

# ONLINE LOAD BALANCING MADE SIMPLE: GREEDY STRIKES BACK

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PAOLO PENNA,<sup>3,4</sup> AND WALTER UNGER<sup>5</sup>

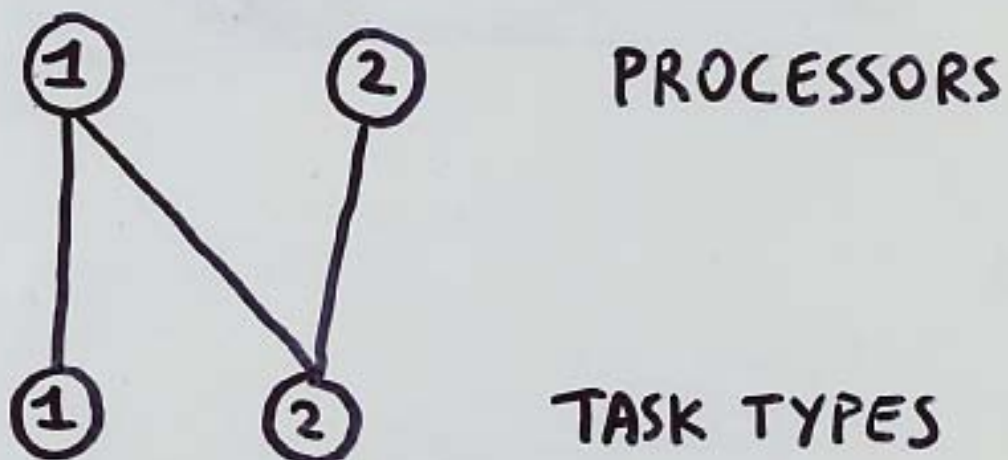
- <sup>1</sup> DIPARTIMENTO DI SISTEMI ED INFORMATICA, UNIVERSITÀ DI FIRENZE
- <sup>2</sup> DIPARTIMENTO DI MATEMATICA, UNIVERSITÀ DI ROMA "TOR VERGATA"
- <sup>3</sup> DIPARTIMENTO DI INFORMATICA ED AUTOMAZIONE, UNIVERSITÀ DI ROMA "TRE"
- <sup>4</sup> DIPARTIMENTO DI INFORMATICA ED APPLICAZIONI "R.M. CAPOCELLI", UNIVERSITÀ DI SALERNO
- <sup>5</sup> RWTH AACHEN

# PROBLEM DEFINITION

## ONLINE LOAD BALANCING VERSION:

- WEIGHTED TEMPORARY TASKS
- UNKNOWN DURATION
- RESTRICTED ASSIGNMENT
- NO PREEMPTION

GOAL: MINIMIZE MAX LOAD

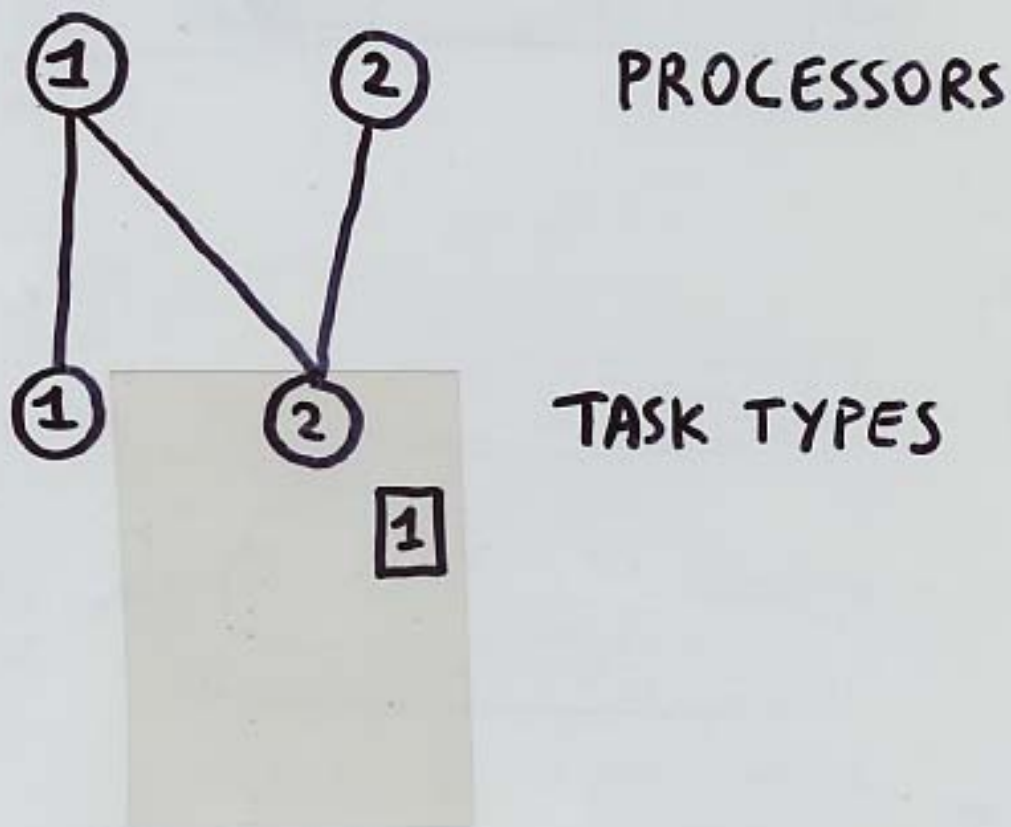


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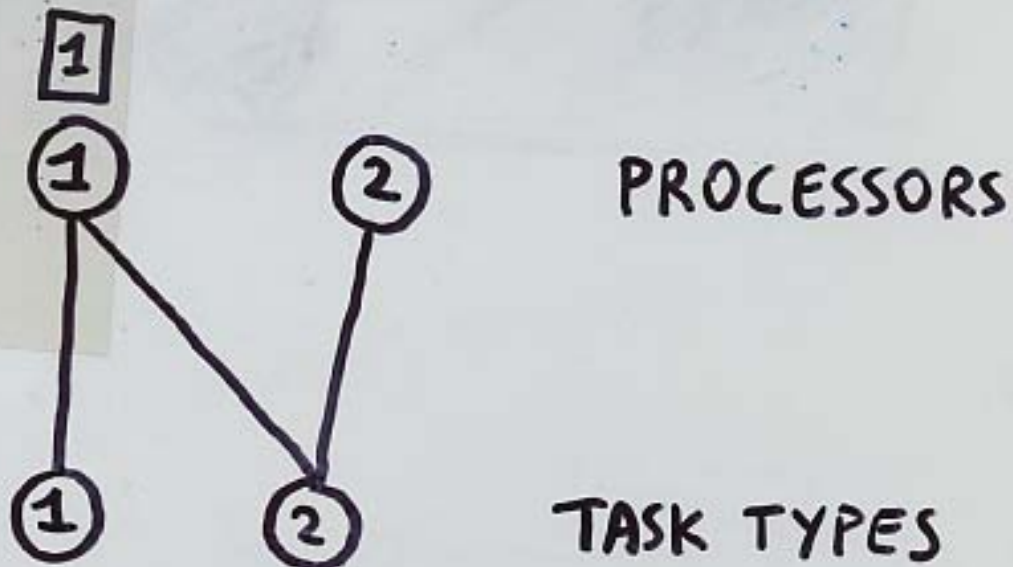


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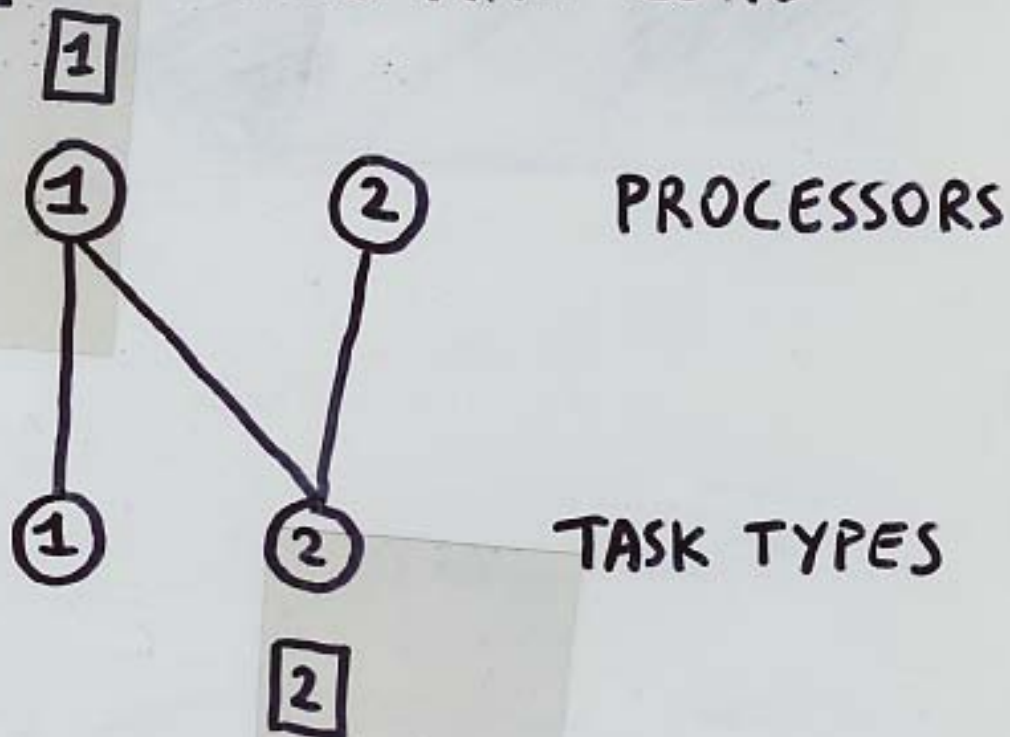


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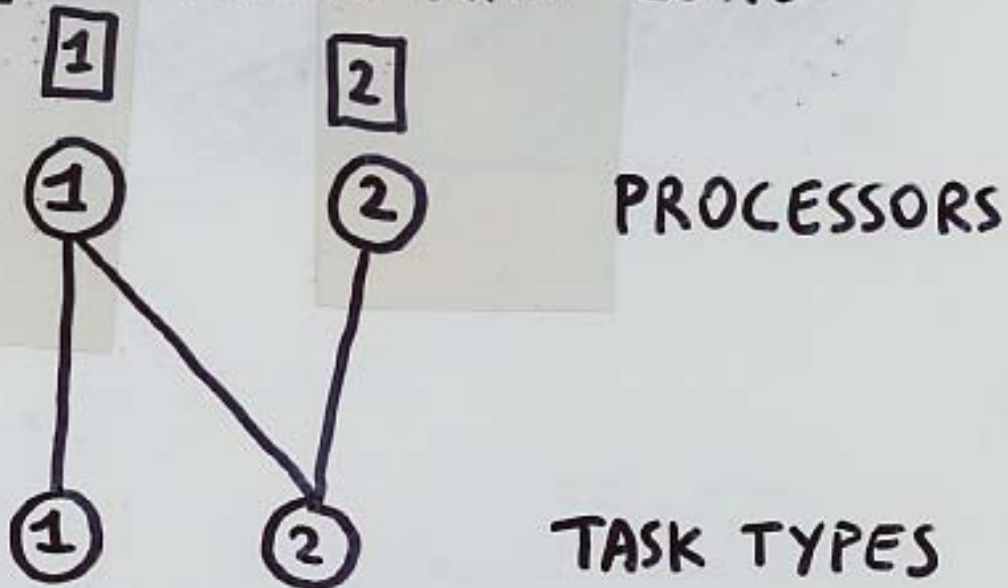


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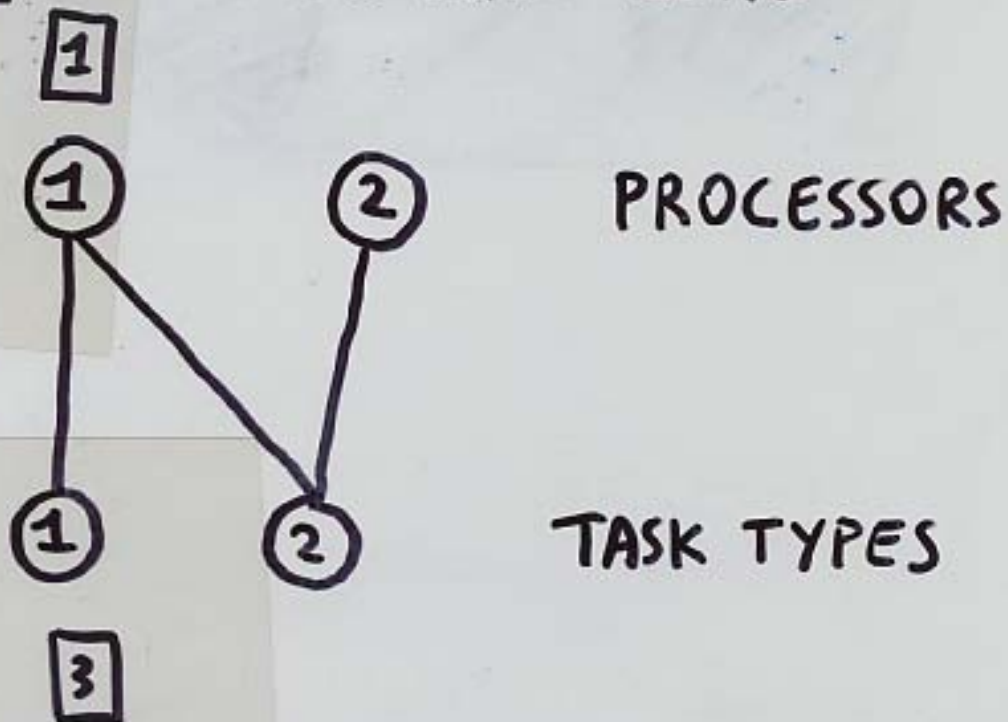


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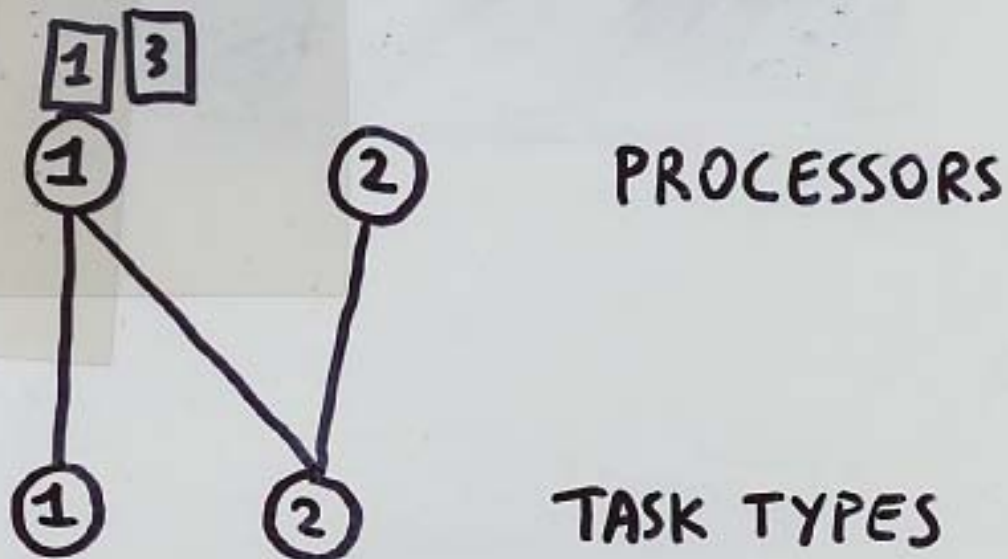


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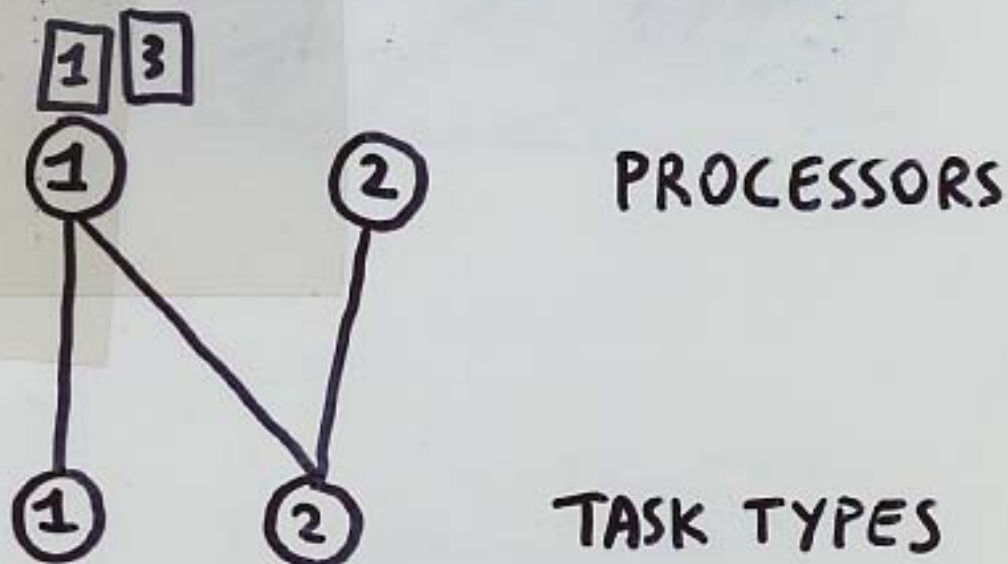


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ALG IS C-COMPETITIVE IF

$$\exists b: \forall \sigma \text{ COST(ALG}(\sigma)) \leq C \cdot \text{OPT}(\sigma) + b$$

## PREVIOUS WORK

### GENERAL CASE (ANY GRAPH)

- GREEDY IS  $\Omega(m^{2/3})$ -COMPETITIVE [AZAR ET AL '95]
- OPTIMAL  $\Theta(m^{1/2})$ -COMPETITIVE ALG. [AZAR ET AL '95,97]

### UNRESTRICTED CASE (GRAPH $K_{1,m}$ )

- GREEDY IS  $(2 - 1/m)$ -COMPETITIVE [GRAHAM '66]
- GREEDY IS OPTIMAL [AZAR & EPSTEIN '97]

### HIERARCHICAL TOPOLOGIES (SPECIAL INTERVAL GRAPHS)

- GREEDY IS  $\Omega(\log m)$ -COMPETITIVE [FOLKLORE]
- 5-COMPETITIVE ALGORITHM [BAR-NOY ET AL '99]

# GREEDY ALGORITHM

SIMPLE AND DISTRIBUTED: QUERIES ONLY  
NEIGHBOR PROCESSORS

THE OPTIMAL ALGORITHMS FOR THE GENERAL  
AND THE HIERARCHICAL CASES

- ARE NOT "LOCAL"
- NEED TO ESTIMATE  $OPT(\infty)$
- NON TRIVIAL ANALYSIS

## QUESTIONS

DOES GREEDY "FAIL" BECAUSE IT ONLY USES LOCAL INFORMATION?

ARE THERE OPTIMAL (DISTRIBUTED) ALGORITHMS WITH THE NICE FEATURES OF THE GREEDY ONE?

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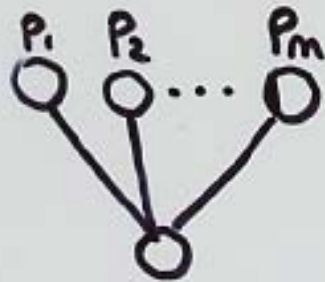
DOES GREEDY "FAIL" BECAUSE IT ONLY USES LOCAL INFORMATION? **NO** [THIS WORK]

ARE THERE OPTIMAL (DISTRIBUTED) ALGORITHMS WITH THE NICE FEATURES OF THE GREEDY ONE?

**YES** [THIS WORK]

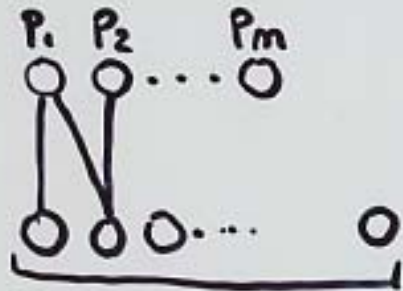
# OBSERVE:

- "SIMPLE" GRAPHS  $\rightarrow$  GREEDY PERFORMS WELL  
 $O(1)$ -COMPETITIVE



$\Leftrightarrow$  UNRESTRICTED CASE

- "HARD" GRAPH  $\rightarrow$  GREEDY PERFORMS BADLY



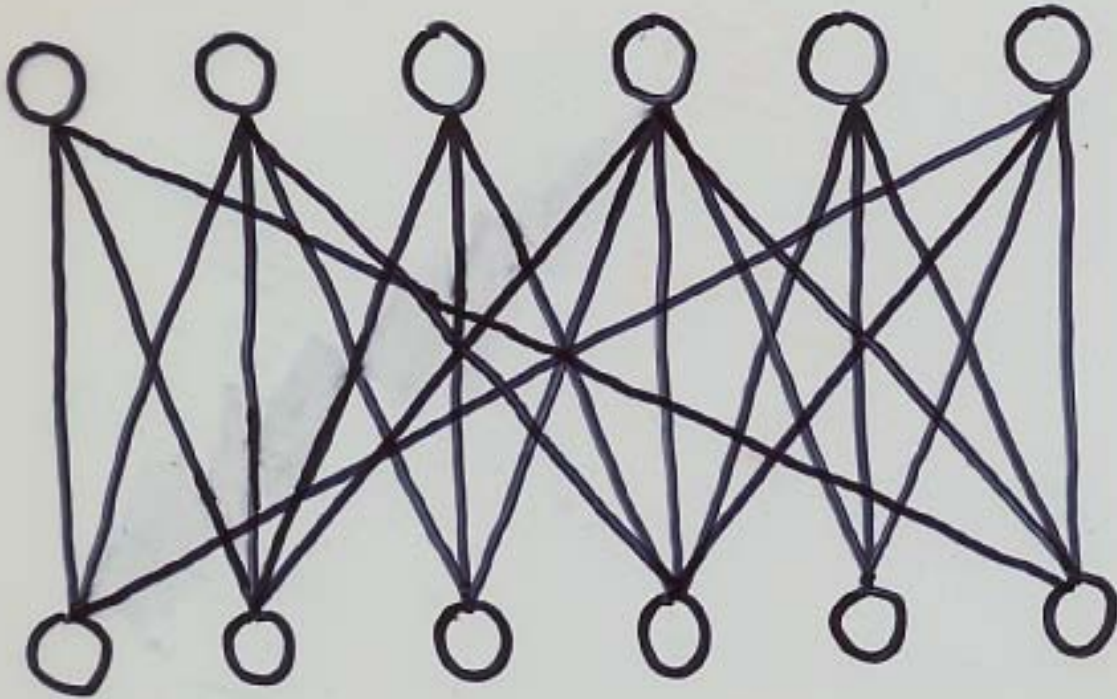
$\Leftrightarrow$  (GENERAL) RESTRICTED CASE

GREEDY  $\Omega(m^{2/3})$

OPT ALG  $\Theta(\sqrt{m})$

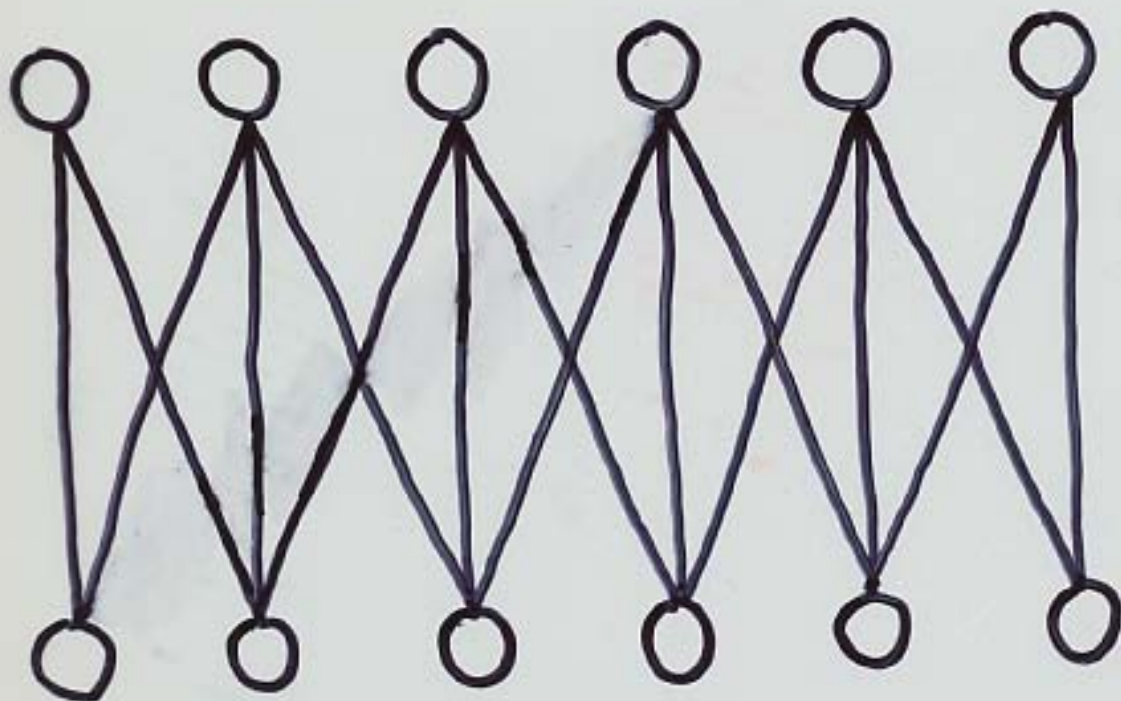
# OUR APPROACH

IDEA: "MAKE  $G$  SIMPLE" AND USE GREEDY



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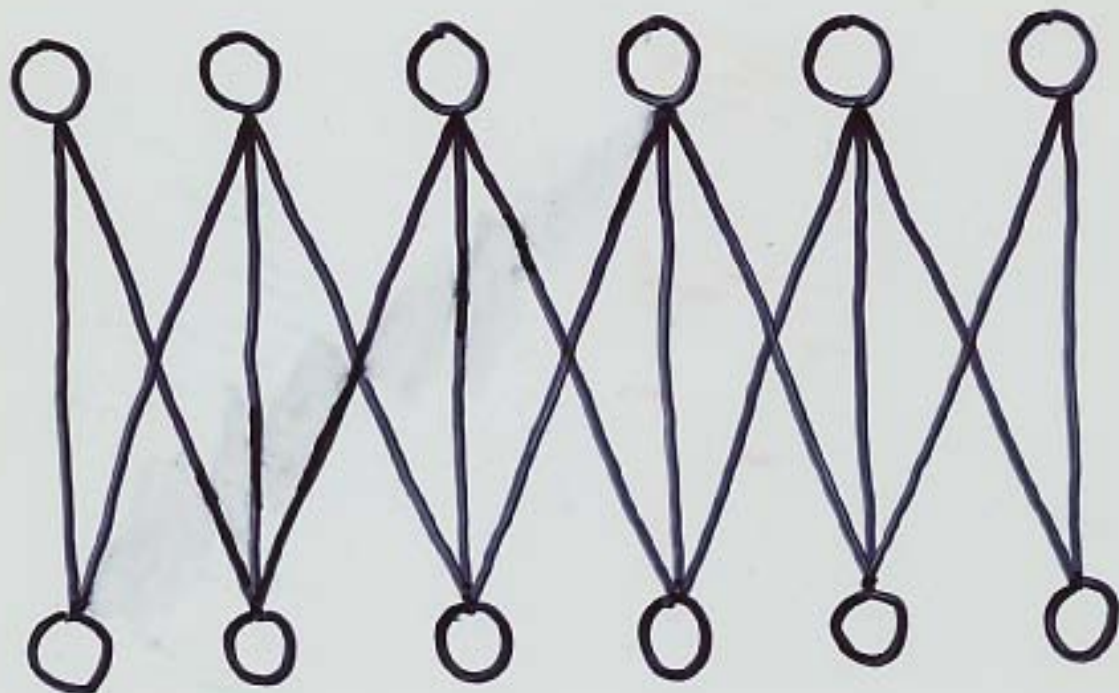
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- PRECOMPUTE (OFFLINE)

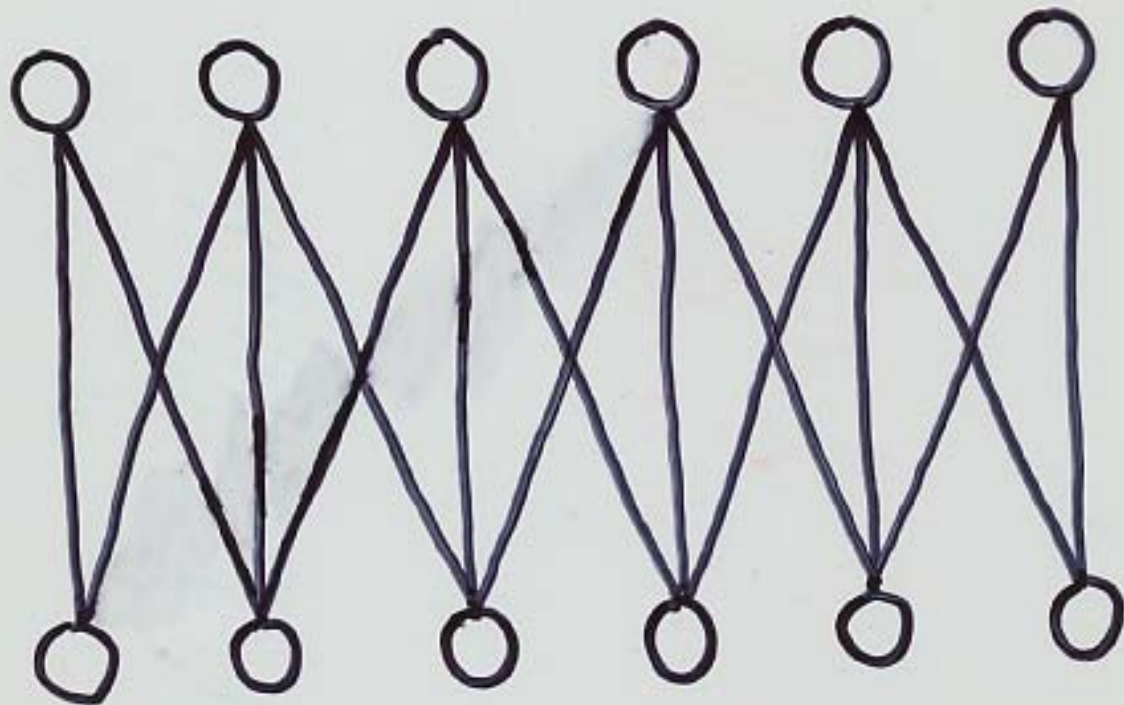
$$G' = (V, E'), \quad E' \subseteq E$$

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- RUN GREEDY ON  $G'$  (ONLINE)

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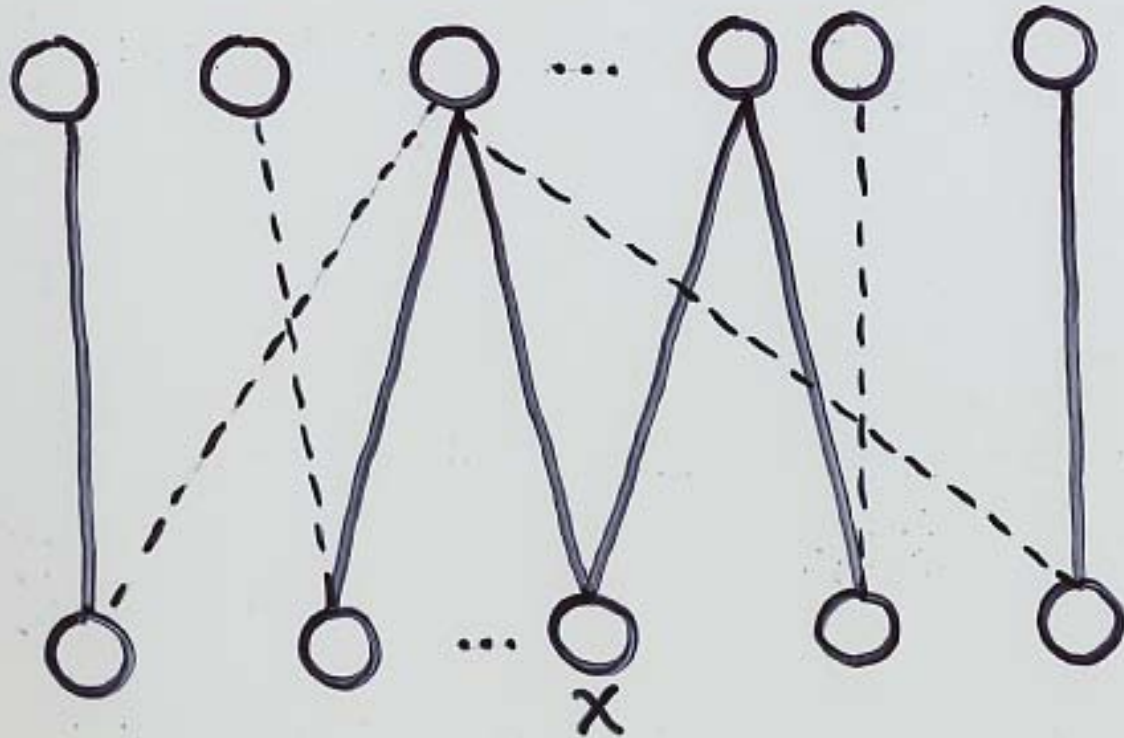
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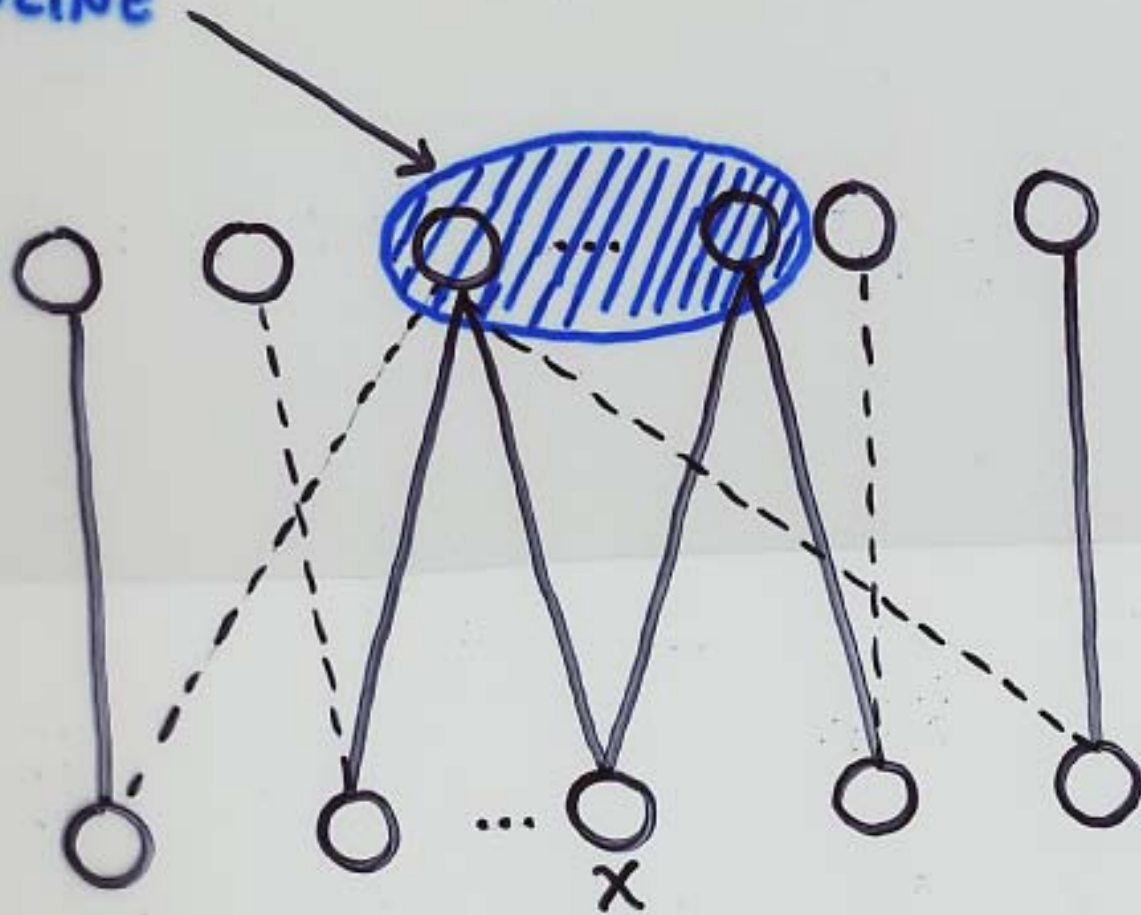
SUB-GREEDY ALGORITHM

# ANALYSIS



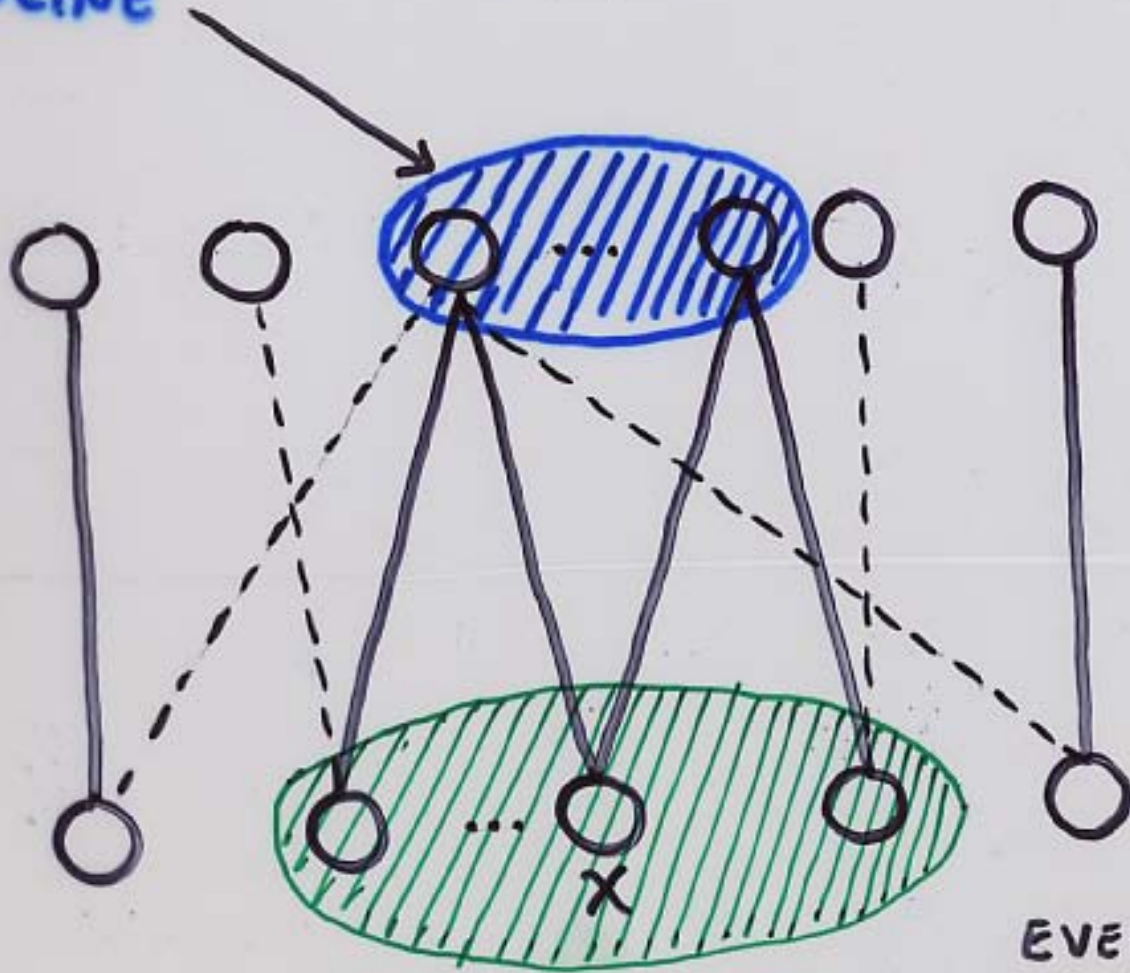
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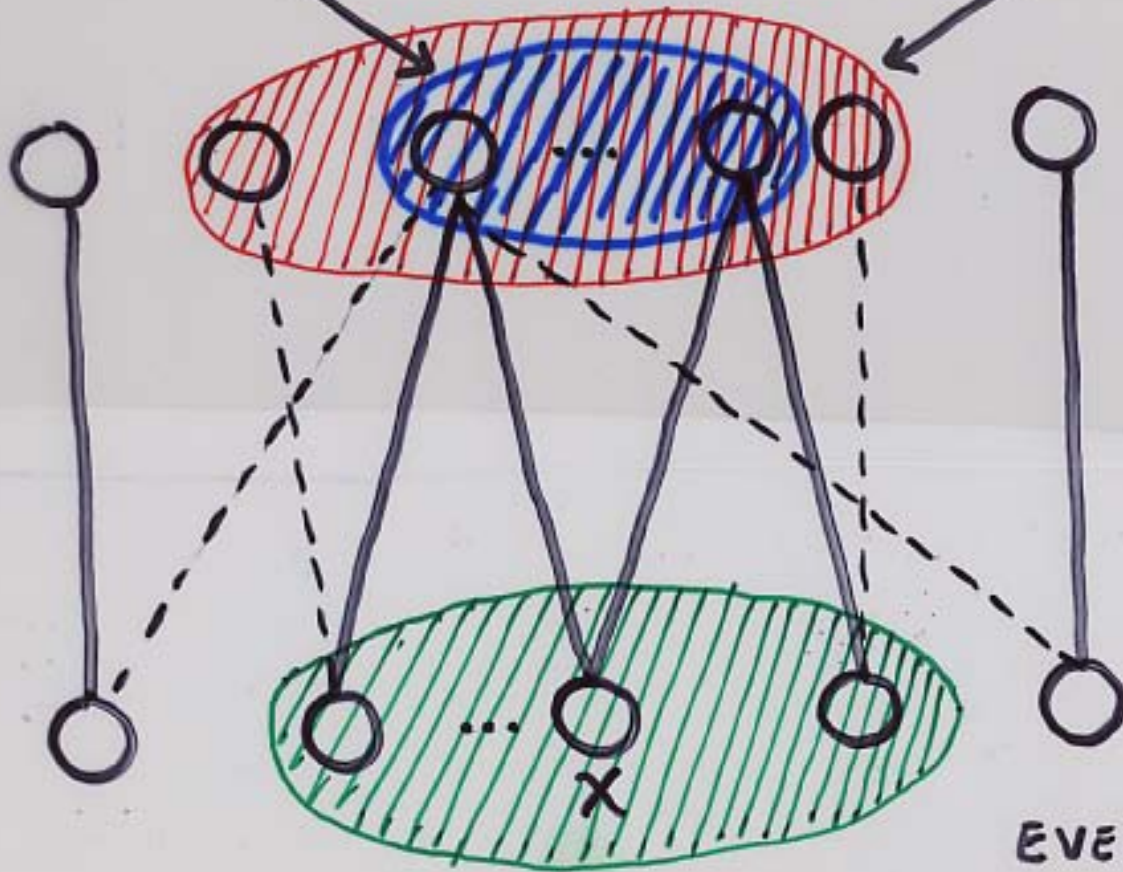
EVERY TASK IN  
COMES FROM



# ANALYSIS

ONLINE

ADVERSARY



EVERY TASK IN  
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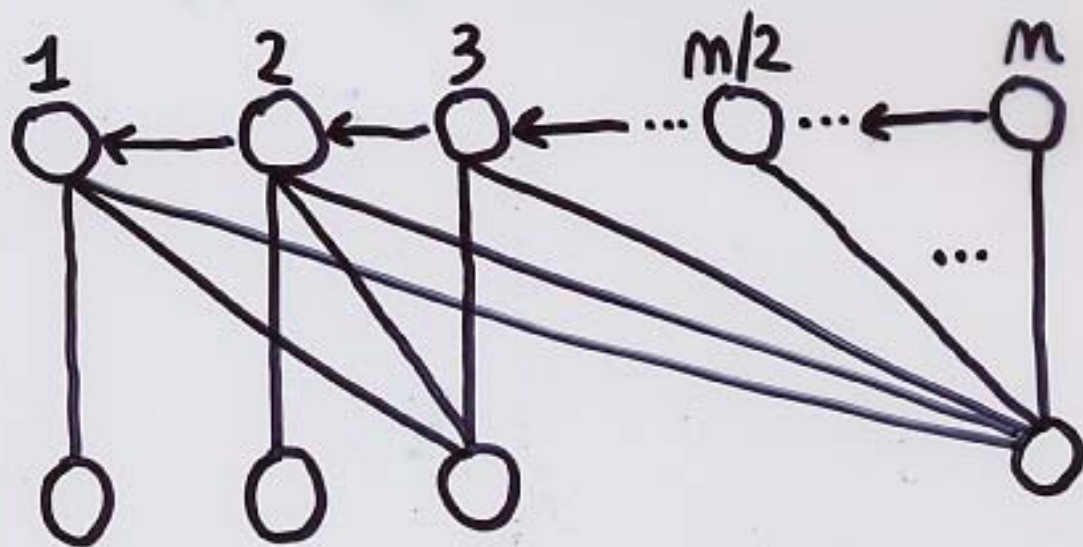
# MAIN RESULT

$$\text{COMPETITIVE RATIO} \approx \frac{\text{ADVERSARY}}{\text{ONLINE}}$$

$$\text{WEIGHTED TASKS: } 1 + \max_{x \in \text{TASK TYPES}} \left\{ \frac{|\Gamma_G(\Gamma_{G'}(\Gamma_{G'}(x)))| - 1}{|\Gamma_{G'}(x)|} \right\}$$

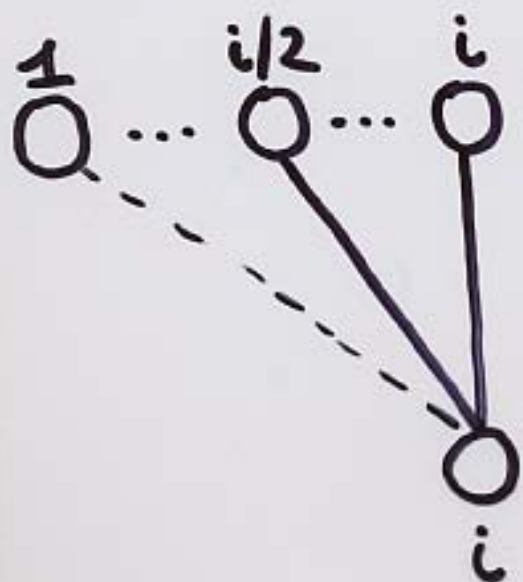
$$\text{UNWEIGHTED TASKS: } \max_{x \in \text{TASK TYPES}} \left\{ \frac{|\Gamma_G(\Gamma_{G'}(\Gamma_{G'}(x)))|}{|\Gamma_{G'}(x)|} \right\}$$

# HIERARCHICAL TOPOLOGIES



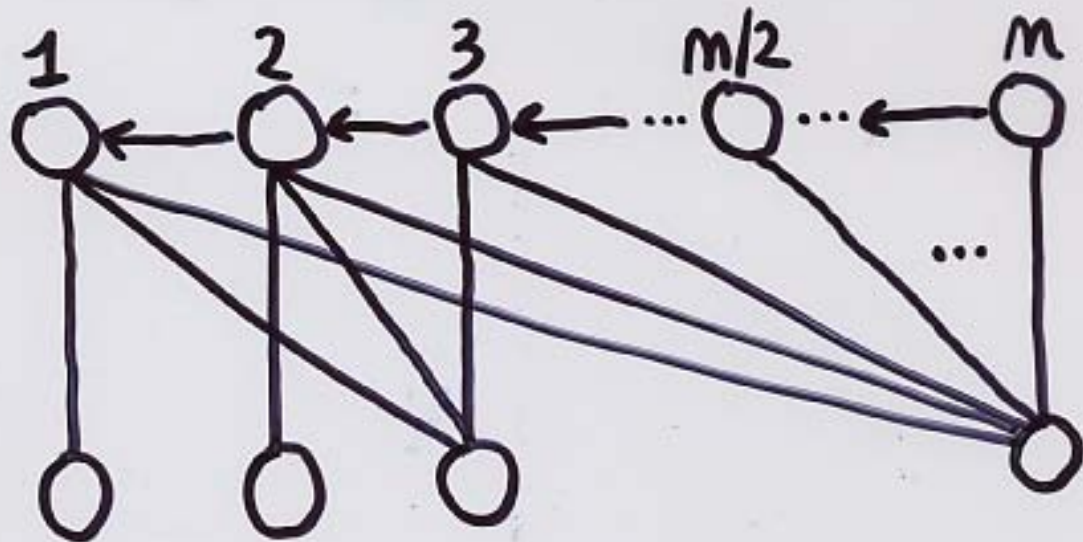
GREEDY:  $\Omega(\log m)$ -COMPETITIVE

SUB-GREEDY: 5-COMPETITIVE



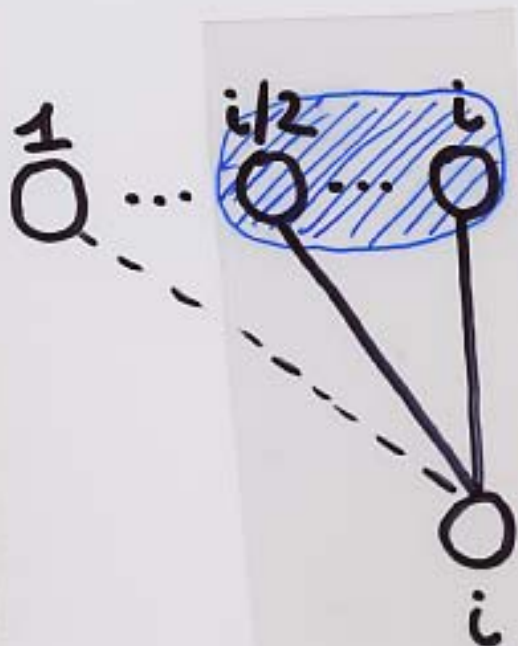


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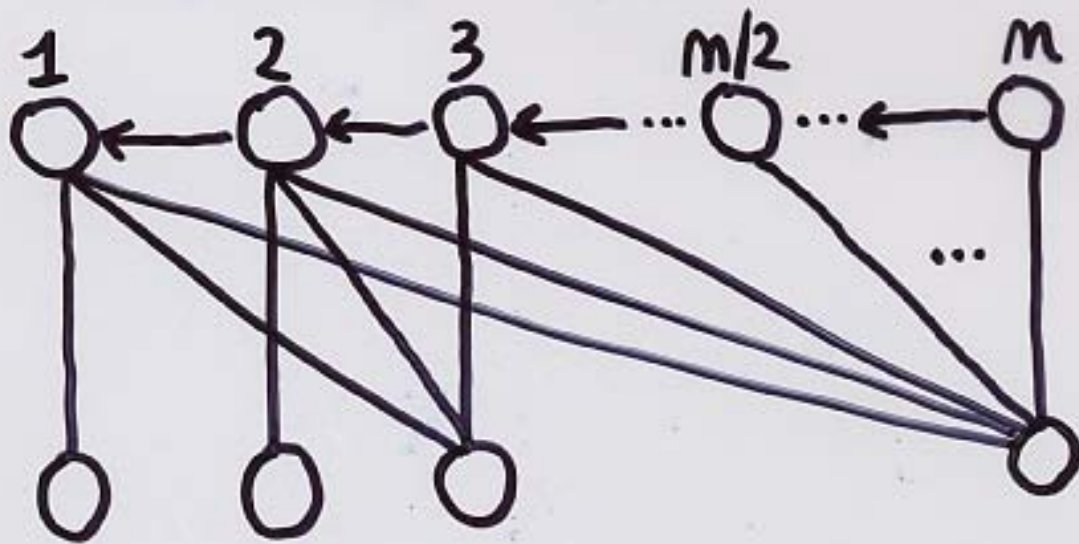


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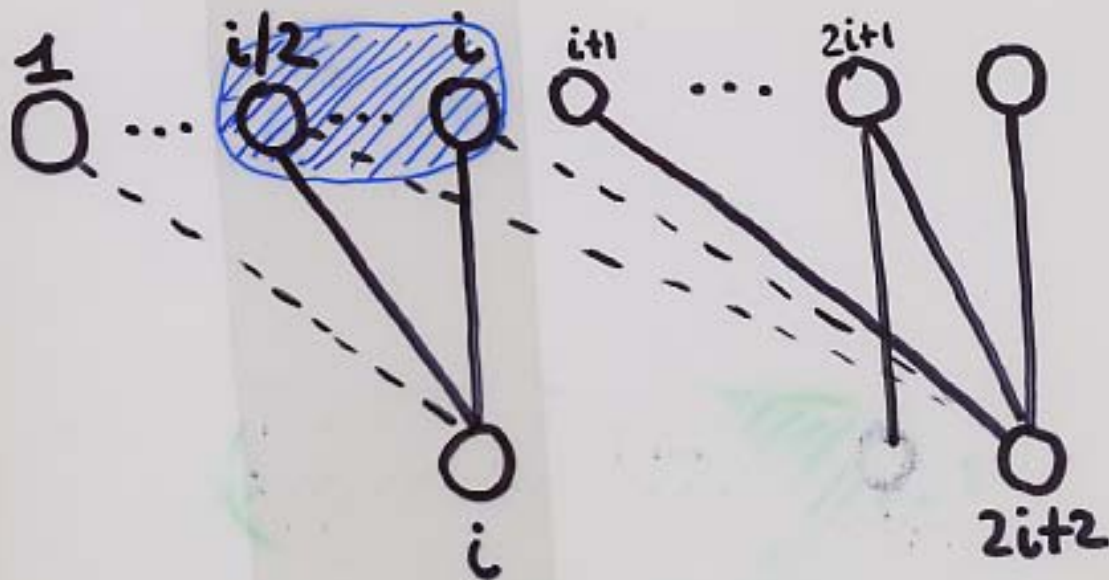


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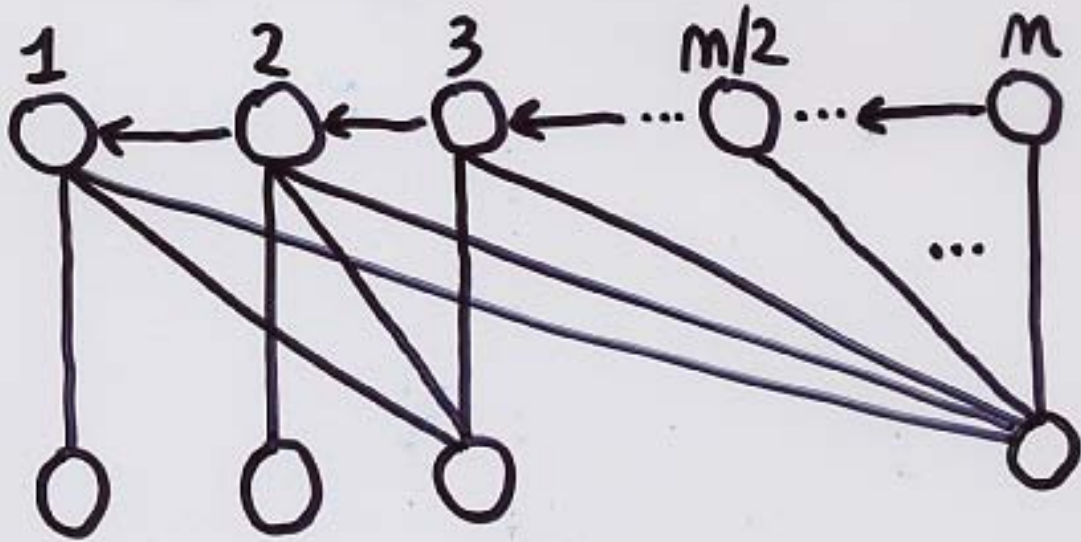


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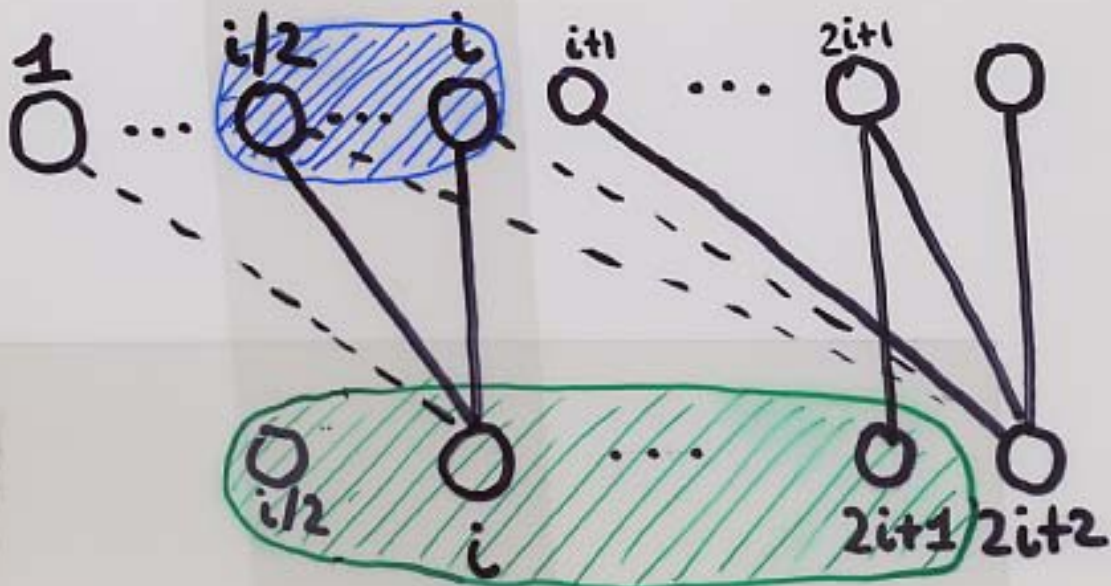


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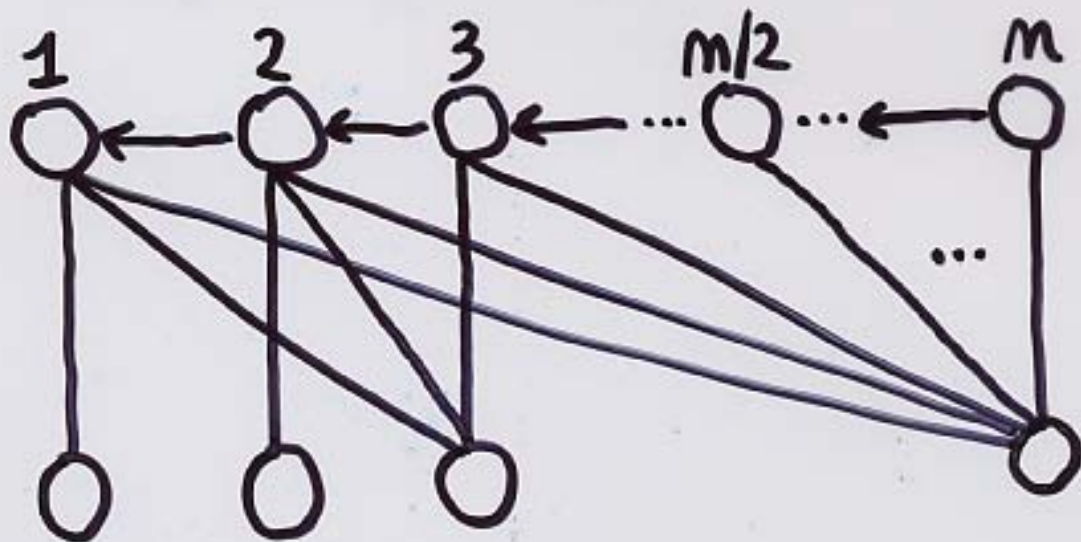


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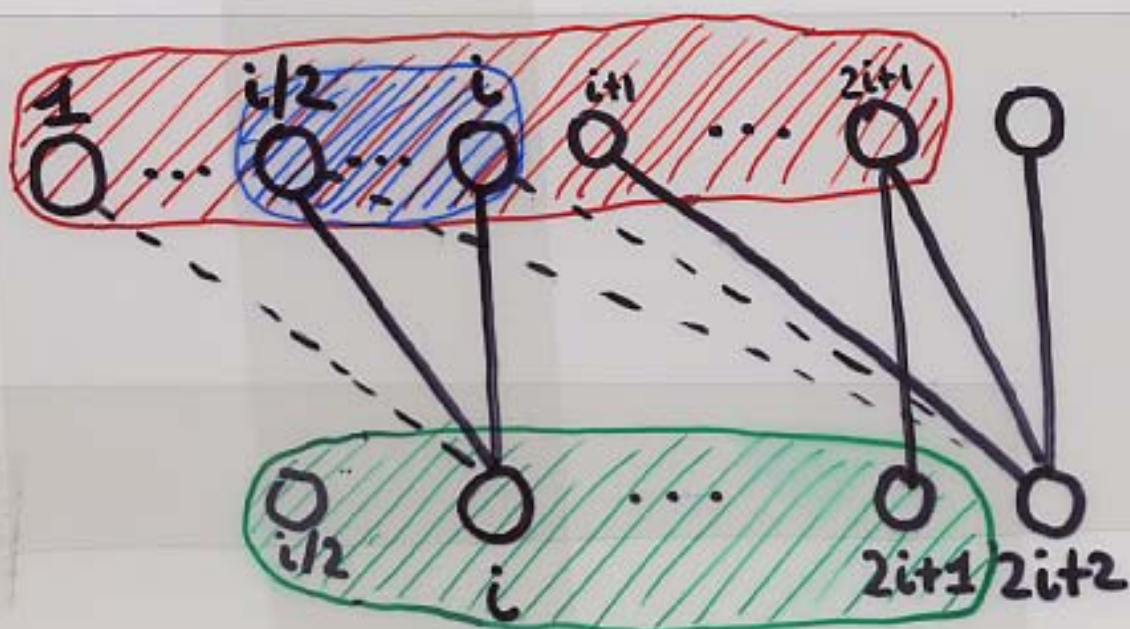


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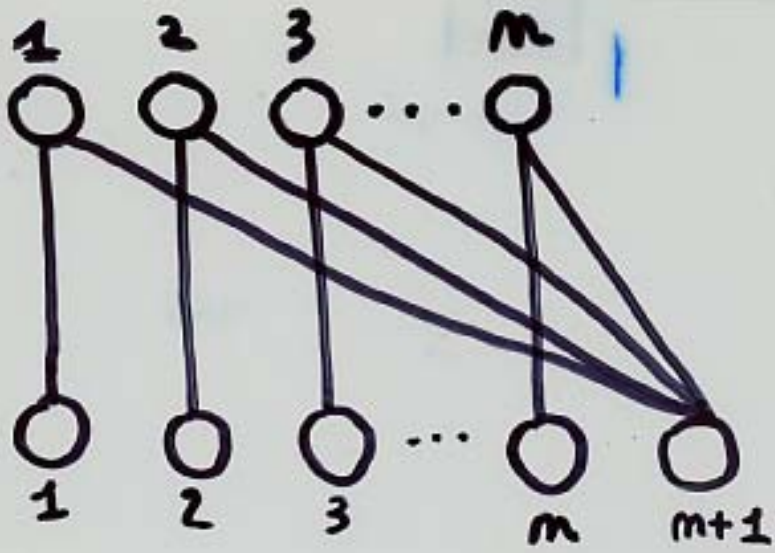
$$\frac{2i+1}{i/2} \approx 4$$

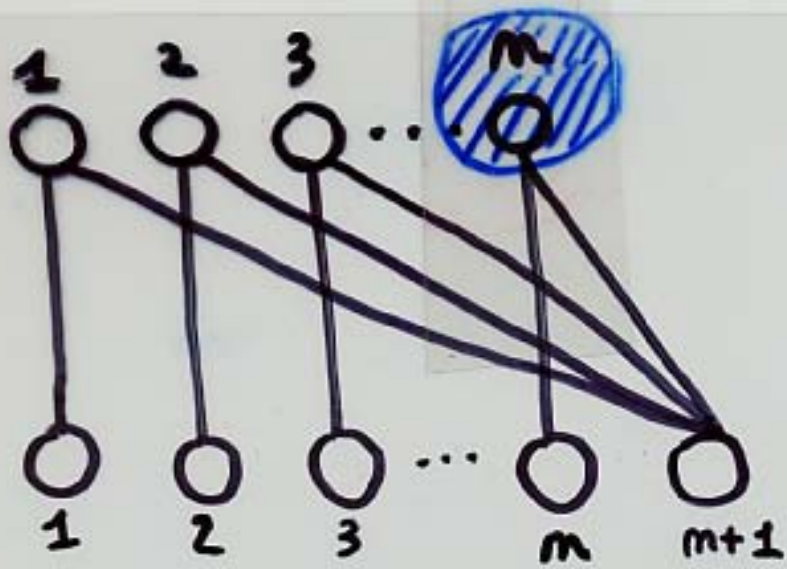
ADDING FURTHER CONSTRAINTS IMPROVES THE  
GREEDY ALGORITHM

OBSERVE: THE **ADVERSARY** IS STILL USING  
THE **ORIGINAL GRAPH**

## FURTHER RESULTS

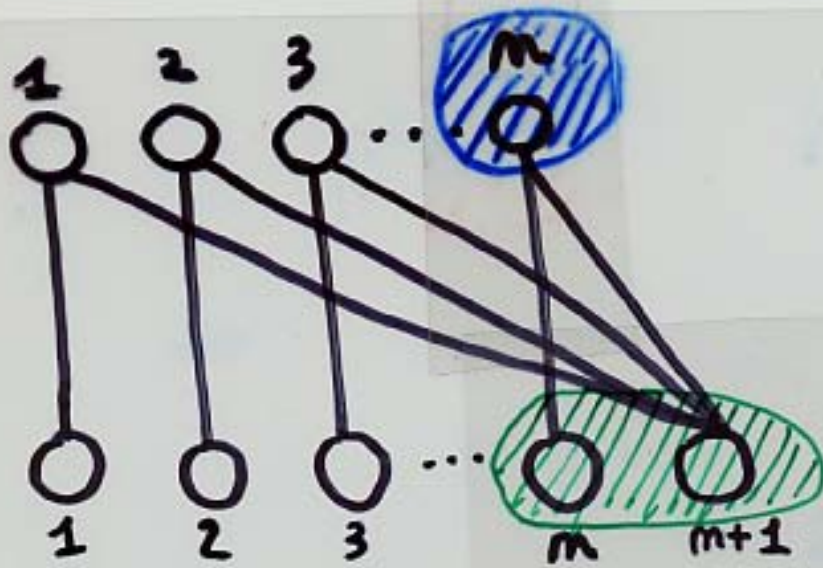
- FINDING THE BEST SUBGRAPH IS NP-HARD, NO PTAS
- EFFICIENT CONSTRUCTION FOR INTERESTING CASES (HIERARCHICAL TOPOLOGIES AND OTHERS)
- SUFFICIENT CONDITIONS FOR  $O(\sqrt{m})$ -COMPETITIVE ALGORITHMS

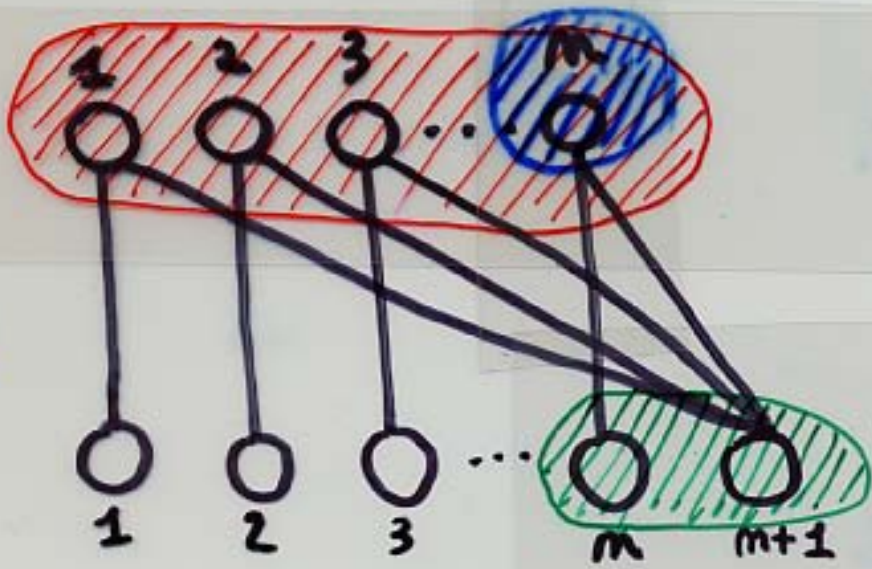




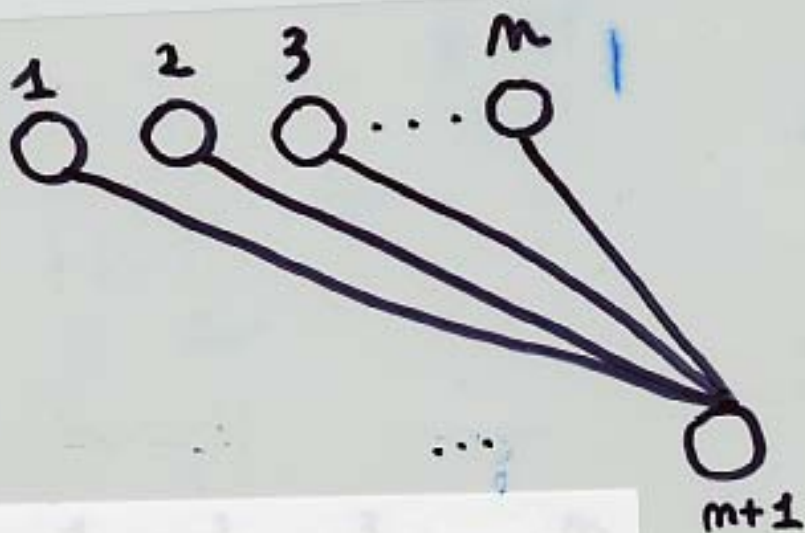
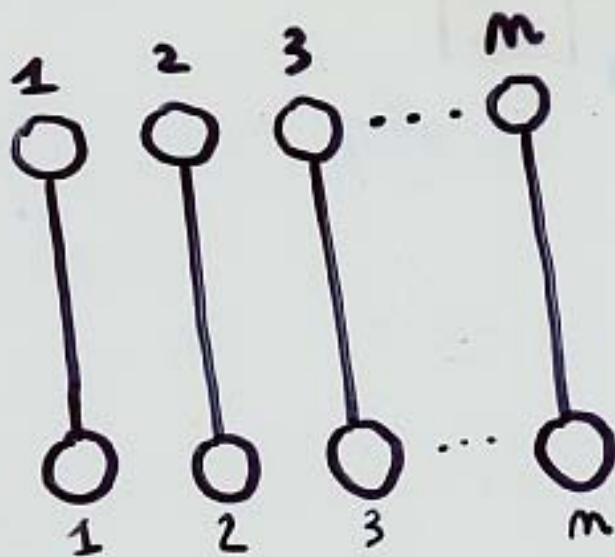
CS 151, Stanford University



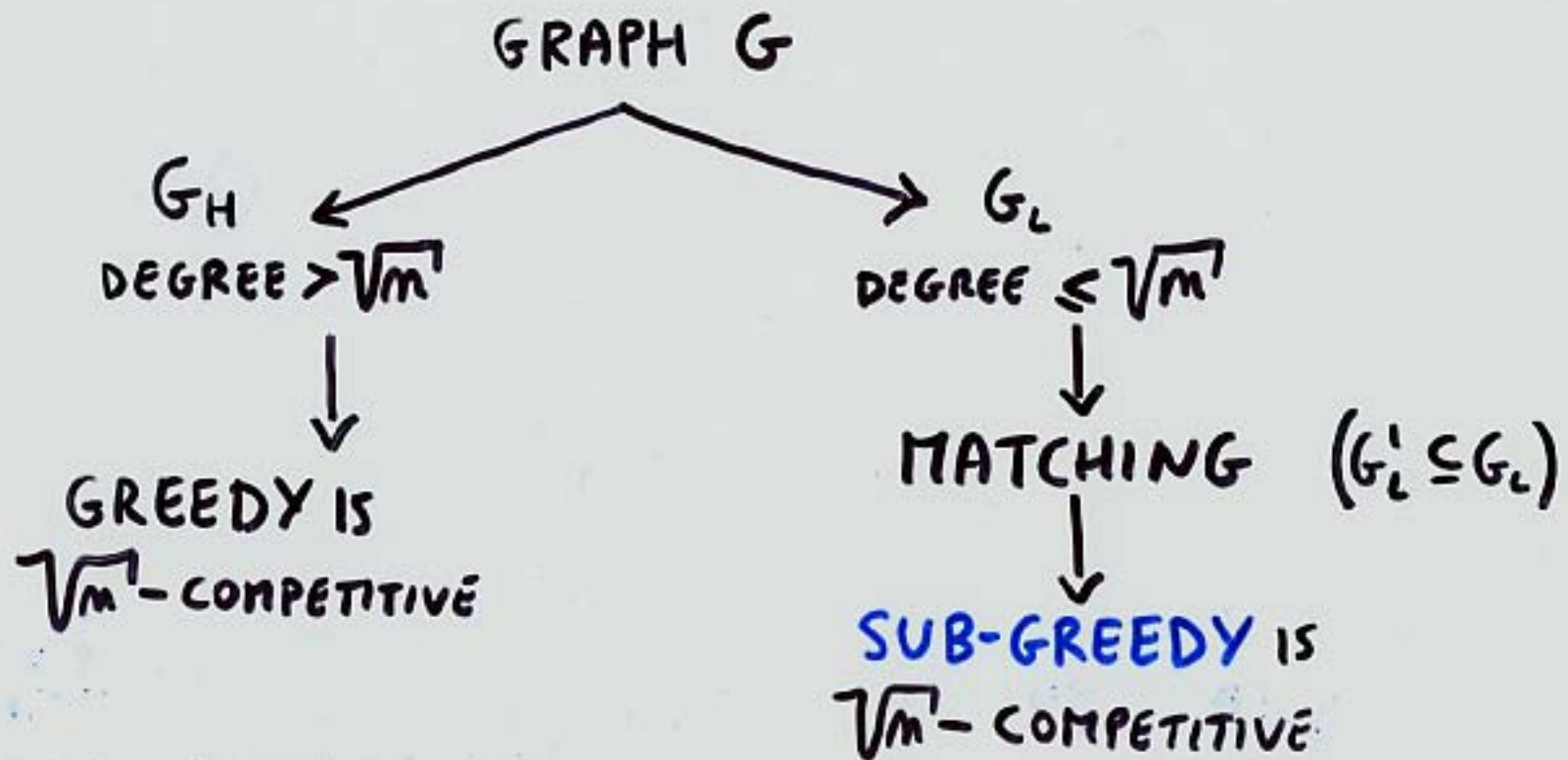




$\frac{m}{1}$  !!! ☹

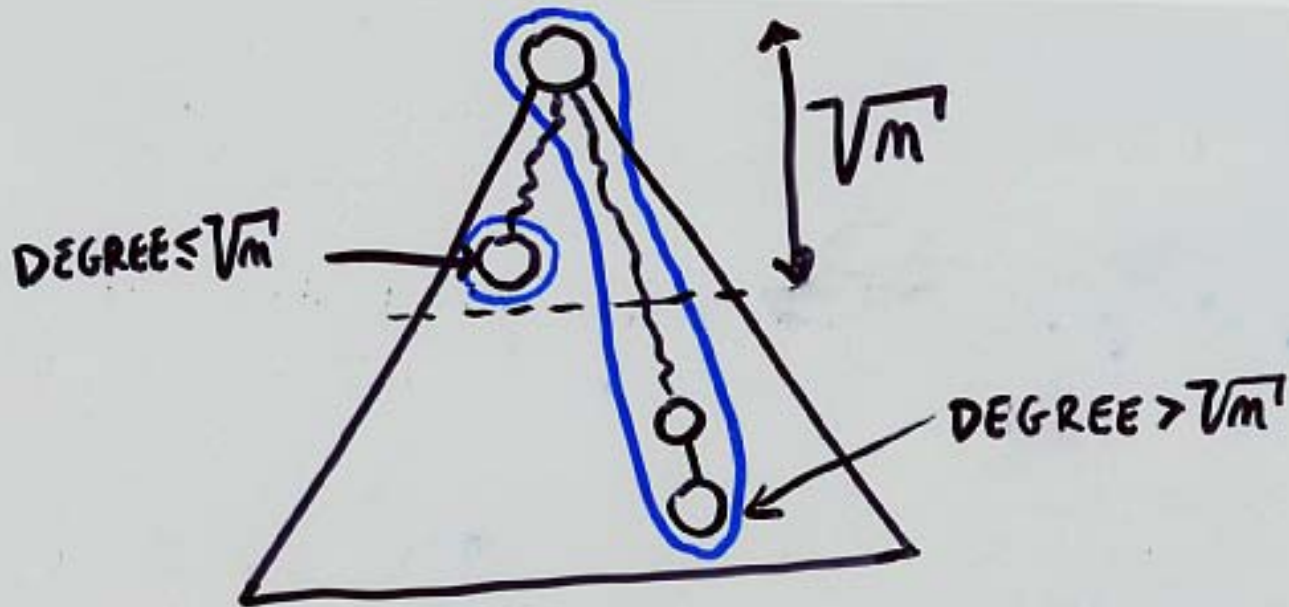
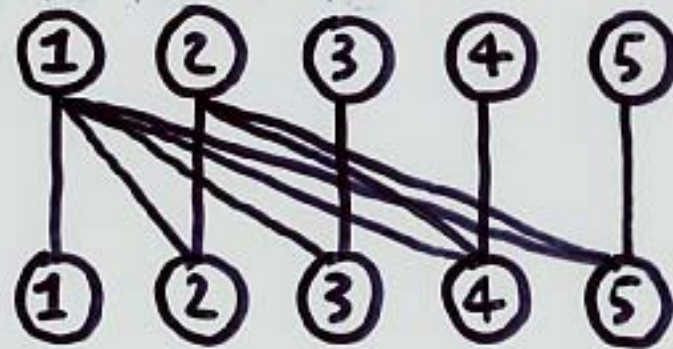
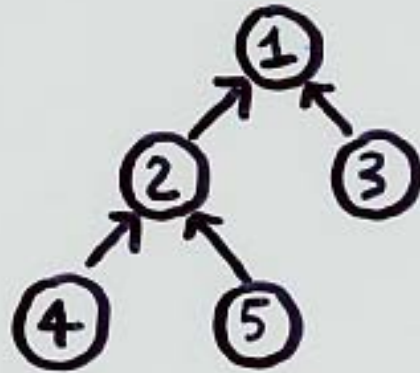


# GENERAL CASE

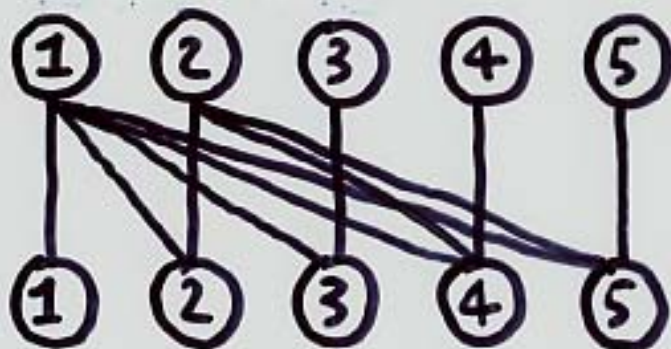
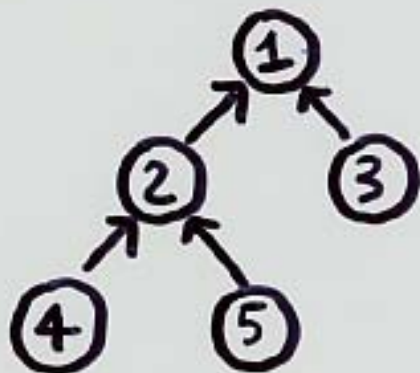


**THEOREM.** IF  $G$  HAS A MATCHING THEN SUB-GREEDY IS  $(2\sqrt{m} + 2)$ -COMPETITIVE.

# TREE HIERARCHICAL TOPOLOGIES

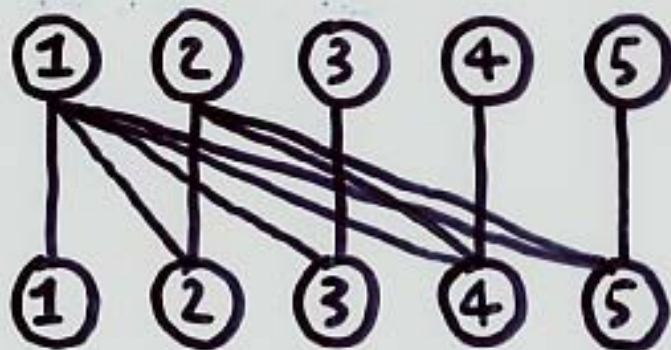
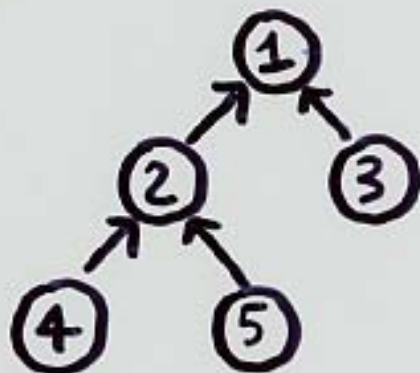


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**THEOREM.** IF  $G$  HAS A MATCHING THEN **SUB-GREEDY** IS  $(2\sqrt{m}+2)$ -COMPETITIVE

**THEOREM** [BAR-NOY ET AL '99] ANY ONLINE ALGORITHM IS  $\Omega(\sqrt{m})$ -COMPETITIVE.

# OPEN PROBLEMS

WHICH GRAPHS YIELD

- $O(\sqrt{m})$ -COMPETITIVE ALGORITHMS
- OPTIMAL ALGORITHMS

APPROXIMATION ALGORITHM FOR  
COMPUTING THE SUBGRAPH