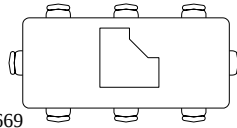


LAYOUT OF MACHINES AND FACILITIES

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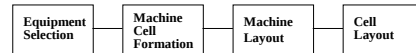


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Outline

- LAYOUT EXAMPLES
- SINGLE-ROW MACHINE LAYOUT
- DOUBLE-ROW MACHINE LAYOUT
- MULTIROW FACILITY LAYOUT
- ALGORITHMS



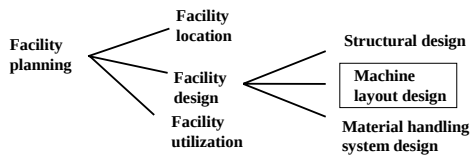
Latest layout software *Proplanner*
<http://www.proplanner.com/product/details/flowpath.aspx>



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Big Picture



Jobs: Facility Designer
Facility Planner

AutoCAD Software
<http://www.autodesk.com/>



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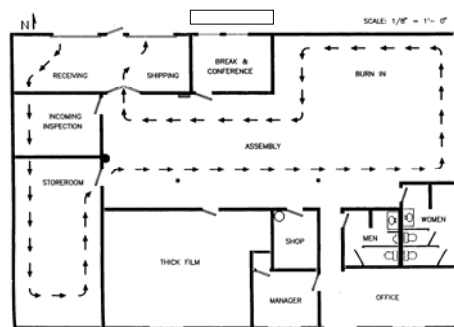
LAYOUT EXAMPLES



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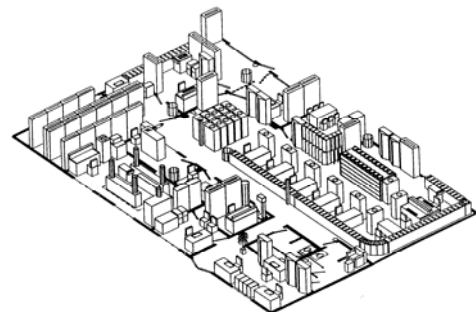
MANUFACTURING FACILITY LAYOUT



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ASSEMBLY AREA LAYOUT



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Office Layout



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LAYOUT OF MACHINES

Methods:

- Visual, e.g., using templates
- Computer based (often an environment for evaluating various layout alternatives)
- Model based



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LAYOUT OF MACHINES

Visualization types:

- 2D
- 3D
- Virtual reality



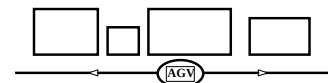
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LAYOUT OF MACHINES Model Based Approach

Basic Layout Patterns

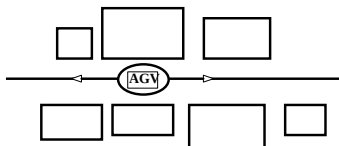
Single-Row Machine Layout



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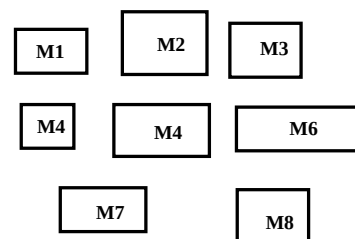
Double-Row Machine Layout



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Multi-row Layout



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BASIC DATA

- UNIT DISTANCE TRAVEL COST (c)
- OR FREQUENCY OF TRIPS (f)
- DISTANCE (d)
- OR TRAVEL TIME (t)



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OBJECTIVE

Arrange machines on the shop floor in such a way that the total product of the travel cost per unit distance traveled [\$/m] and the distance traveled [m] is minimum.

Travel cost is often replaced with the number (frequency - f) of trips per time unit [1/sec] between any two machines.

Distance is replaced with travel time - t [sec].

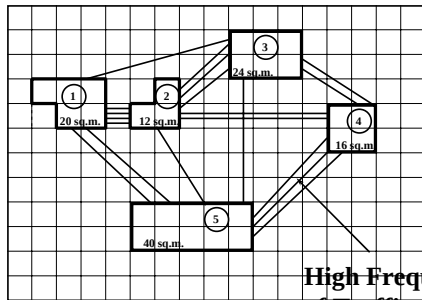
$$\text{Min} \sum_{i=1}^n \sum_{j=1}^n \sum_{k=1}^n \sum_{l=1}^n (f_{ik} t_{jl}) x_{ij} x_{kl}$$



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Example: Intuitive Machine Layout



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SINGLE-ROW MACHINE LAYOUT

Frequency of trips (traffic flow)

$$f_{ij} = \sum_{k=1}^n \left[\frac{v_{ij}^k}{u_k} \right]$$

where: v_{ij}^k = volume of part type k to be moved from machine i to machine j in a given time horizon (for example, 1 year)
 n_{ij} = number of different parts to be moved from machine i to machine j in a given time horizon
 u_k = number of parts to be moved in a single trip of the material handling equipment
 $\lceil \bullet \rceil$ = smallest integer greater than or equal to $\bullet$



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The AGV travel time involves:

- loading time
- acceleration time
- travel time
- deceleration time
- unloading time

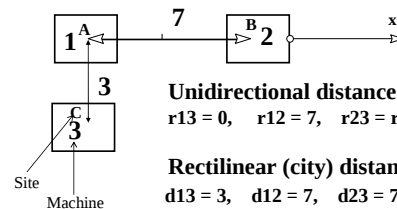


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DISTANCE CALCULATION

Consider 3 machines



Unidirectional distance (along x axis)
 $r_{13} = 0$, $r_{12} = 7$, $r_{23} = r_{12} = 7$

Rectilinear (city) distance
 $d_{13} = 3$, $d_{12} = 7$, $d_{23} = 7 + 3 = 10$

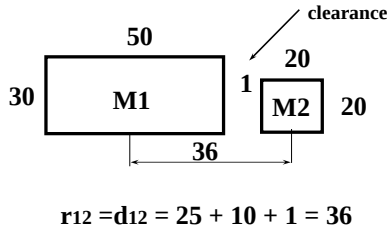
Euclidean distance
 $e_{12} = 7$, $e_{13} = 7.48$



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Adjacent unidirectional distance r_{12}



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Time is the best measure to be used in the optimization of machine layout, however, if the travel speed is constant, an appropriate distance measure can be considered.



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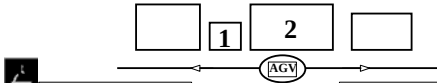
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SINGLE ROW MACHINE LAYOUT

Algorithm 1 Overview

Two machines with the maximum flow between them (e.g., 1 and 2) are placed in the adjacent locations.

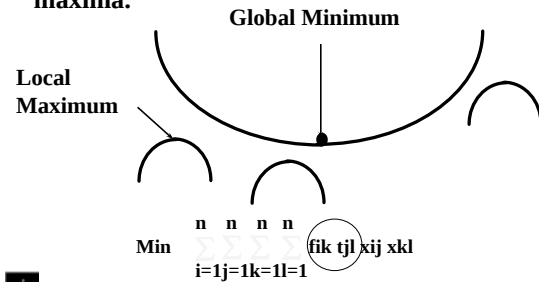
Other machines are placed to the left and right of the two machines based on the flow.



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The minimization of the total product of flow $\times$ travel time is accomplished by local maxima.



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Algorithm 1

Step 0. Set iteration number $k = 1$.

From the flow matrix $[f_{ij}]$ compute

$f_{i^*j^*} = \max \{f_{ij} : i, j = 1, 2, \dots, m\}$.

If there is a tie, $f_{i^*j^*} = \max \{f_{ij} \cdot t_{ij} : i, j = 1, 2, \dots, m\}$.

Connect i^* , j^* and include them in the solution set.

Set the solution set, $U = \{i^*, j^*\}$.



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Step 1. Compute

$f_{p^*q^*} = \max \{f_{i^*j^*} \cdot f_{j^*l^*} : k, l \in \{1, 2, \dots, m\} - U\}$.

Set $s^* = q^*$.

Consider two alternatives:

- (a) Place machine s^* left of machine i^* ;
- (b) Place machine s^* right of machine j^* .

Compute:

$q_{s^*i^*} = \sum \{f_{s^*r} \cdot t_{s^*r} : r \in U \text{ and machine } s^* \text{ is placed left of machine } i^*\}$;

$q_{j^*s^*} = \sum \{f_{s^*r} \cdot t_{s^*r} : r \in U \text{ and machine } s^* \text{ is placed right of machine } j^*\}$



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If $q_{s^*i^*} \leq q_{j^*s^*}$,

- (1) Select the alternative (a) above;
- (2) Set $i^* = s^*$.

If $q_{s^*i^*} > q_{j^*s^*}$,

- (1) Select the alternative (b) above;
- (2) Set $j^* = s^*$.

$U = U + s^*$.



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Step 2. Set iteration number $k = k + 1$.

Repeat Step 1 until the final solution is obtained (i.e., until all the machines are included in the solution set U).



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Example

Single-row machine layout

Given:

$[f_{ij}] = \text{Machine}$

		Machine			
		1	2	3	4
$[f_{ij}] = \text{Machine}$	1	0	10	15	15
	2	10	0	0	5
	3	15	0	0	40
	4	15	5	40	0

f_{ij} = frequency of trips
 t_{ij} = travel time
 r_{ij} = unidirectional distance
 d_{ij} = adjacent distance

Machine number	Machine dimensions
1	2 x 2
2	4 x 4
3	6 x 6
4	2 x 2

Clearance = 1



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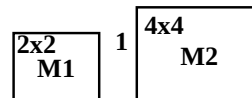
Calculate adjacent distances

$[d_{ij}] = \text{Machine}$

	Machine				
	1	2	3	4	
1	0	4	5	3	
2	4	0	6	4	
3	5	6	0	5	
4	3	4	5	0	

Machine number	Machine dimensions
1	2 x 2
2	4 x 4
3	6 x 6
4	2 x 2

Machine number	Machine dimensions
1	2 x 2
2	4 x 4
3	6 x 6
4	2 x 2



$$d_{12} = 1 + 1 + 2 = 4$$

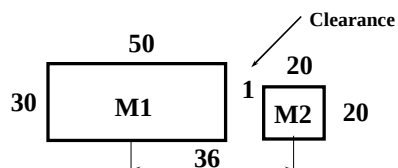
For simplicity assume time t_{ij} = distance d_{ij}



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Distances



Adjacent distance $d_{12} = 25 + 10 + 1 = 36$
 Unidirectional distance $r_{12} = d_{12} = 36$



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Iteration 1

Step 0.

From the flow matrix $[f_{ij}]$,

$\max \{f_{ij} : i = 1, 2, 3, 4, j = 1, 2, 3, 4\} = f_{34} = 40$ is obtained. Thus $i^* = 3, j^* = 4$ is determined.

Machines 3 and 4 are connected and included in the solution, symbolically denoted as



The solution set is updated $U = \{3, 4\}$ and the columns 3 and 4 of the matrix are marked with asterisks.

matrix are marked with asterisks.

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Machine*

	1	2	3	4
1	0	10	15	15
2	10	0	0	5
3	15	0	0	40
4	15	5	40	0

$[f_{ij}] = \text{Machine}$

Step 1. Compute
 $\text{Max } \{f_{3k}, f_{4l} : k = 1, 2; l = 1, 2\} = f_{31} = f_{41} = 15.$
 Set $s^* = 1.$
 Consider two alternatives:
 (a) Place machine 1 on the left hand side of machine 3

1 — 3 — 4

(b) Place machine 1 on the right hand side of machine 4

3 — 4 — 1

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Min $\sum_{i=1}^n \sum_{j=1}^n \sum_{k=1}^n \sum_{l=1}^n f_{ik} t_{jl} x_{ij} x_{kl}$

1 — 3 — 4

$qs^*_{i^*} = q_{13} = f_{13} \cdot t_{13} + f_{14} \cdot t_{14} = f_{13} \cdot r_{13} + f_{14} \cdot r_{14}$
 $= f_{13} \cdot d_{13} + f_{14} \cdot (d_{13} + d_{34}) = 15 \cdot 4 + 15 \cdot (4 + 5) = 195.$

3 — 4 — 1

$qj^*_{s^*} = q_{41} = f_{14} \cdot t_{14} + f_{13} \cdot t_{13} = f_{14} \cdot r_{14} + f_{13} \cdot r_{13}$
 $= f_{14} \cdot d_{14} + f_{13} \cdot (d_{14} + d_{43}) = 15 \cdot 3 + 15 \cdot (3 + 5) = 165.$

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Compute (repeated from the previous slide):

1 — 3 — 4

$qs^*_{i^*} = q_{13} = f_{13} \cdot t_{13} + f_{14} \cdot t_{14} = f_{13} \cdot r_{13} + f_{14} \cdot r_{14}$
 $= f_{13} \cdot d_{13} + f_{14} \cdot (d_{13} + d_{34}) = 15 \cdot 4 + 15 \cdot (4 + 5) = 195.$

3 — 4 — 1

$qj^*_{s^*} = q_{41} = f_{14} \cdot t_{14} + f_{13} \cdot t_{13} = f_{14} \cdot r_{14} + f_{13} \cdot r_{13}$
 $= f_{14} \cdot d_{14} + f_{13} \cdot (d_{14} + d_{43}) = 15 \cdot 3 + 15 \cdot (3 + 5) = 165.$

As $q_{13} > q_{41},$
 (1) Alternative (b) (min) is selected where machine 1 is placed to the right of machine 4

3 — 4 — 1

(2) Set $j^* = 1;$
 (3) The set U is updated to $U + s^* = \{1, 3, 4\}$ and column 1 is marked with an aster.

Step 2. Since machine 2 is not included in the solution set U, go to Step 1.

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3 — 4 — 1

Machine*

	1	2	3	4
1	0	10	15	15
2	10	0	0	5
3	15	0	0	40
4	15	5	40	0

$[f_{ij}] = \text{Machine}$

Iteration 2
 Step 1. Compute $\text{Max } \{f_{3k}, f_{1l} : k = 2, l = 2\} = f_{12} = 10.$
 Set $s^* = 2.$
 Consider two alternatives:
 (a) Place machine 2 left of machine 3

2 — 3 — 4 — 1

(b) Place machine 2 right of machine 1

3 — 4 — 1 — 2

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Compute:

2 — 3 — 4 — 1

$qs^*_{i^*} = q_{23} = f_{23} \cdot t_{23} + f_{24} \cdot t_{24} + f_{21} \cdot t_{21} = f_{23} \cdot r_{23} + f_{24} \cdot r_{24} + f_{21} \cdot r_{21}$
 $= f_{23} \cdot d_{23} + f_{24} \cdot (d_{23} + d_{34}) + f_{21} \cdot (d_{23} + d_{34} + d_{41})$
 $= 0 \cdot 6 + 5 \cdot (6 + 5) + 10 \cdot (6 + 5 + 3) = 195.$

3 — 4 — 1 — 2

$qj^*_{s^*} = q_{12} = f_{21} \cdot t_{21} + f_{24} \cdot t_{24} + f_{23} \cdot t_{23} = f_{21} \cdot r_{21} + f_{24} \cdot r_{24} + f_{23} \cdot r_{23}$
 $= f_{21} \cdot d_{21} + f_{24} \cdot (d_{21} + d_{14}) + f_{23} \cdot (d_{21} + d_{14} + d_{43})$
 $= 10 \cdot 4 + 5 \cdot (4 + 3) + 0 \cdot (4 + 3 + 5) = 75.$

Since $q_{23} > q_{12},$

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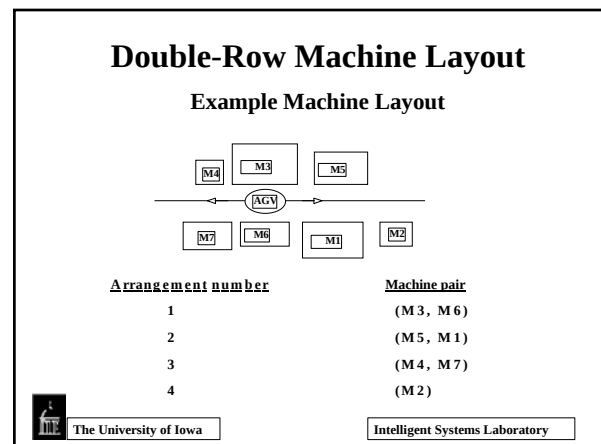
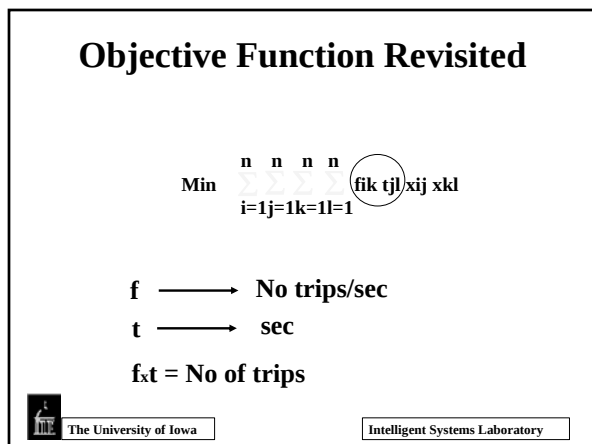
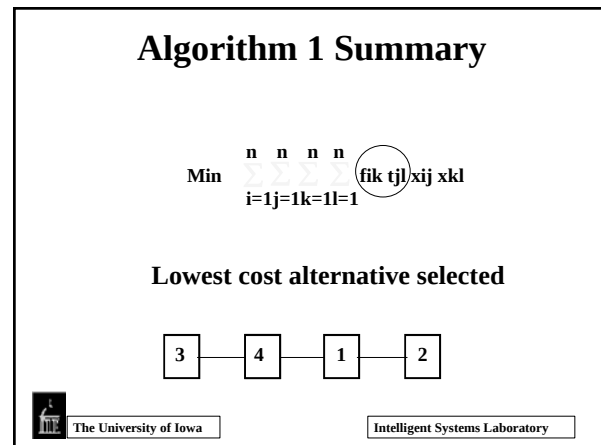
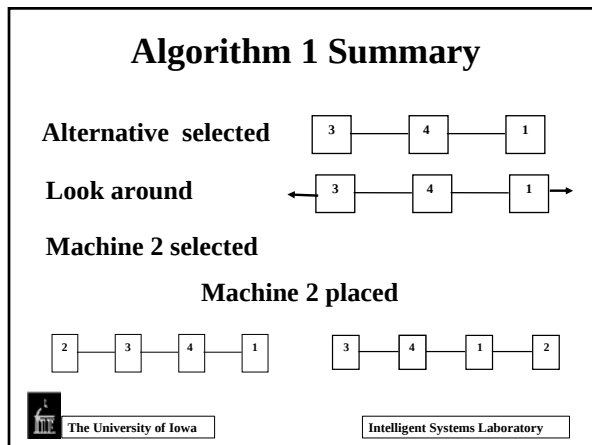
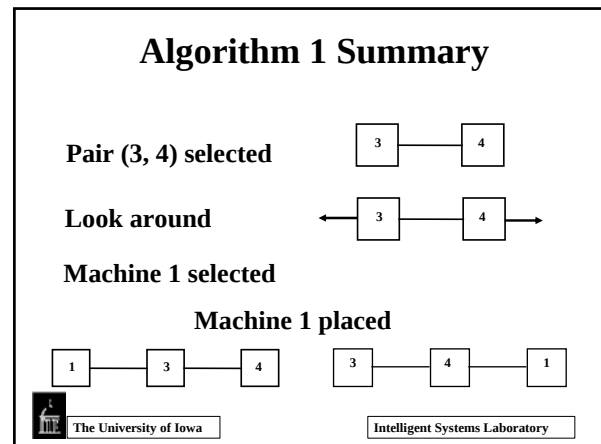
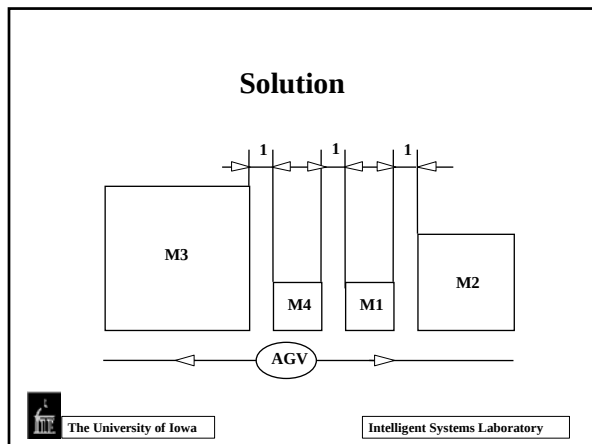
(1) Alternative (b) [min] is selected, i.e.,

3 — 4 — 1 — 2

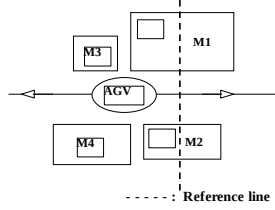
(2) Row 1 and column 1 are deleted from $[f_{ij}]$;
 (3) Set $j^* = 2;$
 (4) The solution set U is updated to $U + s^* = \{1, 2, 3, 4\}.$

Step 2. Since all machines have been included in the solution set U, stop.

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Computation of Unidirectional Distances Between Pairs of Machines



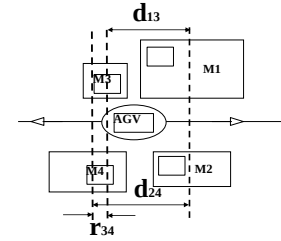
Unidirectional distances

$$\begin{aligned} r_{12} &= 0 & r_{14} &= d_{24} \\ r_{13} &= d_{13} & r_{23} &= d_{13} \\ r_{24} &= d_{24} & r_{34} &= |r_{13} - r_{24}| = |d_{13} - d_{24}| \end{aligned}$$



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$$r_{34} = |r_{24} - r_{13}| = |d_{13} - d_{24}|$$



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Algorithm 2: Double-row machine layout

- A pair of machines with the largest value of the flow is selected
- The machines selected are placed on the opposite sites of the aisle (or an AGV track)
- Other pairs of machines are placed to the left and right of the pairs selected.



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Algorithm 2

- Step 0. Set iteration number $k = 1$.
 From the flow matrix $[f_{ij}]$, compute
 $fi*j* = \text{Max} \{f_{ij} : i, j = 1, 2, \dots, m\}$.
 If there is a tie, $fi*j* = \text{Max} \{f_{ij} \cdot t_{ij} : i, j = 1, 2, \dots, m\}$.
 Place i^*, j^* on the opposite sites of the AGV path and include them in the solution.
 Set the solution set, $U = \{i^*, j^*\}$.
 Remove columns i^* and j^* of matrix $[f_{ij}]$ from further consideration.
- Step 1. Compute
 $fp*q* = \text{Max} \{fi*k, fj*l : k, l \in \{1, 2, \dots, m\} - U\}$.
 Set $s* = q^*$ and remove q^* from further consideration.
 Compute
 $fx*y* = \text{Max} \{fi*k, fj*l, fs*v : k, l, v \in \{1, 2, \dots, m\} - U - q^*\}$.
 Set $t* = y^*$ and remove y^* from further consideration.
 Consider two alternatives:
 (a) Place s^* right of i^* and t^* right of j^* .
 (b) Place t^* right of i^* and s^* right of j^* .



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Compute:

$$\begin{aligned} qi*s*j*t* &= \sum \{fs*r \cdot ts*r + ft*r \cdot tt*r : r \in U\} + fs*t* \cdot ts*t*, \\ &\text{where } s^* \text{ is placed right of } i^* \text{ and } t^* \text{ is placed right of } j^*; \\ qi*t*j*s* &= \{fs*r \cdot ts*r + ft*r \cdot tt*r : r \in U\} + fs*t* \cdot ts*t*, \\ &\text{where } t^* \text{ is placed right of } i^* \text{ and } s^* \text{ is placed right of } j^*. \end{aligned}$$

If $qi*s*j*t* < qi*t*j*s*$, select the alternative (a);
 Otherwise, select the alternative (b).
 Set $U = U + \{s^*, t^*\}$.

Step 2. If only one machine has not been assigned, go to Step 4;
 Otherwise go to Step 3.



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Step 3. Compute

$$\begin{aligned} fp*q* &= \text{Max} \{fi*k, fj*l, fs*v, ft*w : k, l, v, w \in \{1, 2, \dots, m\} - U\}. \\ \text{Set } c* &= q^* \text{ and remove } q^* \text{ from further consideration.} \end{aligned}$$

Compute

$$fx*y* = \text{max} \{fi*k, fj*l, fs*v, ft*w, fc*z : k, l, v, w, z \in \{1, 2, \dots, m\} - U - q^*\}.$$

Set $d* = y^*$ and remove y^* from further consideration.
 Consider four alternatives:

- Place c^* left of i^* and d^* left of j^* ;
- Place d^* left of i^* and c^* left of j^* ;
- Place c^* right of s^* and d^* right of t^* ;
- Place d^* right of s^* and c^* right of t^* .



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Compute:

$qc^*i^*d^*j^* = \{ fc^*r \cdot tc^*r + fd^*r \cdot td^*r: r \in U \} + fc^*d^* \cdot tc^*d^*$,
where c^* is placed left of i^* and d^* is placed left of j^* ;

$qd^*i^*c^*j^* = \sum \{ fc^*r \cdot tc^*r + fd^*r \cdot td^*r: r \in U \} + fc^*d^* \cdot tc^*d^*$,
where d^* is placed left of i^* and c^* is placed left of j^* ;

$qs^*c^*t^*d^* = \sum \{ fc^*r \cdot tc^*r + fd^*r \cdot td^*r: r \in U \} + fc^*d^* \cdot tc^*d^*$,
where c^* is placed right of s^* and d^* is placed right of t^* ;

$qs^*d^*t^*c^* = \sum \{ fc^*r \cdot tc^*r + fd^*r \cdot td^*r: r \in U \} + fc^*d^* \cdot tc^*d^*$,
where d^* is placed right of s^* and c^* is placed right of t^* .



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If $qc^*i^*d^*j^* = \min \{ qc^*i^*d^*j^*, qd^*i^*c^*j^*, qs^*c^*t^*d^*, qs^*d^*t^*c^* \}$,
(1) Select alternative (a);

(2) Set $i^* = c^*$ and $j^* = d^*$.

If $qd^*i^*c^*j^* = \min \{ qc^*i^*d^*j^*, qd^*i^*c^*j^*, qs^*c^*t^*d^*, qs^*d^*t^*c^* \}$,
(1) Select alternative (b);

(2) Set $i^* = d^*$ and $j^* = c^*$.

If $qs^*c^*t^*d^* = \min \{ qc^*i^*d^*j^*, qd^*i^*c^*j^*, qs^*c^*t^*d^*, qs^*d^*t^*c^* \}$,
(1) Select alternative (c);

(2) Set $s^* = c^*$ and $t^* = d^*$.

If $qs^*d^*t^*c^* = \min \{ qc^*i^*d^*j^*, qd^*i^*c^*j^*, qs^*c^*t^*d^*, qs^*d^*t^*c^* \}$,
(1) Select alternative (d);

(2) Set $s^* = d^*$ and $t^* = c^*$.

Set $U = U + \{ c^*, d^* \}$.

Go to Step 5.



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Step 4. Set c^* to the last machine which has not been assigned.

Consider four alternatives:

- Place c^* left of i^* ;
- Place c^* left of j^* ;
- Place c^* right of s^* ;
- Place c^* right of t^* .

Compute:

$qc^*i^* = \sum \{ fc^*r \cdot tc^*r: r \in U \}$,
where c^* is placed left of i^* ;

$qc^*j^* = \sum \{ fc^*r \cdot tc^*r: r \in U \}$,
where c^* is placed left of j^* ;

$qs^*c^* = \sum \{ fc^*r \cdot tc^*r: r \in U \}$,
where c^* is placed right of s^* ;

$qt^*c^* = \sum \{ fc^*r \cdot tc^*r: r \in U \}$,
where c^* is placed right of t^* .



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If $qc^*i^* = \min \{ qc^*i^*, qc^*j^*, qs^*c^*, qt^*c^* \}$,
select alternative (a);

If $qc^*j^* = \min \{ qc^*i^*, qc^*j^*, qs^*c^*, qt^*c^* \}$,
select alternative (b);

If $qs^*c^* = \min \{ qc^*i^*, qc^*j^*, qs^*c^*, qt^*c^* \}$,
select alternative (c);

If $qt^*c^* = \min \{ qc^*i^*, qc^*j^*, qs^*c^*, qt^*c^* \}$,
select alternative (d).

Set $U = U + \{ c^* \}$.

Go to Step 5.

Step 5. Set iteration number $k = k + 1$.

Repeat Steps 2 through 4 until the final solution is obtained

(i.e., all the machines are included in the solution set U).



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Example

Frequency of trips

	Machine				
	1	2	3	4	5
1	0	5	1	4	1
2	5	0	3	0	2
3	1	3	0	0	0
4	4	0	0	0	5
5	1	2	0	5	0

$[f_{ij}] = \text{Machine}$

Clearances

	Machine				
	1	2	3	4	5
1	0	1	1	1	2
2	1	0	1	1	1
3	1	1	0	1	1
4	1	1	1	0	3
5	2	1	1	3	0

$[c_{ij}] = \text{Machine}$

Machine Dimensions

Machine Number	Machine Dimension
1	50x30
2	20x20
3	25x20
4	60x35
5	30x15



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Distances

Distance d_{ij} is calculated from machine dimensions and clearance

		Machine					Machine Dimensions	
		1	2	3	4	5	Machine Number	Machine Dimension
$[d_{ij}] = \text{Machine}$	1	0	36	38.5	56	42	1	50x30
	2	36	0	23.5	41	26	2	20x20
	3	38.5	23.5	0	43.5	28.5	3	25x20
	4	56	41	43.5	0	48	4	60x35
	5	42	26	28.5	48	0	5	30x15

Based on d_{ij} , r_{ij} is computed in the algorithm

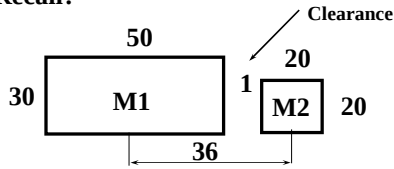
Assume $t_{ij} = r_{ij}$



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Recall?



Adjacent distance $d_{12} = 25 + 10 + 1 = 36$
Unidirectional distance $r_{12} = d_{12} = 36$



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Example

	Machine				
	1	2	3	4	5
$[f_{ij}] = \text{Machine}$	1	0	5	1	4
	2	5	0	3	0
	3	1	3	0	0
	4	4	0	0	0
	5	1	2	0	5

Iteration 1

Step 0. For the flow matrix above, compute

$\max \{f_{ij} : i, j = 1, 2, \dots, 5\} = f_{12} = f_{45} = 5$ is determined.

The flow value f_{45} is selected because $f_{45} \cdot t_{45} =$

$f_{45} \cdot d_{45} = 5 \cdot 48 = 240 > f_{12} \cdot t_{12} = f_{12} \cdot d_{12} = 5 \cdot 36 = 180$.

Thus $i^* = 4$ and $j^* = 5$.

Machines 4 and 5 are assigned to the opposite sites of the AGV path and are included in the solution.



The solution set is updated, $U = \{4, 5\}$. Exclude columns 4 and 5 from further consideration.

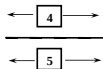


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	Machine *				
	1	2	3	4	5
$[f_{ij}] = \text{Machine}$	1	0	5	1	4
	2	5	0	3	0
	3	1	3	0	0
	4	4	0	0	5
	5	1	2	0	5

Max Flow

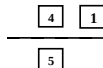


Step 1. Compute

$\max \{f_{4k}, f_{5l} : k, l = 1, 2, 3\} = f_{41}$.

Set $s^* = 1$ and exclude column 1 from further consideration.

	Machine *			
	1	2	3	4
$[f_{ij}] = \text{Machine}$	1	0	5	1
	2	5	0	3
	3	1	3	0
	4	4	0	0
	5	1	2	0



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Compute:

$\max \{f_{5l}, f_{1v} : l, v = 2, 3\} = f_{12}$.

Set $t^* = 2$ and exclude column 2 from further consideration.

	Machine *			
	1	2	3	4
$[f_{ij}] = \text{Machine}$	1	0	5	1
	2	5	0	3
	3	1	3	0
	4	4	0	0
	5	1	2	0

Consider two alternatives:

(a) Place machine 1 right of machine 4 and machine 2 right of machine 5

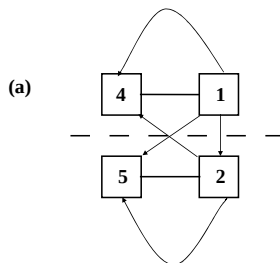
(b) Place machine 2 right of machine 4 and machine 1 right of machine 5



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Distance Pattern



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Compute:

	Machine				
	1	2	3	4	5
$[f_{ij}] = \text{Machine}$	1	0	5	1	4
	2	5	0	3	0
	3	1	3	0	0
	4	4	0	0	5
	5	1	2	0	5

	Machine				
	1	2	3	4	5
$[d_{ij}] = \text{Machine}$	1	0	36	38.5	56
	2	36	0	23.5	41
	3	38.5	23.5	0	43.5
	4	56	41	43.5	0
	5	42	1	28.5	48

$t_{ij} = r_{ij}$

$qs^*i^*t^*j^* = q_{4152} = f_{14} \cdot t_{14} + f_{15} \cdot t_{15} + f_{24} \cdot t_{24} + f_{25} \cdot t_{25} + f_{12} \cdot t_{12}$
 $= f_{14} \cdot r_{14} + f_{15} \cdot r_{15} + f_{24} \cdot r_{24} + f_{25} \cdot r_{25} + f_{12} \cdot r_{12} = f_{14} \cdot d_{14} + f_{15} \cdot d_{15} + f_{24} \cdot d_{24} + f_{25} \cdot d_{25} + f_{12} \cdot d_{12} = 4 \cdot 56 + 1 \cdot 56 + 0 \cdot 26 + 2 \cdot 26 + 5 \cdot 30 = 482$.



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(b)

$$q_s^* j^* t^* i^* = q_{4251} = f_{24} \cdot t_{24} + f_{25} \cdot t_{25} + f_{14} \cdot t_{14} + f_{15} \cdot t_{15} + f_{12} \cdot t_{12} \\ = f_{24} \cdot r_{24} + f_{25} \cdot r_{25} + f_{14} \cdot r_{14} + f_{15} \cdot r_{15} + f_{12} \cdot r_{12} = f_{24} \cdot d_{24} + f_{25} \cdot d_{24} \\ + f_{14} \cdot d_{15} + f_{15} \cdot d_{15} + f_{12} \cdot |d_{24} - d_{15}| = 0 \cdot 41 + 2 \cdot 41 + 4 \cdot 42 + 1 \cdot 42 \\ + 5 \cdot |41 - 42| = 297.$$

Since $q_{4251} < q_{4152}$, alternative (b) is selected.
Set $U = U + \{1, 2\}$.

Step 2. Since only machine 3 has not been assigned, go to Step 4.

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Step 4. Set $c^* = 3$.

$[f_{ij}] = \text{Machine}$

	1	2	3	4	5
1	0	5	1	4	1
2	5	0	3	0	2
3	1	3	0	0	0
4	4	0	0	0	5
5	1	2	0	5	0

Consider four alternatives:

(a) Place machine 3 left of machine 4 (b) Place machine 3 left of machine 5

(c) Place machine 3 right of machine 2 (d) Place machine 3 right of machine 1

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Compute

(a)

$$q_c^* i^* = q_{34} = f_{34} \cdot t_{34} + f_{35} \cdot t_{35} + f_{32} \cdot t_{32} + f_{31} \cdot t_{31} = f_{34} \cdot r_{34} + f_{35} \cdot r_{35} \\ + f_{32} \cdot r_{32} + f_{31} \cdot r_{31} = f_{34} \cdot d_{34} + f_{35} \cdot d_{34} + f_{32} \cdot (d_{34} + d_{42}) + f_{31} \cdot (d_{34} + d_{51}) \\ = 0 \cdot 43.5 + 0 \cdot 43.5 + 3 \cdot (43.5 + 41) + 1 \cdot (43.5 + 42) = 109.5 \cdot 1 + 67 \cdot 3 = 339.$$

(b)

$$q_c^* j^* = q_{35} = f_{35} \cdot t_{35} + f_{34} \cdot t_{34} + f_{32} \cdot t_{32} + f_{31} \cdot t_{31} = f_{35} \cdot r_{35} + f_{34} \cdot r_{34} \\ + f_{32} \cdot r_{32} + f_{31} \cdot r_{31} = f_{35} \cdot d_{35} + f_{34} \cdot d_{35} + f_{32} \cdot (d_{35} + d_{42}) + f_{31} \cdot (d_{35} + d_{51}) \\ = 0 \cdot 28.5 + 0 \cdot 28.5 + 3 \cdot (28.5 + 41) + 1 \cdot (28.5 + 42) = 279.$$

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Compute (continued)

(c)

$$q_s^* c^* = q_{23} = f_{32} \cdot t_{32} + f_{31} \cdot t_{31} + f_{34} \cdot t_{34} + f_{35} \cdot t_{35} = f_{32} \cdot r_{32} + f_{31} \cdot r_{31} \\ + f_{34} \cdot r_{34} + f_{35} \cdot r_{35} = f_{32} \cdot d_{32} + f_{31} \cdot d_{32} + f_{34} \cdot (d_{32} + d_{24}) + f_{35} \cdot (d_{32} + d_{15}) \\ = 3 \cdot 23.5 + 1 \cdot 23.5 + 0 \cdot (23.5 + 41) + 0 \cdot (23.5 + 42) = 94.$$

(d)

$$q_t^* c^* = q_{13} = f_{31} \cdot t_{31} + f_{32} \cdot t_{32} + f_{34} \cdot t_{34} + f_{35} \cdot t_{35} = f_{31} \cdot r_{31} + f_{32} \cdot r_{32} \\ + f_{34} \cdot r_{34} + f_{35} \cdot r_{35} = f_{31} \cdot d_{31} + f_{32} \cdot d_{31} + f_{34} \cdot (d_{31} + d_{24}) + f_{35} \cdot (d_{31} + d_{15}) \\ = 1 \cdot 38.5 + 3 \cdot 38.5 + 0 \cdot (38.5 + 41) + 0 \cdot (38.5 + 42) = 154.$$

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Since $q_{23} = \min \{q_{34}, q_{35}, q_{23}, q_{13}\}$, alternative (c) is selected

Best solution

Set $U = U + \{3\}$.

Step 5. Since all machines have been included in the set U, stop.

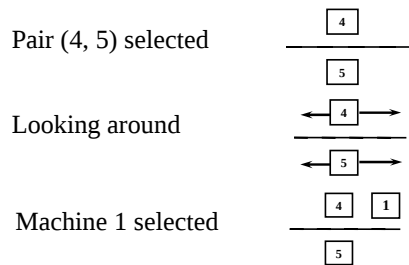
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Solution

Reference line

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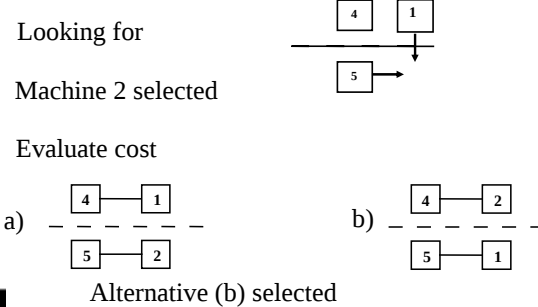
Algorithm 2 Summary



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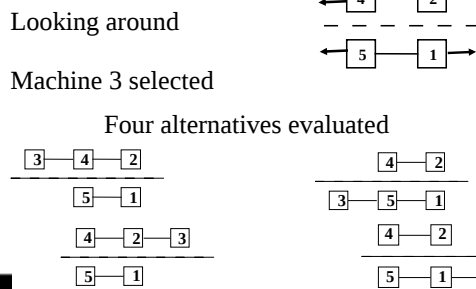
Algorithm 2 Summary



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Algorithm 2 Summary



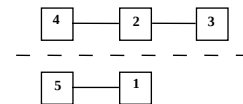
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Algorithm 2 Summary

Lowest cost alternative selected

Best solution



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MULTIROW FACILITY AND MACHINE LAYOUT

Quadratic Assignment Model

n = number of facilities and their locations
 a_{ij} = cost of locating and operating facility i at location j
 f_{ik} = flow of material between facility i and facility k
 c_{jl} = cost per unit flow of material between location j and location l .

$x_{ij} = \begin{cases} 1 & \text{if facility } i \text{ is at location } j \\ 0 & \text{otherwise} \end{cases}$



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$$\text{Min} \sum_{i=1}^n \sum_{j=1}^n \sum_{k=1}^n \sum_{l=1}^n f_{ik} c_{jl} x_{ij} x_{kl} + \sum_{i=1}^n a_{ij} x_{ij}$$

subject to:

$$\sum_{j=1}^n x_{ij} = 1 \quad i = 1, \dots, n$$

$$\sum_{i=1}^n x_{ij} = 1 \quad j = 1, \dots, n$$

$$x_{ij} = 0 \text{ or } 1 \quad i = 1, \dots, n, j = 1, \dots, n$$



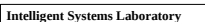
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MULTIROW FACILITY(MACHINE) LAYOUT

CRAFT Algorithm

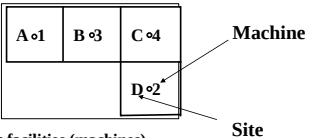
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MULTIROW FACILITY(MACHINE) LAYOUT

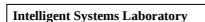
Example

Determine the layout of four facilities (machines) 1, 2, 3, and 4 at sites A, B, C, and D

Location of Four Facilities (Machines) at Four Sites



1, 2, 3, 4 = facilities (machines)
A, B, C, D = sites (beacons)
• = site center

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Flow Matrix (between facilities (machines))

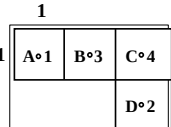
Assumptions:

- Symmetric flow matrix
- Square facilities

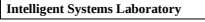
$$[f_{ij}] = \begin{bmatrix} 1 & 2 & 3 & 4 \\ 1 & - & 50 & 20 & 100 \\ 2 & 50 & - & 30 & 10 \\ 3 & 20 & 30 & - & 70 \\ 4 & 100 & 10 & 70 & - \end{bmatrix}$$

Potential problem?

Matrix of Rectilinear Distances (between sites)



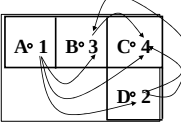
$$[d_{ij}] = \begin{bmatrix} A & B & C & D \\ A & - & 1 & 2 & 3 \\ B & 1 & - & 1 & 2 \\ C & 2 & 1 & - & 1 \\ D & 3 & 2 & 1 & - \end{bmatrix}$$

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CRAFT Algorithm

Begin with an initial assignment

Cost 510 $A \cdot 1 \ B \cdot 3 \ C \cdot 4 \ D \cdot 2 =$



$$[f_{ij}] = \begin{bmatrix} 1 & 2 & 3 & 4 \\ 1 & - & 50 & 20 & 100 \\ 2 & 50 & - & 30 & 10 \\ 3 & 20 & 30 & - & 70 \\ 4 & 100 & 10 & 70 & - \end{bmatrix}$$

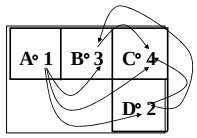
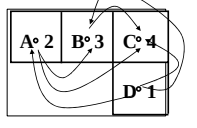
$$[d_{ij}] = \begin{bmatrix} A & B & C & D \\ A & - & 1 & 2 & 3 \\ B & 1 & - & 1 & 2 \\ C & 2 & 1 & - & 1 \\ D & 3 & 2 & 1 & - \end{bmatrix}$$

COST =
 $= f_{12}d_{AD} + f_{13}d_{AB} + f_{14}d_{AC} + f_{23}d_{DB} + f_{24}d_{DC} + f_{34}d_{BC}$
 $= 50 \cdot 3 + 20 \cdot 1 + 100 \cdot 2 + 30 \cdot 2 + 10 \cdot 1 + 70 \cdot 1 = 510.$

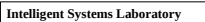
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Pairwise Exchanges

First exchange: Machines (1, 2)

Cost = $f_{12}d_{AD} + f_{13}d_{BD} + f_{14}d_{CD} + f_{23}d_{AB} + f_{24}d_{AC} + f_{34}d_{BC}$
 $= 50 \cdot 3 + 20 \cdot 2 + 100 \cdot 1 + 30 \cdot 1 + 10 \cdot 2 + 70 \cdot 1 = 410.$

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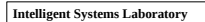
Cost computation

Cost 510 $A \cdot 1 \ B \cdot 3 \ C \cdot 4 \ D \cdot 2$

Exchange facilities (machines) 1 and 2

Cost = 410 $A \cdot 2 \ B \cdot 3 \ C \cdot 4 \ D \cdot 1$

The cost change is then $410 - 510 = -100.$

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The Result

All pairs exchanged

Exchanged Pair	(1, 2)	(1, 3)	(1, 4)	(2, 3)	(2, 4)	(3, 4)
Cost Change	-100	-50	-80	-60	90	-100

A° 2	B° 3	C° 4
		D° 1

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Cost 410

$A \cdot 2 \ B \cdot 3 \ C \cdot 4$

$D \cdot 1$

Exchange Pair	(1,2)	(1,3)	(1,4)	(2,3)	(2,4)	(3,4)
Cost Change	100	-40	10	30	100	100

Solution with facilities (machines) 1 and 3 exchanged is selected

Cost 370

$A \cdot 2 \ B \cdot 1 \ C \cdot 4$

$D \cdot 3$

Exchange Pair	(1,2)	(1,3)	(1,4)	(2,3)	(2,4)	(3,4)
Cost Change	80	40	90	90	40	60

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Best solution

Final Solution

Cost 370

$A \cdot 2 \ B \cdot 1 \ C \cdot 4$

$D \cdot 3$

A° 2	B° 1	C° 4
		D° 3

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Machine Relationship Constraints

1
2
3
4

This "box" shows the relationship between machine (facility) 1 and 3

Top half shows importance of relationship

Lower half shows reason(s) of importance

"Closeness" ratings

Rating	Closeness
A	Absolutely Necessary
E	Especially Important
I	Important
O	Ordinary Closeness
U	Unimportant
X	Not desirable

Code	Reason
1	Personal contact
2	Convenience
3	Noise, Disturbance
4	Light

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EXAMPLE: Flow data and relationship constraints

To \ From	1	2	3	4	5
1		1500 E	100 O	-	800 I
2	-		1200 E	200 O	-
3	-	-		100 O	-
4	-	-	50 O		2500 A
5	-	-	-	-	

"Closeness" rating

Rating	Closeness
A	Absolutely Necessary
E	Especially Important
I	Important
O	Ordinary Closeness
U	Unimportant
X	Not desirable

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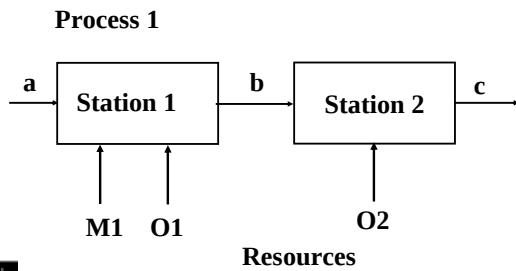
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Process Layout: Medical Application

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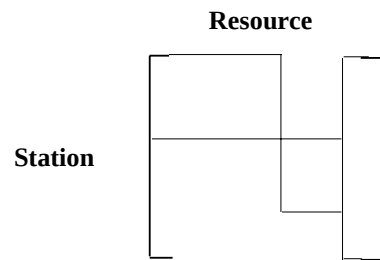
Data Collection



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Possible Groupings

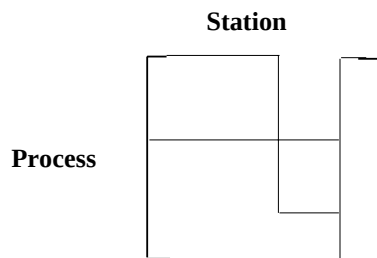


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Note: Precedences are ignored in this matrix

Possible Groupings

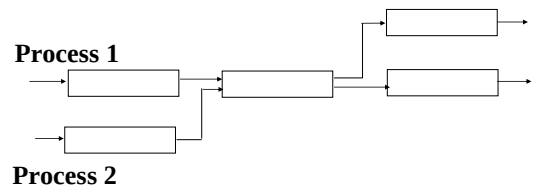


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System Layout

Based on the process-station grouping



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