

Lecture 7

Lecture 7

Previously in Opt 2 ...

The Project Selection Problem

- Input:
 - m projects: $\mathcal{P} = \{1, 2, \dots, m\}$
 - n tools: $\mathcal{T} = \{1, 2, \dots, n\}$
 - For each project i ,
 - T_i = the set of tools needed for completing project i
 - b_i = the benefit from completing project i
 - For each tool j ,
 - c_j = the cost of purchasing tool j
- Objective:

To select projects to complete and tools to buy, as to minimize

$$\text{net profit} = \text{total benefit from selected projects} - \text{total cost of selected tools}$$
- Constraints:

If project i is selected to be completed, then all tools in T_i must also be selected to be purchased

The Project Selection Problem

- Input:
 - m projects: $\mathcal{P} = \{1, 2, \dots, m\}$
 - n tools: $\mathcal{T} = \{1, 2, \dots, n\}$
 - For each project i ,
 - T_i = the set of tools needed for completing project i
 - b_i = the benefit from completing project i
 - For each tool j ,
 - c_j = the cost of purchasing tool j
- Objective:

To select P' (subset of \mathcal{P}) and T' (subset of \mathcal{T}) to minimize

$$\text{net profit} = \sum_{i \in P'} b_i + \sum_{j \in T'} c_j$$
- Constraints:

If project i is in P' , then the set of tools T_i is a subset of T'

The Project Selection Problem

Example

$$\mathcal{P} = \{1, 2, 3\}$$

$$\mathcal{J} = \{1, 2, 3, 4\}$$

$$T_1 = \{1, 2, 3\}, T_2 = \{2, 3\}, T_3 = \{3, 4\}$$

$$b_1 = 15, b_2 = 20, b_3 = 10$$

$$c_1 = 5, c_2 = 10, c_3 = 5, c_4 = 15$$

The Project Selection Problem: Mincut Formulation

Step 1: Construct the Mincut input

A directed graph $G = (N, E)$, where

$$N = \{s, t\} \cup \mathcal{P} \cup \mathcal{T}$$

$$E = \{(s, i) \mid \text{for all project nodes } i \text{ in } \mathcal{P}\} \cup$$

$$\{(i, j) \mid \text{for } j \text{ in } T_i, \text{ for all } i \text{ in } \mathcal{P}\} \cup$$

$$\{(j, t) \mid \text{for all tool nodes } j \text{ in } \mathcal{T}\} \cup$$

Edge capacities: for (i, j) in E ,

$$u_{ij} = ?$$

The Project Selection Problem

Example

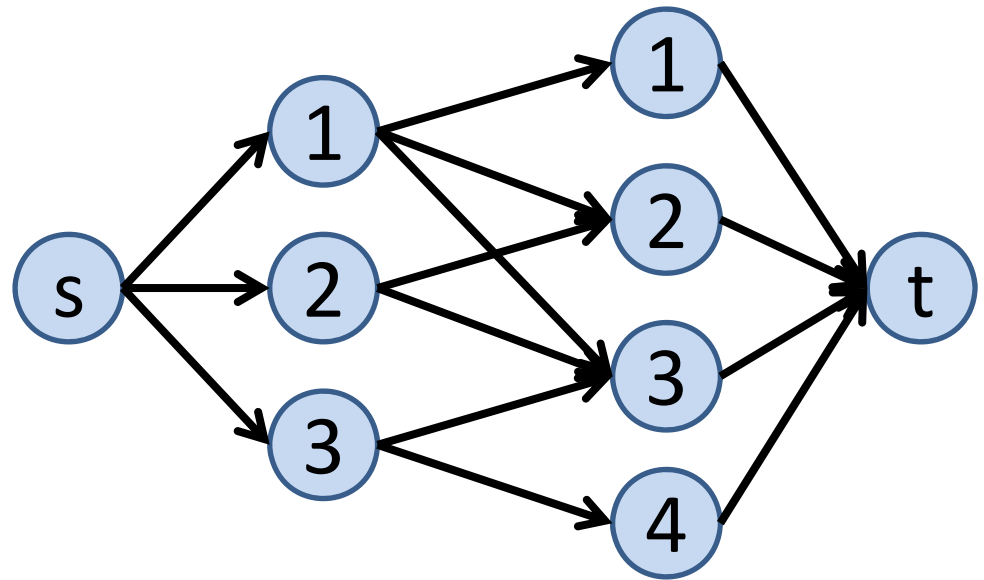
$$\mathcal{P} = \{1, 2, 3\}$$

$$\mathcal{J} = \{1, 2, 3, 4\}$$

$$T_1 = \{1, 2, 3\}, T_2 = \{2, 3\}, \\ T_3 = \{3, 4\}$$

$$b_1 = 15, b_2 = 20, b_3 = 10$$

$$c_1 = 5, c_2 = 10, c_3 = 5, \\ c_4 = 15$$



The Project Selection Problem: Mincut Formulation

Step 1: Construct the Mincut input

A directed graph $G = (N, E)$, where

$$N = \{s\} \cup P \cup T$$

$$E = \{(s, i) \mid \text{for all } i \text{ in } \mathcal{P}\}$$

$$\cup \{(i, j) \mid \text{for } j \text{ in } T_i, \text{ for all } i \text{ in } \mathcal{P}\}$$

$$\cup \{(j, t) \mid \text{for all } j \text{ in } \mathcal{T}\}$$

Edge capacities:

$$u_{si} = b_i \text{ for all projects } i; u_{jt} = c_j \text{ for all tools } j;$$

$$u_{ij} = +\infty \text{ for all } i \text{ in } \mathcal{P} \text{ and } j \text{ in } T_i$$

The Project Selection Problem

Example

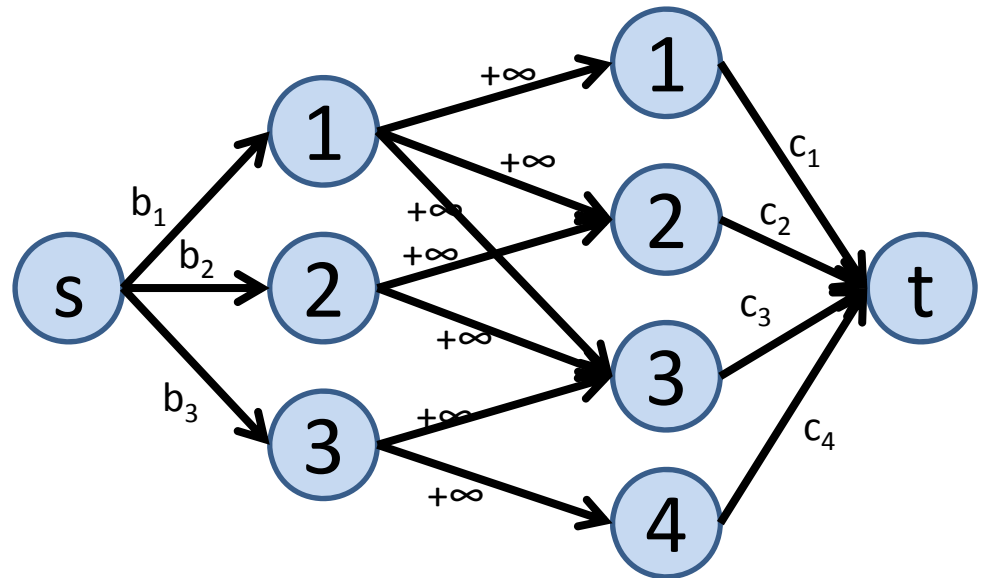
$$\mathcal{P} = \{1, 2, 3\}$$

$$\mathcal{J} = \{1, 2, 3, 4\}$$

$$T_1 = \{1, 2, 3\}, T_2 = \{2, 3\}, \\ T_3 = \{3, 4\}$$

$$b_1 = 15, b_2 = 20, b_3 = 10$$

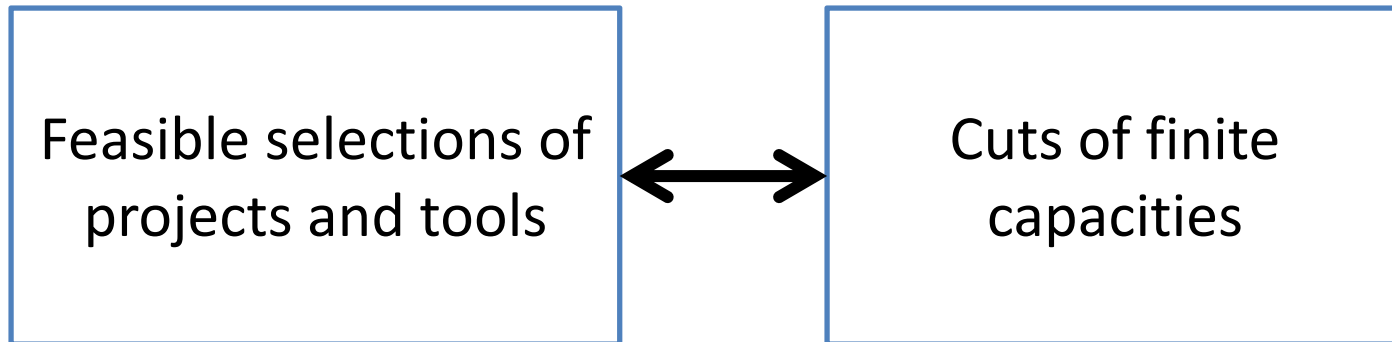
$$c_1 = 5, c_2 = 10, c_3 = 5, \\ c_4 = 15$$



The Project Selection Problem: Mincut Formulation

Step 2: Correspondence of feasible solutions

Goal: to show the correspondence:



The Project Selection Problem

Example

$$\mathcal{P} = \{1, 2, 3\}$$

$$\mathcal{T} = \{1, 2, 3, 4\}$$

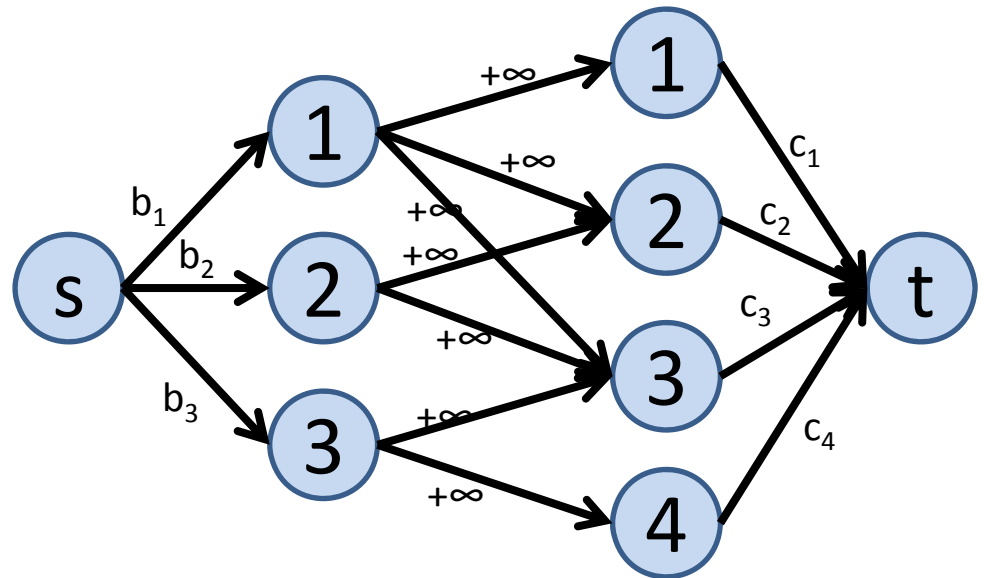
$$T_1 = \{1, 2, 3\}, T_2 = \{2, 3\},$$
$$T_3 = \{3, 4\}$$

$$b_1 = 15, b_2 = 20, b_3 = 10$$

$$c_1 = 5, c_2 = 10, c_3 = 5,$$
$$c_4 = 15$$

Feasible selection:

$$P' = \{1, 2\}, T' = \{1, 2, 3\}$$



The Project Selection Problem

Example

$$\mathcal{P} = \{1, 2, 3\}$$

$$\mathcal{T} = \{1, 2, 3, 4\}$$

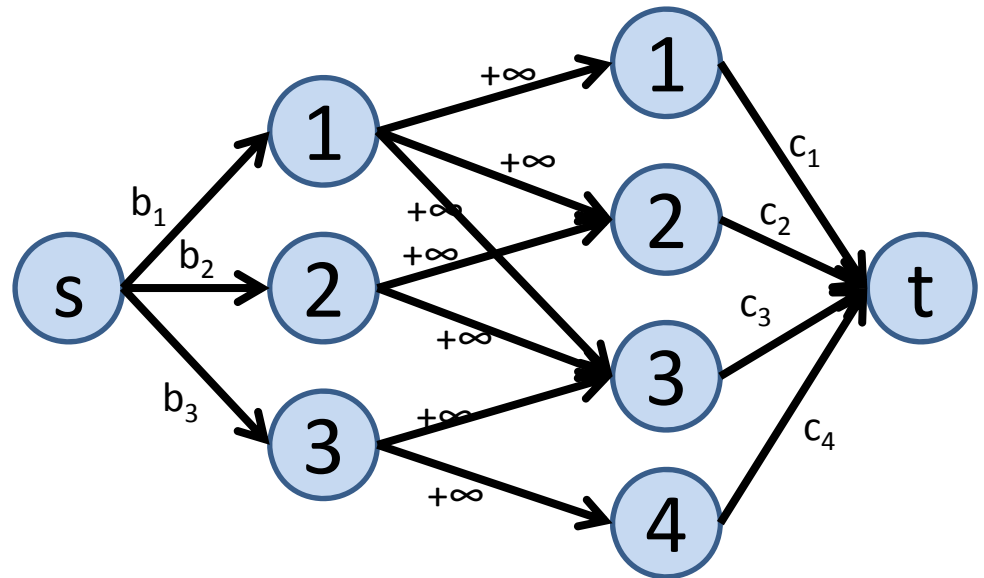
$$T_1 = \{1, 2, 3\}, T_2 = \{2, 3\}, \\ T_3 = \{3, 4\}$$

$$b_1 = 15, b_2 = 20, b_3 = 10$$

$$c_1 = 5, c_2 = 10, c_3 = 5, \\ c_4 = 15$$

Infeasible selection:

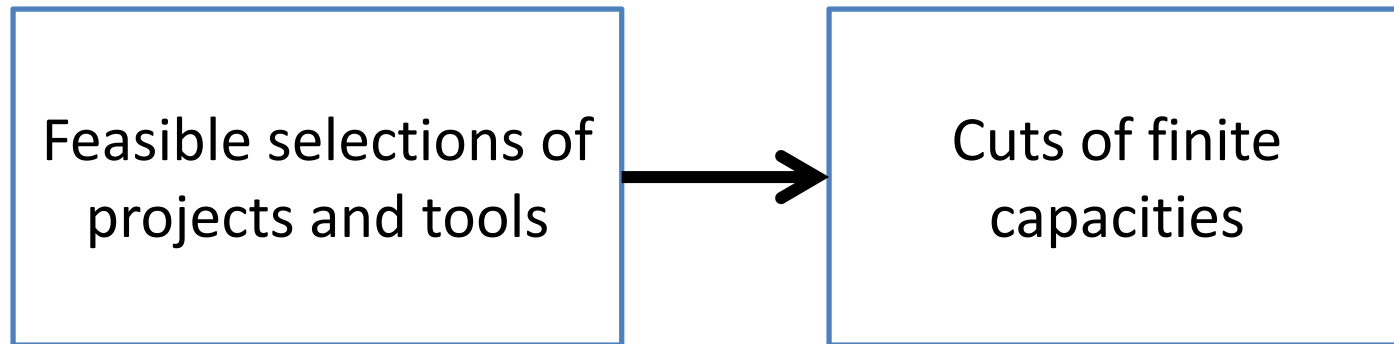
$$P' = ?, T' = ?$$



The Project Selection Problem: Mincut Formulation

Step 2: Correspondence of feasible solutions

First, show the correspondence:



Suppose that we have a feasible selections of projects and tools (P', T') ...

The Project Selection Problem: Mincut Formulation

Step 2: Correspondence of feasible solutions

Suppose
 (P', T')
is feasible

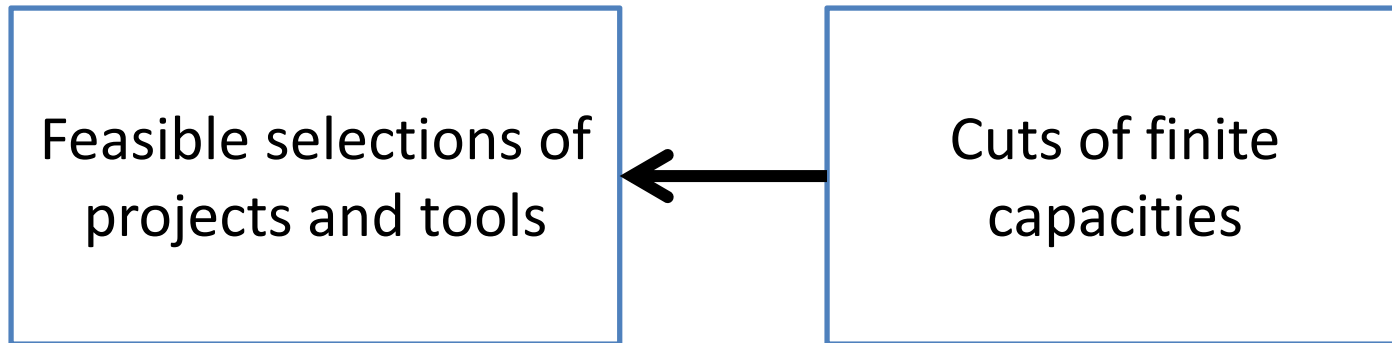


Construct the cut:
 $S = \{s\} \cup P' \cup T'$,
 $T = \text{all other nodes}$
Then (S, T) has finite
capacity

The Project Selection Problem: Mincut Formulation

Step 2: Correspondence of feasible solutions

Next, show the correspondence:



Suppose that we have a cut (S, T) of finite capacity...

The Project Selection Problem: Mincut Formulation

Step 2: Correspondence of feasible solutions

Construct (P', T') :

P' = projects that are in S

T' = tools that are in S

Then (P', T') is a
feasible selection

Suppose

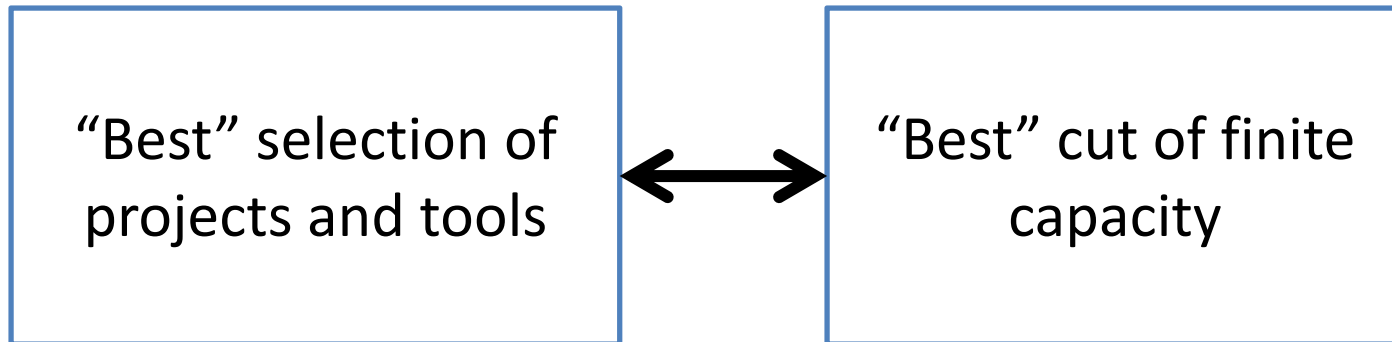
(S, T) is a cut of
finite capacity



The Project Selection Problem: Mincut Formulation

Step 3: Correspondence of optimal solutions

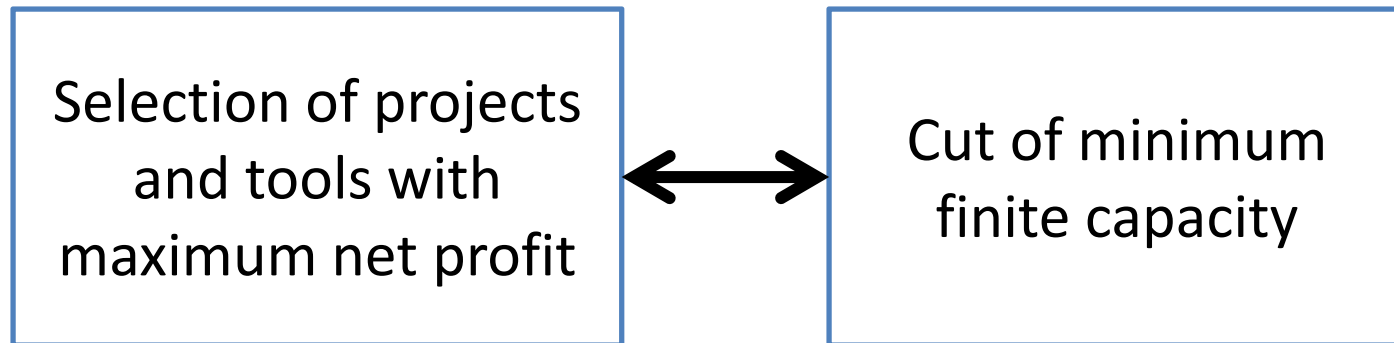
Goal: to show the correspondence:



The Project Selection Problem: Mincut Formulation

Step 3: Correspondence of optimal solutions

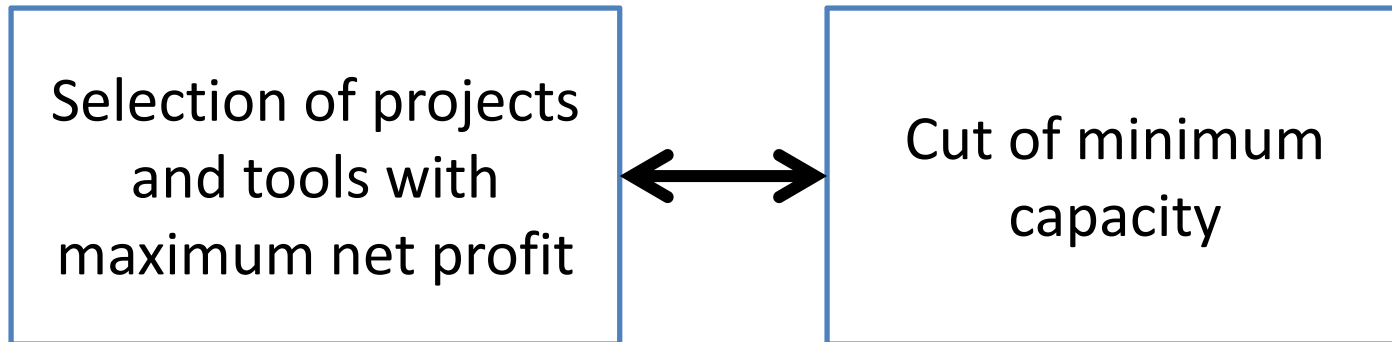
Goal: to show the correspondence:



The Project Selection Problem: Mincut Formulation

Step 3: Correspondence of optimal solutions

Goal: to show the correspondence:



The Project Selection Problem: Mincut Formulation

Step 3: Correspondence of optimal solutions

So, maximizing the net profit of (P', T') is equivalent to minimizing the capacity of (S, T)

$$\max_{(P', T') \text{ feas}} \left(\sum_{i \in P'} b_i - \sum_{j \in T'} c_j \right) \longleftrightarrow \min_{(S, T), \text{feas cut}} \sum_{i \in S, j \in T} u_{ij}$$

where (S, T) is the cut that corresponds to (P', T') :

$S = \{s\} \cup P' \cup T'$ and $T =$ all the other nodes

i>clicker

(after the break)

Q1: The Assignment Problem

$n = 3$

With cost table:

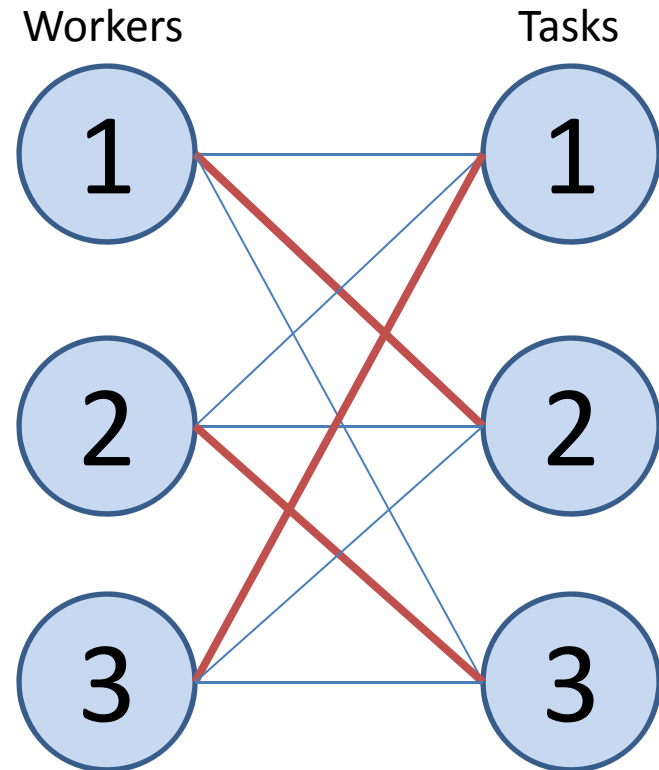
(Row i = worker i ; Column j = task j)

1	0	3
0	4	0
0	2	0

A feasible assignment:

$(1, 2), (2, 3), (3, 1).$

Is this optimal?



Q1: The Assignment Problem

$n = 3$

With cost table:

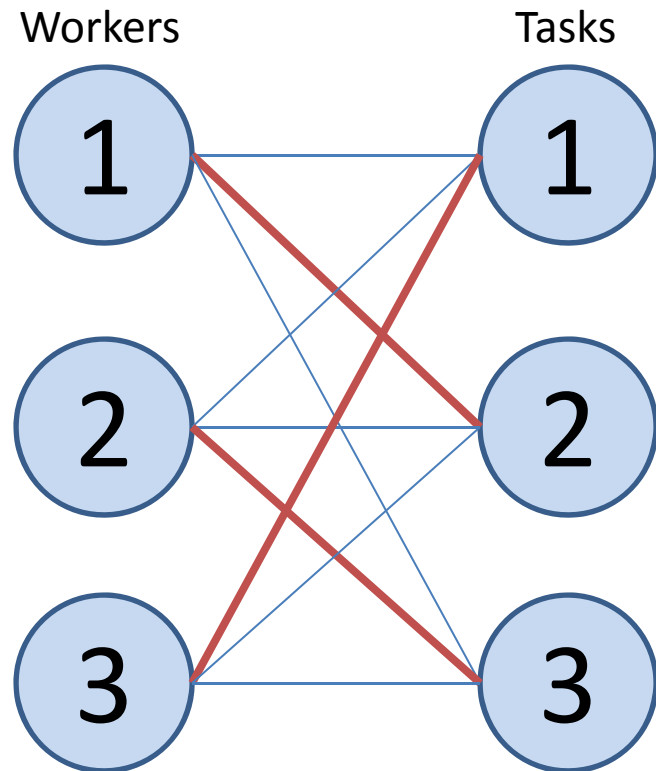
(Row i = worker i ; Column j = task j)

1	0	3
0	4	0
0	2	0

A feasible assignment:

(1, 2), (2, 3), (3, 1).

Is this optimal?



- A. Yes
- B. No
- C. Maybe
- D. Some of the above
- E. None of the above

The assignment problem

(revisited!)

The Assignment Problem

- Input:
 - A set of n workers: $W = \{1, 2, \dots, n\}$
 - A set of n tasks: $T = \{1, 2, \dots, n\}$
 - For each pair of worker i and task j :
 t_{ij} = time (or cost) for worker i to finish task j
- Objective:
 - To minimize the total time (or cost) for finishing all n tasks
- Constraint:
 - Each worker is assigned to do one task
 - Each task is assigned to one worker

The Assignment Problem:

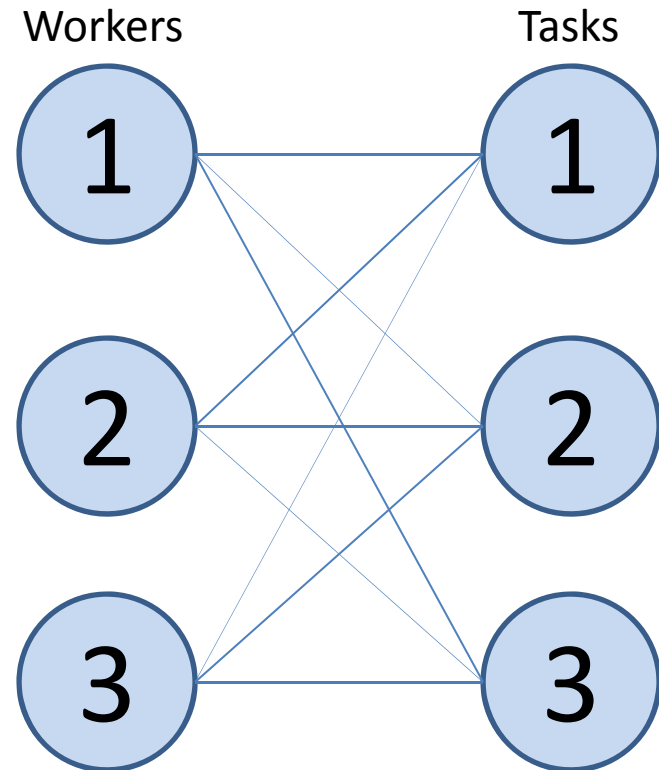
Example 0

$n = 3$

With cost table:

(Row i = worker i ; Column j = task j)

1	0	3
0	4	0
0	2	0



The Assignment Problem:

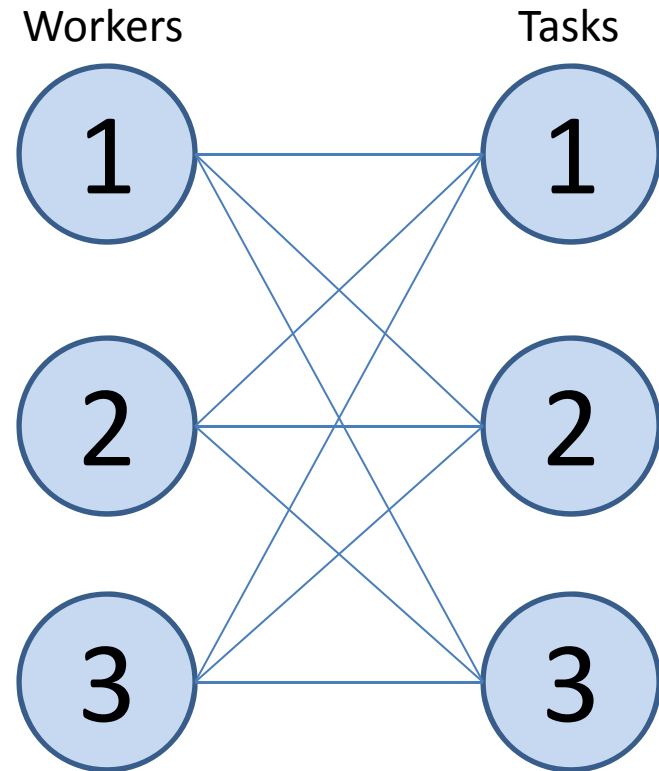
Example 1

$n = 3$

With cost table:

(Row i = worker i ; Column j = task j)

t_{11}	t_{12}	t_{13}
t_{21}	t_{22}	t_{23}
t_{31}	t_{32}	t_{33}



The Assignment Problem:

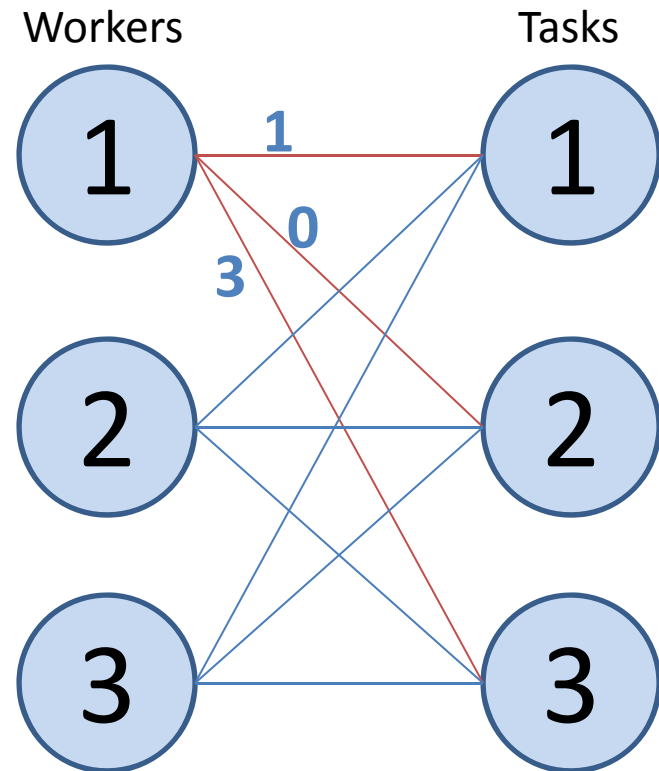
Example 1

$n = 3$

With cost table:

(Row i = worker i ; Column j = task j)

	$j = 1$	$j = 2$	$j = 3$
$i = 1$	1	0	3
	0	4	0
	0	2	0



The Assignment Problem:

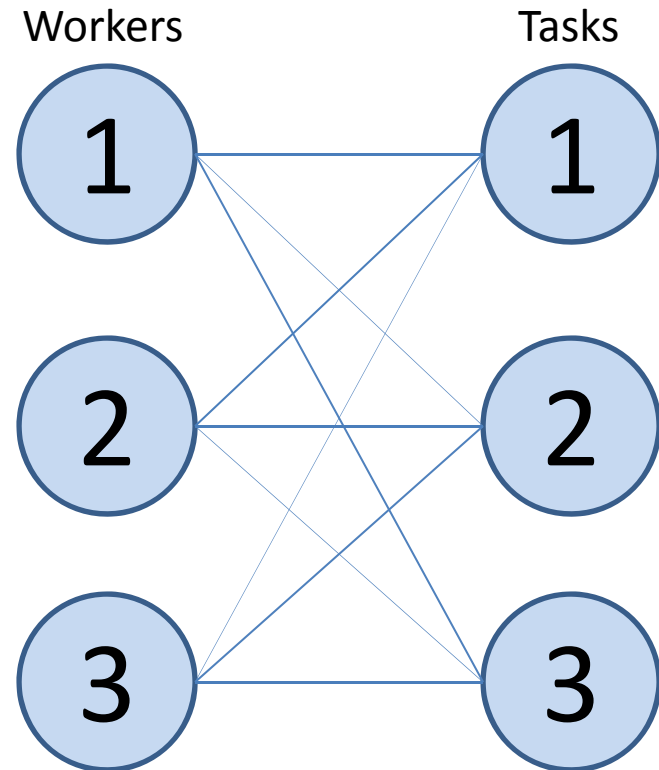
Example 0

$n = 3$

With cost table:

(Row i = worker i ; Column j = task j)

1	0	3
0	4	0
0	2	0



The Assignment Problem:

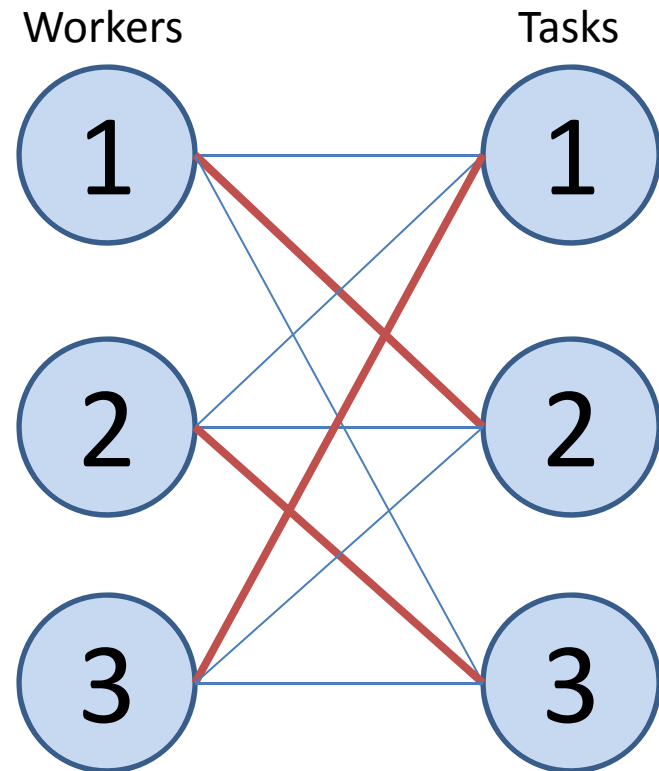
Example 0

$n = 3$

With cost table:

(Row i = worker i ; Column j = task j)

1	0	3
0	4	0
0	2	0



The assignment:

$(1, 2), (2, 3), (3, 1)$

Is this optimal?

The Assignment Problem:

An observation

Observation

If $t_{ij} \geq 0$ for all pairs (i, j) , and if we have an assignment of zero total cost, then this assignment is optimal.

Moreover, each pairing in this assignment must have zero cost.

The Assignment Problem:

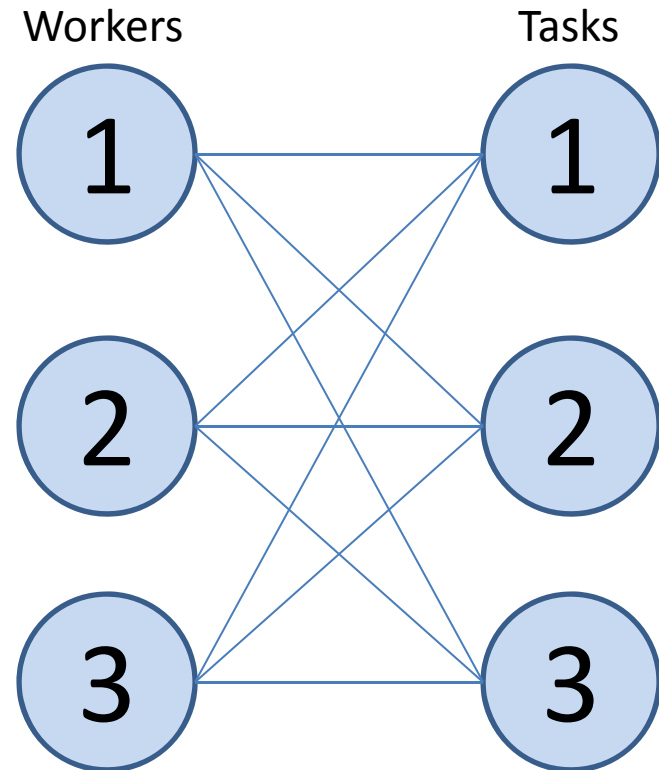
Example 1

$n = 3$

With cost table:

(Row i = worker i ; Column j = task j)

6	4	7
2	5	1
3	4	2

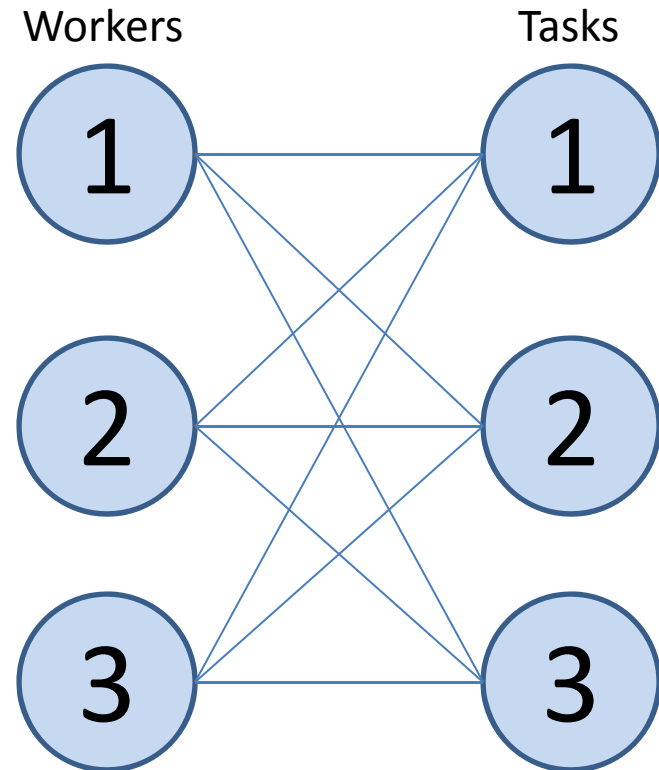


The Assignment Problem:

Example 1

Subtract 4 from each entry in row 1

6	4	7
2	5	1
3	4	2

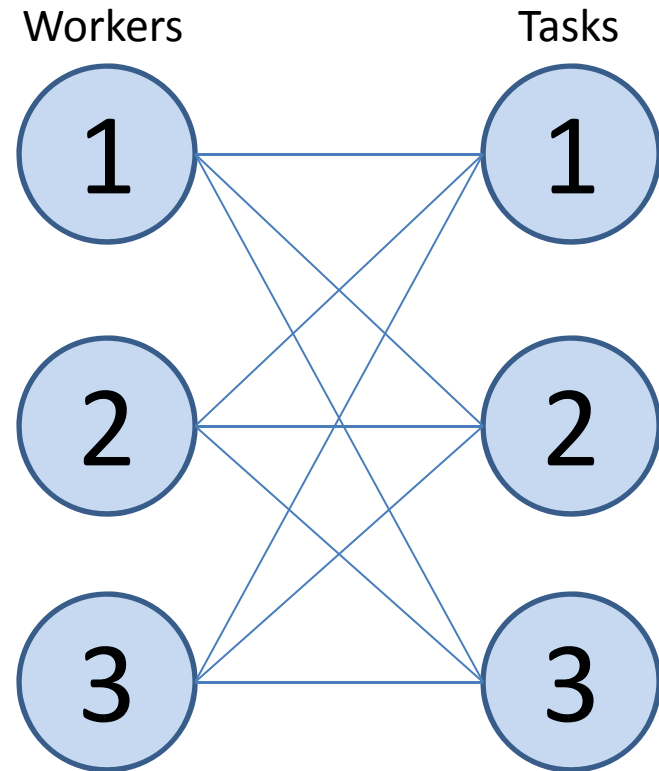


The Assignment Problem:

Example 1

Subtract 4 from each entry in row 1

2	0	3
2	5	1
3	4	2



The Assignment Problem:

Another observation

Claim

Suppose x denote an optimal assignment to an input with edge costs t_{ij} .

Suppose that we subtract δ from each entry of row i (or from each entry of column j).

(i.e., subtract δ from the cost of each edge adjacent to worker-node i , or from the cost of each edge adjacent to task-node j , respectively)

Then x is still optimal for the modified input.

The Assignment Problem:

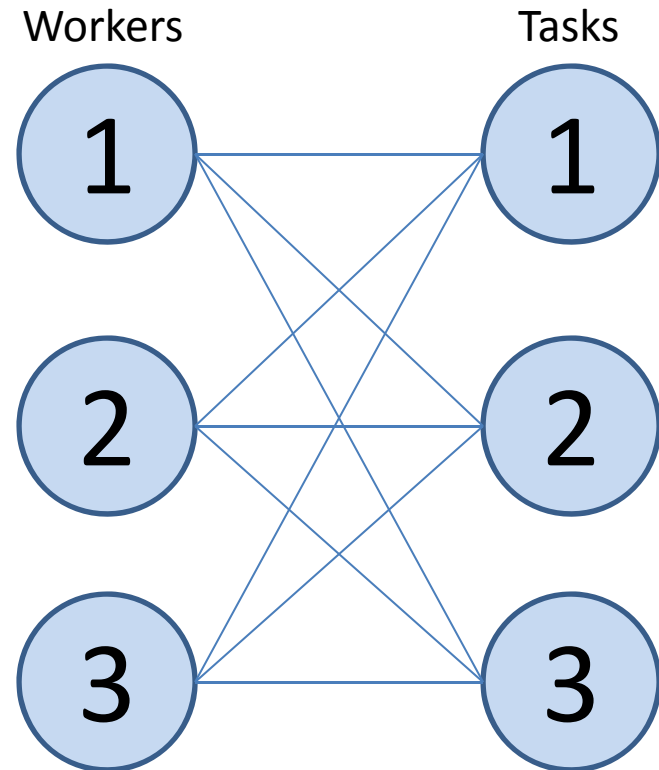
Example 1

Subtract 4 from each entry in row 1

Subtract 1 from each entry in row 2

Subtract 2 from each entry in row 3

2	0	3
2	5	1
3	4	2



The Assignment Problem:

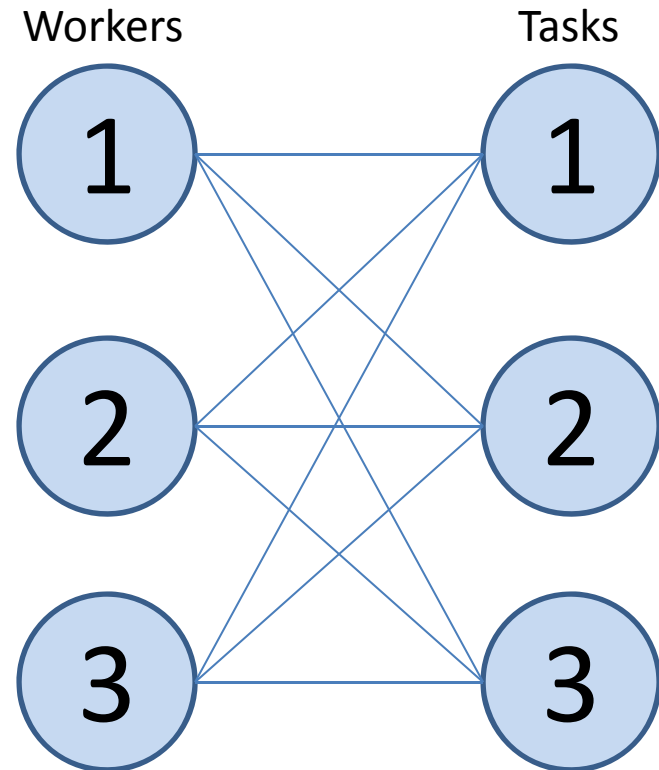
Example 1

Subtract 4 from each entry in row 1

Subtract 1 from each entry in row 2

Subtract 2 from each entry in row 3

2	0	3
1	4	0
1	2	0



The Assignment Problem:

Example 1

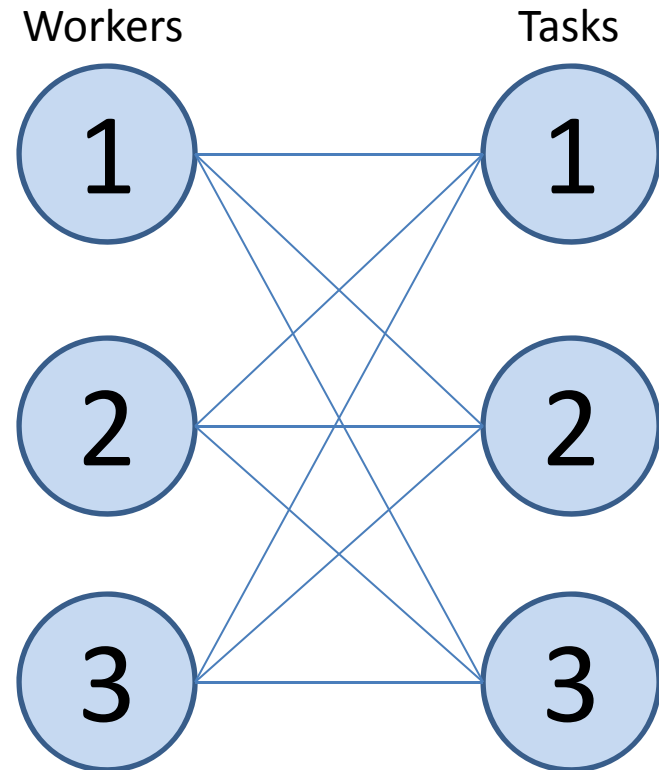
Subtract 4 from each entry in row 1

Subtract 1 from each entry in row 2

Subtract 2 from each entry in row 3

Subtract 1 from each entry in col 1

2	0	3
1	4	0
1	2	0



The Assignment Problem:

Example 1

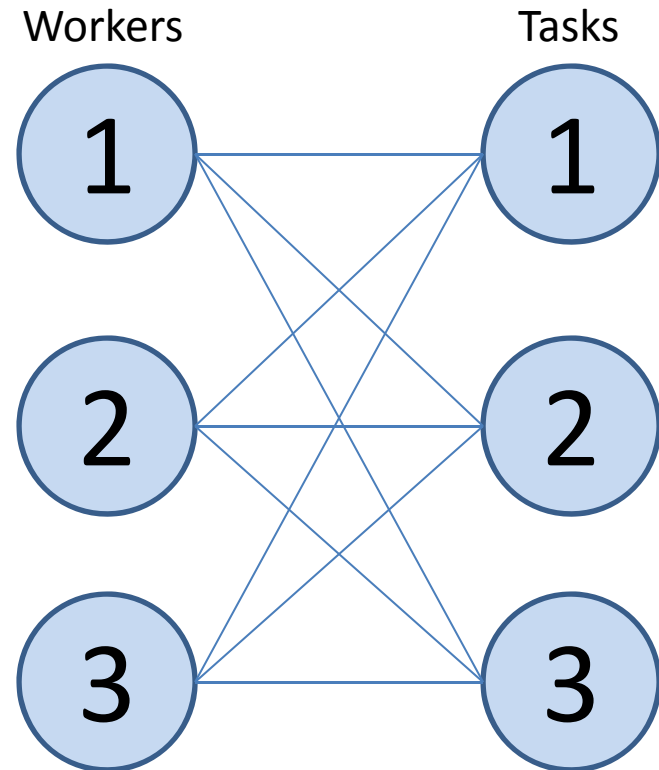
Subtract 4 from each entry in row 1

Subtract 1 from each entry in row 2

Subtract 2 from each entry in row 3

Subtract 1 from each entry in col 1

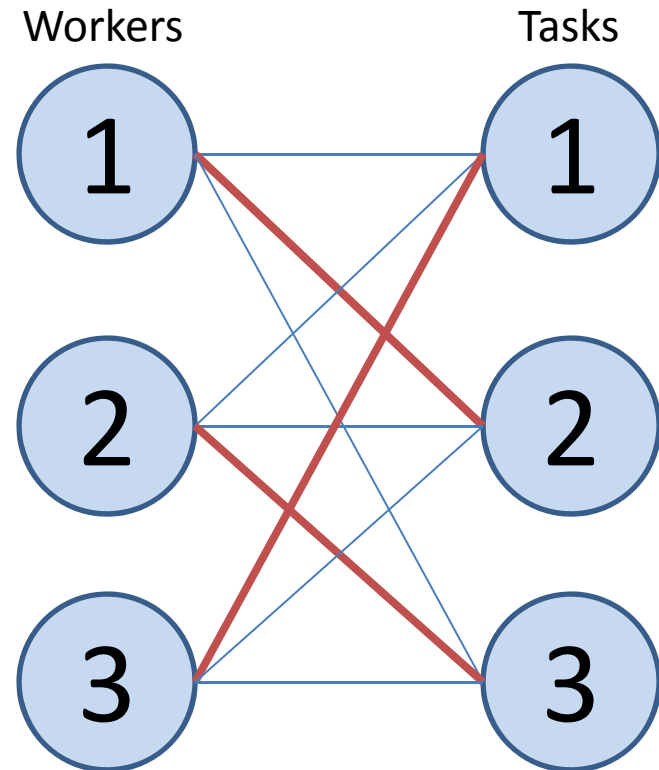
1	0	3
0	4	0
0	2	0



The Assignment Problem:

Example 1

1	0	3
0	4	0
0	2	0



The assignment:

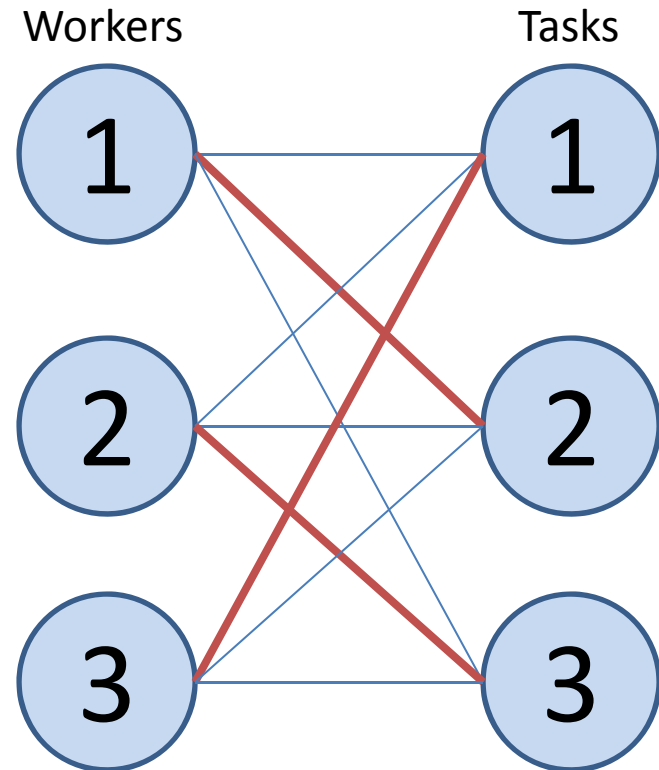
$(1, 2), (2, 3), (3, 1)$

is an ***all-zero-assignment***.

The Assignment Problem:

Example 1

6	4	7
2	5	1
3	4	2



The assignment:

$(1, 2), (2, 3), (3, 1)$

is also optimal for the original problem,
with total cost = $4 + 1 + 3 = 8$

The Assignment problem:

A first algorithm

0. Set up a cost table. Assume all costs are ≥ 0 .
1. For each row $i = 1, \dots, n$
 let α_i = the smallest entry in row i
 update: $t_{ij} \leftarrow t_{ij} - \alpha_i$ for all entries (i,j) in row i
2. For each col $j = 1, \dots, n$
 let β_j = the smallest entry in column j
 update: $t_{ij} \leftarrow t_{ij} - \beta_j$ for all entries (i,j) in col j
3. Check if there is an all-zero assignment
 If there is one, this assignment is optimal

The Assignment problem:

A first algorithm

0. Set up a cost table. Assume all costs are ≥ 0 .
1. For each row $i = 1, \dots, n$
 let α_i = the smallest entry in row i
 update: $t_{ij} \leftarrow t_{ij} - \alpha_i$ for all entries (i,j) in row i
2. For each col $j = 1, \dots, n$
 let β_j = the smallest entry in column j
 update: $t_{ij} \leftarrow t_{ij} - \beta_j$ for all entries (i,j) in col j
3. Check if there is an all-zero assignment
 If there is one, this assignment is optimal
 If there isn't one: ...?

The Assignment Problem:

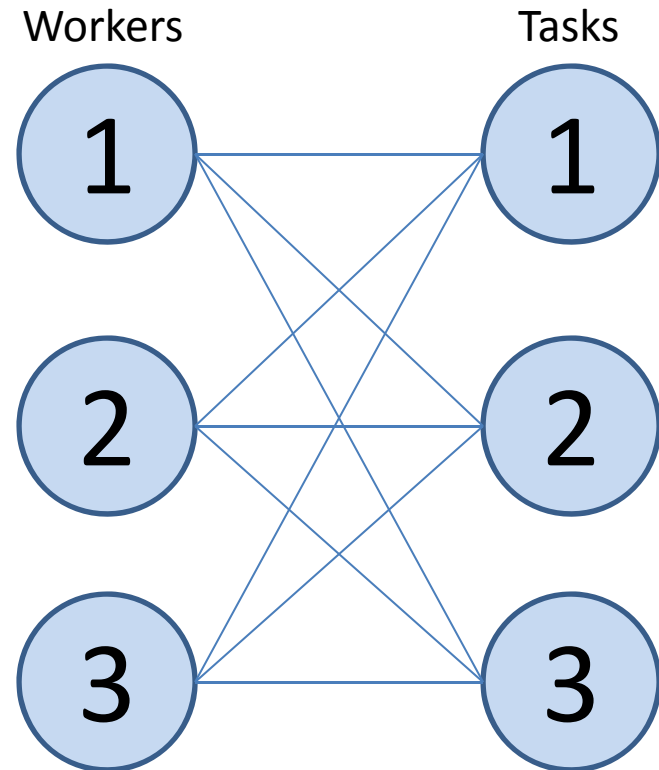
Example 2

$n = 3$

With cost table:

(Row i = worker i ; Column j = task j)

8	10	7
10	11	8
5	6	7



The Assignment Problem:

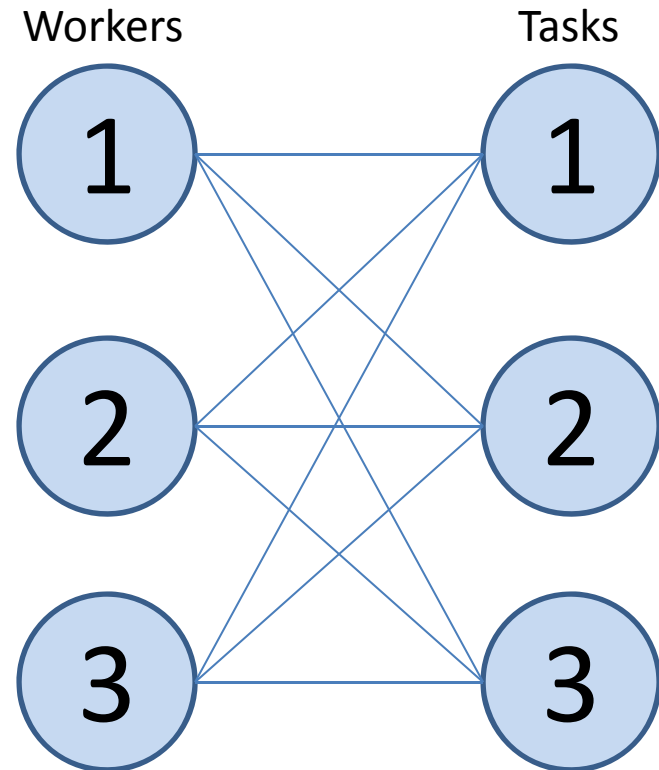
Example 2

Subtract 7 from each entry in row 1

Subtract 8 from each entry in row 2

Subtract 5 from each entry in row 3

8	10	7
10	11	8
5	6	7



The Assignment Problem:

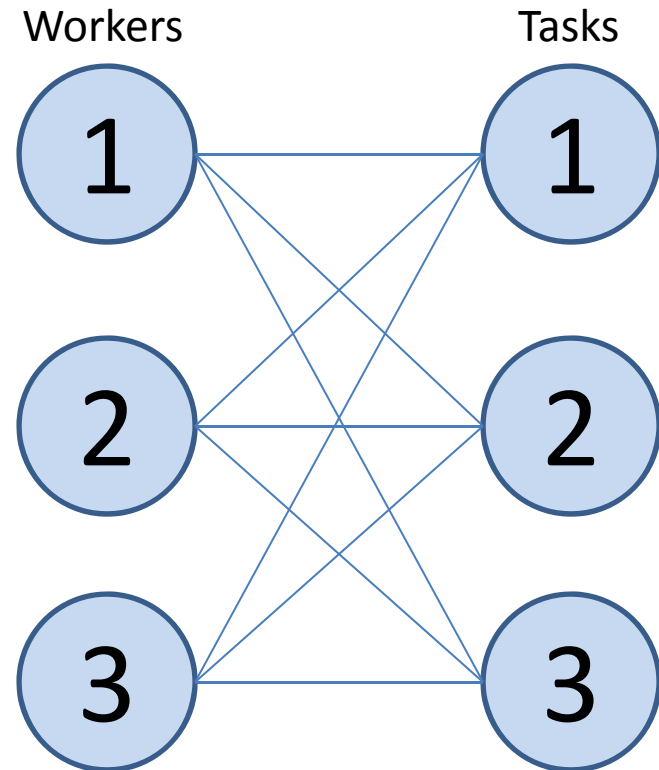
Example 2

Subtract 7 from each entry in row 1

Subtract 8 from each entry in row 2

Subtract 5 from each entry in row 3

1	3	0
2	3	0
0	1	2



The Assignment Problem:

Example 2

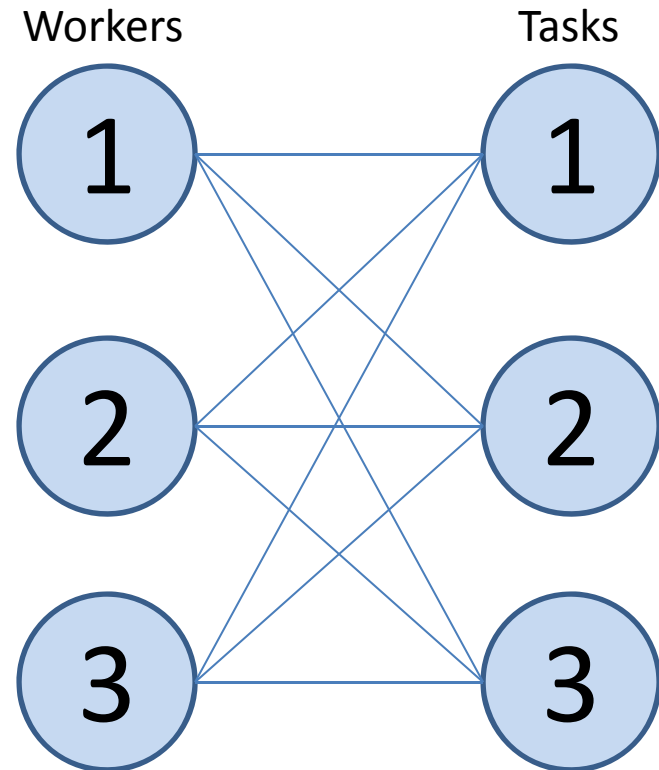
Subtract 7 from each entry in row 1

Subtract 8 from each entry in row 2

Subtract 5 from each entry in row 3

Subtract 1 from each entry in col 2

1	3	0
2	3	0
0	1	2



The Assignment Problem:

Example 2

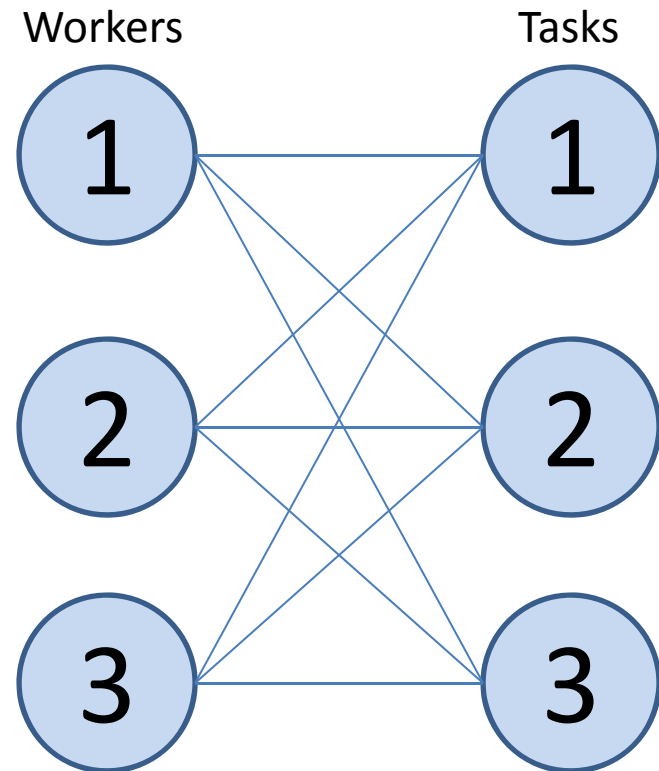
Subtract 7 from each entry in row 1

Subtract 8 from each entry in row 2

Subtract 5 from each entry in row 3

Subtract 1 from each entry in col 2

1	2	0
2	2	0
0	0	2

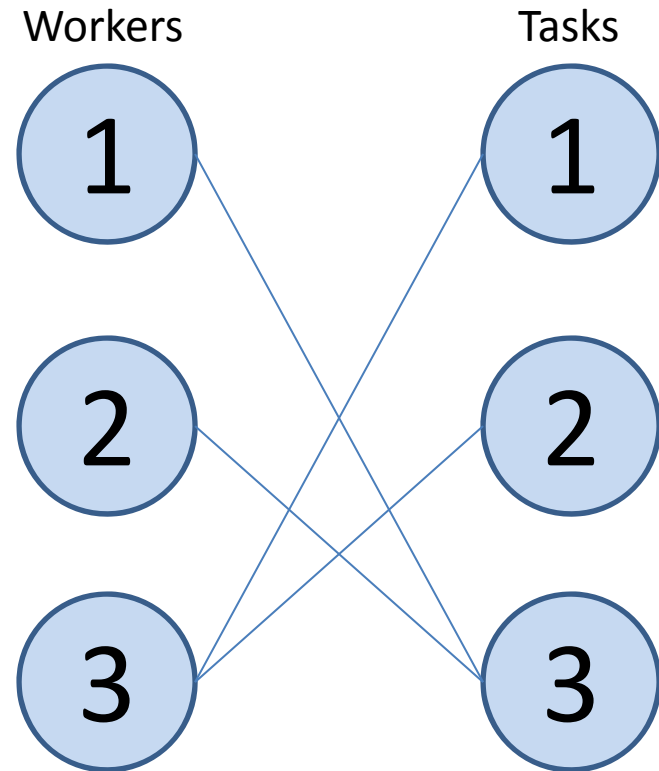


There is no all-zero-assignment.

The Assignment Problem:

Example 2

1	2	0
2	2	0
0	0	2



There is no all-zero-assignment:
No matching of size n in the graph
containing just zero-cost edges