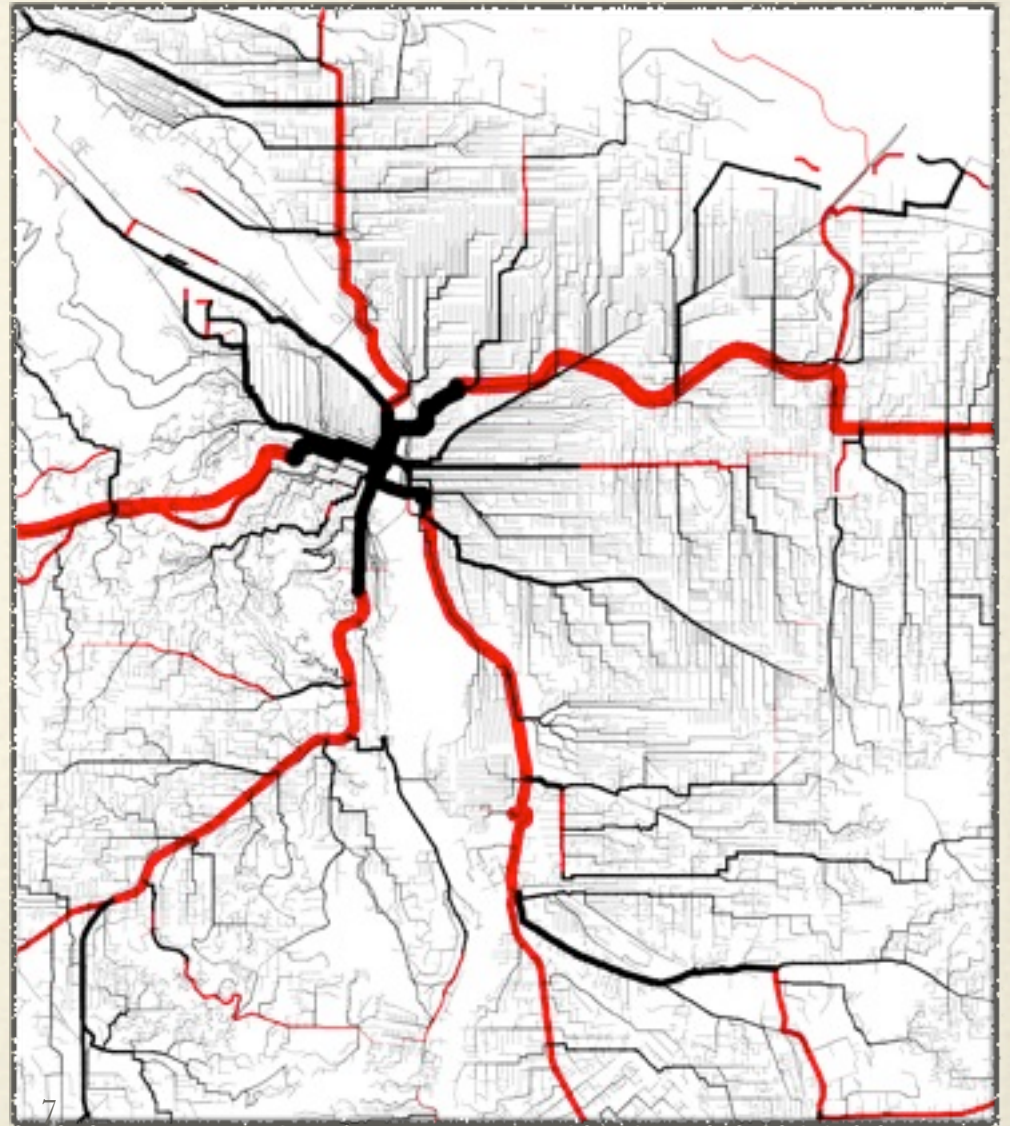
❖ Photo cuts



**traveling
salesman**

Introduction

- ❖ Shortest path:
- ❖ weighted graph
- ❖ directed/undirected
- ❖ Bellman–Ford/
Dijkstra



Introduction

- ❖ Texture synthesis:
- ❖ define energy functions
- ❖ overlap and immerse texture patches
- ❖ computed by energy function minimization



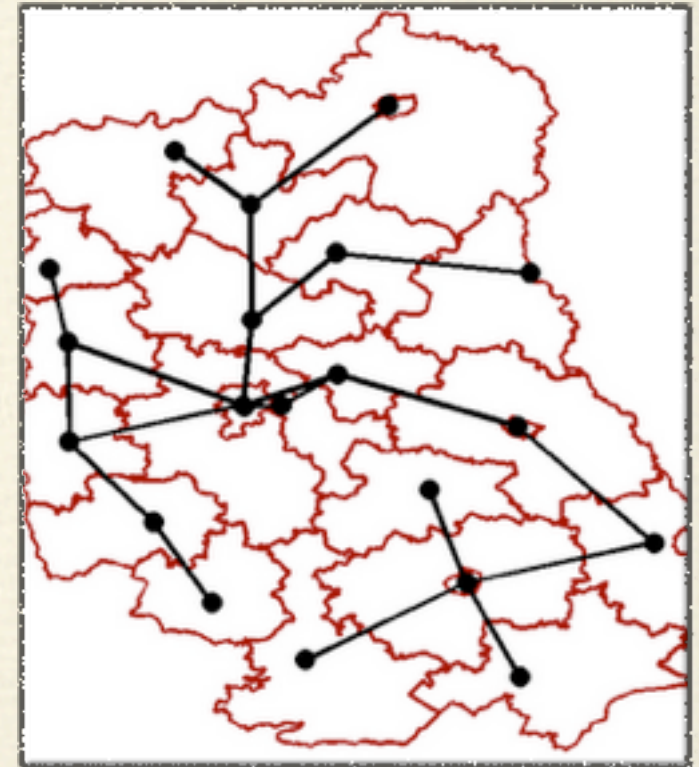
Introduction

- ❖ Photo cuts:
- ❖ define energy function
- ❖ combine photos for panorama purpose
- ❖ computed by energy function minimization



Introduction

- ❖ Network Design Problem
- ❖ given a **undirected graph**
- ❖ find **subgraph** connects all vertices
- ❖ **minimize** sum of shortest path weights
- ❖ subject to **budget constraint**



Introduction

- ❖ This paper try to:
- ❖ show NP-completeness of NDP
- ❖ even for special case:
all edge weights are equal and
budget restricts to spanning tree



Introduction

- ❖ The result implies:
 - ❖ construct similar algorithms for other combinatorial problems
 - ❖ traveling salesman problem
 - ❖ multi-commodity network flow problem
 - ❖ none are solvable in poly-time



Introduction

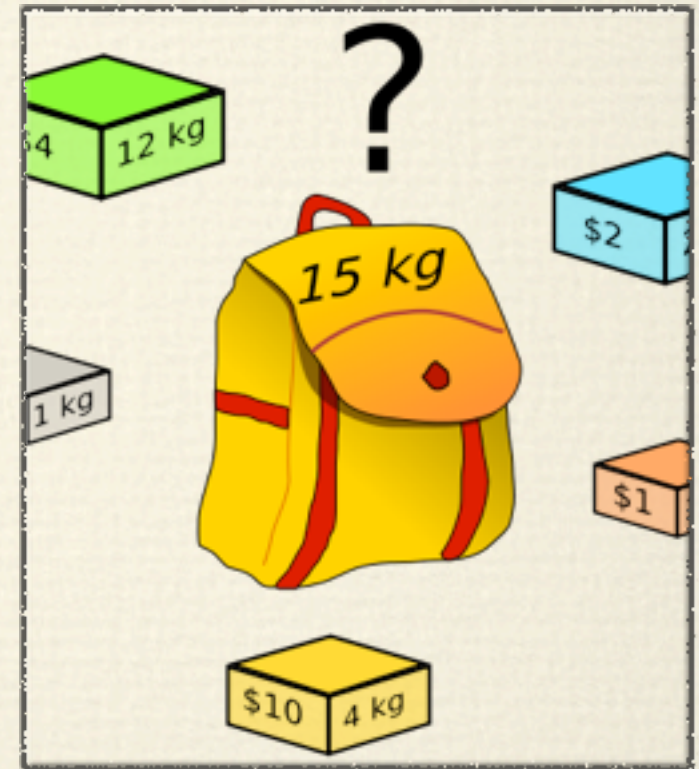
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- ❖ construct similar algorithms for other combinatorial problems
 - ❖ traveling salesman problem
 - ❖ multi-commodity network flow problem
- ❖ none are solvable in poly-time



Discuss more precisely later

Introduction

- ❖ In the rest of this presentation, we are going to:
- ❖ Demonstrate what's P and NP.
- ❖ Give formal definition for Network Design Problem(NDP).
- ❖ Discuss relation between NDP and KNAPSACK.
- ❖ Prove NDP and SNDP is NPC.



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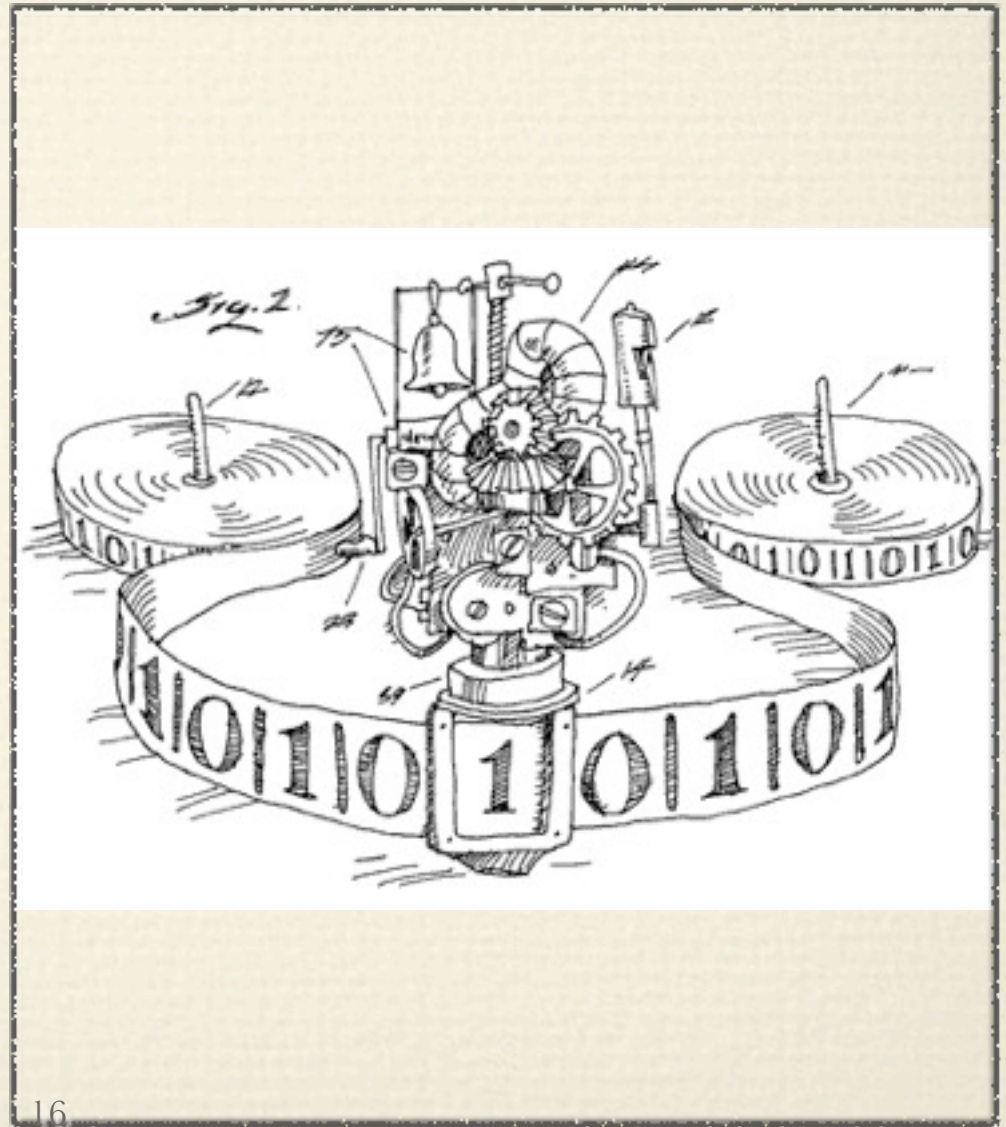
P and NP



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What is Turing Machine anyway ?

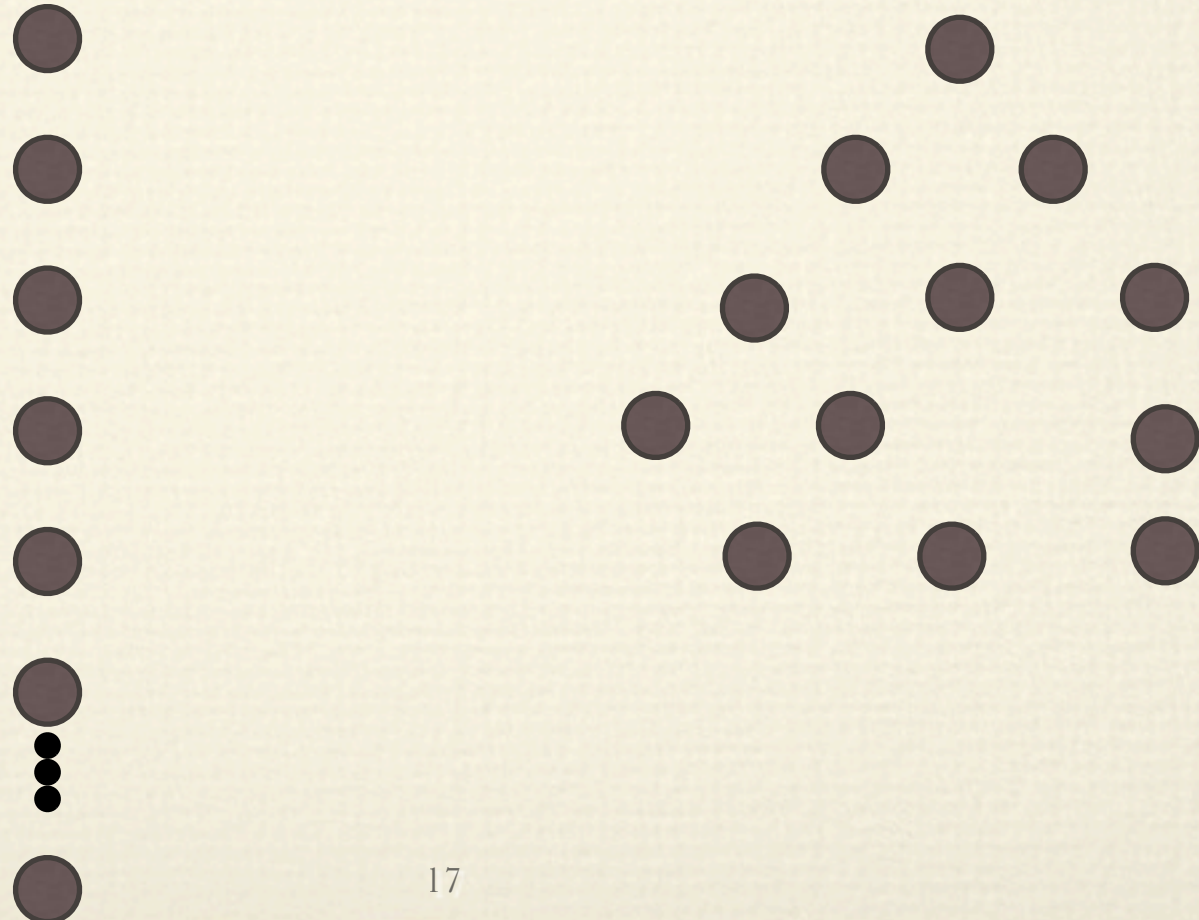
- ❖ A simple machine conceptually exists for computation.
- ❖ Almost every computation model can be transformed to Turing Machine.



Deterministic and Non-deterministic

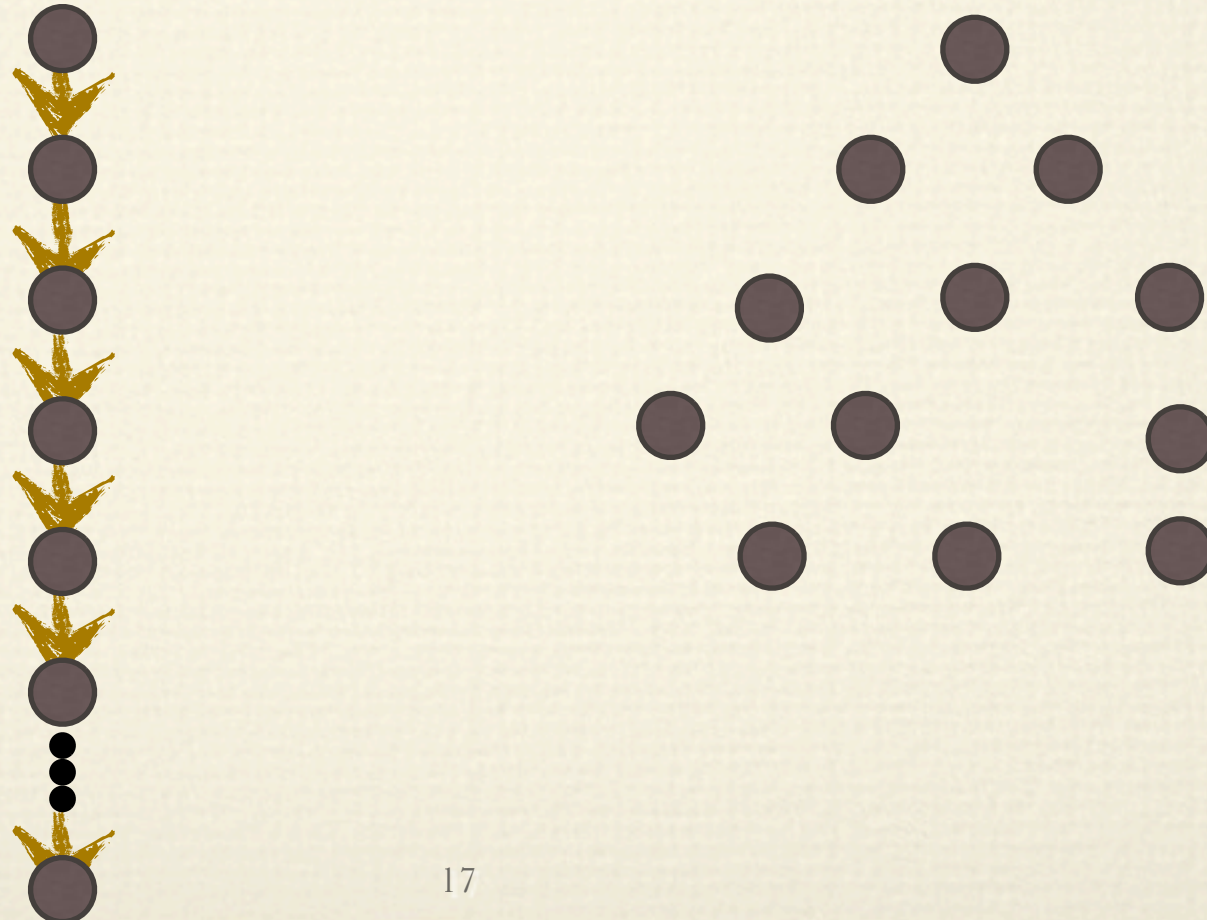
❖ Take a closer look on the main difference between these two types.

(Transition Functions and Transition Relations)



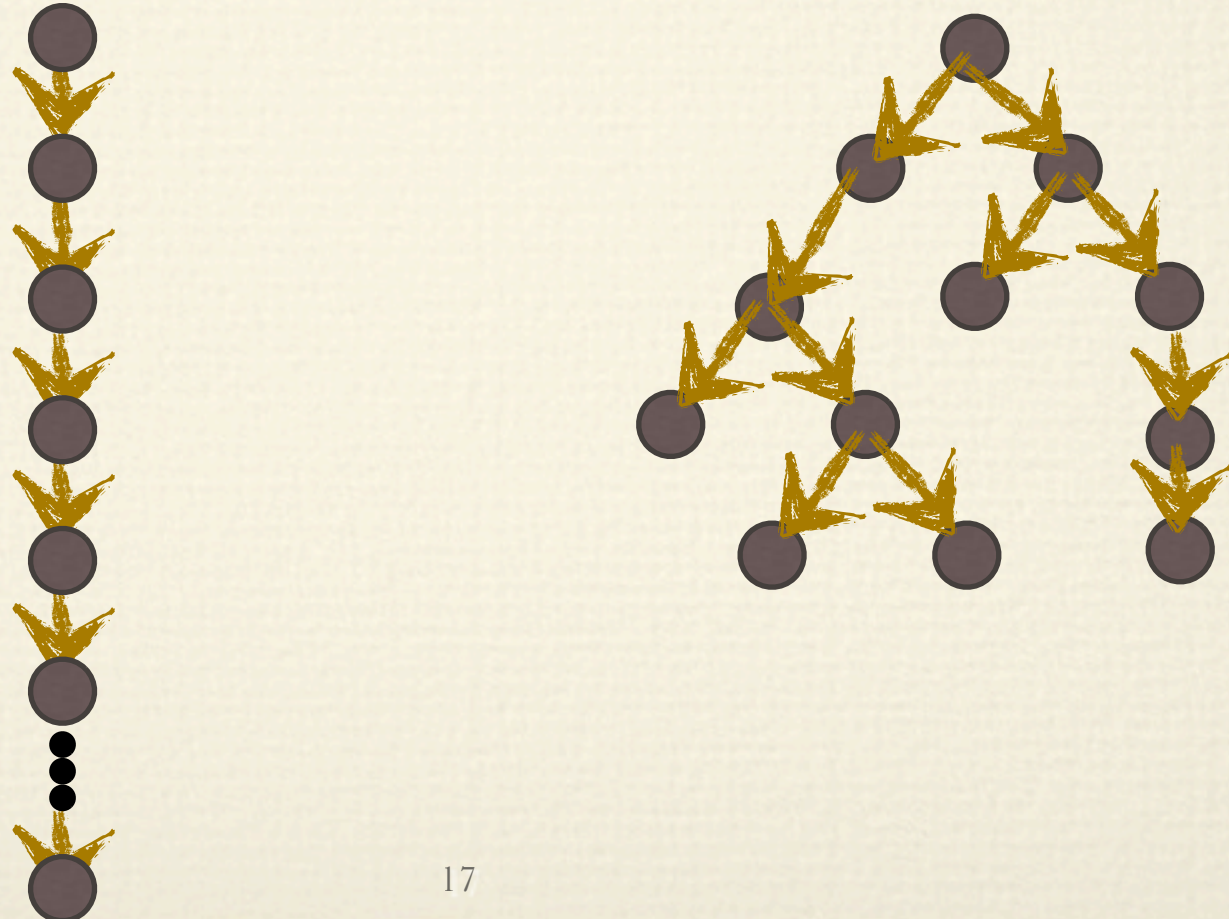
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Deterministic and Non-deterministic

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(Transition Functions and Transition Relations)



P vs NP

- ❖ A common misunderstanding
- ❖ Polynomial Time v.s. Non-Polynomial Time

Polynomial Time v.s. Non-deterministic Polynomial Time

$$P = \bigcup_{k>0} \text{TIME}(n^k) \quad NP = \bigcup_{k>0} \text{NTIME}(n^k)$$

P vs NP

❖ A common misunderstanding

~~Polynomial Time v.s. Non Polynomial Time~~

Polynomial Time v.s. Non-deterministic Polynomial Time

$$P = \bigcup_{k>0} \text{TIME}(n^k) \quad NP = \bigcup_{k>0} \text{NTIME}(n^k)$$

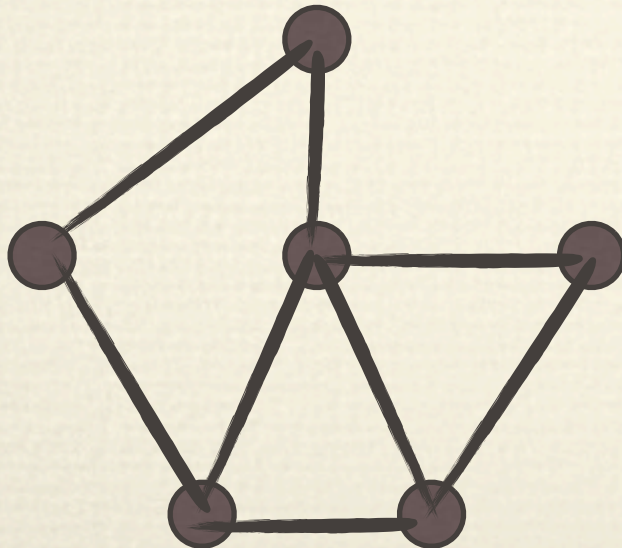
Reduction

❖ What's reduction for?

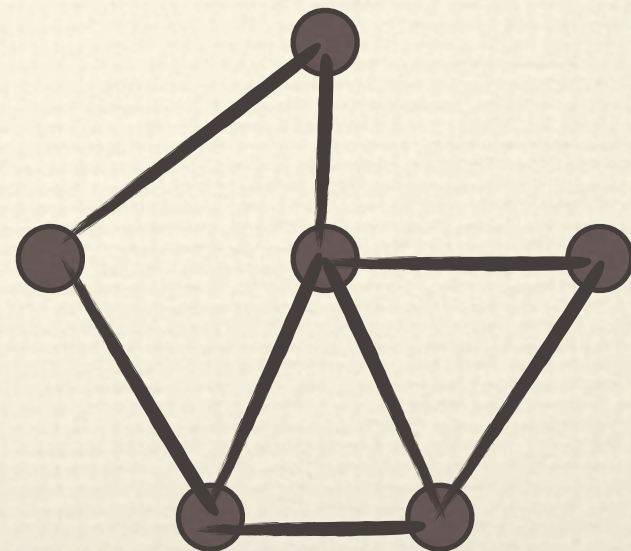
we say “A reduce to B” if there exists a transformation R which $x \in A \Leftrightarrow R(x) \in B$, this prove problem B is “at least hard as” problem A

Example: 3-coloring reduce to 4-coloring

3-coloring



4-coloring



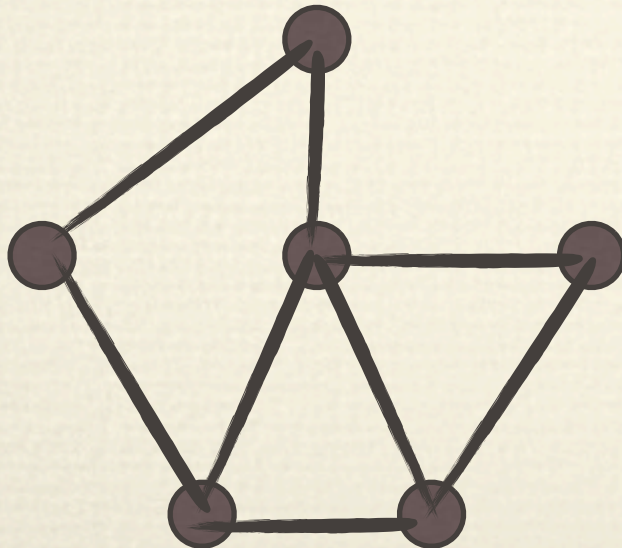
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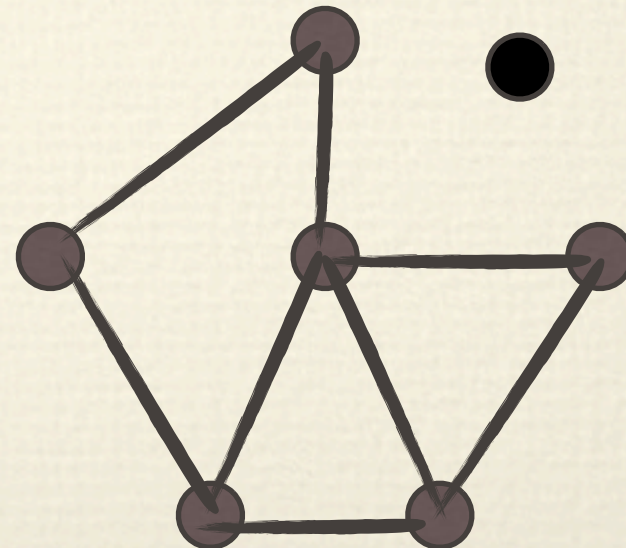
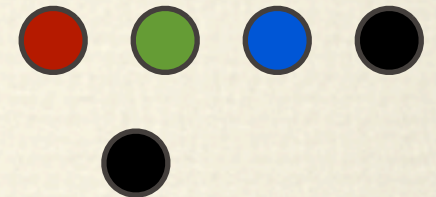
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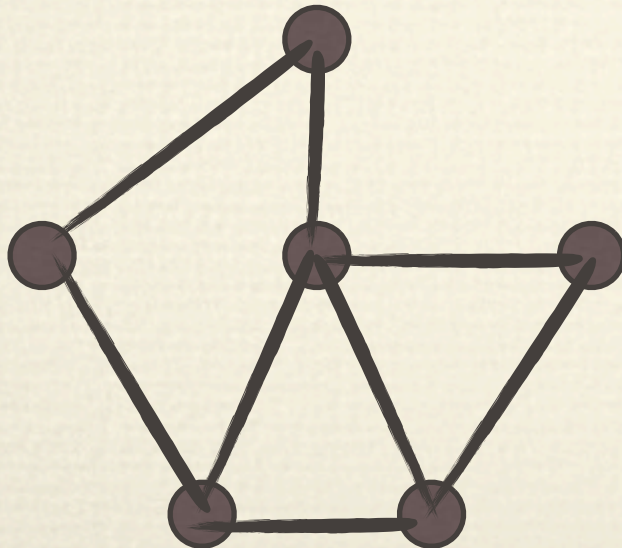
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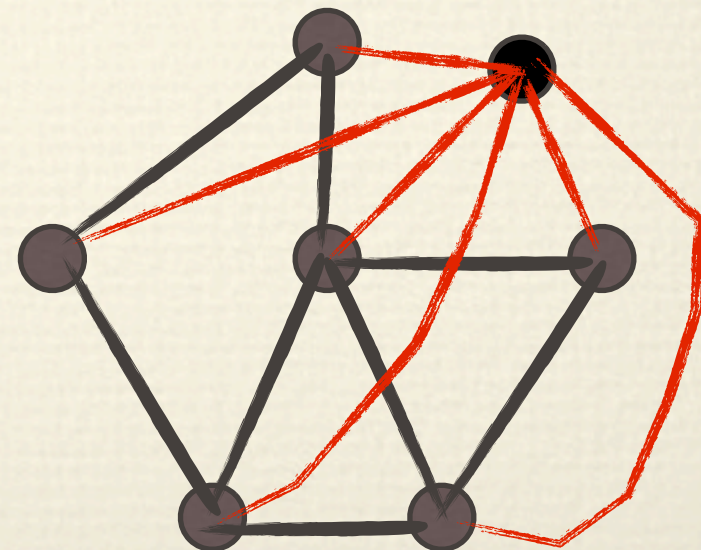
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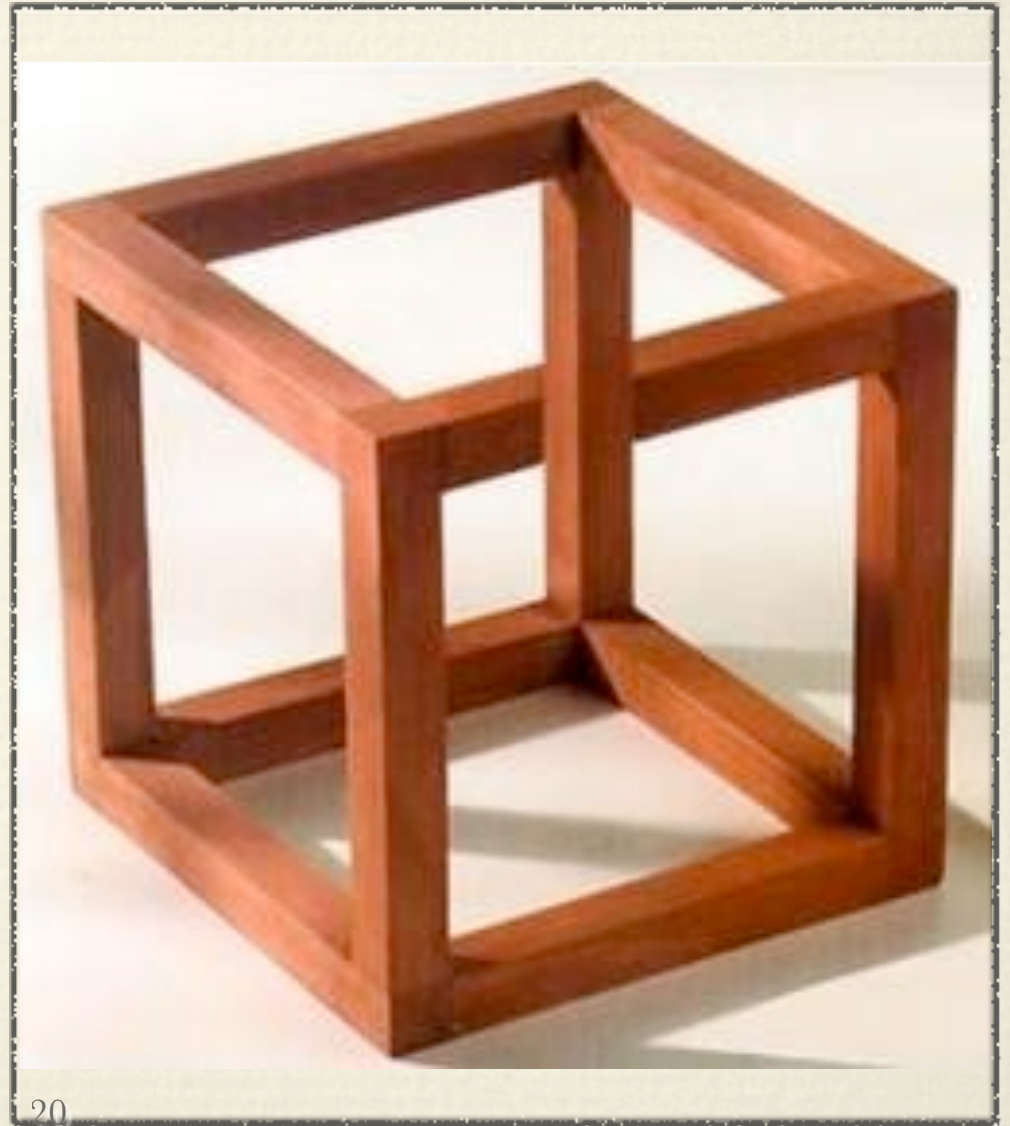


4-coloring



Reduction - Paradox

- ❖ Reduction must be polynomial to prevent paradox



P-hard, NP-hard, NP-complete

- ❖ We call a problem X is NP-hard if all the problems in the NP can be reduced to X .
- ❖ In addition, if X belongs to NP, X is NP-complete.
- ❖ This also applied to the P-hard and P-complete.

❖ Examples of P and NP

❖ Examples of P and NP

Examples

- ❖ NPC examples

- ❖ Hamiltonian path

- ❖ Vertex cover

- ❖ Integer linear programming

- ❖ 3-satisfiability

- ❖ P examples

- ❖ Circuit Value Problem (CVP)

- ❖ Linear programming

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Network Design Problem (NDP)



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NDP

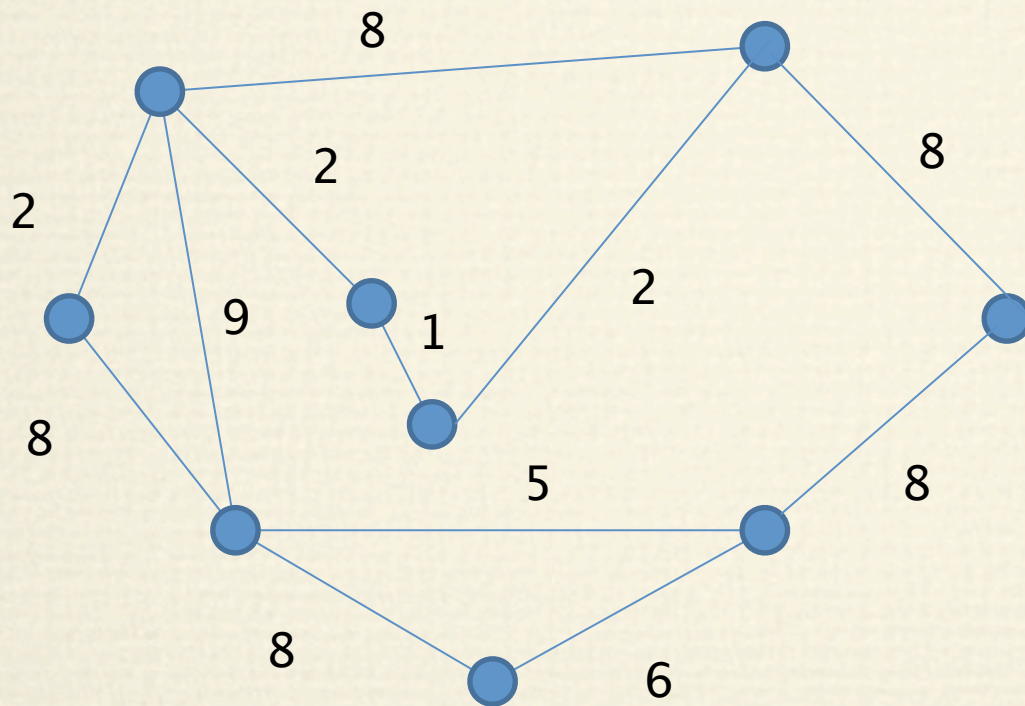
- ❖ Goal : NDP is NP-complete
- ❖ Step 1 : NDP is in NP
- ❖ Step 2 : Reduce a NP-complete
 - ❖ problem to NDP

NDP(cont.)

- ❖ NETWORK DESIGN PROBLEM(NDP):
- ❖ Given an undirected graph $G=(V,E)$, a weight function $L:E \rightarrow \mathbb{N}$, a budget B and a criterion threshold $C(B,C \in \mathbb{N})$, does there exist a subgraph $G'=(V,E')$ of G with weight $\sum_{\{i,j\} \in E'} L(\{i,j\}) \leq B$ and criterion value $F(G') \leq C$
- ❖ where $F(G')$ denotes the sum of the weights of the shortest paths in G' between all vertex pairs?

NDP(cont.)

Weighted Graph G

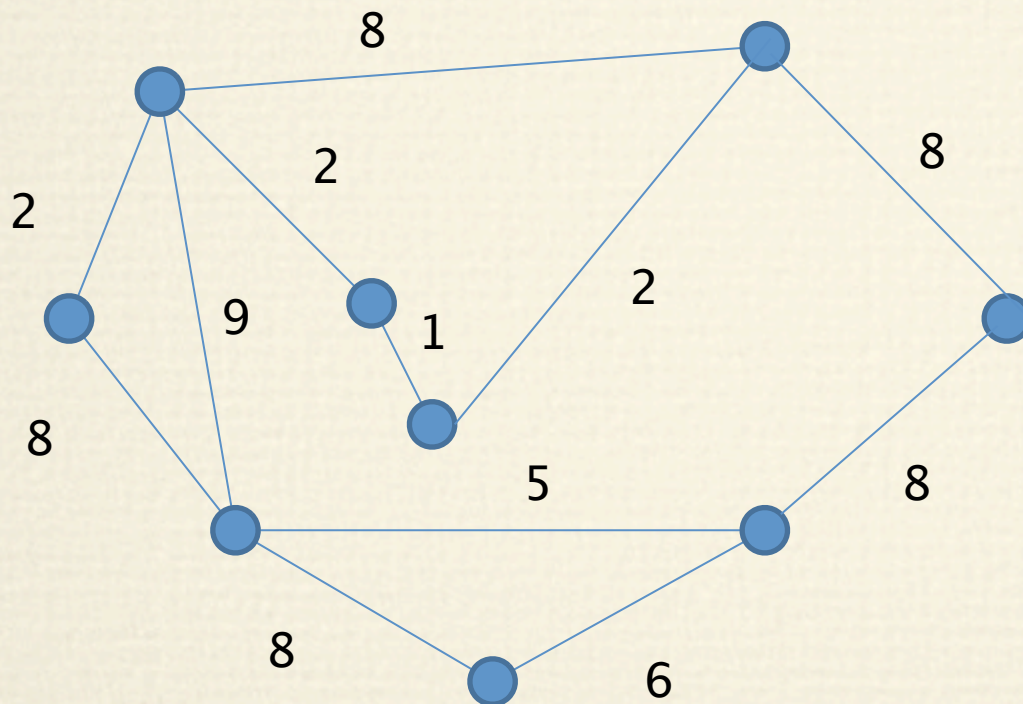


Budget $B=50$

Criterion threshold $C=500$

NDP(cont.)

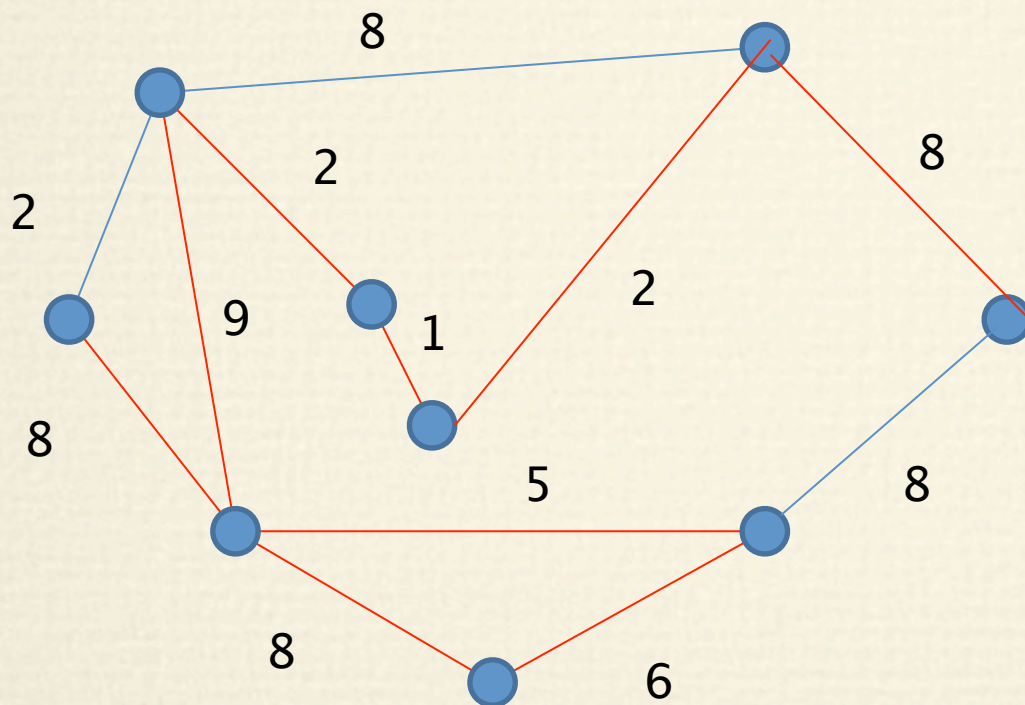
Weighted Graph G



Subgraph exists?
Total weight $\leq B$
Criterion value $\leq C$

NDP(cont.)

❖ Now guess and verify!!



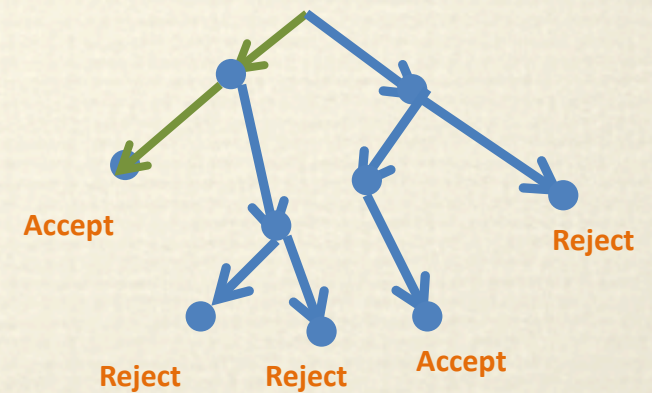
B=50, C=500

Total weight=49

Criterion value=491

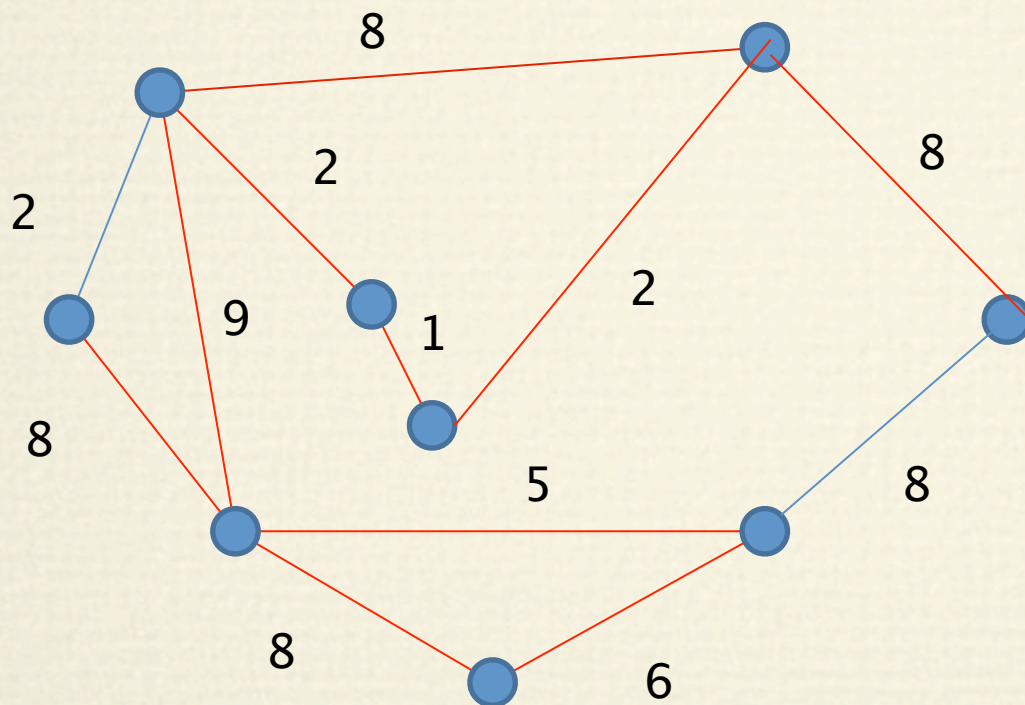
$49 \leq 50, 491 \leq 500$

Yes!!!!!!!



NDP(cont.)

❖ Now guess and verify!!



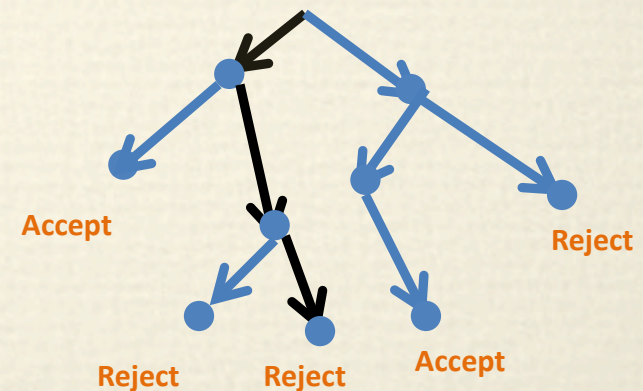
B=50, C=500

Total weight=57

Criterion value=463

57 > 50, 463 ≤ 500

NDP is NO???????



NDP(cont.)

- ❖ NDP is in NP
- ❖ NP-complete?
- ❖ Reduce Knapsack problem to NDP

Knapsack problem

- ❖ n items ($T = \{1, 2, 3, 4, 5, 6, \dots, t\}$)
- ❖ Item x has value v_x and weight w_x
- ❖ Given V and W
- ❖ Does there exist a subset $S \subset T$ such that
- ❖ $\sum_{i \in S} w_i \leq W$ and $\sum_{i \in S} v_i \geq V$?

Example



0.5kg,
200NT



0.6kg,
22NT



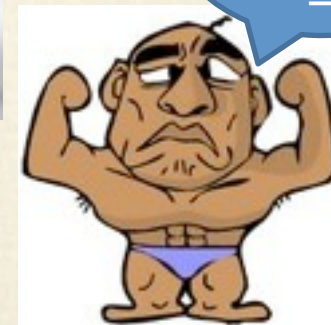
給我去偷價
值超過
10000NT
的東西!!



80kg,6000NT



1200kg,
700000NT



我只能舉
100KG
T_T



5kg,100NT

Example



0.5kg,
200NT



0.6kg,
22NT



給我去偷價
值超過
10000NT
的東西!!



80kg,6000NT



1200kg,
700000NT

我只能舉
100KG
T_T



5kg,100NT



Example



0.5kg,
200NT



0.6kg,
22NT



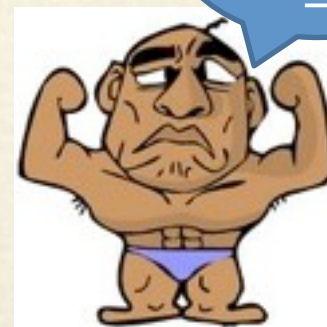
可憐你,超
過1000NT
就好!!



80kg,6000NT



1200kg,
700000NT



我只能舉
100KG
T_T



5kg,100NT

Example



0.5kg,
200NT



0.6kg,
22NT



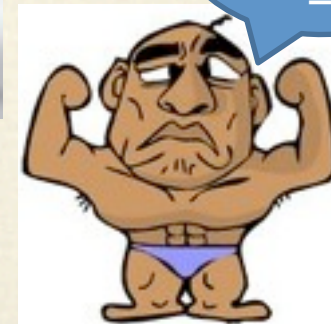
可憐你,超
過1000NT
就好!!



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1200kg,
700000NT



我只能舉
100KG
T_T



5kg,100NT

Knapsack problem (another def.)

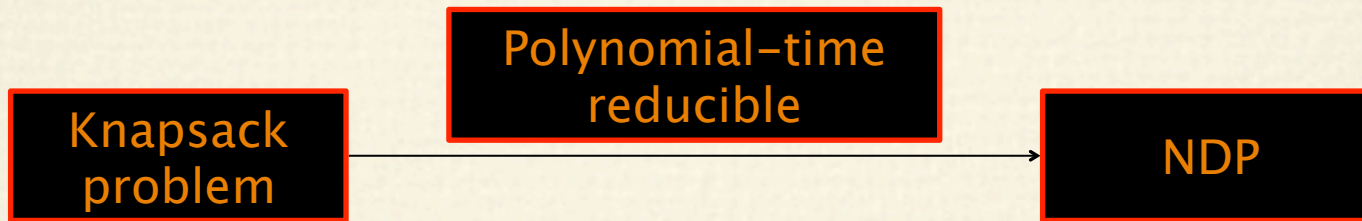
- $W = V$
- $v_x = w_x$ for $x=1,2,\dots,t$

Knapsack problem (another def.)

- n items ($T = \{1, 2, 3, 4, 5, 6, \dots, t\}$)
- Item i has value a_i
- Given b
- Does there exist a subset $S \subset T$ such that
- $\sum_{i \in S} a_i = b$?

Knapsack problem

- Knapsack problem is NP-complete



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KNAPSACK & NDP



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A KNAPSACK Example

$$t = 4 \quad \left\{ \begin{array}{l} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{array} \right. \quad b = 7$$

❖ There is a solution \Rightarrow $a_1 + a_3 = 2 + 5 = 7$

KNAPSACK \Rightarrow NDP

❖ KNAPSACK

$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

$$\text{Let } A = \sum_{i=1}^t a_i = 16$$

❖ NDP



Reduce

$$V = \{0\} \cup \{i, i' \mid i \in [1, t]\}$$

$$E = \{(0, i), (0, i'), (i, i') \mid i \in [1, t]\}$$

$$L((0, i)) = L((0, i')) = L((i, i')) = a_i$$

$$B = 2A + b$$

$$C = 4tA - b$$

KNAPSACK \Rightarrow NDP

❖ KNAPSACK

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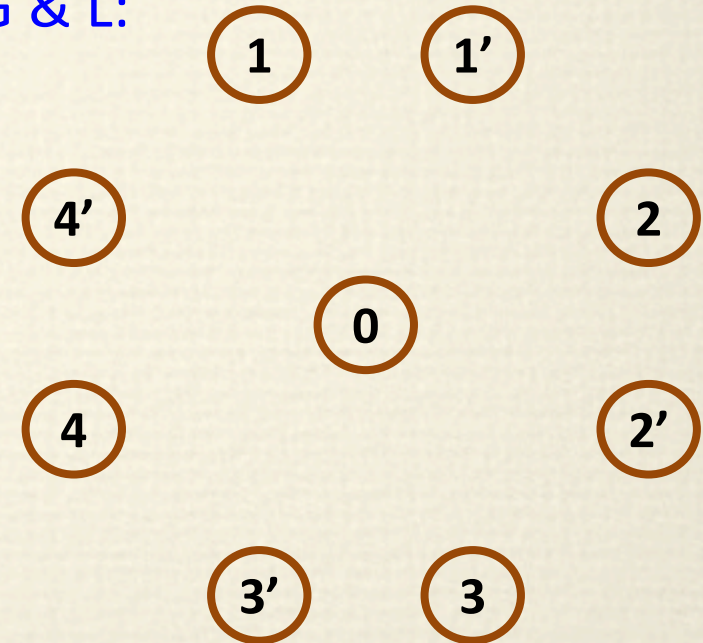
Let $A = \sum_{i=1}^t a_i = 16$

❖ NDP



$$\begin{aligned} V &= \{0\} \cup \{i, i' \mid i \in [1, t]\} \\ E &= \{(0, i), (0, i'), (i, i') \mid i \in [1, t]\} \\ L((0, i)) &= L((0, i')) = L((i, i')) = a_i \\ B &= 2A + b \\ C &= 4tA - b \end{aligned}$$

G & L:



KNAPSACK \Rightarrow NDP

❖ KNAPSACK

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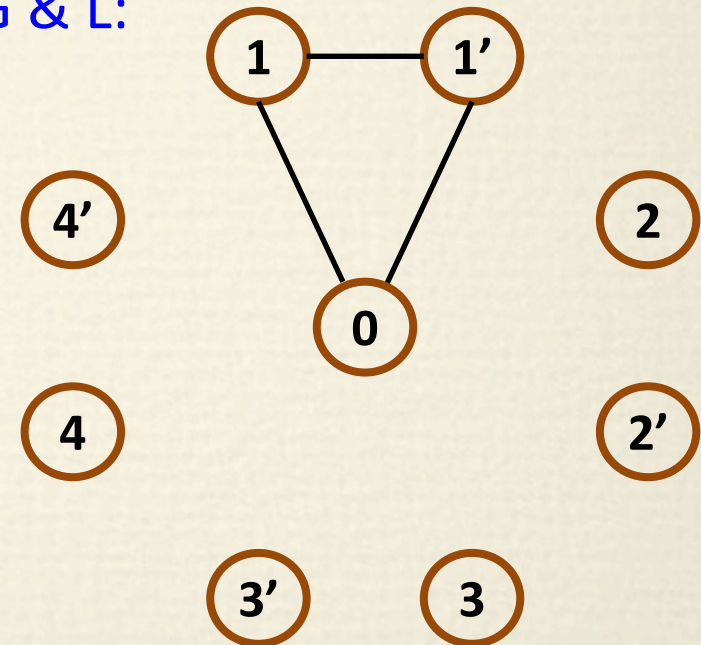
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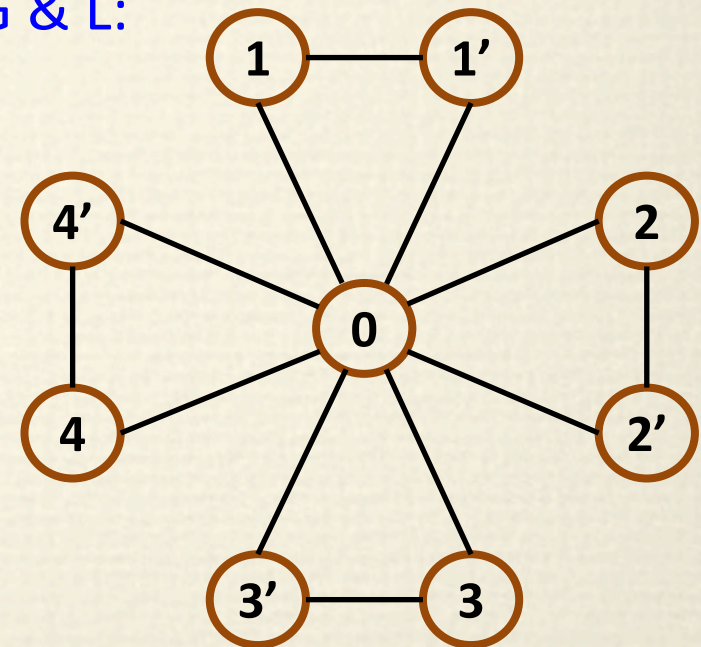
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KNAPSACK \Rightarrow NDP

❖ KNAPSACK

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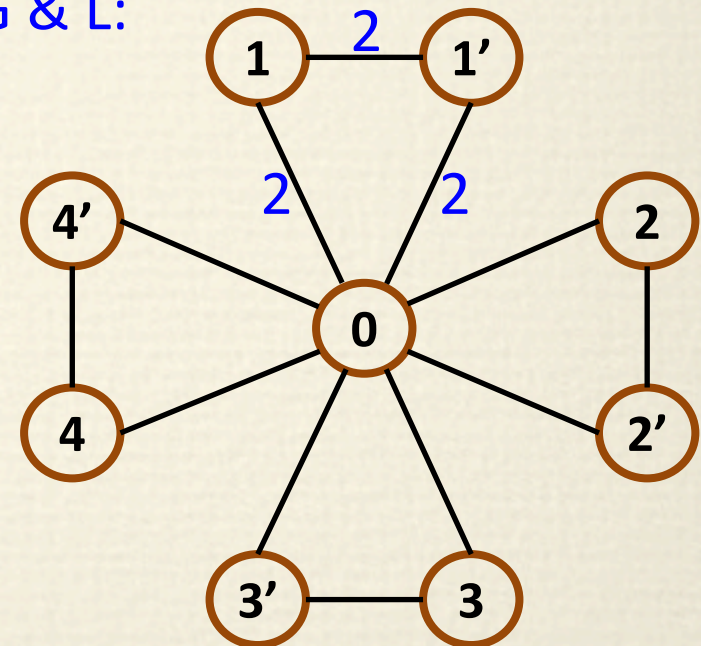
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G & L:



KNAPSACK \Rightarrow NDP

❖ KNAPSACK

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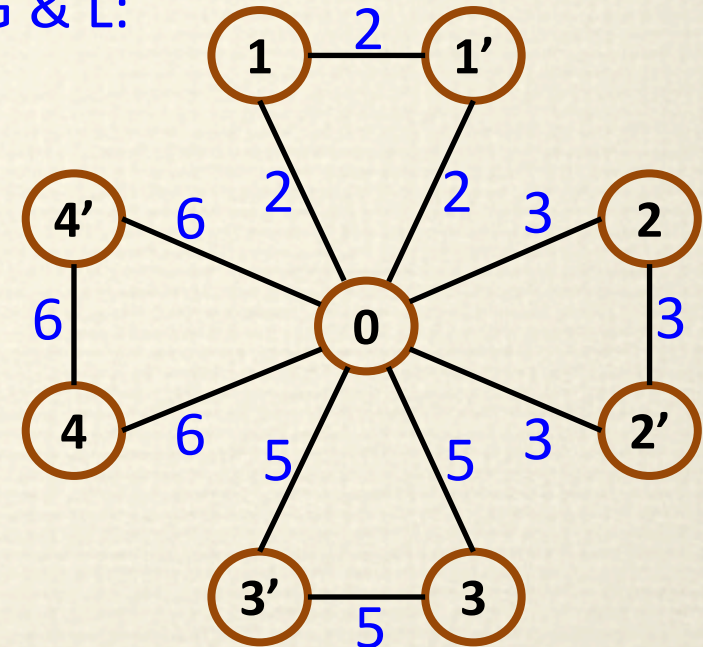
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❖ NDP



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KNAPSACK \Rightarrow NDP

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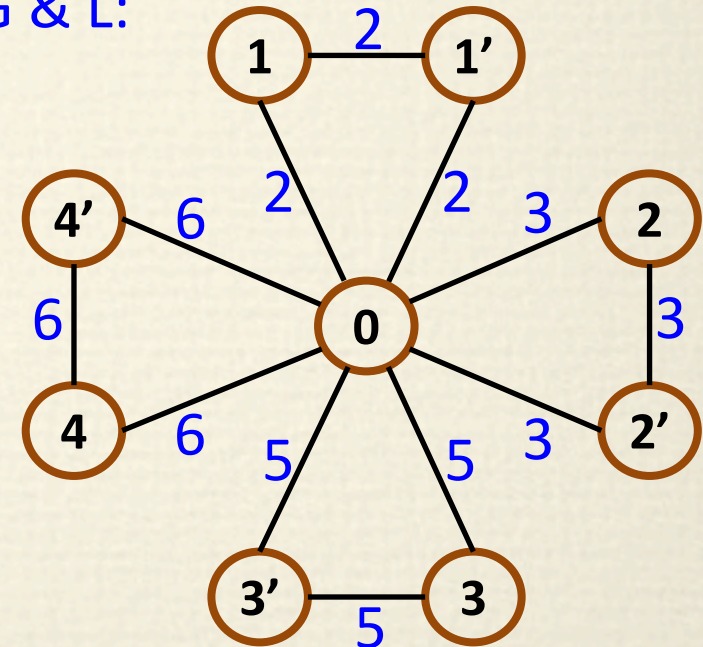
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❖ NDP



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G & L:



$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

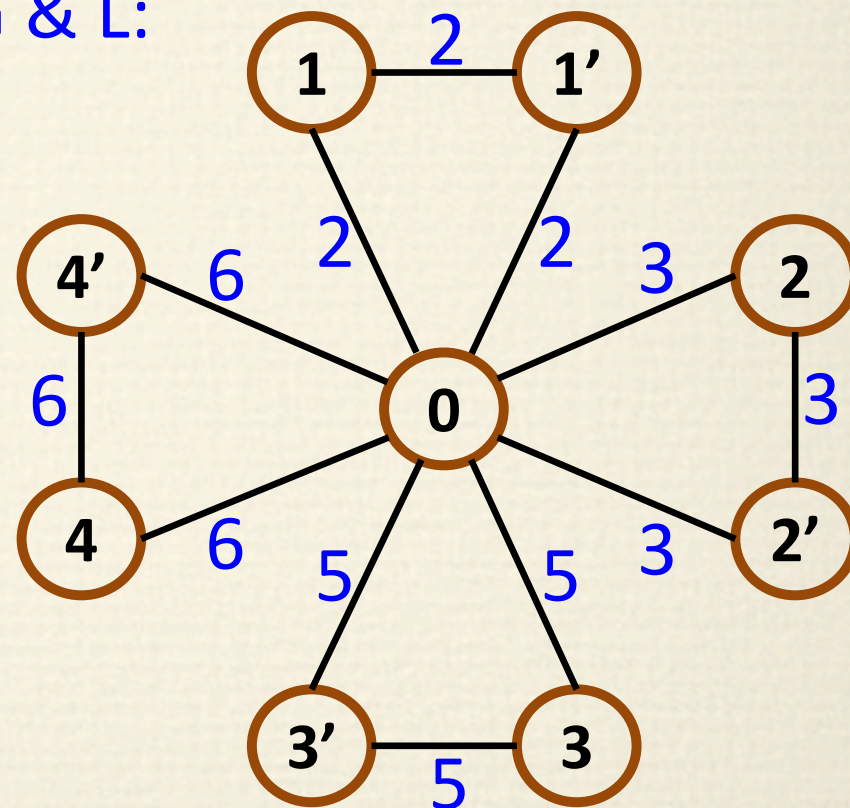
Solve NDP

$$A = \sum_{i=1}^t a_i = 16$$

$$B = 2A + b = 39 \text{ (budget)}$$

$$C = 4tA - b = 249 \text{ (criterion threshold)}$$

G & L:



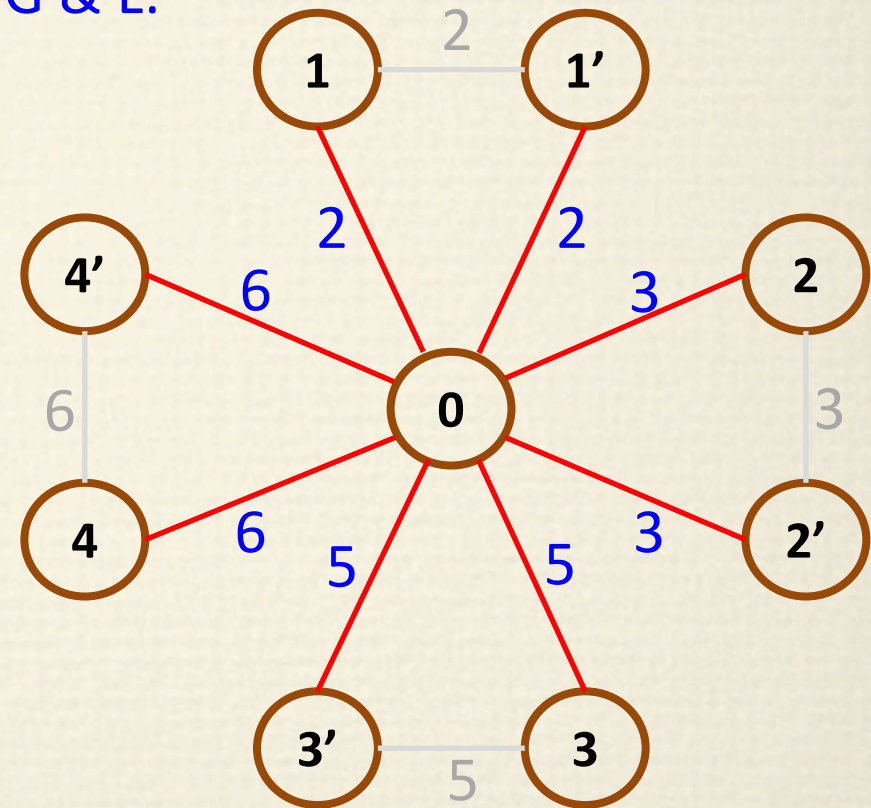
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Solve NDP

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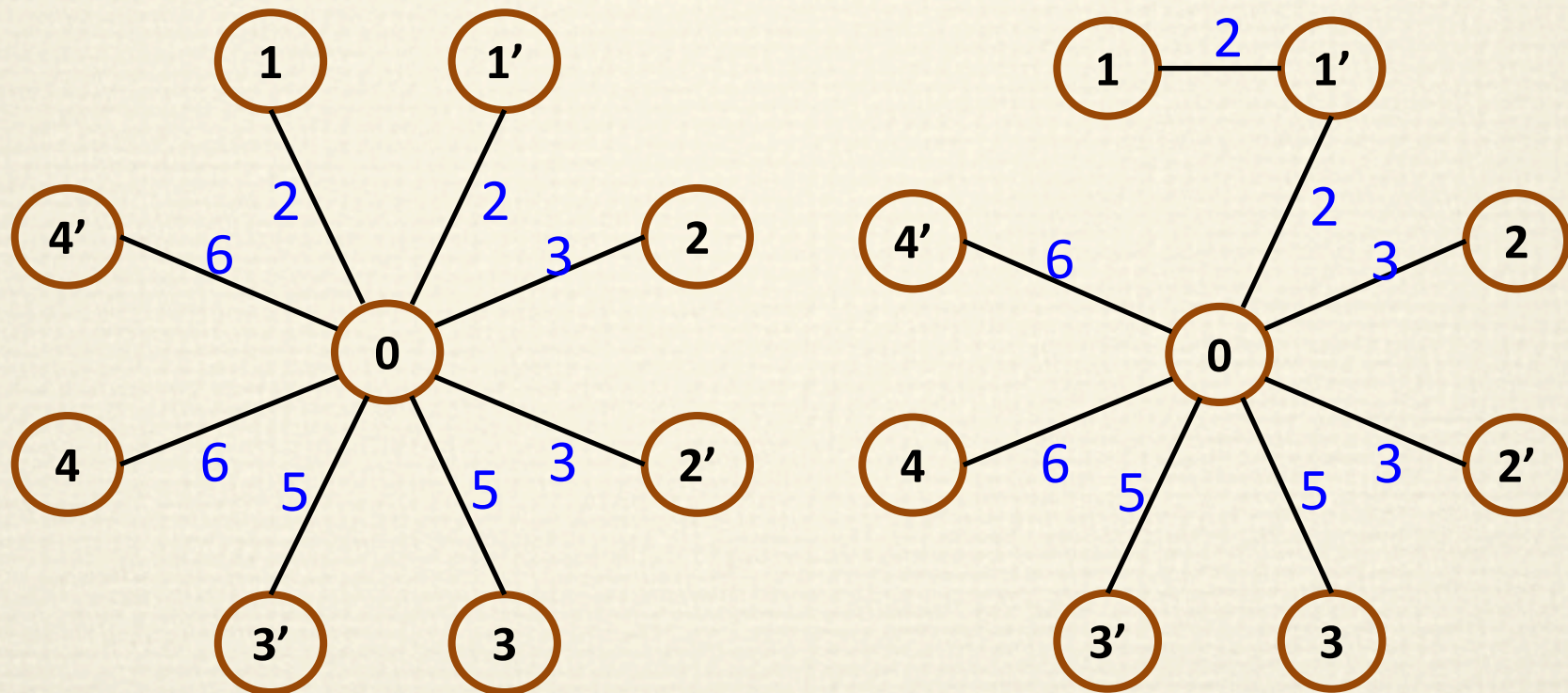
- Any feasible solution can be assumed to contain the **star** graph.

G & L:



Solve NDP

- Any feasible solution can be assumed to contain the **star** graph.



Both consume same budget, but the criterion value of right one is larger!

$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

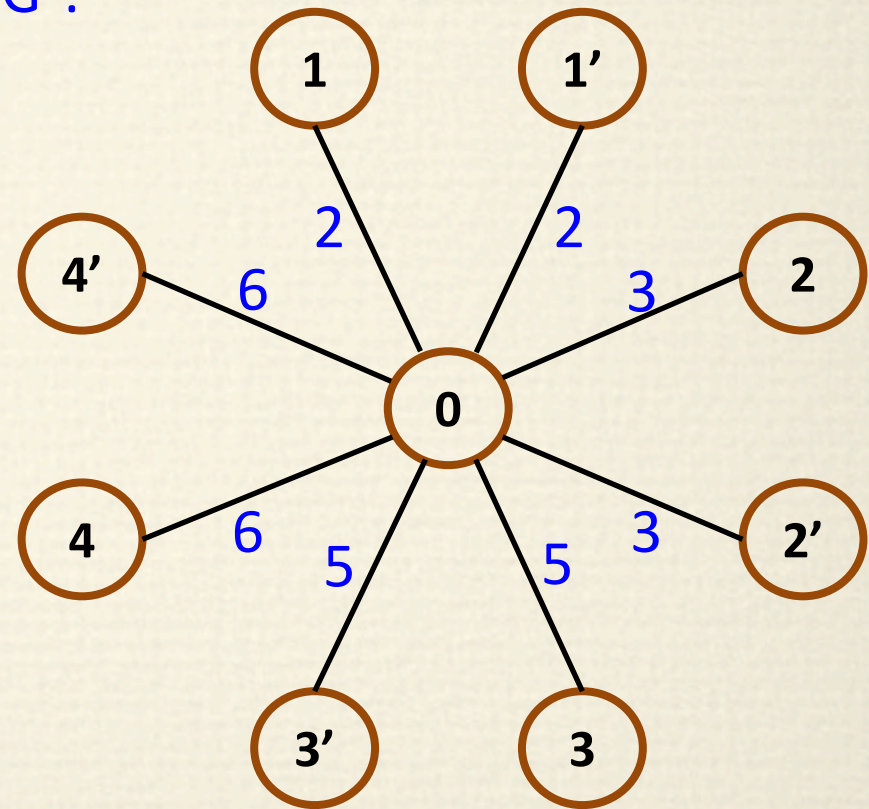
Solve NDP

$$A = \sum_{i=1}^t a_i = 16$$

$$B = 2A + b = 39 \text{ (budget)}$$

$$C = 4tA - b = 249 \text{ (criterion threshold)}$$

G^* :



$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

Solve NDP

$$A = \sum_{i=1}^t a_i = 16$$

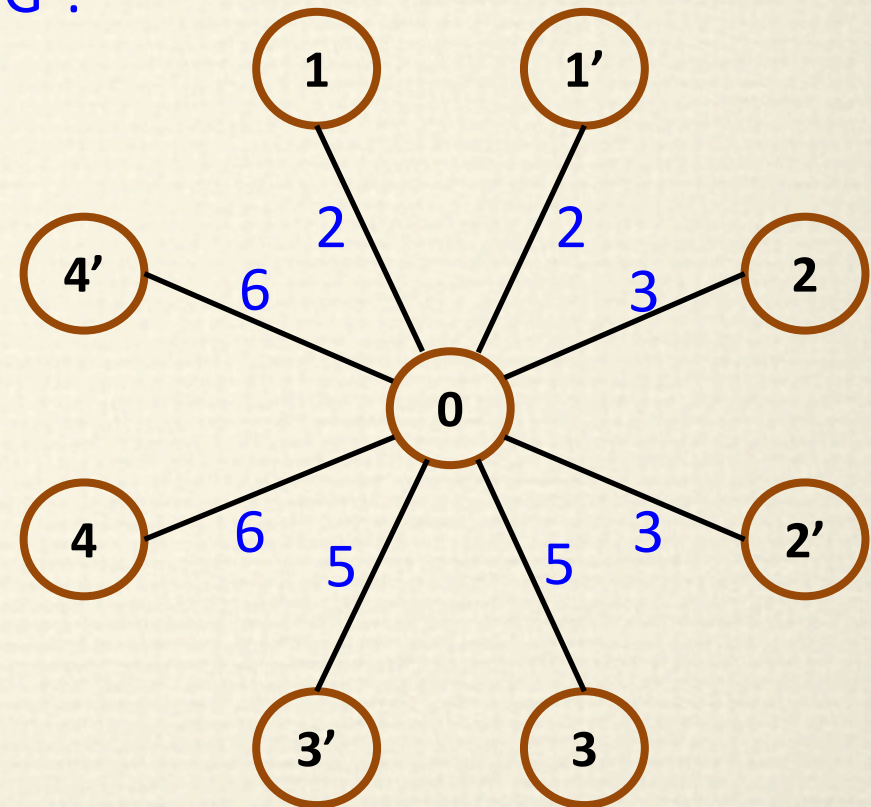
$$B = 2A + b = 39 \text{ (budget)}$$

$$C = 4tA - b = 249 \text{ (criterion threshold)}$$

$$\text{Sum of weight: } 2A = 32$$

$$\text{Criterion value: } 4tA = 256$$

G^* :



$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

Solve NDP

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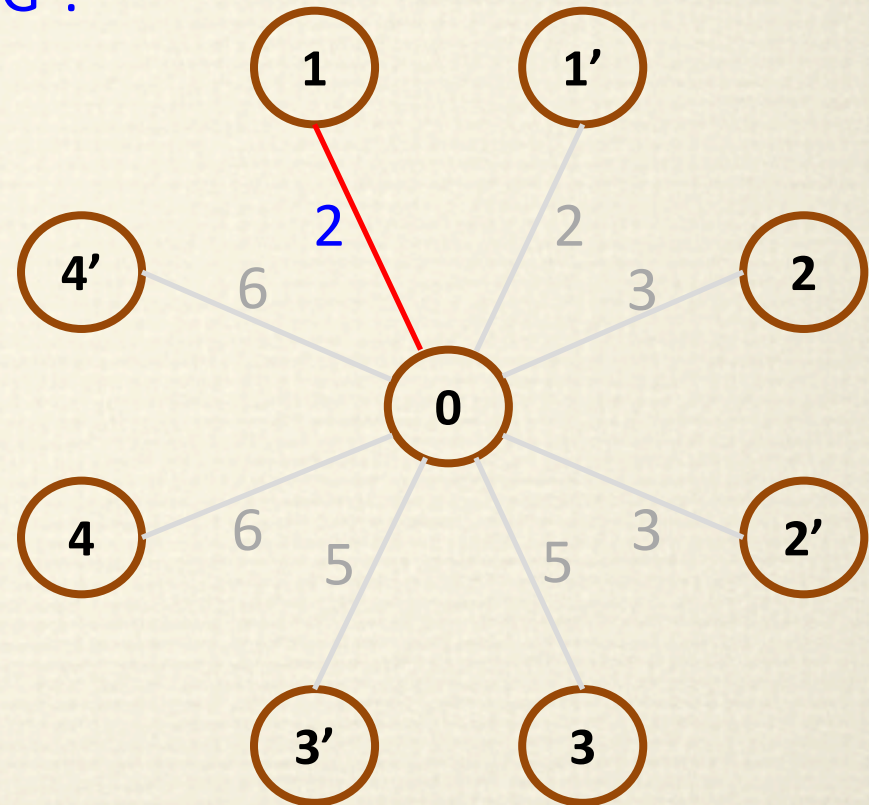
$$\text{Sum of weight: } 2A = 32$$

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routing load

$$2 \times 1 \times 2t$$

G^* :



$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

Solve NDP

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$$B = 2A + b = 39 \text{ (budget)}$$

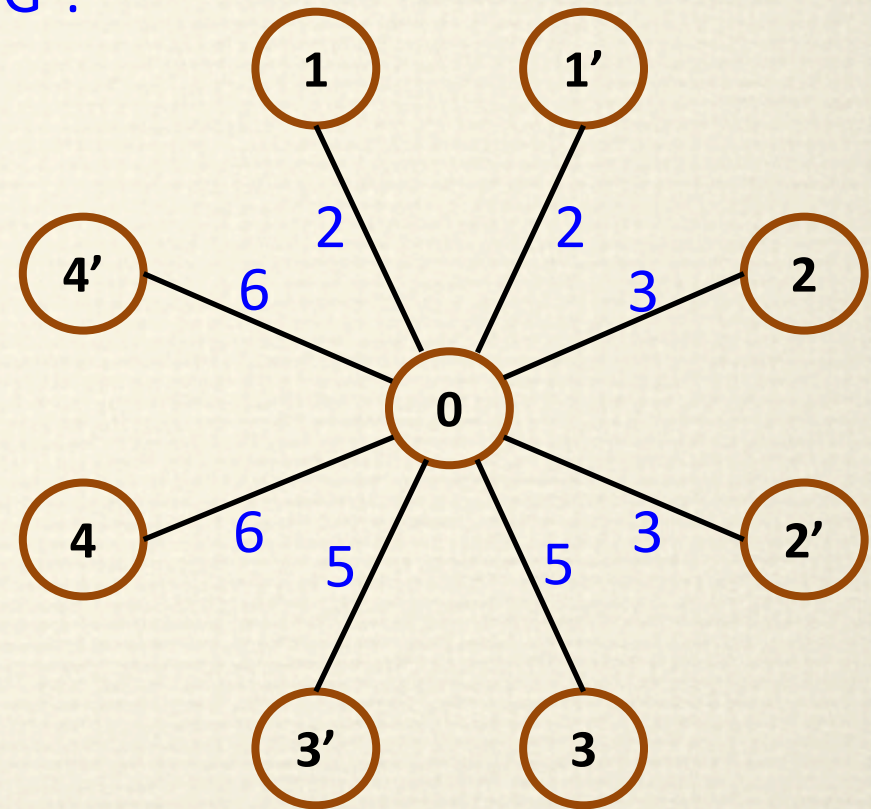
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$$2A \times (2 \times 1 \times 2t)$$

G^* :



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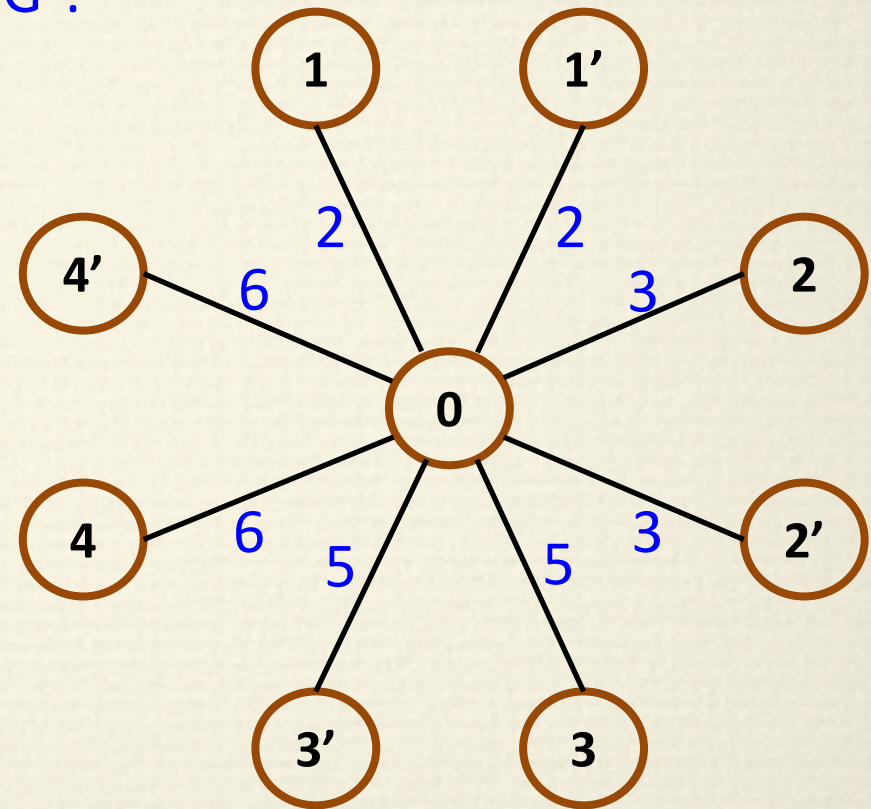
$$C = 4tA - b = 249 \text{ (criterion threshold)}$$

$$\text{Sum of weight: } 2A = 32$$

$$\text{Criterion value: } 4tA = 256$$

$$\frac{2A \times (2 \times 1 \times 2t)}{2}$$

G^* :



$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

Solve NDP

$$A = \sum_{i=1}^t a_i = 16$$

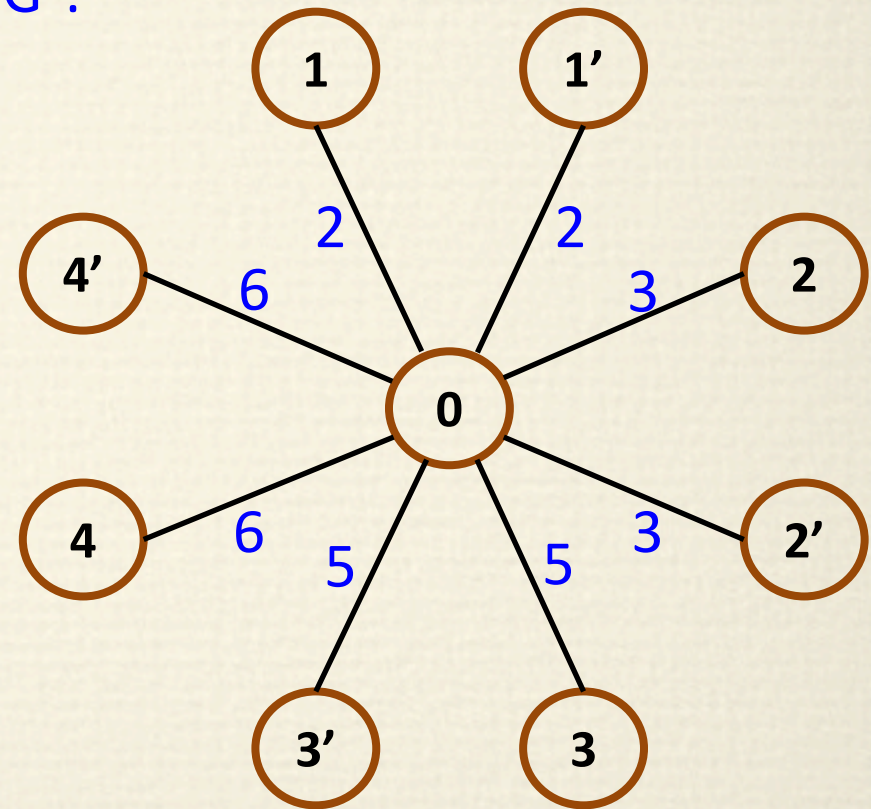
$$B = 2A + b = 39 \text{ (budget)}$$

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Sum of weight: $2A = 32$
 Budget: $2A + b = 39$

Criterion value: $4tA = 256$
 Criterion threshold: $4tA - b = 249$ ✗

G^* :



$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

Solve NDP

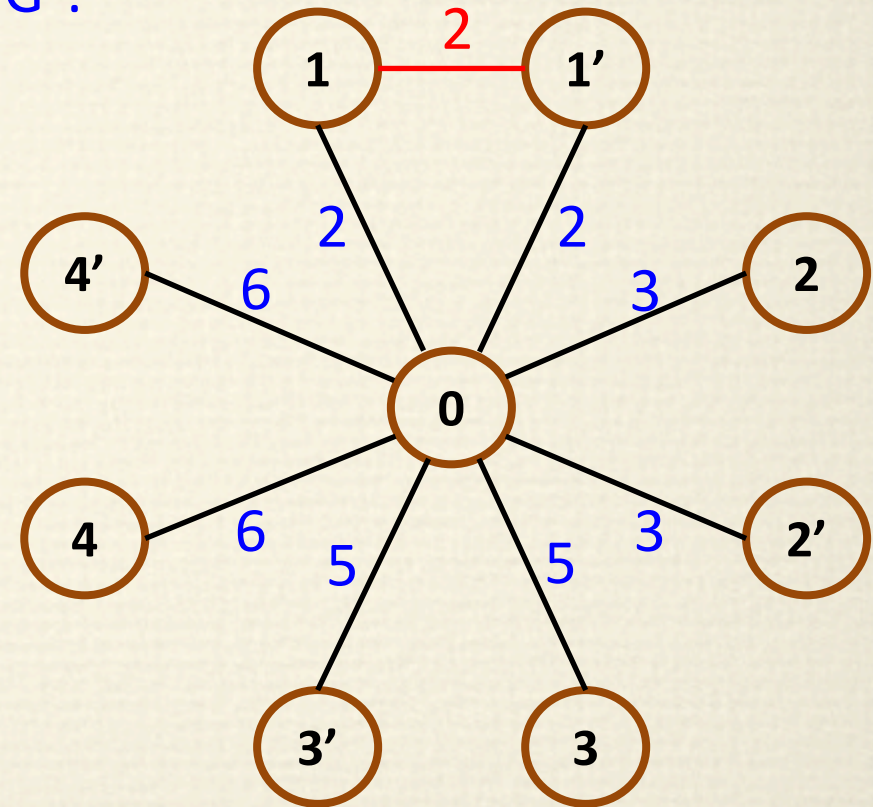
$$\begin{aligned} A &= \sum_{i=1}^t a_i = 16 \\ B &= 2A + b = 39 \text{ (budget)} \\ C &= 4tA - b = 249 \text{ (criterion threshold)} \end{aligned}$$

$$\begin{aligned} \text{Sum of weight: } 2A + 2 &= \cancel{34} = 34 \\ \text{Budget: } 2A + b &= 39 \end{aligned}$$

$$\begin{aligned} \text{Criterion value: } 4tA - 2 &= \cancel{256} = 254 \\ \text{Criterion threshold: } 4tA - b &= 249 \end{aligned}$$



G^* :



$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

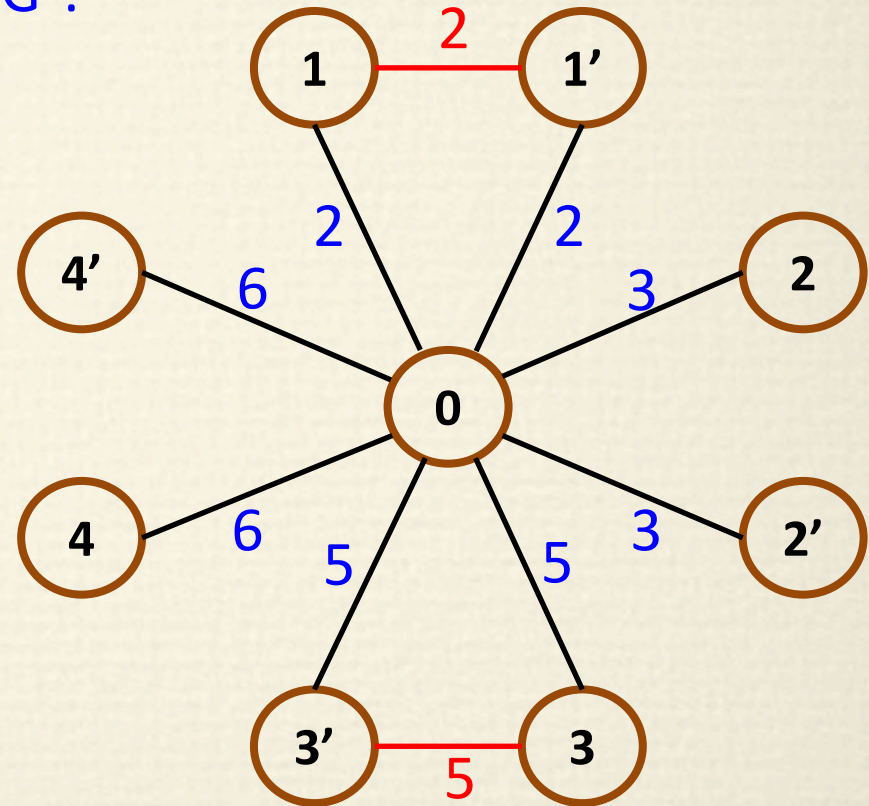
Solve NDP

$$\begin{aligned} A &= \sum_{i=1}^t a_i = 16 \\ B &= 2A + b = 39 \text{ (budget)} \\ C &= 4tA - b = 249 \text{ (criterion threshold)} \end{aligned}$$

Sum of weight: $2A + 7 = \cancel{34} = 39$
 Budget: $2A + b = 39$

Criterion value: $4tA - 7 = \cancel{256} = 249$
 Criterion threshold: $4tA - b = 249$

G^* :



$$t = 4 \quad \begin{cases} a_1 = 2 \\ a_2 = 3 \\ a_3 = 5 \\ a_4 = 6 \end{cases} \quad b = 7$$

Solve NDP

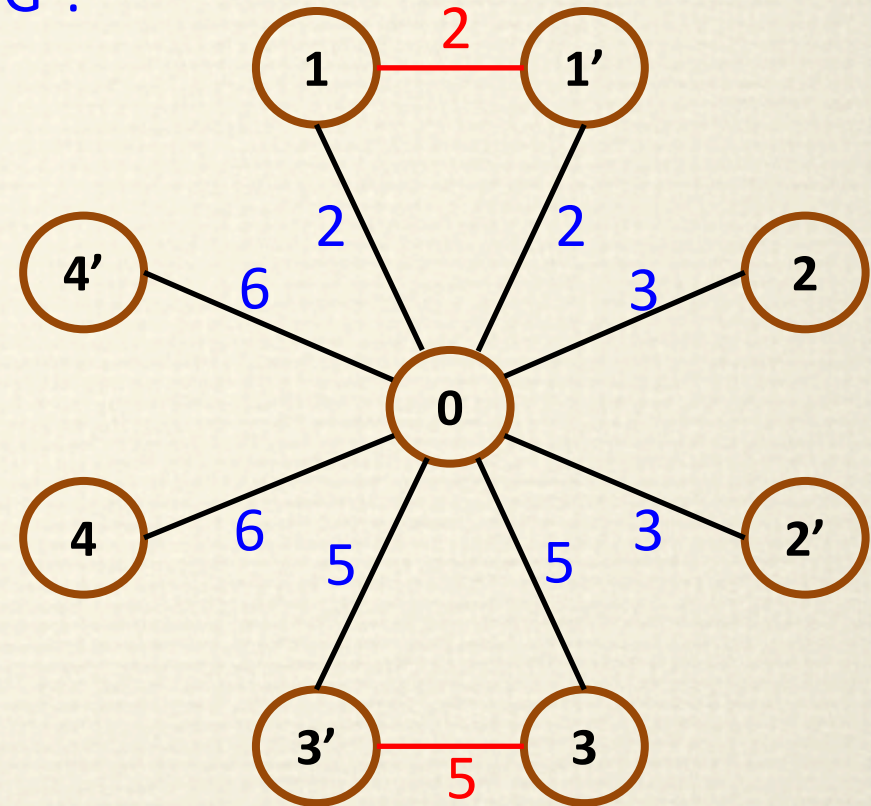
$$a_1 + a_3 = b$$

$$\begin{aligned} A &= \sum_{i=1}^t a_i = 16 \\ B &= 2A + b = 39 \text{ (budget)} \\ C &= 4tA - b = 249 \text{ (criterion threshold)} \end{aligned}$$

Sum of weight: $2A + 7 = \cancel{34} = 39$
 Budget: $2A + b = 39$

Criterion value: $4tA - 7 = \cancel{256} = 249$
 Criterion threshold: $4tA - b = 249$

G^* :



NDP is NP-complete

- ❖ **KNAPSACK is NP-complete and reducible to NDP.**
 - ❖ For any instance of KNAPSACK, an instance of NDP can be constructed in polynomial-bounded time.
- ❖ **KNAPSACK has solution \Leftrightarrow NDP has solution**
 - ❖ Solving the instance of NDP solves the instance of KNAPSACK as well.
- ❖ **NDP belongs to NP.**
 - ❖ Any feasible subgraph can be recognized in polynomial time.
- ❖ **NDP is NP-complete**

Outline

- ❖ Introduction
- ❖ P and NP
- ❖ Network Design Problem (NDP)
- ❖ KNAPSACK and NDP
- ❖ SNDP is NP-complete
- ❖ Proof of SNDP
- ❖ Conclusion

SNDP is NP-complete



R00922157 李庚謙

R00922156 陳子筠

We will show that EXACT 3-COVER is reducible to SNDP.

Problem Formulation of SNDP

Simple Network Design Problem (SNDP):

- NDP with $L(\{i, j\}) = 1$ for all $\{i, j\} \in E$
and $B = |V| - 1$

- ❖ unit edge weight
- ❖ spanning tree
- ❖ $\text{SNDP} \in \text{NP}$

A Known NPC Problem: Exact 3-cover

- Given a collection $S = \{\sigma_1, \sigma_2, \dots, \sigma_s\}$ of 3-element subsets of a set $T = \{\tau_1, \tau_2, \dots, \tau_{3t}\}$, does there exist a sub-collection $S' \subset S$ of pairwise disjoint sets such that $\sum_{\sigma \in S'} \sigma = T$?
- Example:
 - $T = \{1,2,3,4,5,6\}$, $S = \{\{1,2,3\}, \{1,2,4\}, \{1,2,5\}, \{1,2,6\}\}$
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No!
 - $T = \{1,2,3,4,5,6\}$, $S = \{\{1,2,3\}, \{3,4,5\}, \{1,2,5\}, \{1,2,6\}\}$

A Known NPC Problem: Exact 3-cover

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No!
 - $T = \{1,2,3,4,5,6\}$, $S = \{\{1,2,3\}, \{3,4,5\}, \{1,2,5\}, \{1,2,6\}\}$
 $S' = \{\{3,4,5\}, \{1,2,6\}\}$ **Yes!**

Problem Formulation of SNDP

Simple Network Design Problem (SNDP):

- NDP with $L(\{i, j\}) = 1$ for all $\{i, j\} \in E$
and $B = |V| - 1$

- ❖ special case of NDP
- ❖ unit edge weight
- ❖ spanning tree
- ❖ $\text{SNDP} \in \text{NP}$

Reduction

- ❖ Given any instance of EXACT 3-COVER, we define an instance of SNDP as follows:

$$V = R \cup S \cup T$$

$$R = \{\rho_0, \rho_1, \dots, \rho_r\}$$

$$r = C_{SS} + C_{ST} + C_{TT}$$

$$E = \{\{\rho_i, \rho_0\} : i = 1, \dots, r\}$$

$$\cup \{\{\rho_0, \sigma\} : \sigma \in S\}$$

$$\cup \{\{\sigma, \tau\} : \tau \in \sigma \in S\}$$

$$C = C_{RR} + C_{RS} + C_{RT} + C_{SS} + C_{ST} + C_{TT}$$

Reduction

- Given any instance of EXACT 3-COVER, we define an instance of SNDP as follows:

$$V = R \cup S \cup T$$

$$R = \{\rho_0, \rho_1, \dots, \rho_r\}$$

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$$\cup \{\{\rho_0, \sigma\} : \sigma \in S\}$$

$$\cup \{\{\sigma, \tau\} : \tau \in \sigma \in S\}$$

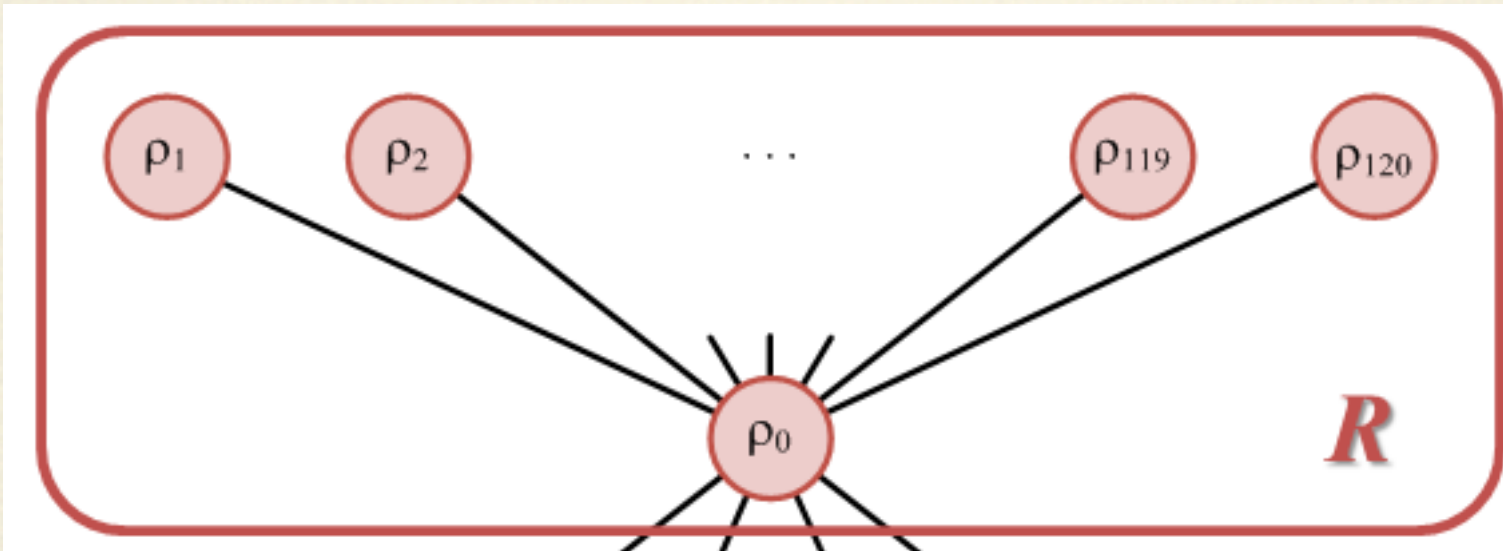
$$C = C_{RR} + C_{RS} + C_{RT} + C_{SS} + C_{ST} + C_{TT} = r$$

Meaning of parameters

- ❖ V: vertex
- ❖ R: vertex of S.T construct
- ❖ r: $C_{SS} + C_{ST} + C_{TT}$
- ❖ E: edge of R.S.T
- ❖ C: Total routing cost

Criterion Threshold

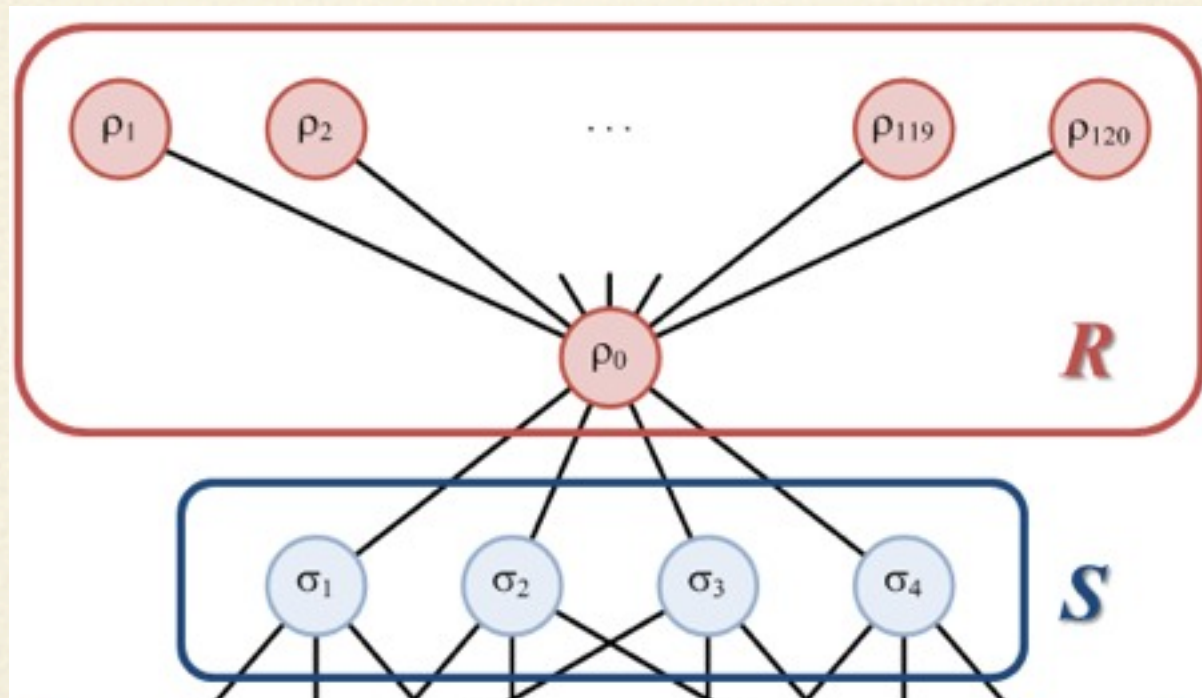
$$\diamond C_{RR} = r^2$$



$$\diamond C_{RR} = \{[2*(r-1)+1]*r+r\}/2 = r^2$$

Criterion Threshold

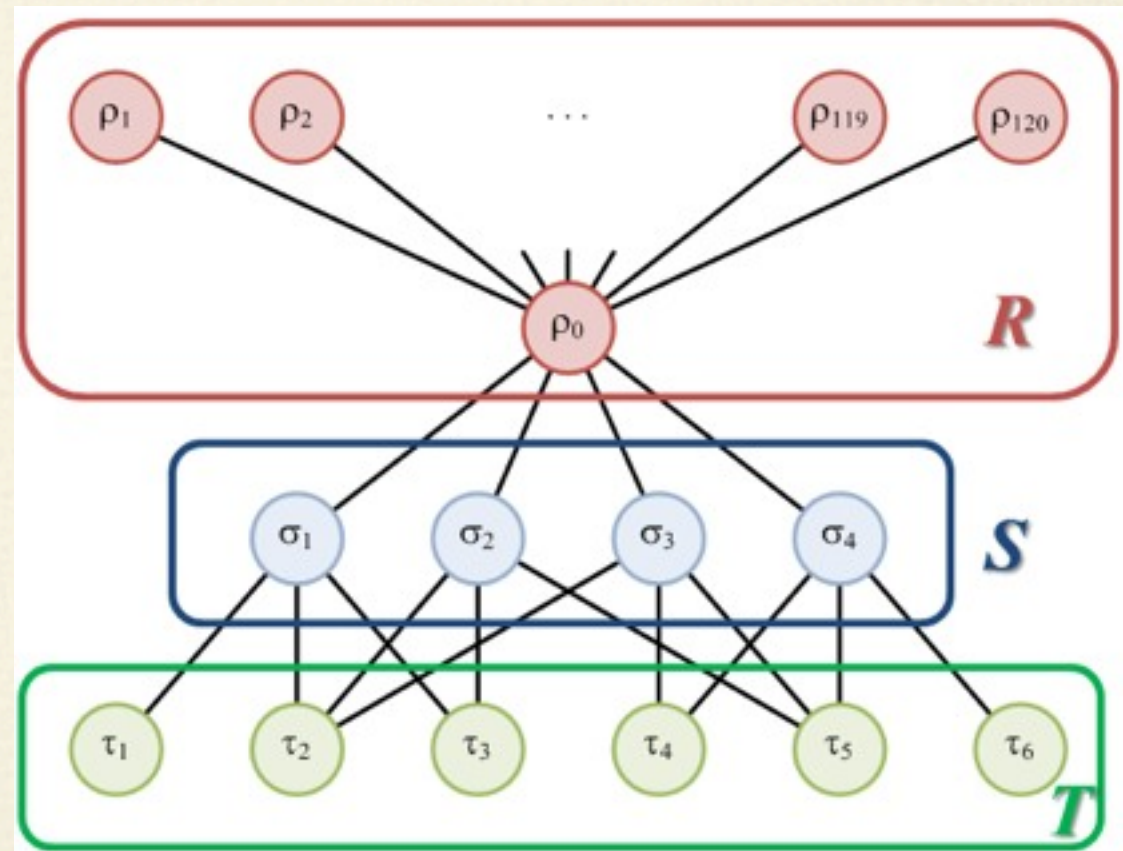
$$\diamond C_{RS} = 2rs + s$$



$$\diamond C_{RS} = (2 * s) * r + s = 2rs + s$$

Criterion Threshold

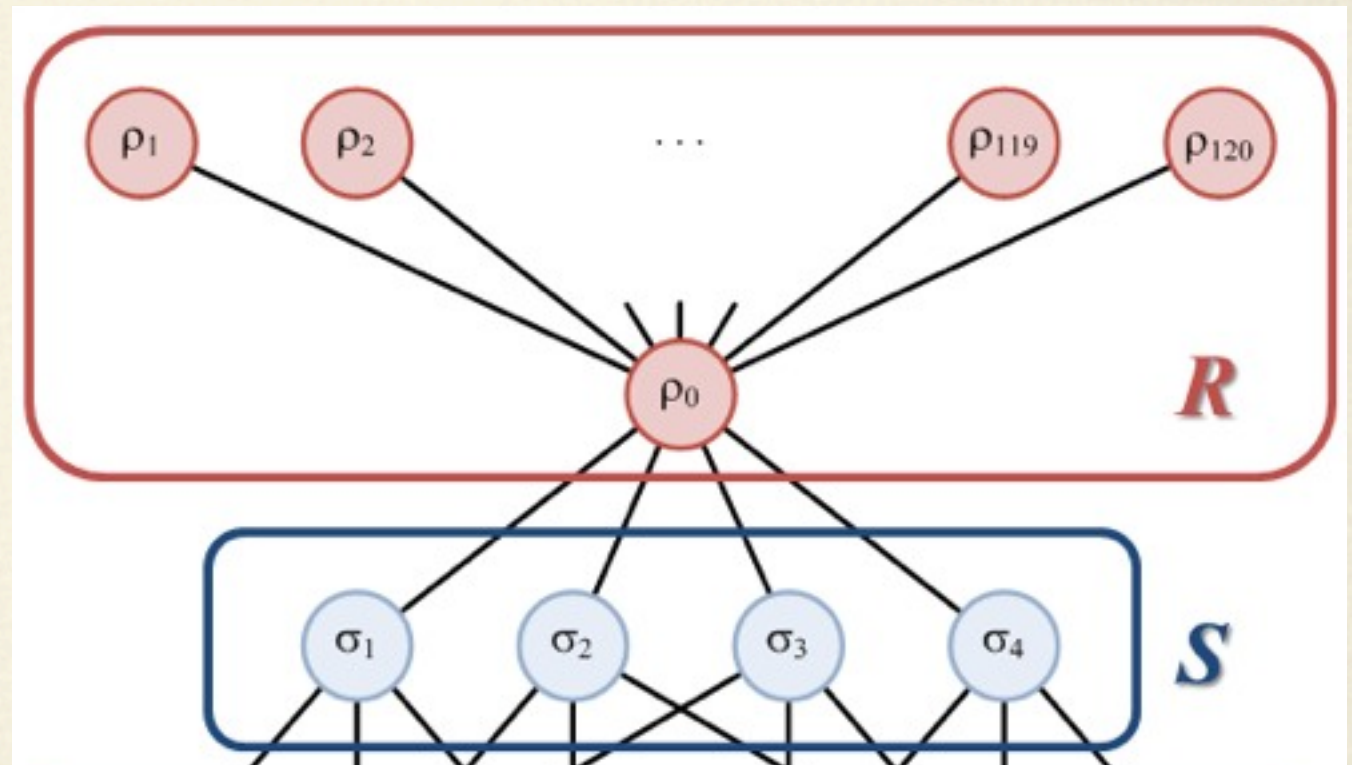
❖ $C_{RT} = 9rt + 6t$



❖ $C_{RT} = (3 * 3t) * r + 2 * 3t = 9rt + 6t$

Criterion Threshold

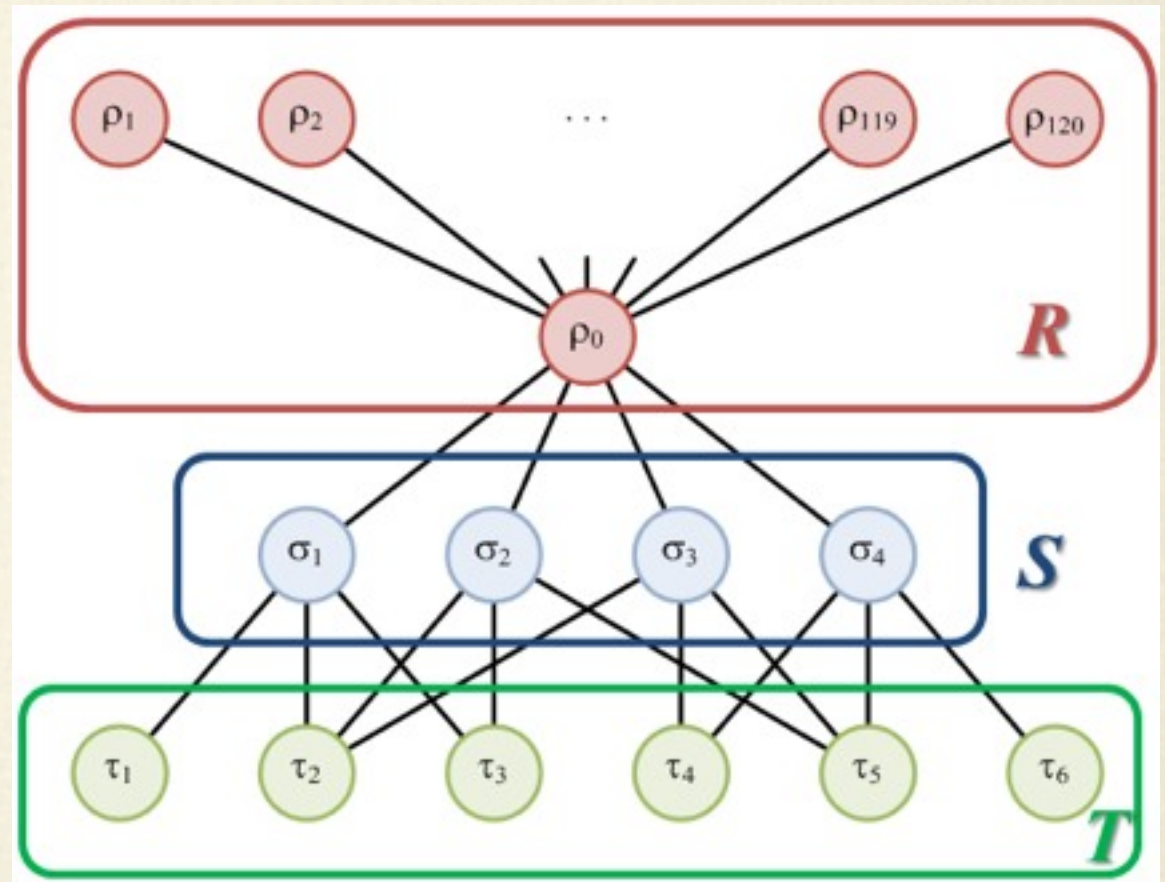
$$\diamond C_{SS} = s^2 - s$$



$$\diamond C_{SS} = \{[2 * (s-1)] * s\} / 2 = s^2 - s$$

Criterion Threshold

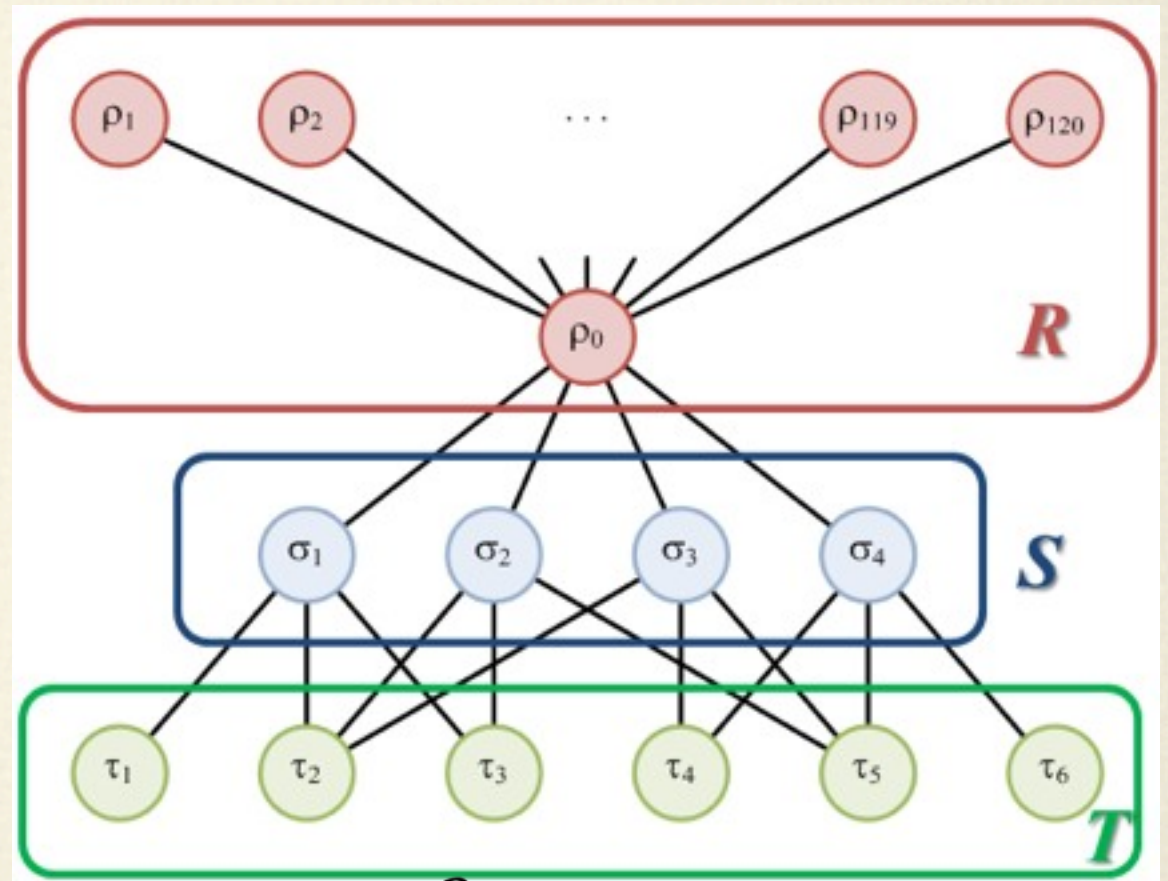
$$\diamond C_{ST} = 9st - 6t$$



$$\diamond C_{ST} = [1 + 3 * (s - 1)] * 3t = 9st - 6t$$

Criterion Threshold

$$\diamond C_{TT} = 18t^2 - 12t$$



$$\diamond C_{TT} = \{[2*2 + 4*(3t-3)]*3t\}/2 = 18t^2 - 12t$$

Criterion Threshold

- ❖ $C_{RR} = r^2$
- ❖ $C_{RS} = 2rs + s$
- ❖ $C_{RT} = 9rt + 6t$
- ❖ $C_{SS} = s^2 - s$
- ❖ $C_{ST} = 9st - 6t$
- ❖ $C_{TT} = 18t^2 - 12t$

Illustration of Reduction

Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\}$$

Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4$$

Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\}$$

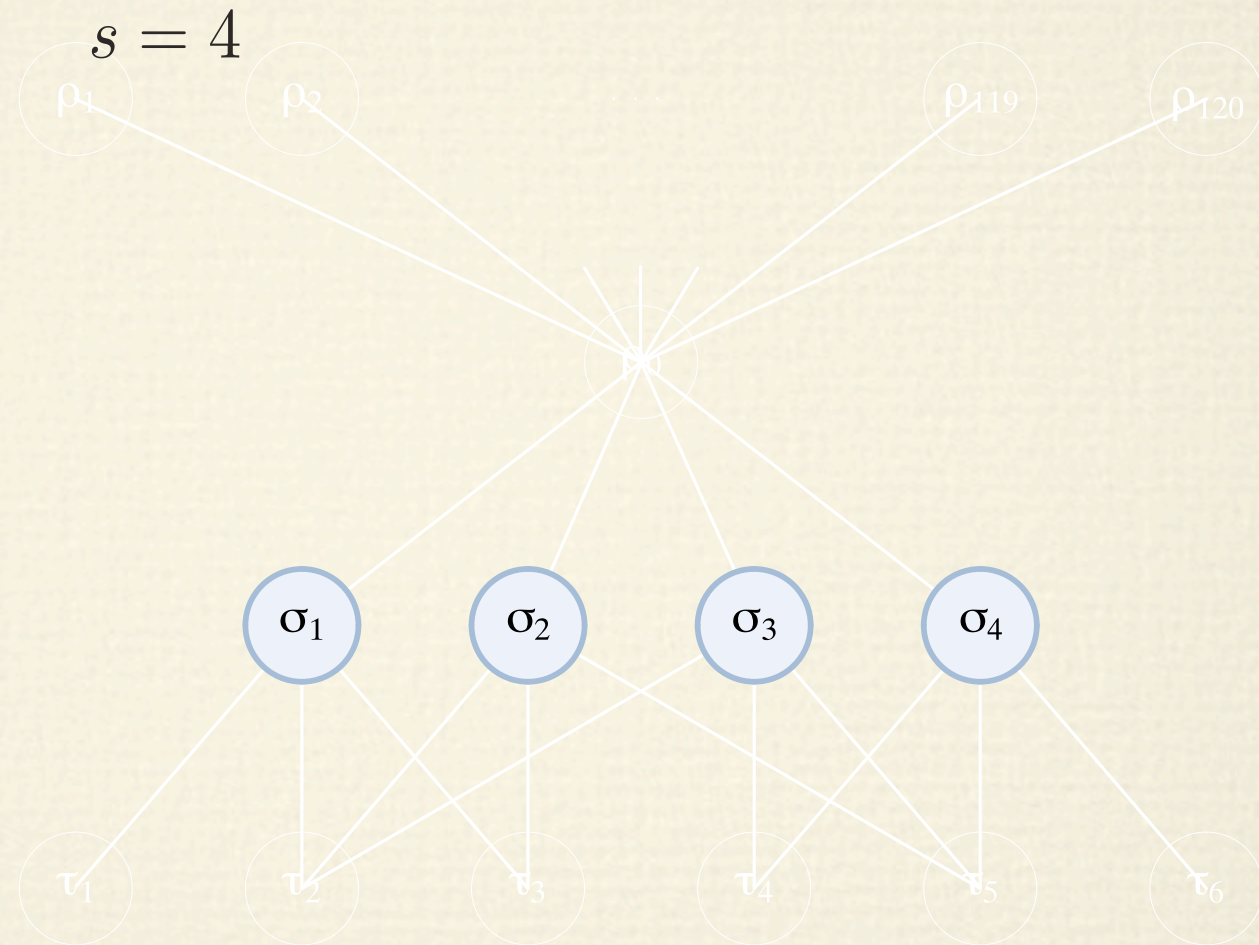


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\}$$

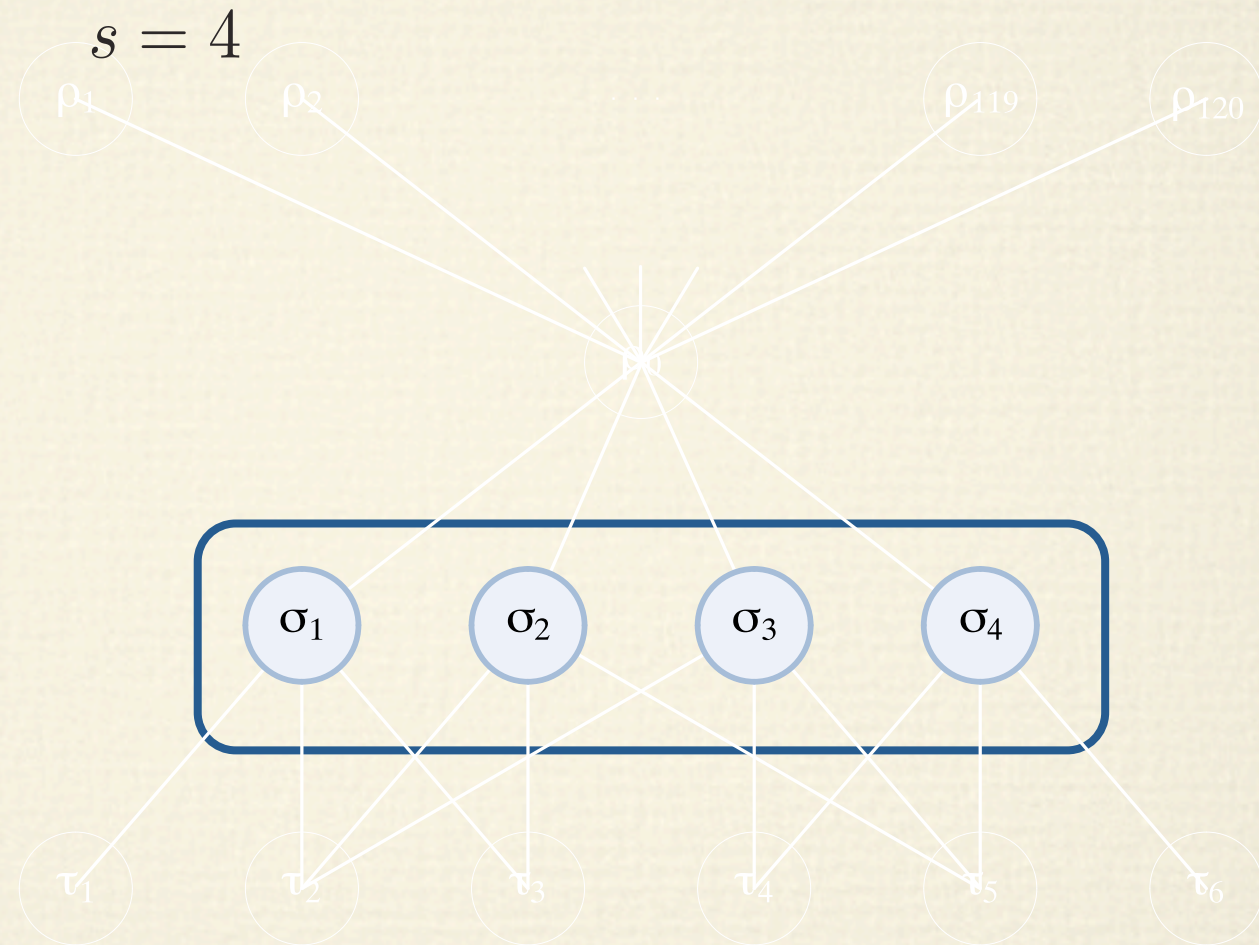


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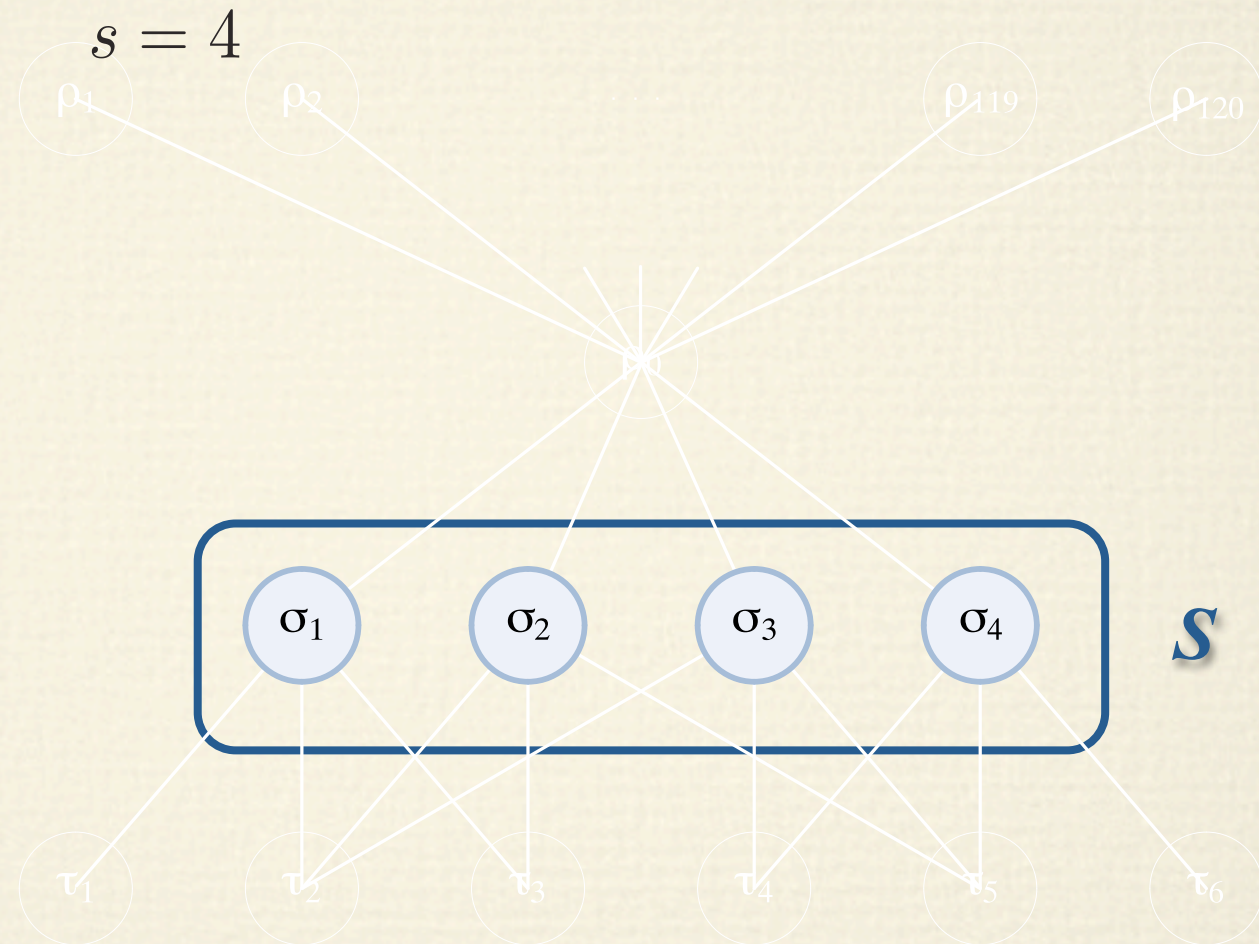


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4$$

$$T = \{\tau_1, \tau_2, \tau_3, \tau_4, \tau_5, \tau_6\}$$

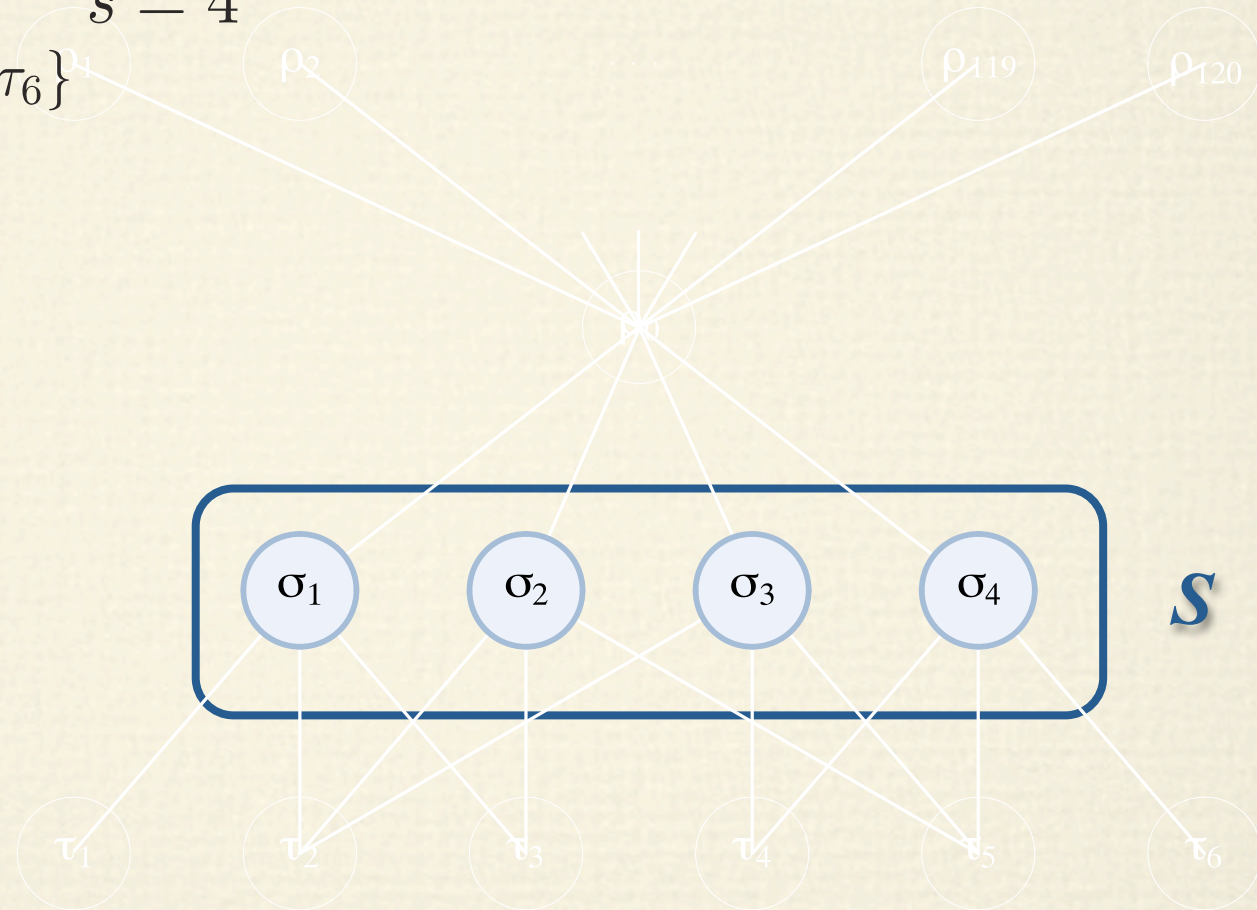


Illustration of Reduction

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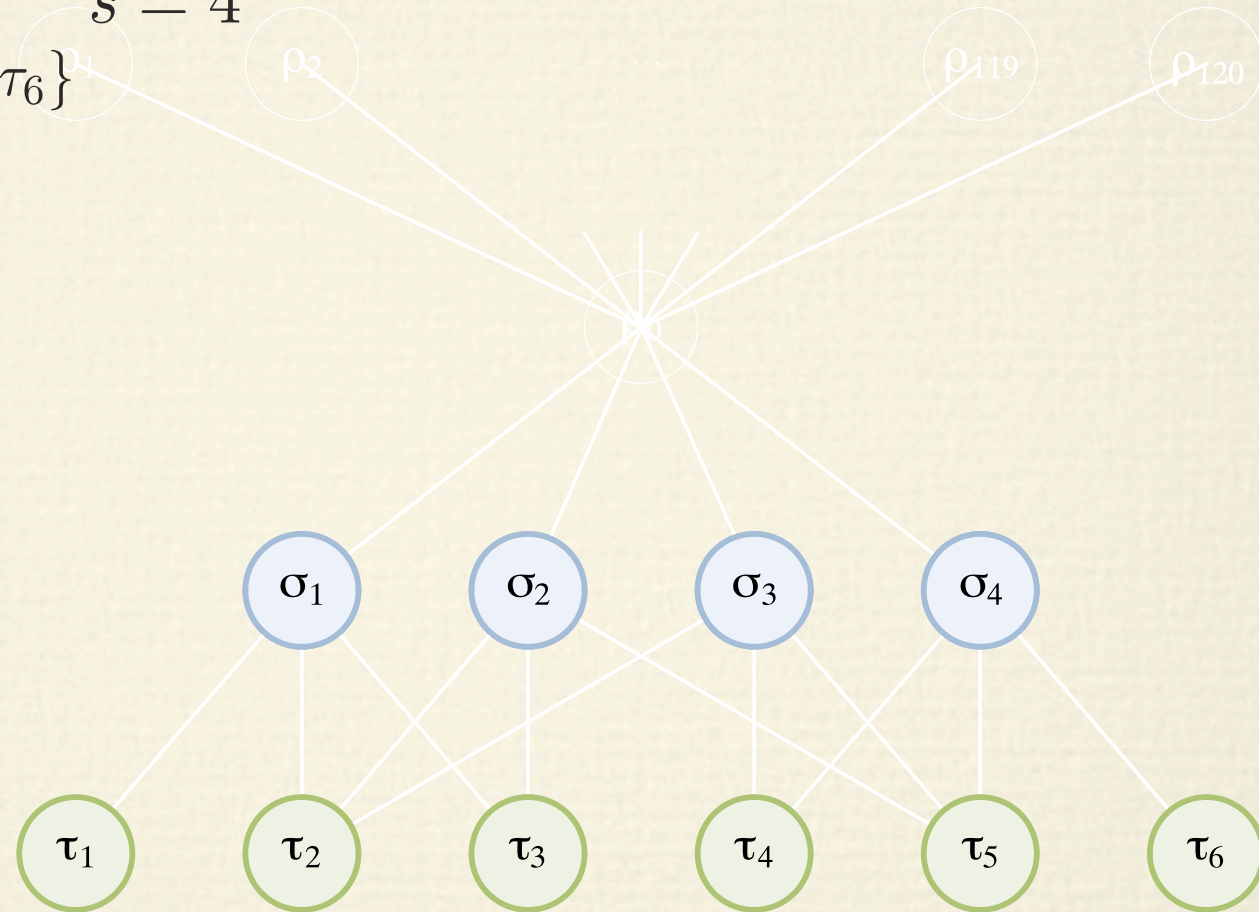


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4$$

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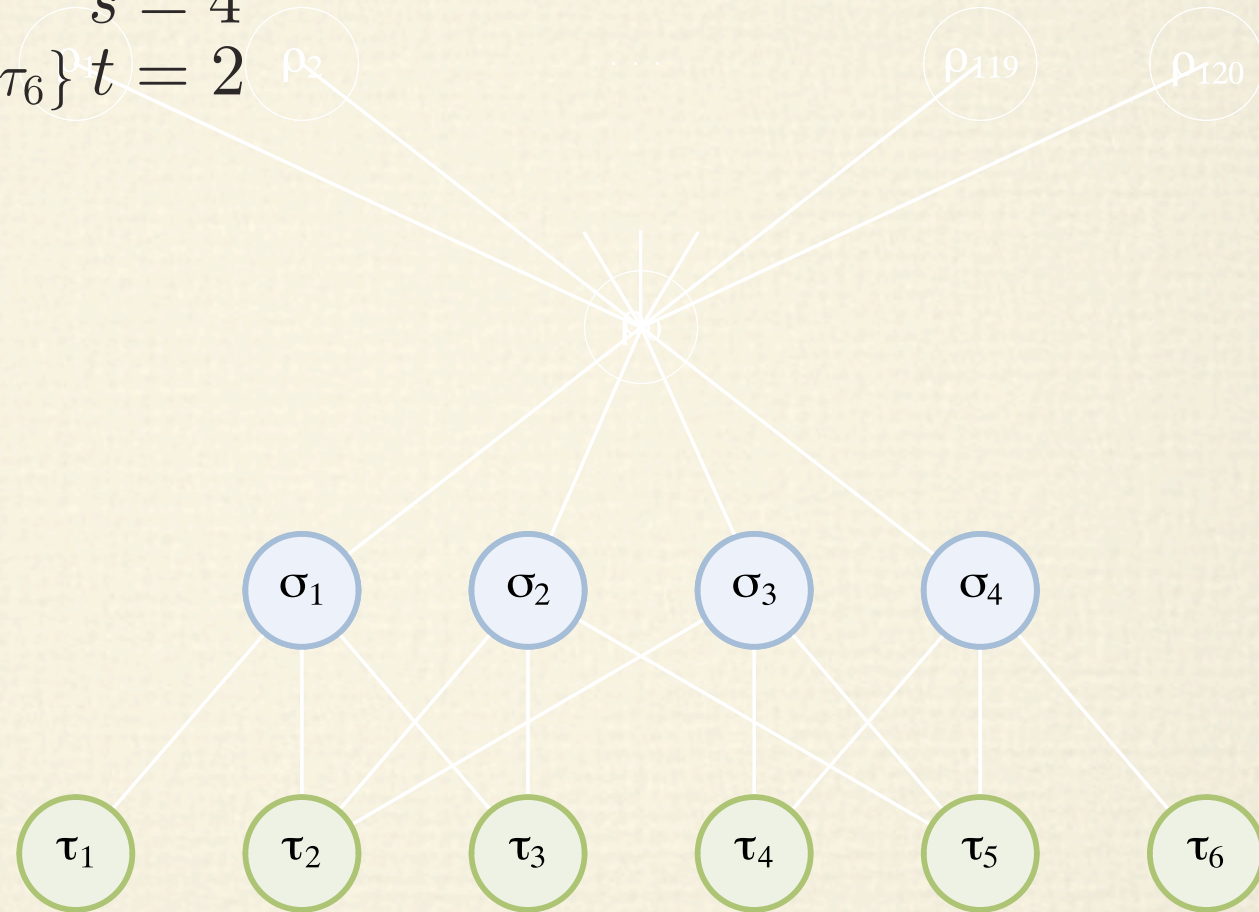


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4$$

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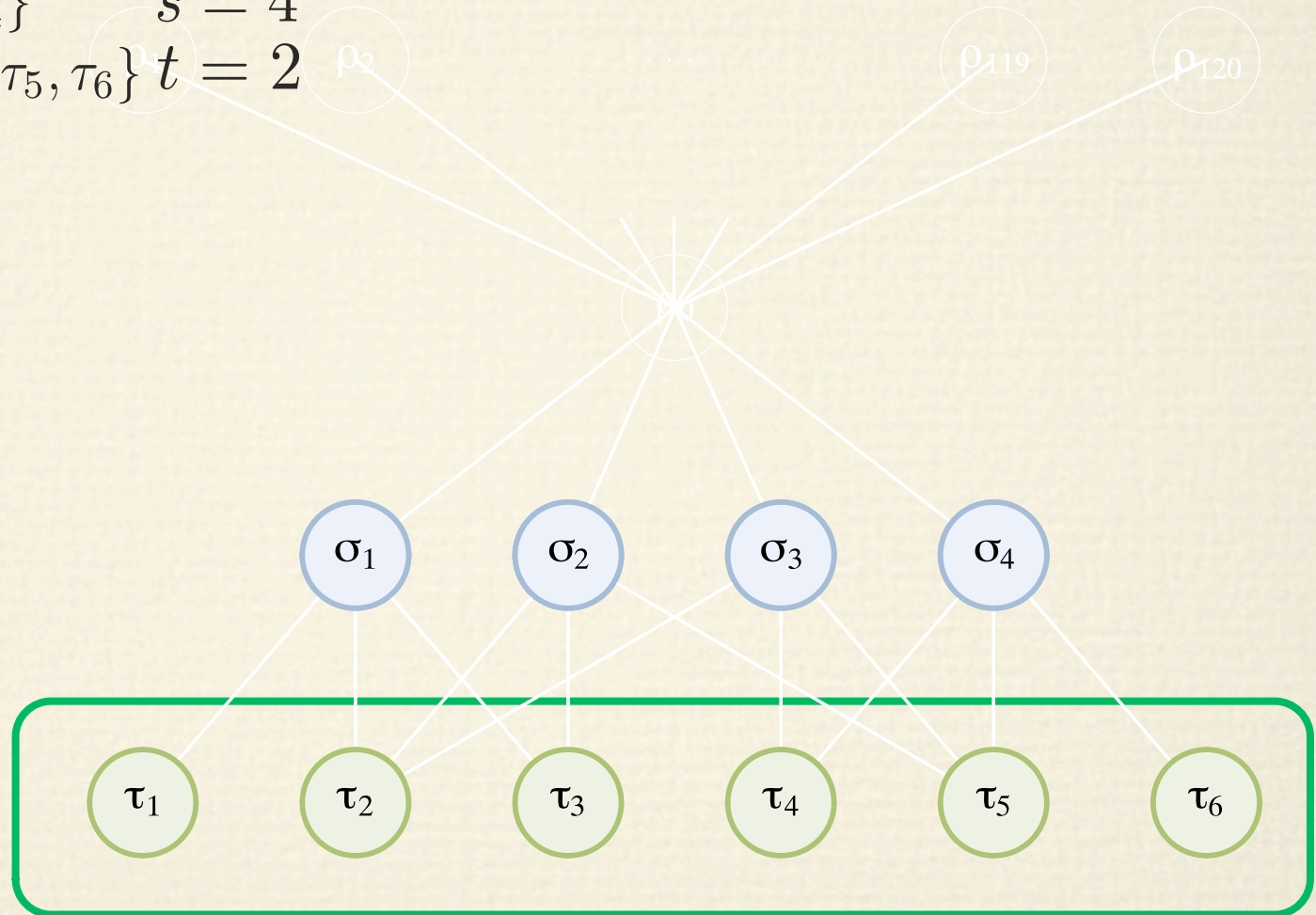


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4$$

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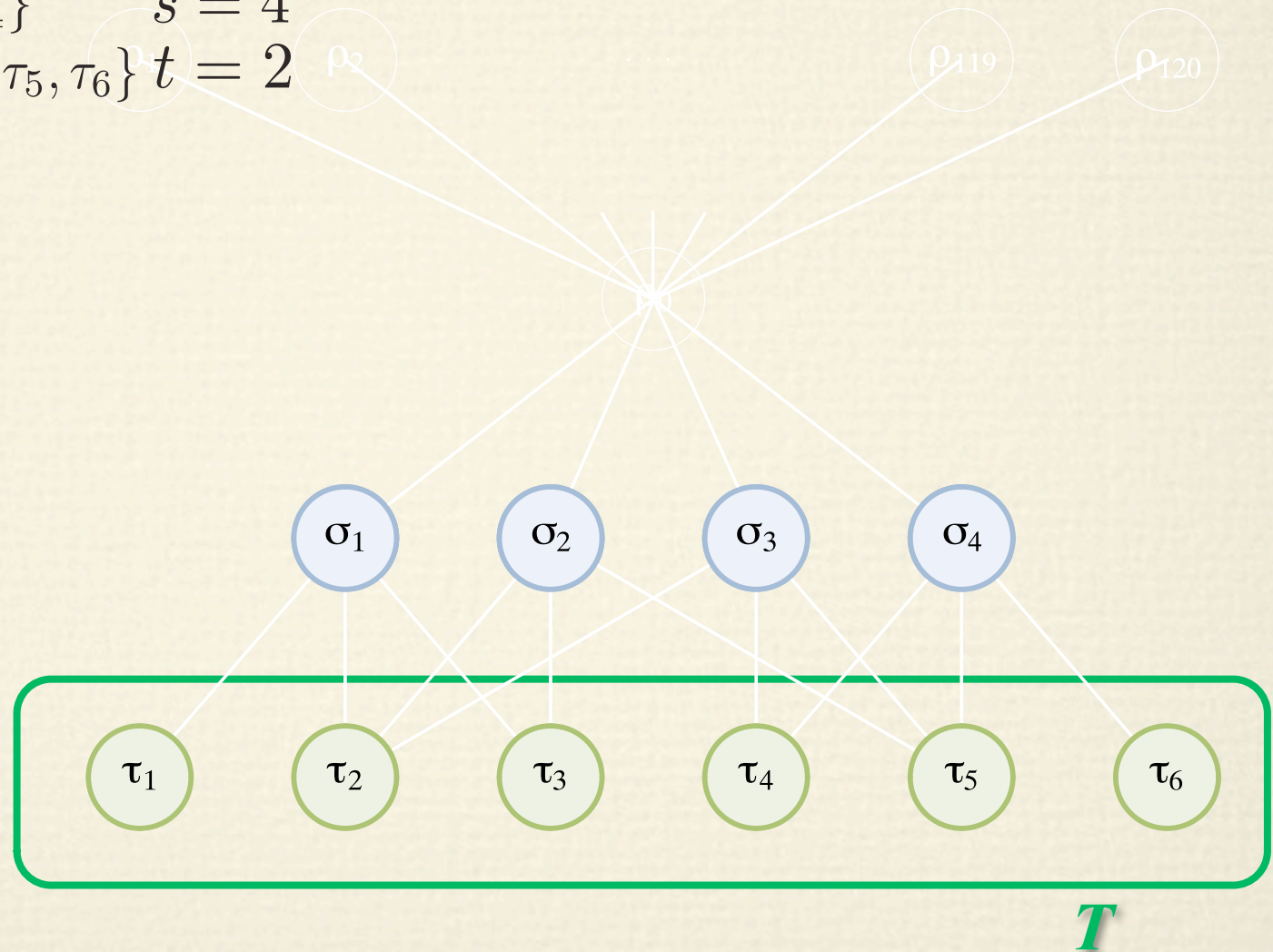


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4 \quad \sigma_1 = \{\tau_1, \tau_2, \tau_3\}$$
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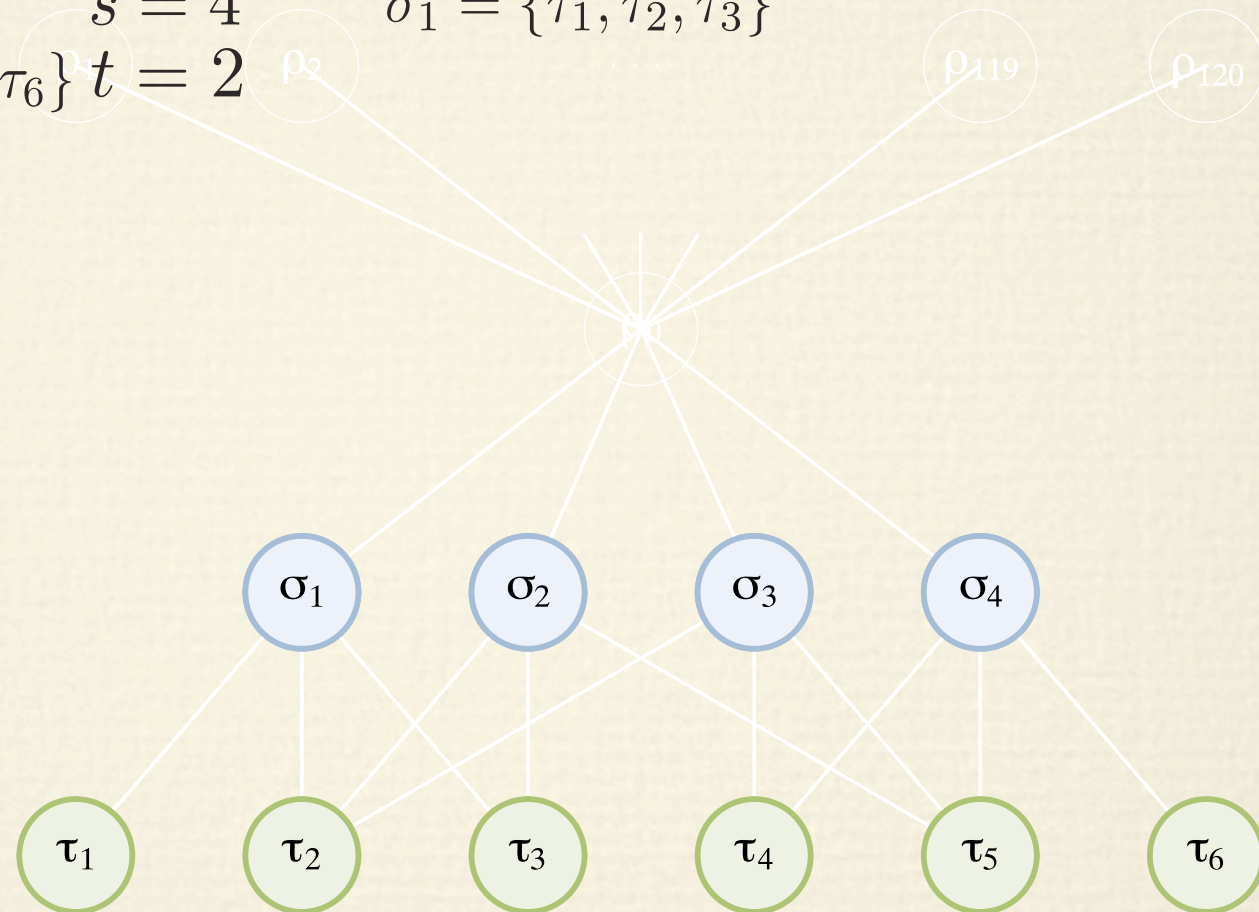


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4 \quad \sigma_1 = \{\tau_1, \tau_2, \tau_3\}$$

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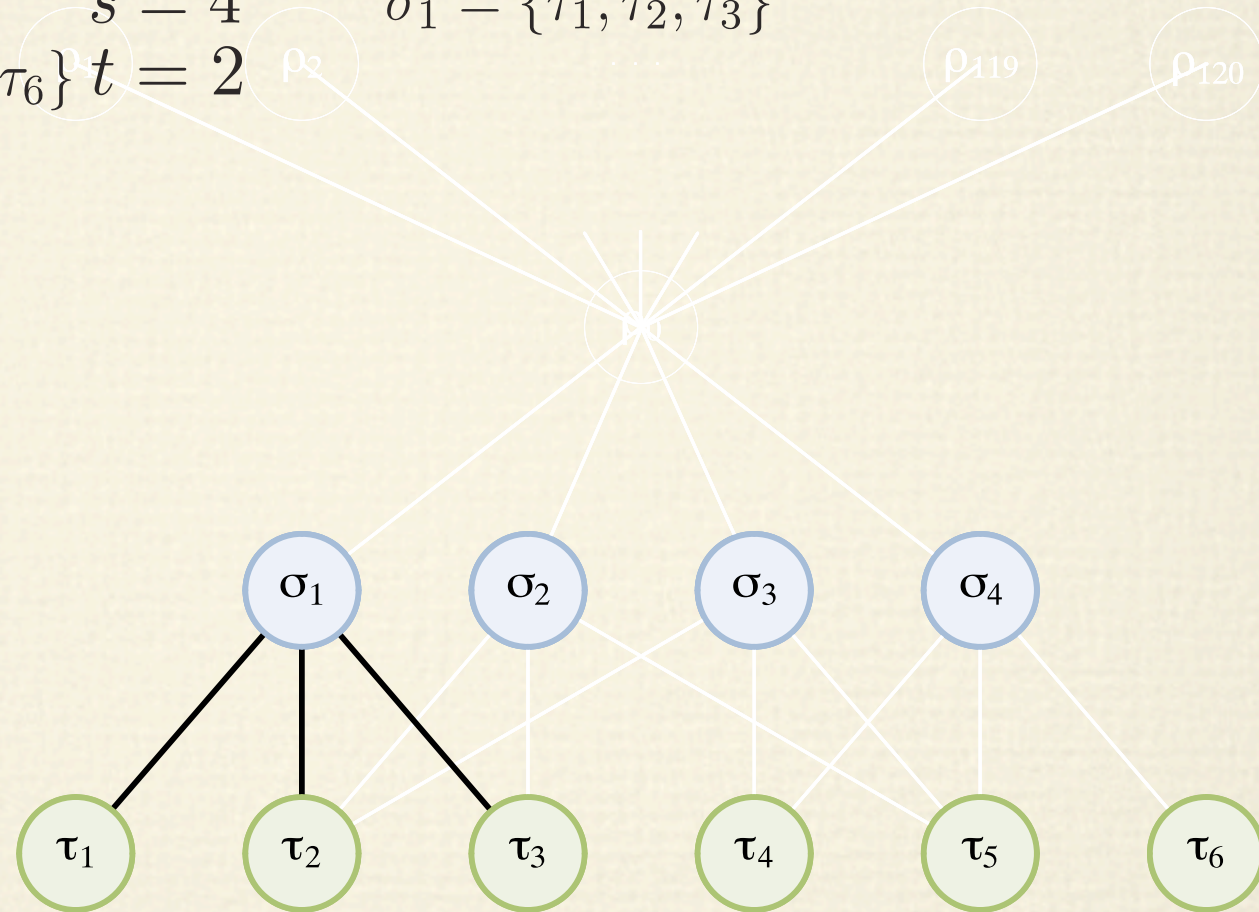


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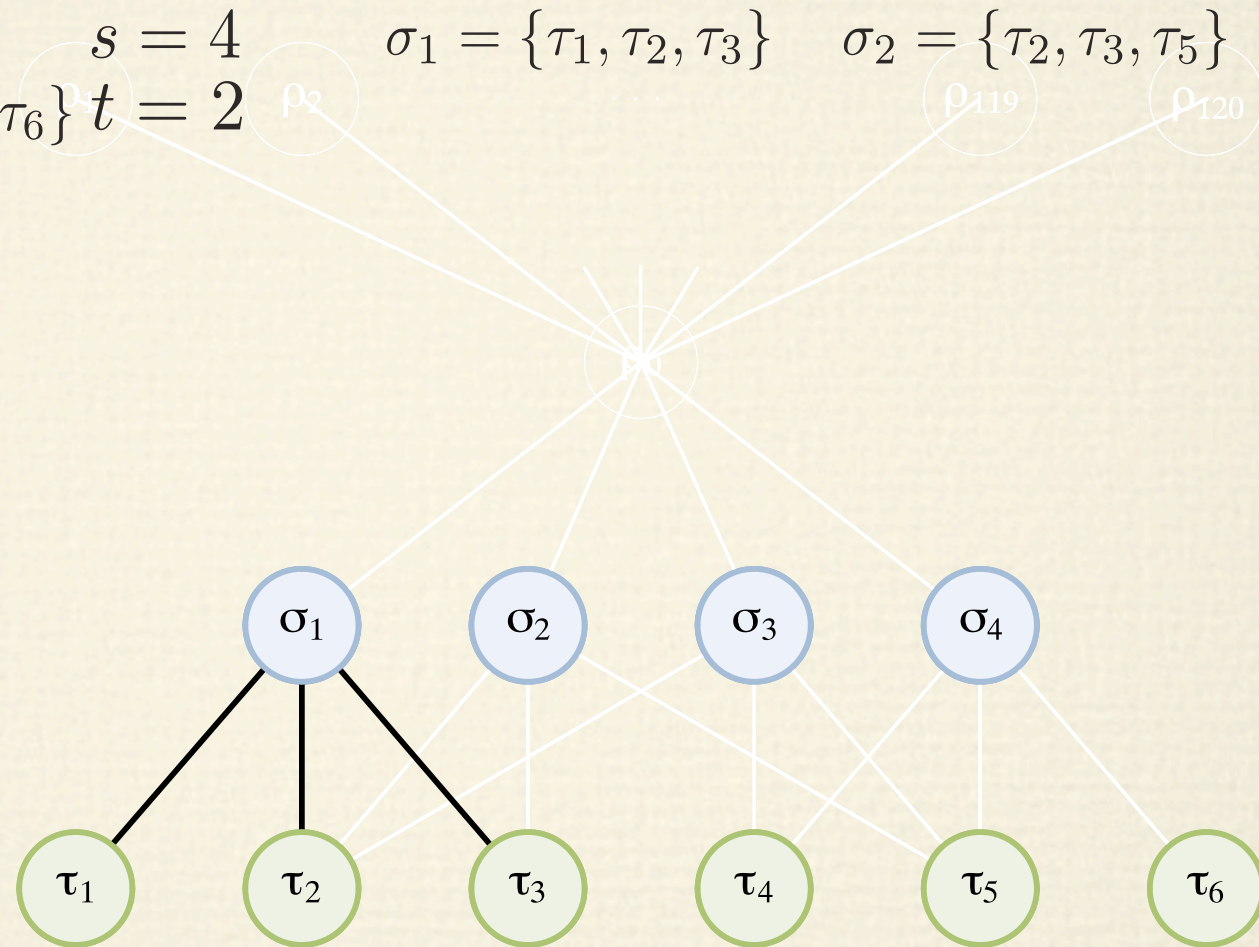


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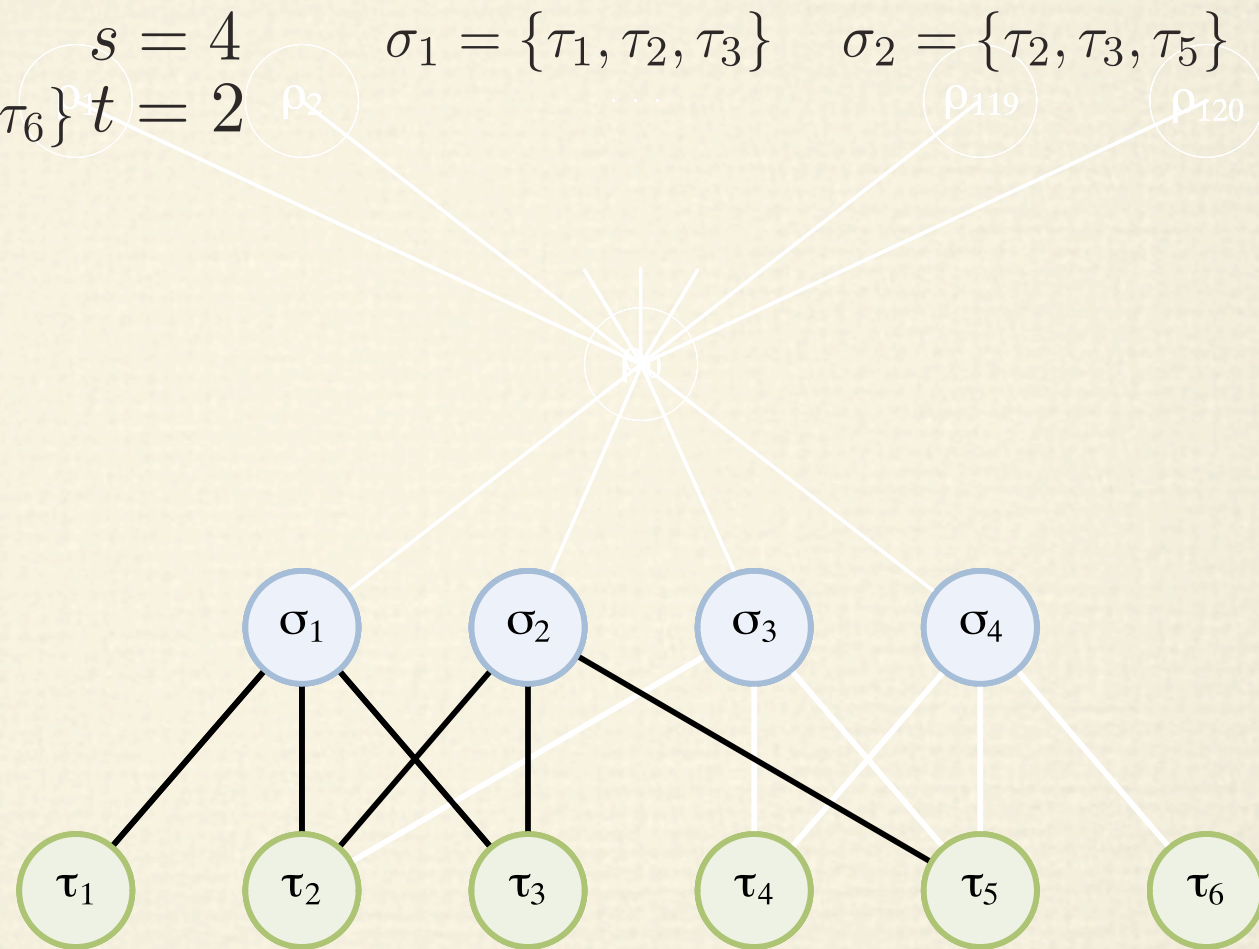


Illustration of Reduction

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$$T = \{\tau_1, \tau_2, \tau_3, \tau_4, \tau_5, \tau_6\} \quad t = 2 \quad \sigma_3 = \{\tau_2, \tau_4, \tau_5\}$$

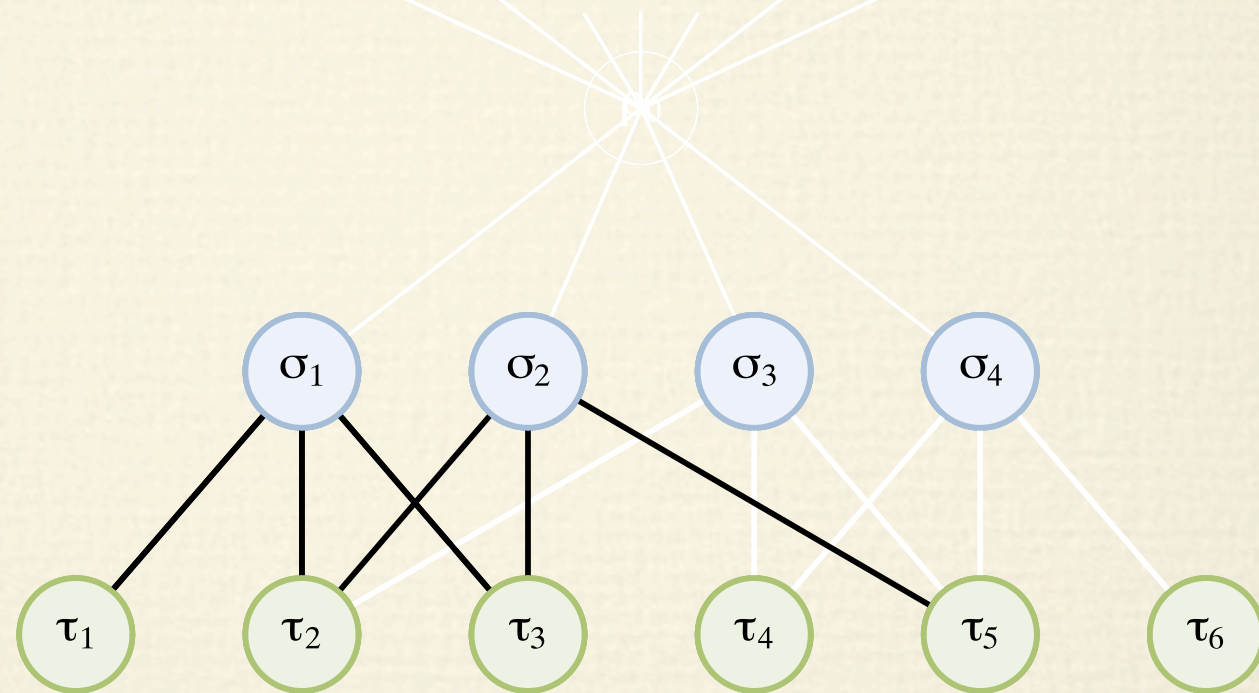


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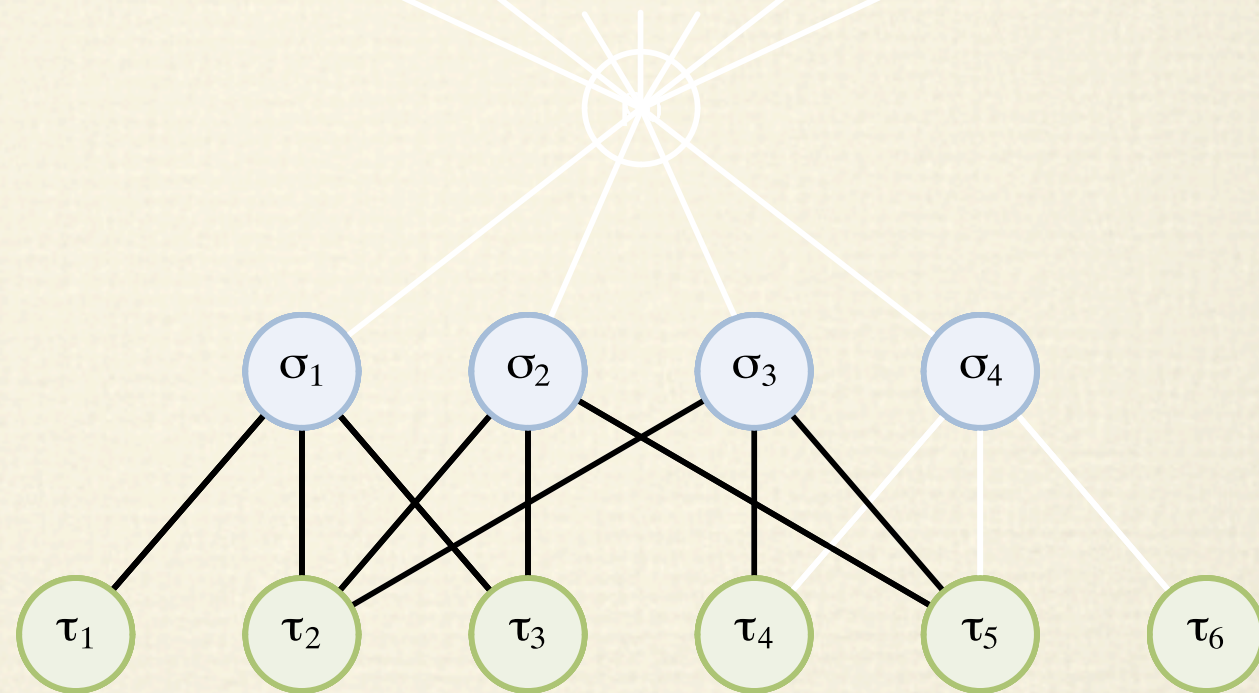


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$$\sigma_1 = \{\tau_1, \tau_2, \tau_3\} \quad \sigma_2 = \{\tau_2, \tau_3, \tau_5\}$$

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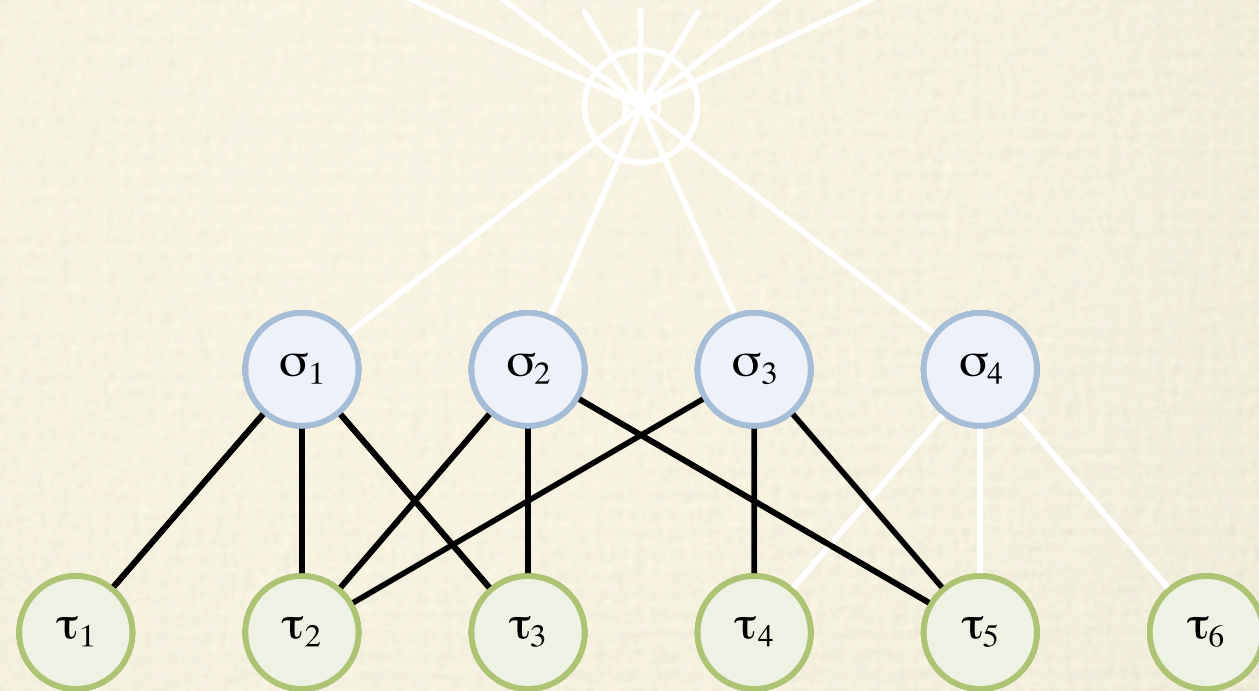


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\}$$

$$s = 4$$

$$\sigma_1 = \{\tau_1, \tau_2, \tau_3\}$$

$$\sigma_2 = \{\tau_2, \tau_3, \tau_5\}$$

$$T = \{\tau_1, \tau_2, \tau_3, \tau_4, \tau_5, \tau_6\} \quad t = 2$$

$$\sigma_3 = \{\tau_2, \tau_4, \tau_5\}$$

$$\sigma_4 = \{\tau_4, \tau_5, \tau_6\}$$

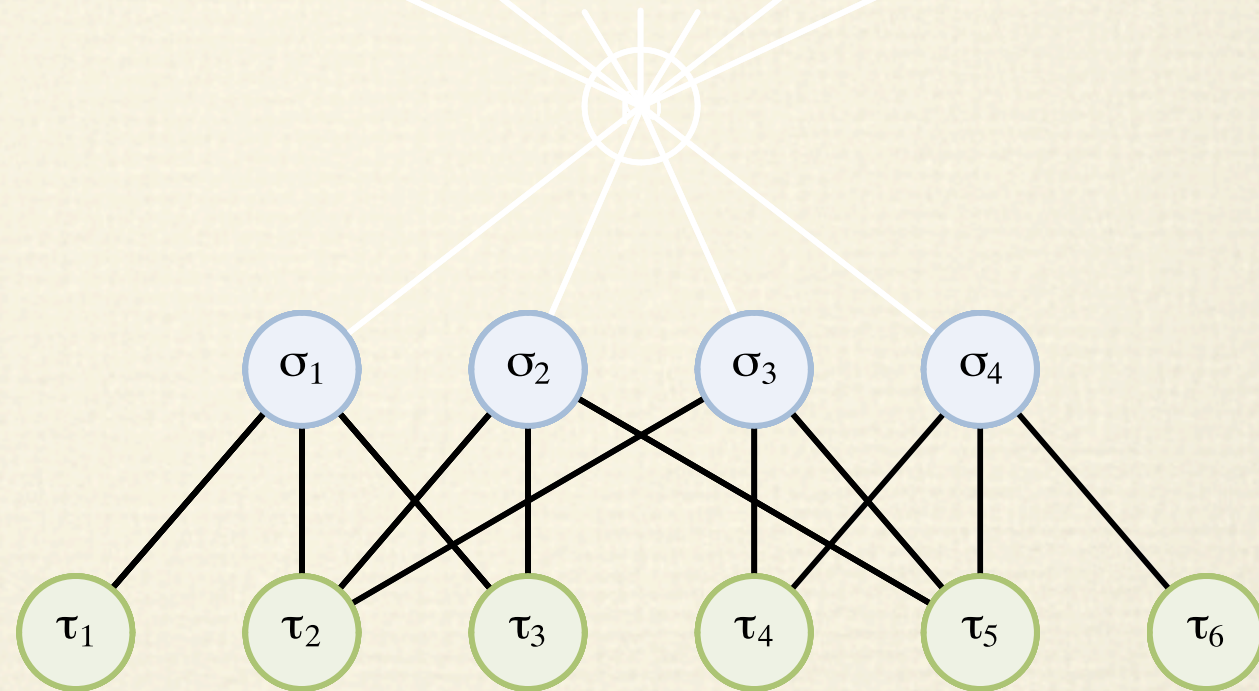


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$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4$$

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$$\sigma_3 = \{\tau_2, \tau_4, \tau_5\}$$

$$\sigma_4 = \{\tau_4, \tau_5, \tau_6\}$$

$$C_{SS} = s^2 - s = 16 - 4 = 12$$

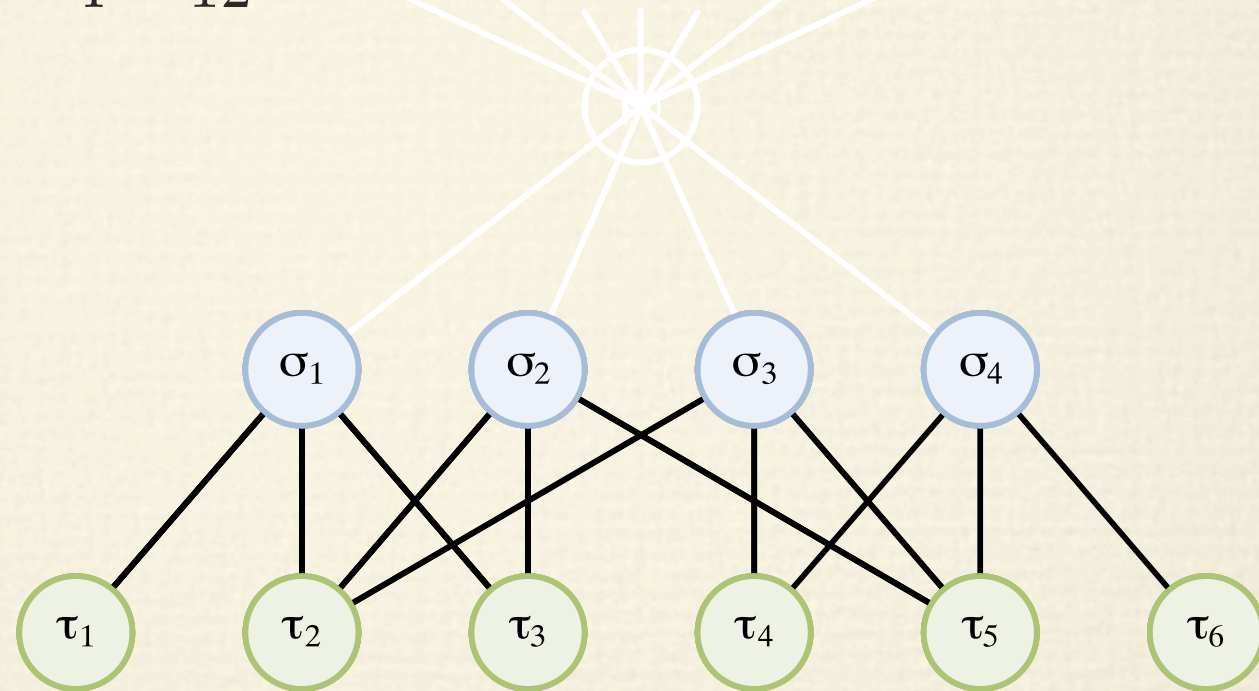


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4 \quad \sigma_1 = \{\tau_1, \tau_2, \tau_3\} \quad \sigma_2 = \{\tau_2, \tau_3, \tau_5\}$$

$$T = \{\tau_1, \tau_2, \tau_3, \tau_4, \tau_5, \tau_6\} \quad t = 2 \quad \sigma_3 = \{\tau_2, \tau_4, \tau_5\} \quad \sigma_4 = \{\tau_4, \tau_5, \tau_6\}$$

$$C_{SS} = s^2 - s = 16 - 4 = 12$$

$$C_{ST} = 9st - 6t$$

$$= 9 \times 4 \times 2 - 6 \times 2 = 60$$

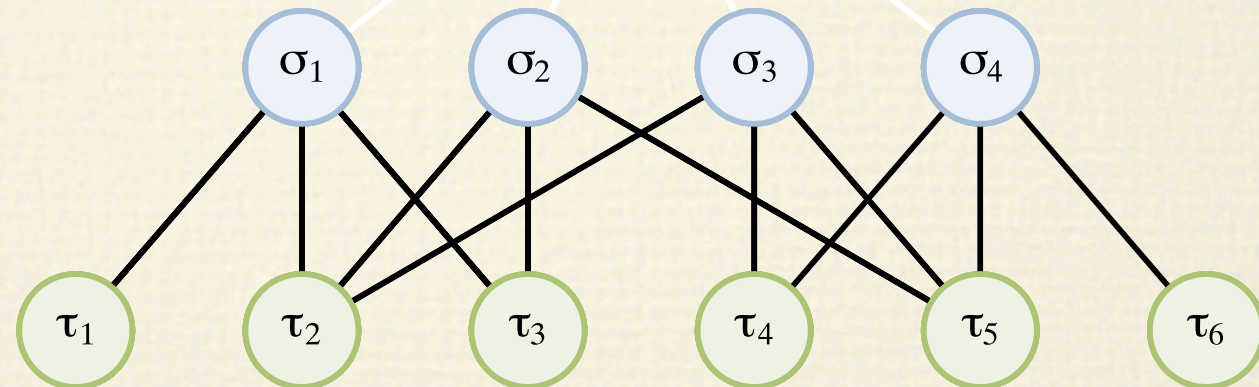


Illustration of Reduction

$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4 \quad \sigma_1 = \{\tau_1, \tau_2, \tau_3\} \quad \sigma_2 = \{\tau_2, \tau_3, \tau_5\}$$

$$T = \{\tau_1, \tau_2, \tau_3, \tau_4, \tau_5, \tau_6\} \quad t = 2 \quad \sigma_3 = \{\tau_2, \tau_4, \tau_5\} \quad \sigma_4 = \{\tau_4, \tau_5, \tau_6\}$$

$$C_{SS} = s^2 - s = 16 - 4 = 12$$

$$C_{ST} = 9st - 6t$$

$$= 9 \times 4 \times 2 - 6 \times 2 = 60$$

$$C_{TT} = 18t^2 - 12t$$

$$= 18 \times 4 - 12 \times 2$$

$$= 48$$

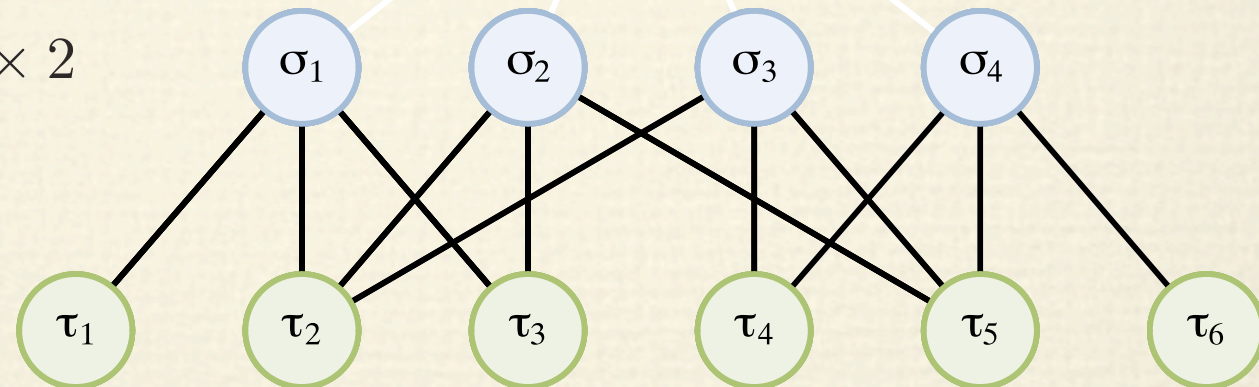


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$$S = \{\sigma_1, \sigma_2, \sigma_3, \sigma_4\} \quad s = 4 \quad \sigma_1 = \{\tau_1, \tau_2, \tau_3\} \quad \sigma_2 = \{\tau_2, \tau_3, \tau_5\}$$

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$$= 18 \times 4 - 12 \times 2$$

$$= 48$$

$$r = C_{SS} + C_{ST} + C_{TT}$$

$$= 12 + 60 + 48$$

$$= 120$$

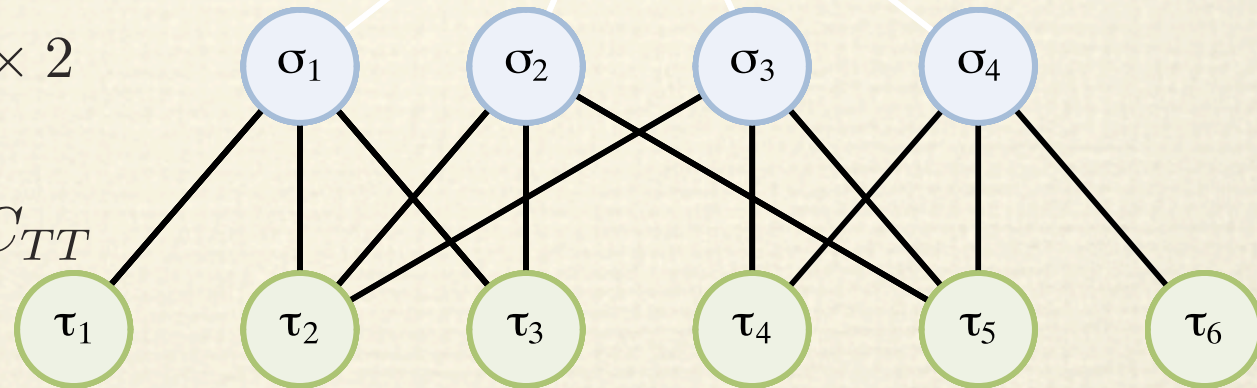


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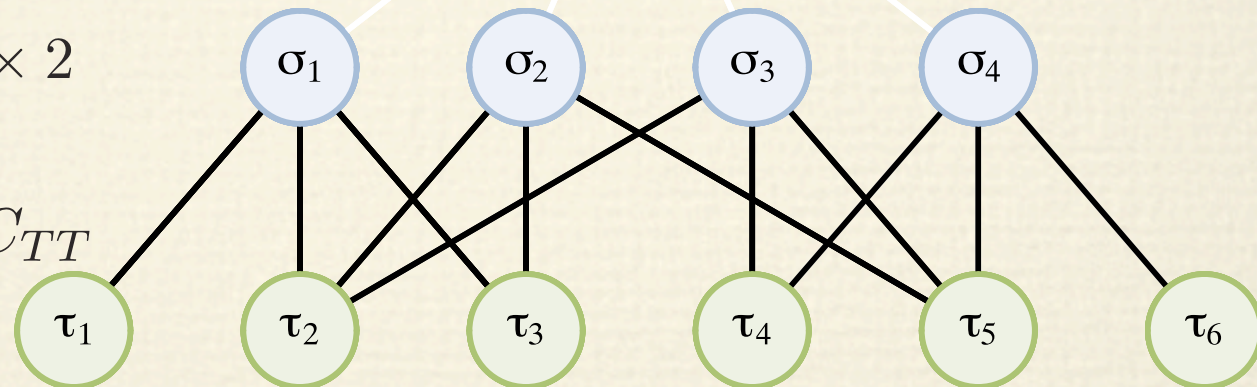


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$$C_{SS} = s^2 - s = 16 - 4 = 12$$

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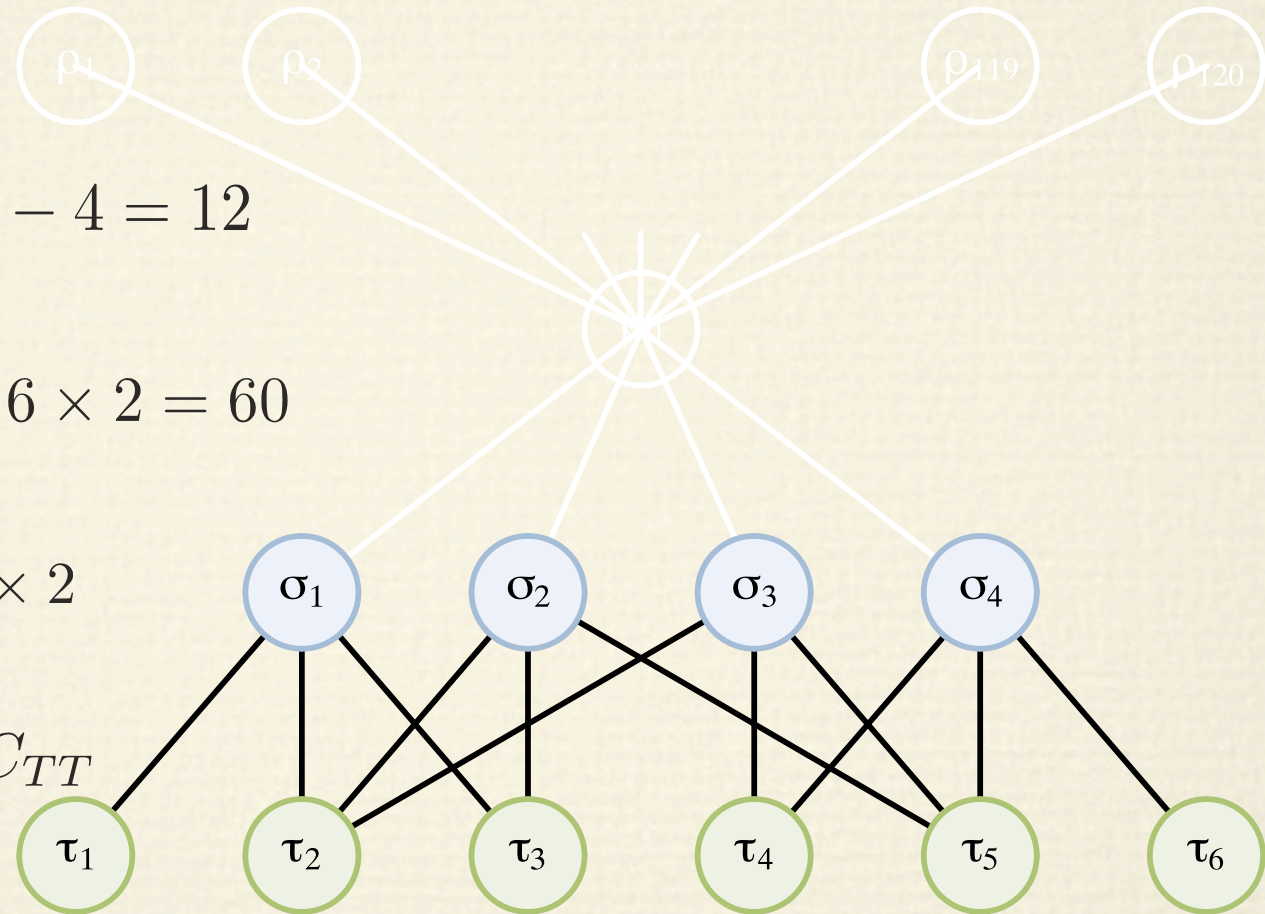


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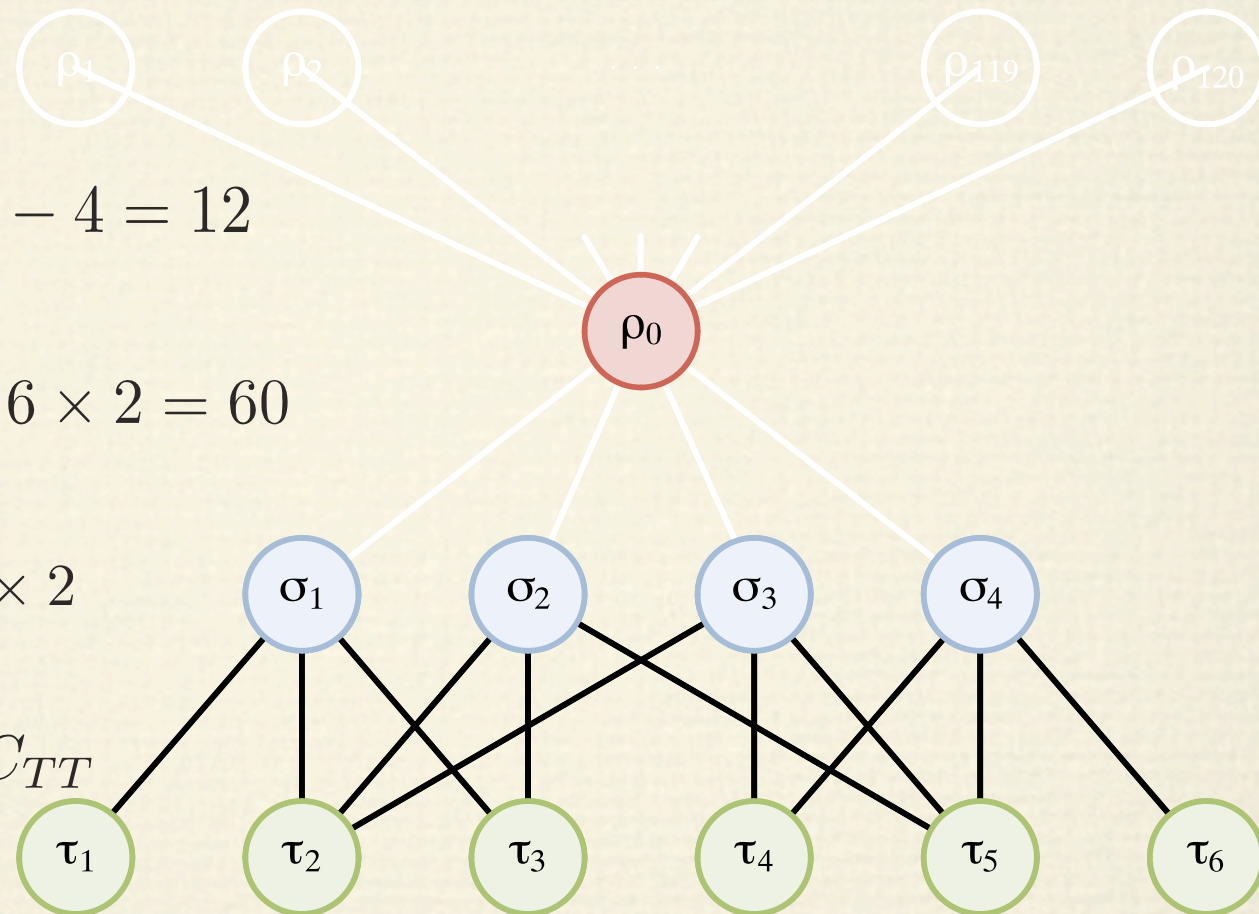


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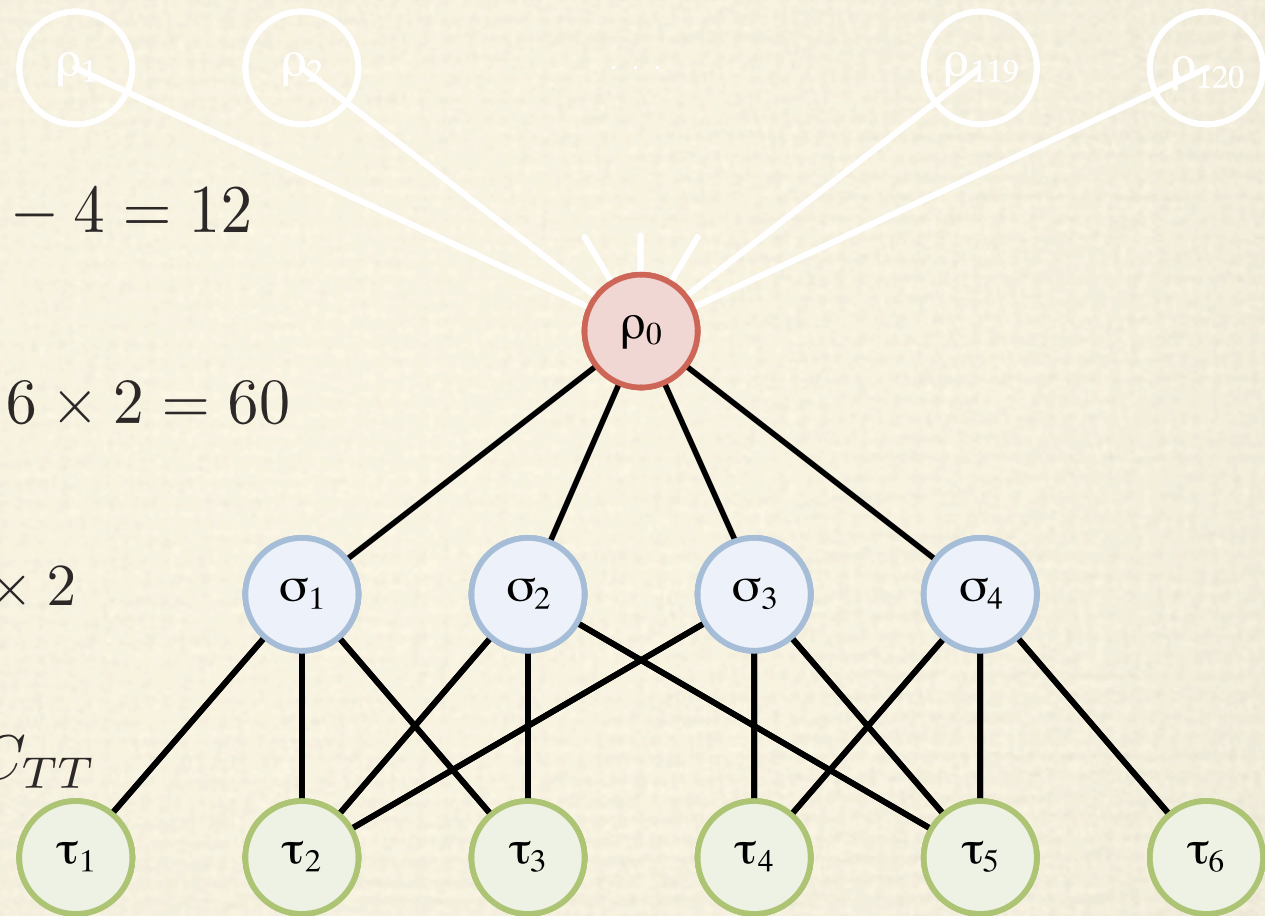


Illustration of Reduction

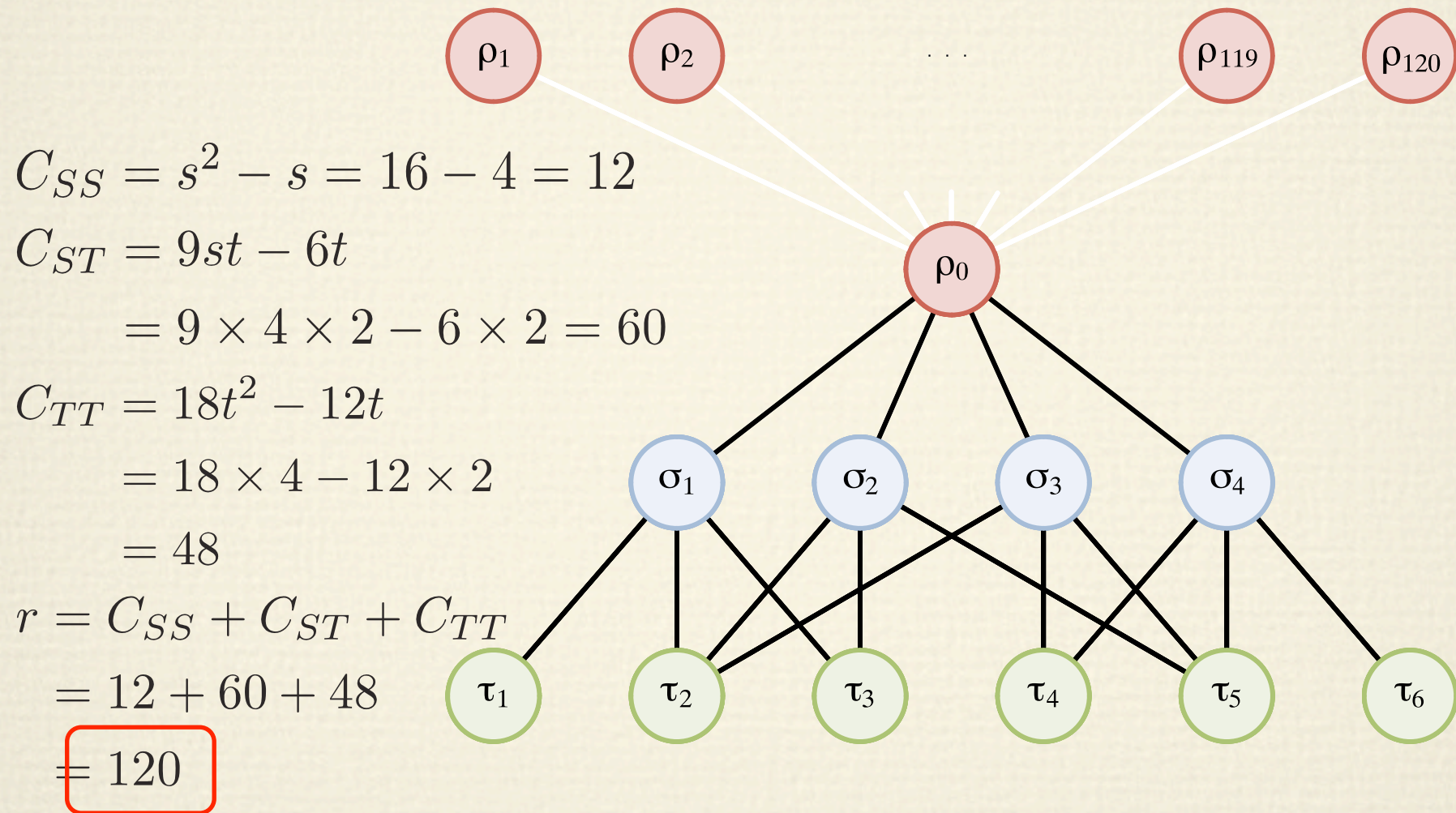


Illustration of Reduction

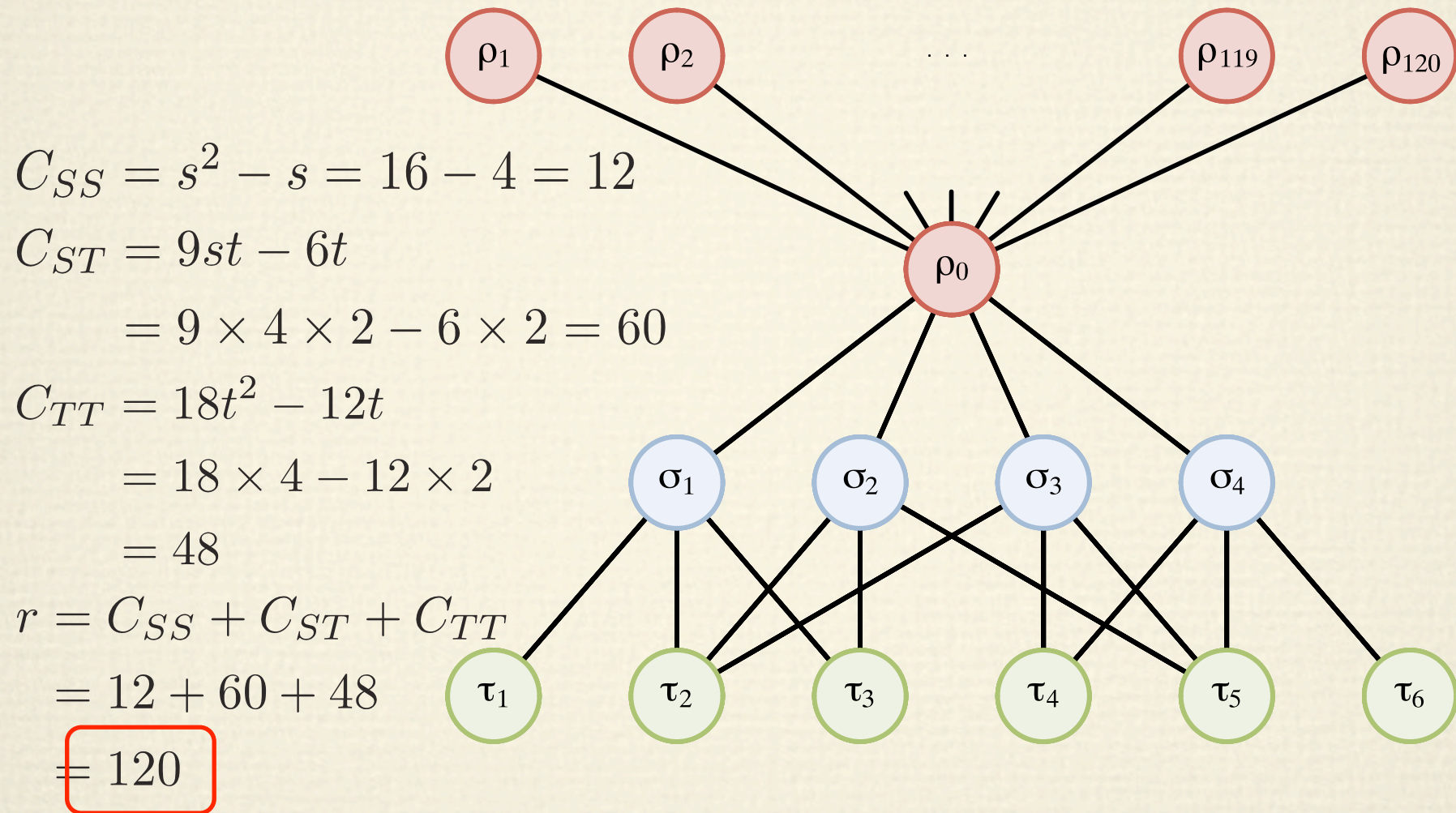


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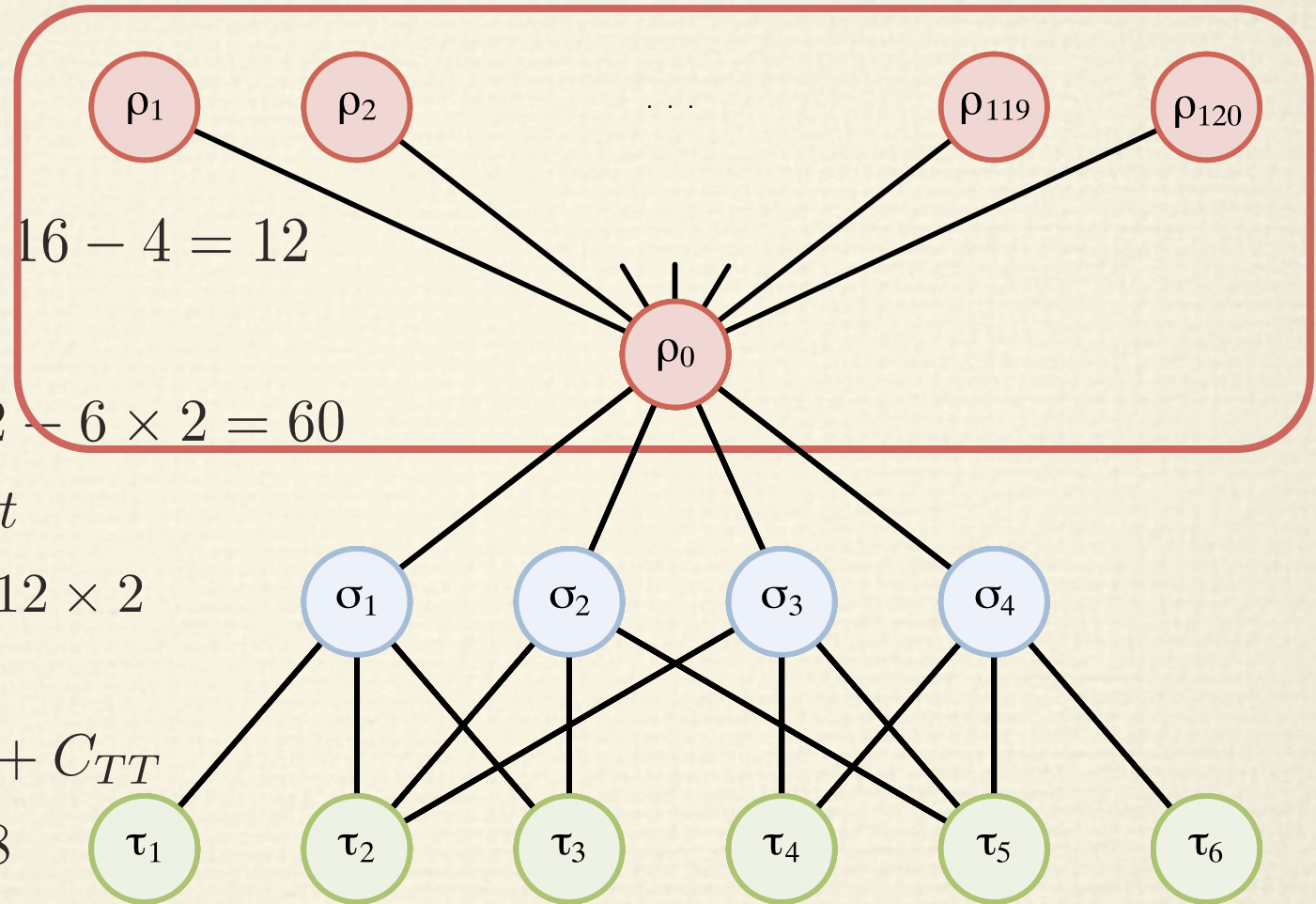


Illustration of Reduction

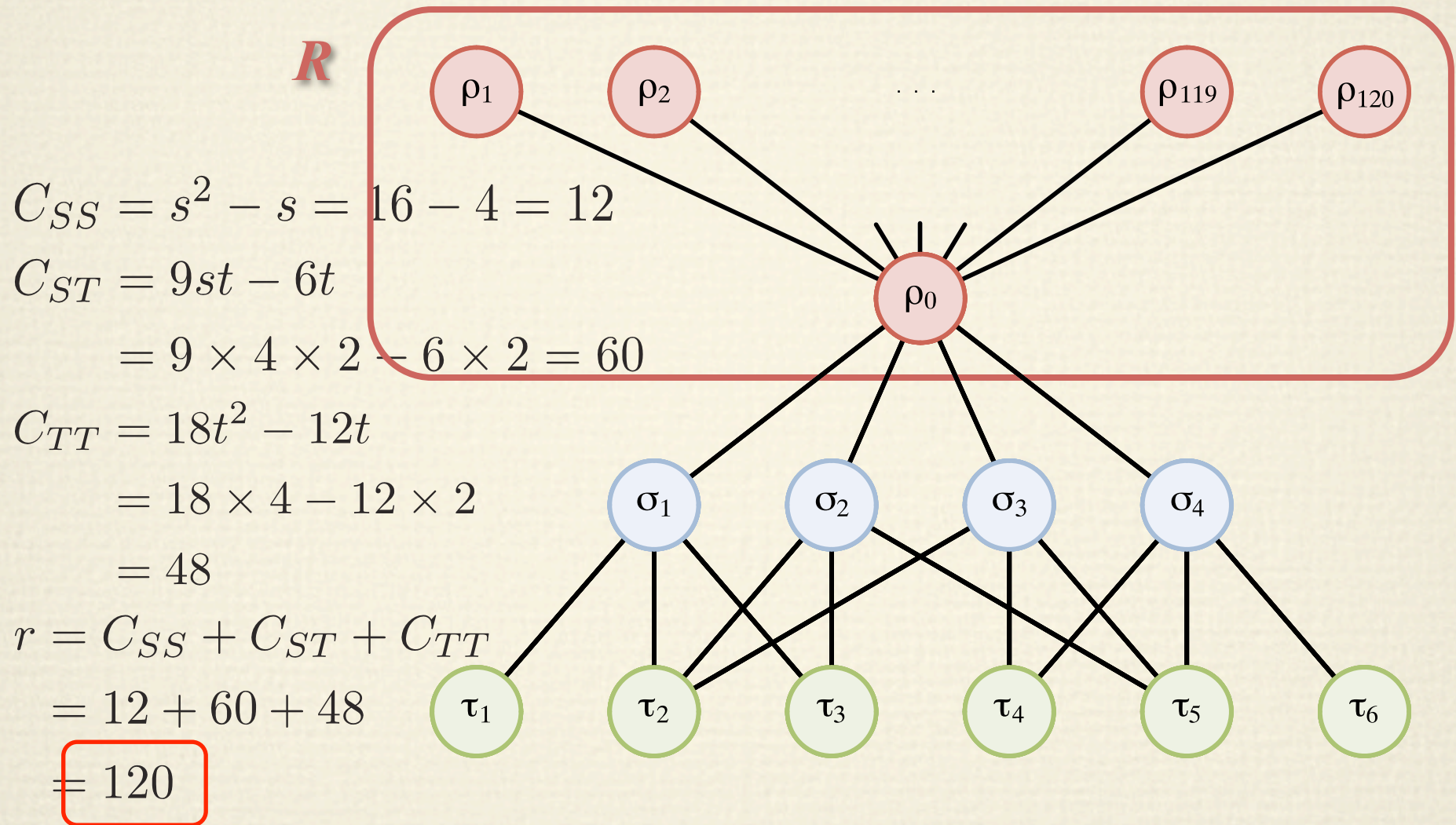


Illustration of Reduction

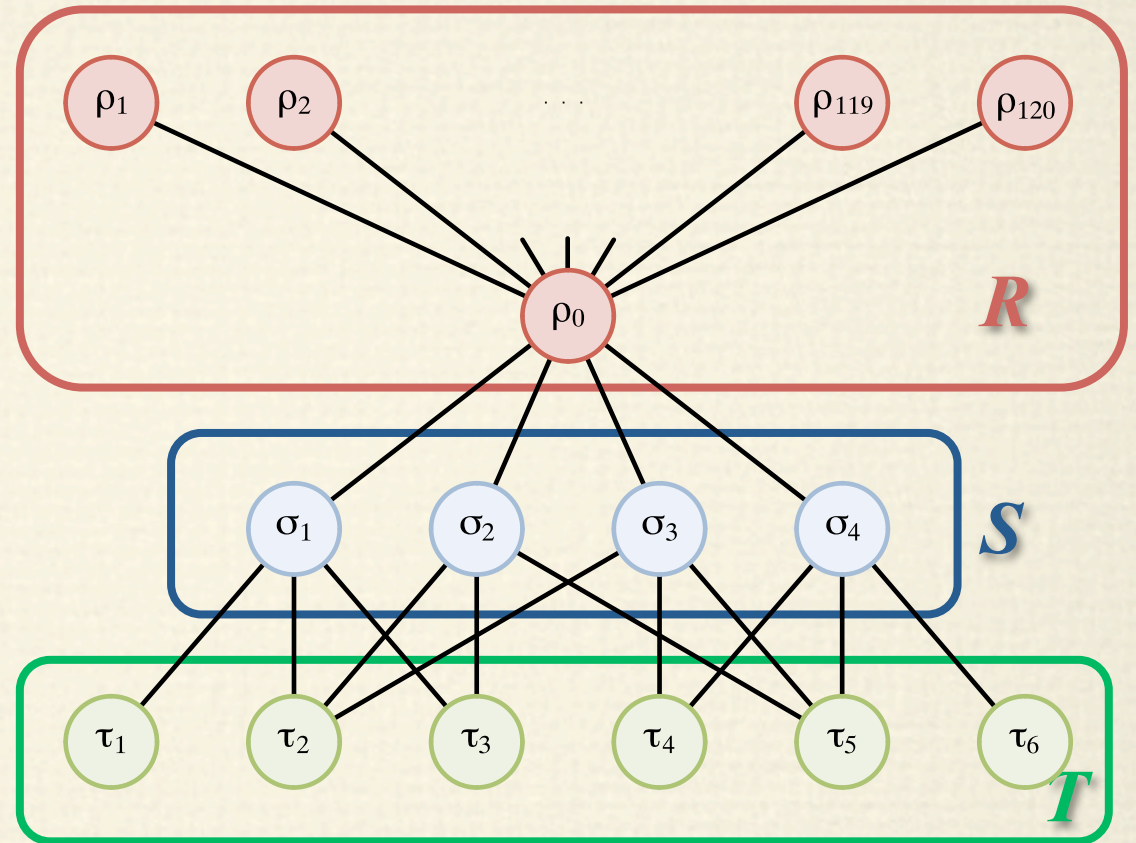


Illustration of Reduction

$$C_{RR} = r^2 = 14400$$

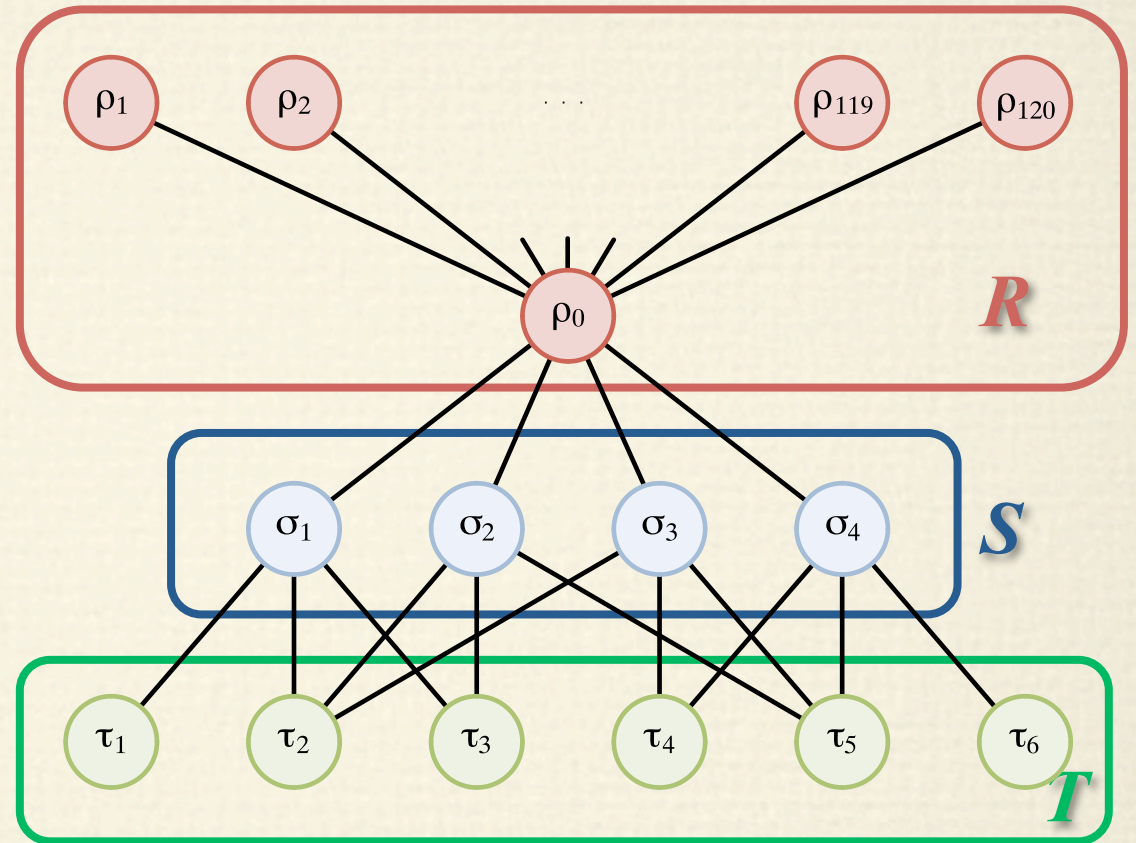


Illustration of Reduction

$$C_{RR} = r^2 = 14400$$

$$\begin{aligned} C_{RS} &= 2rs + s \\ &= 2 \times 120 \times 4 + 4 \\ &= 964 \end{aligned}$$

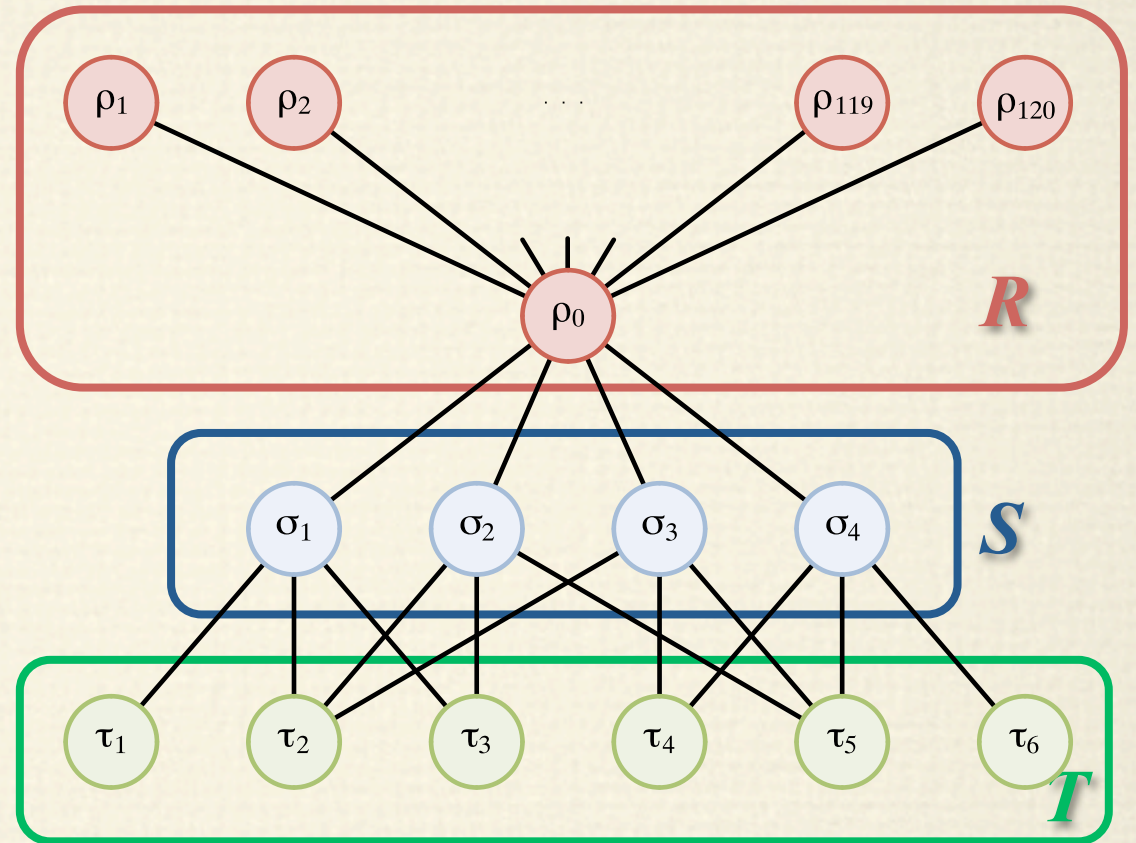


Illustration of Reduction

$$C_{RR} = r^2 = 14400$$

$$\begin{aligned} C_{RS} &= 2rs + s \\ &= 2 \times 120 \times 4 + 4 \\ &= 964 \end{aligned}$$

$$\begin{aligned} C_{RT} &= 9rt + 6t \\ &= 9 \times 120 \times 2 + 6 \times 2 \\ &= 2172 \end{aligned}$$

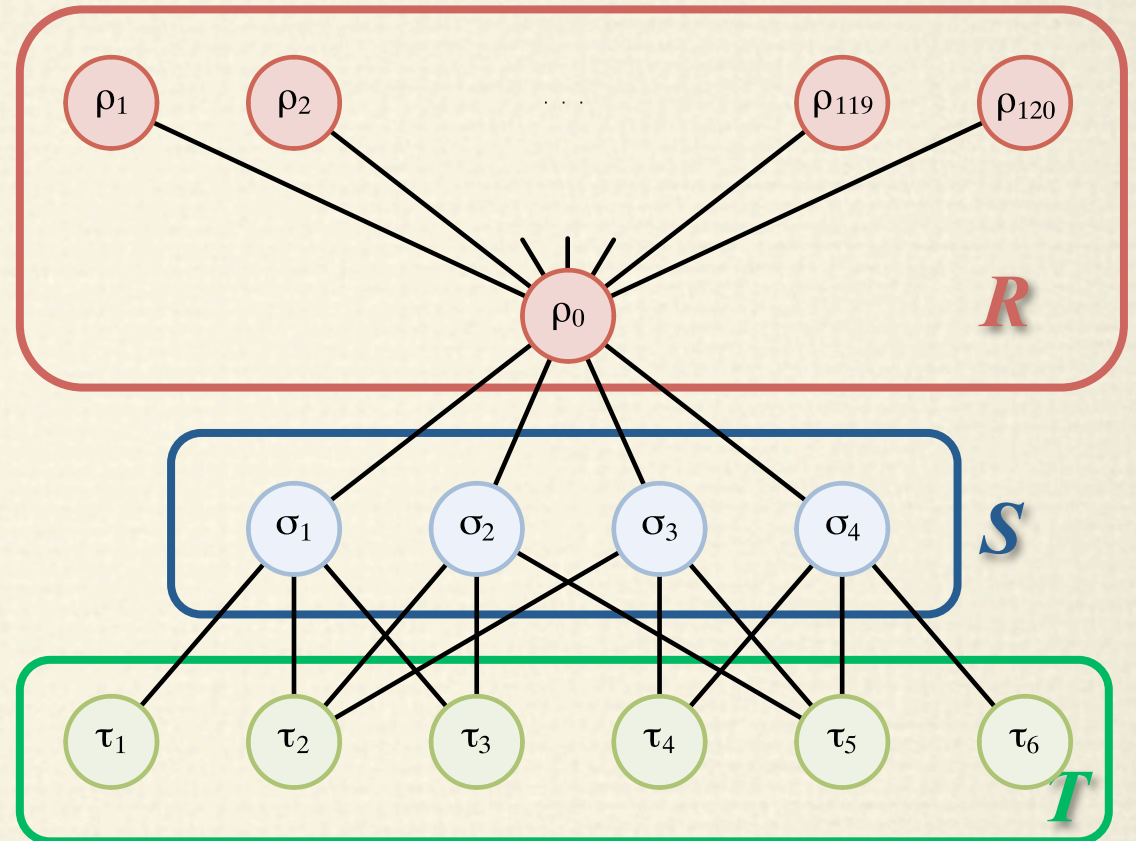


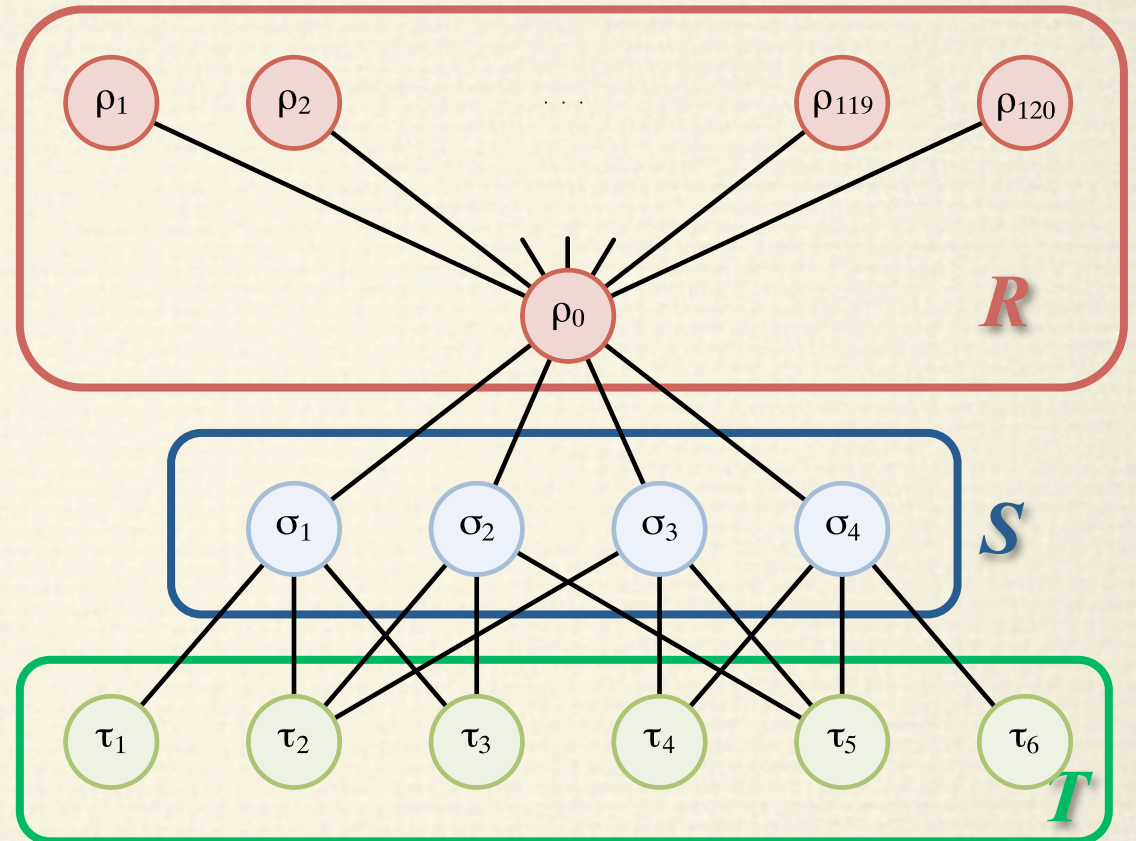
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$$\begin{aligned} C &= C_{RR} + C_{RS} + C_{RT} + r \\ &= 14400 + 964 + 2172 + 120 \\ &= 17656 \end{aligned}$$



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- ❖ Conclusion

Proof of SMDP



R00922102 張庭耀

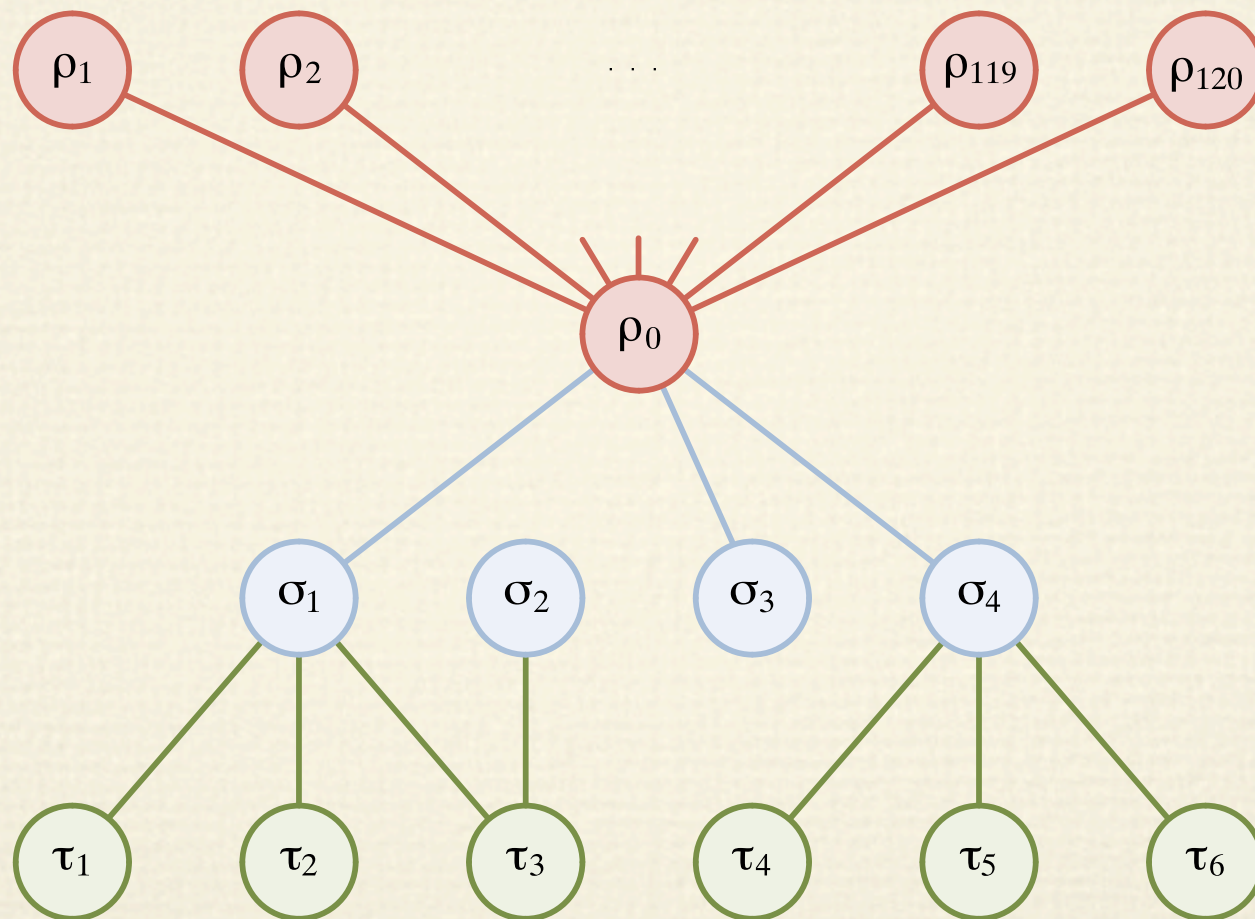
2nd Property

❖ If $\{\rho_0, \sigma\} \notin E'$ for some $\sigma \in S$, then

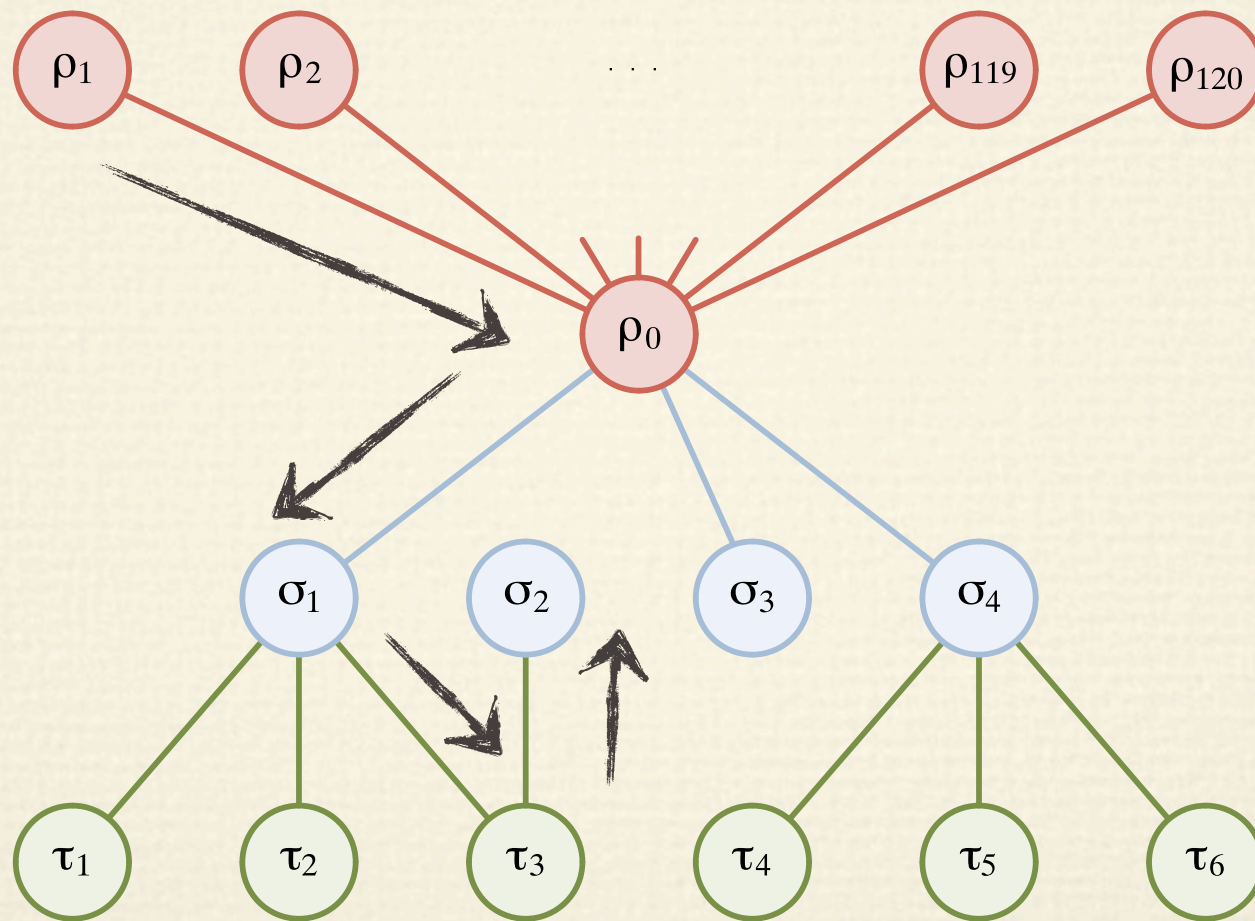
$$\begin{aligned}
 F(G') &= F_{RR}(G') + F_{RS}(G') + F_{RT}(G') + F_{SS}(G') + F_{ST}(G') + F_{TT}(G') \\
 &> F_{RR}(G') + F_{RS}(G') + F_{RT}(G') \\
 &\geq C_{RR} + C_{RS} + 2(r+1) + C_{RT} \\
 &> C_{RR} + C_{RS} + r + C_{RT} \\
 &= C_{RR} + C_{RS} + C_{RT} + r \\
 &= C_{RR} + C_{RS} + C_{RT} + C_{SS} + C_{ST} + C_{TT} \\
 &= C
 \end{aligned}$$

$$\begin{aligned}
 C_{RR} &= r^2 \\
 C_{RS} &= 2rs + s \\
 C_{RT} &= 9rt + 6t \\
 C_{SS} &= s^2 - s \\
 C_{ST} &= 9st - 6t \\
 C_{TT} &= 18t^2 - 12t
 \end{aligned}$$

2nd Property

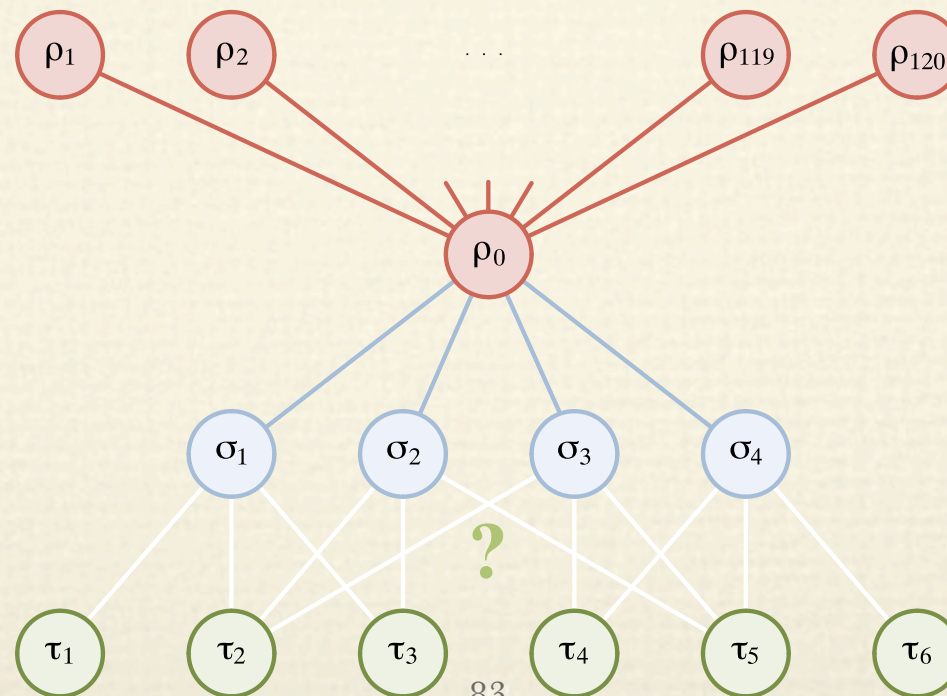


2nd Property



❖ $\{\rho_0, \sigma\} \in E'$ for all $\sigma \in S$

- Implication: In G' , each vertex in T is adjacent to exactly one vertex in S
- $F_{RR}(G') = C_{RR}$, $F_{RS}(G') = C_{RS}$, $F_{SS}(G') = C_{SS}$,
 $F_{RT}(G') = C_{RT}$, $F_{ST}(G') = C_{ST}$
- $[F(G') \leq C]$ iff $[F_{TT}(G') = C_{TT}]$

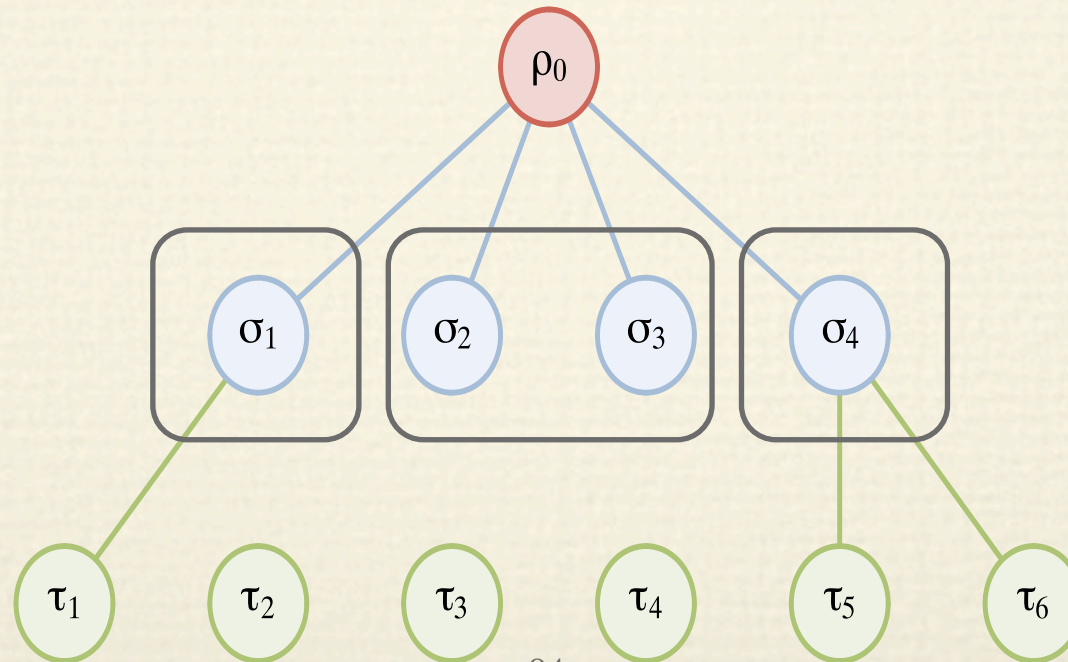


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3rd Property

- Denote the number of vertices in S being adjacent in G' to exactly h vertices in T by S_h ($h=0,1,2,3$)

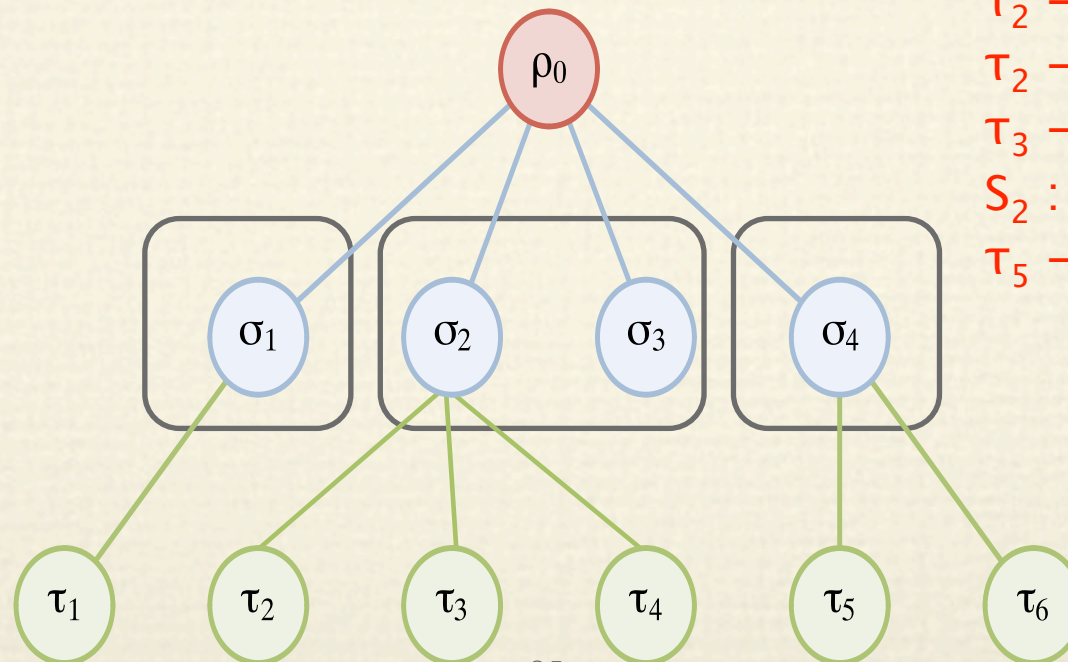
Example: $S_0=2$, $S_1=1$, $S_2=1$, $S_3=0$



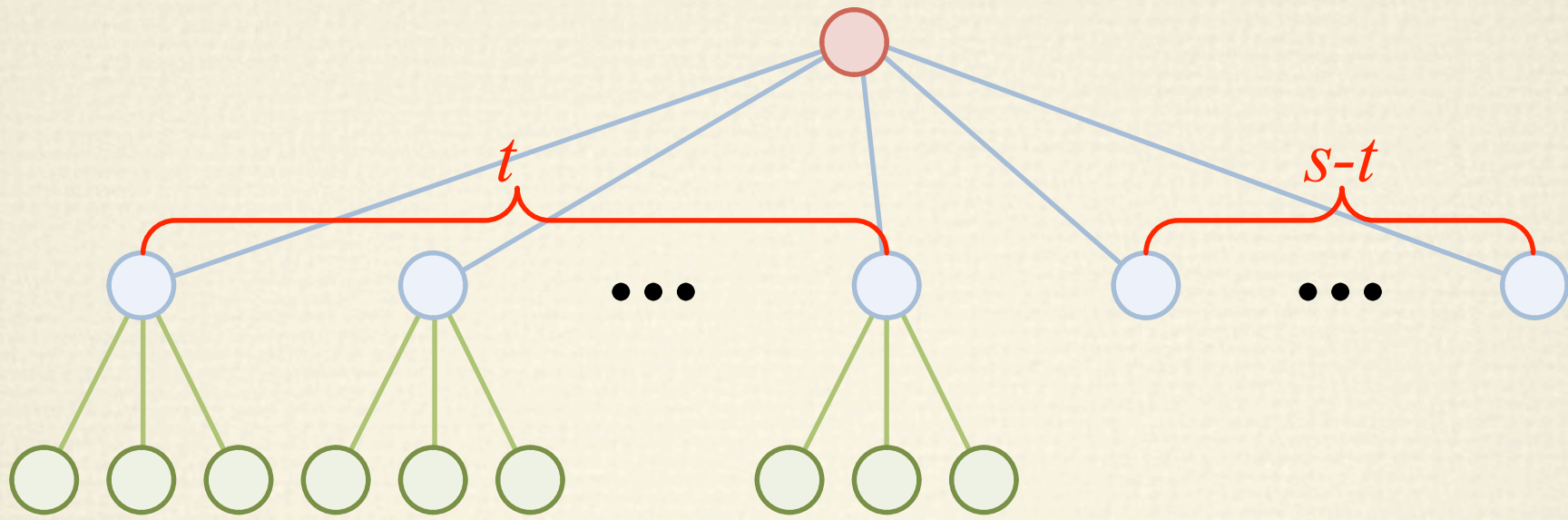
3rd Property

C_2^{3t}

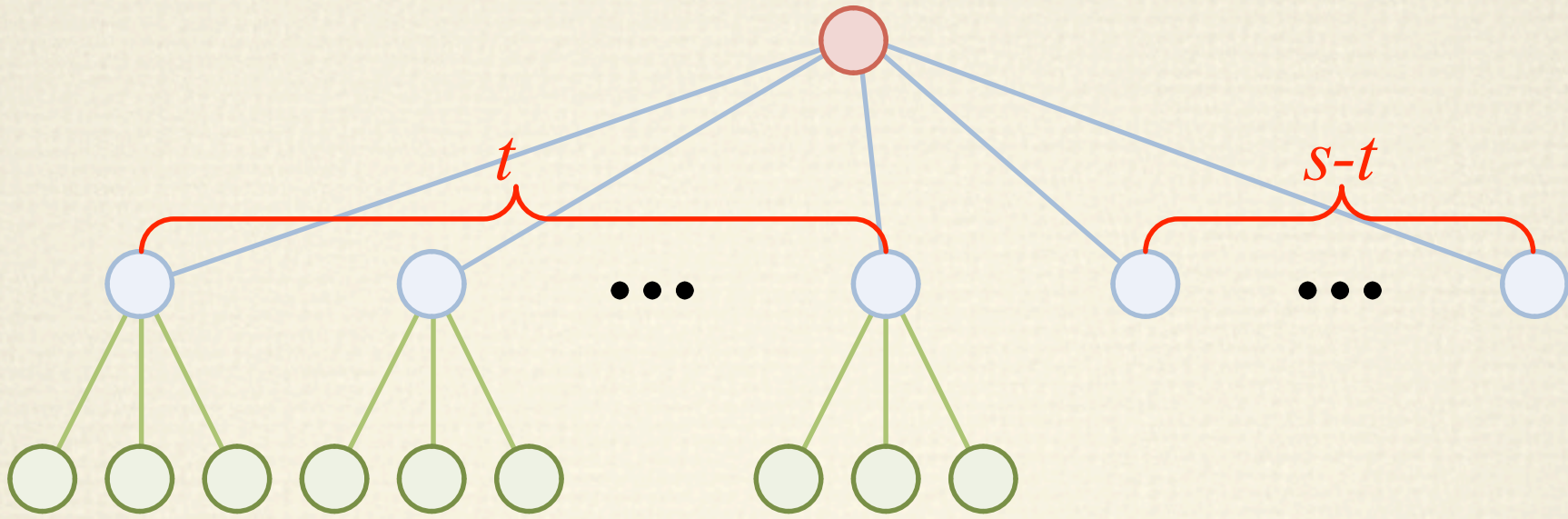
$$\begin{aligned}
 F_{TT}(G') &= 4(3t(3t - 1)/2) \\
 &\quad - 2|\{\{\tau, \tau'\} : \tau \neq \tau', \{\{\sigma, \tau\}, \{\sigma, \tau'\}\} \subset E' \text{ for some } \sigma \in S\}| \\
 &= (18t^2 - 6t) - (2s_2 + 6s_3) \\
 &= C_{TT} + 6(t - s_3) - 2s_2
 \end{aligned}$$



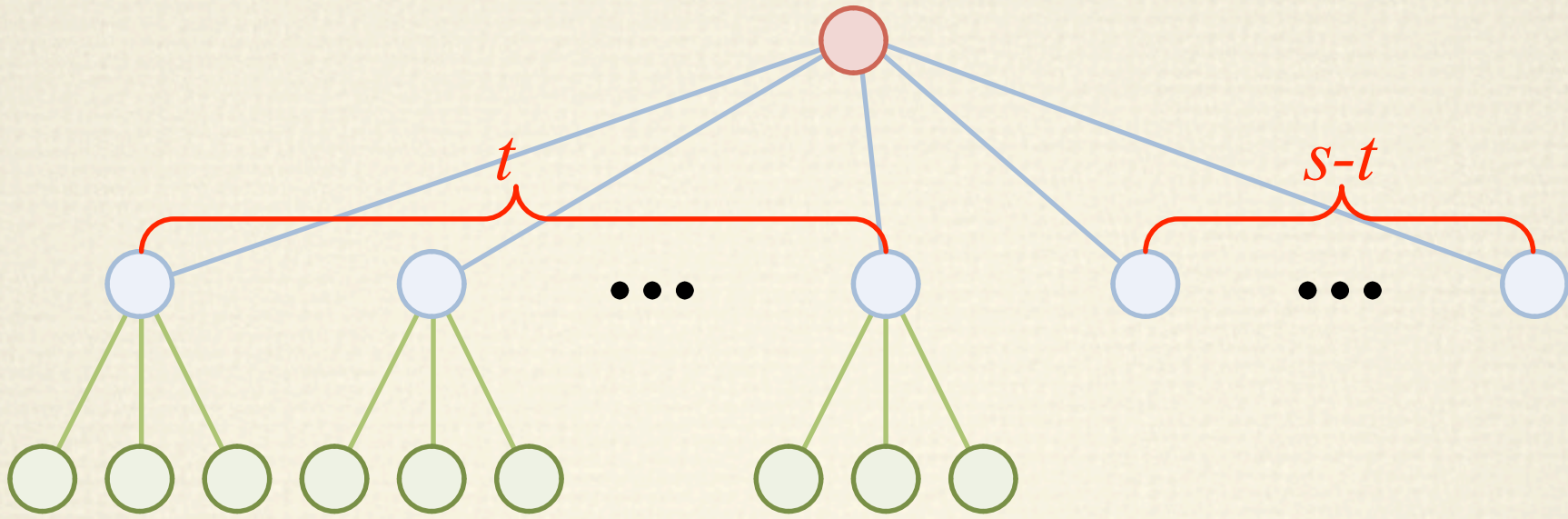
$S_3 :$
 $\tau_2 \rightarrow \tau_3$
 $\tau_2 \rightarrow \tau_4$
 $\tau_3 \rightarrow \tau_4$
 $S_2 :$
 $\tau_5 \rightarrow \tau_6$



Clearly, $[F_{TT}(G') = C_{TT} = 18t^2 - 12t]$ iff $[S_3 = t, S_0 = s - t, S_1 = S_2 = 0]$



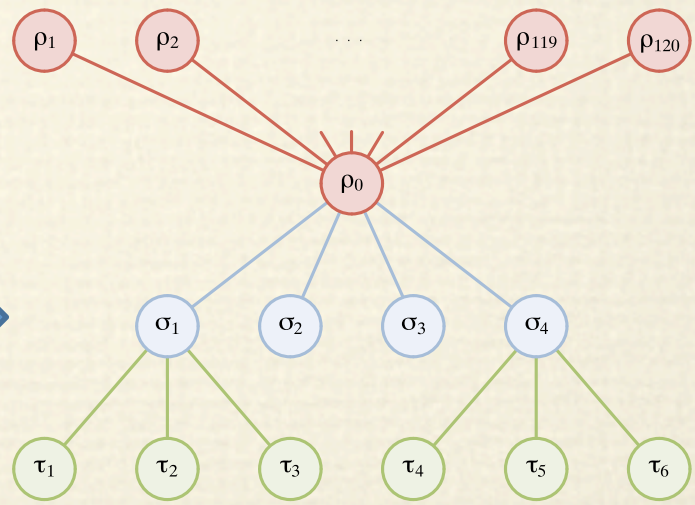
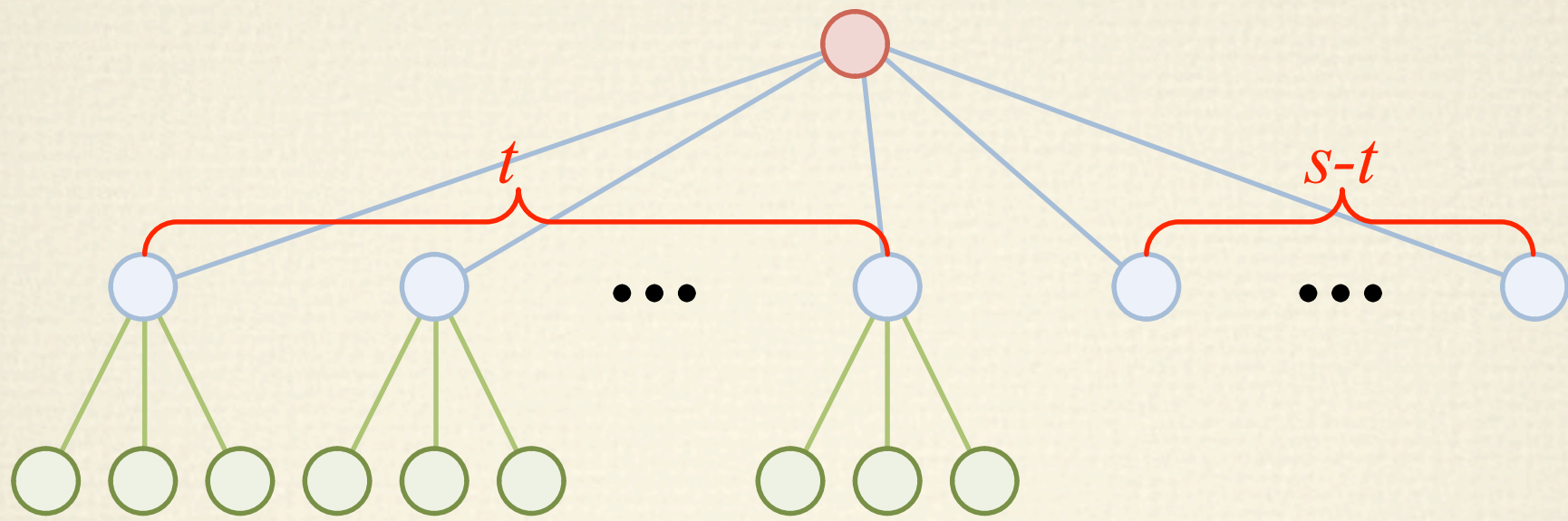
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$$S' = \{\{\tau_1, \tau_2, \tau_3\}, \{\tau_4, \tau_5, \tau_6\}\}$$

Exact 3-cover solution

Clearly, $[F_{TT}(G') = C_{TT} = 18t^2 - 12t]$ iff $[S_3 = t, S_0 = s - t, S_1 = S_2 = 0]$



$$S' = \{\{\tau_1, \tau_2, \tau_3\}, \{\tau_4, \tau_5, \tau_6\}\}$$

Exact 3-cover solution



SNDP solution

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Conclusion



R00944050 王舜玄

Conclusion

- ❖ There's various types of NDP, for example:
- ❖ A complete Graph, a **Distance** and a **Requirement** for vertex pair. $\text{Cost} = \text{Distance} * \text{Requirement}$.
Find SPT to minimize Total Cost.
distance equal: poly-time, requirement equal: NPC
- ❖ A weighted Graph, **specific vertex p** and **integer k**,
find SPT to minimize Total Weight subj to: each subtree **include p** and contain **at most k** vertices.
k=2: matching problem, k=3: NPC

Conclusion

- ❖ We have shown today:
- ❖ how P differs from NP
- ❖ what is Network Design Problem
- ❖ why NDP and SNDP are NPC
- ❖ who involved in this presentation
- ❖ and...



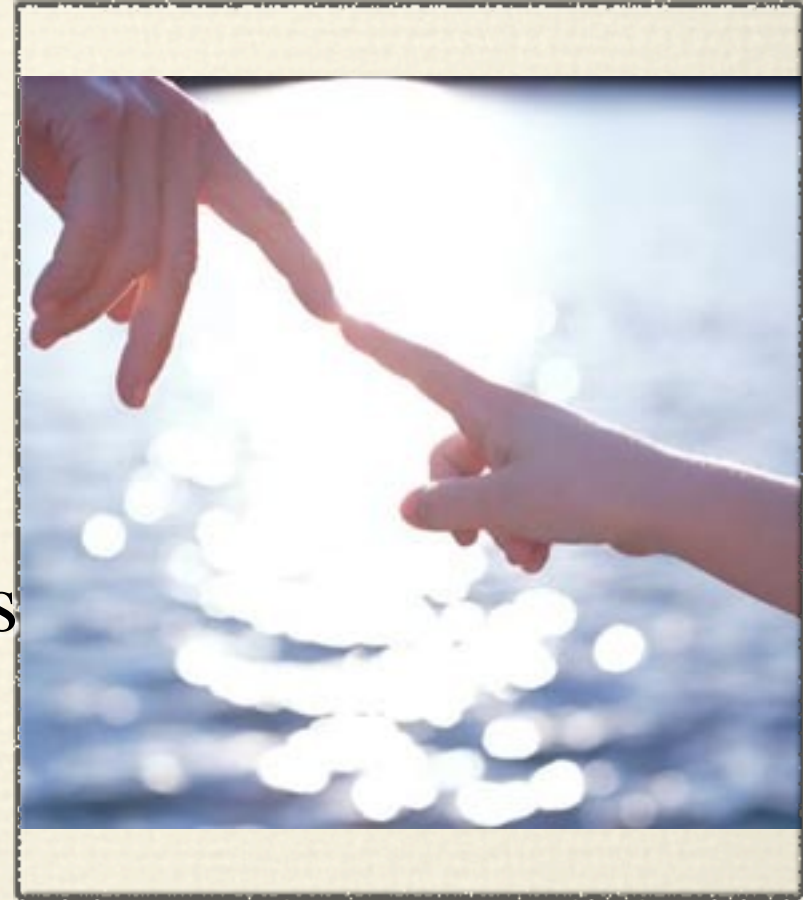
Conclusion

- ❖ The most people are interested:
when will we finish the demo?
- ❖ Let me show applications of NDP
- ❖ Bus/MRT Network
- ❖ Social Network
- ❖ Sensor Network



Conclusion

- ❖ A better way to:
- ❖ get people connected
- ❖ refine transportation
- ❖ communicate between machines
- ❖ That's why engineers provide people more comfortable life.



Q/A

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Thanks for
your attention

