



# Vehicle Routing and Scheduling in a Supply Chain Network

Jaime Cerdá - Carlos A. Méndez

Instituto de Desarrollo Tecnológico para la Industria Química (INTEC)  
Universidad Nacional de Litoral (UNL) – CONICET  
Güemes 3450, 3000 Santa Fe, Argentina  
jcerda@intec.unl.edu.ar - [cmendez@intec.unl.edu.ar](mailto:cmendez@intec.unl.edu.ar)

<http://www.intec.ceride.gov.ar/es/investigacion/estructura/grupos/110/datos.html>

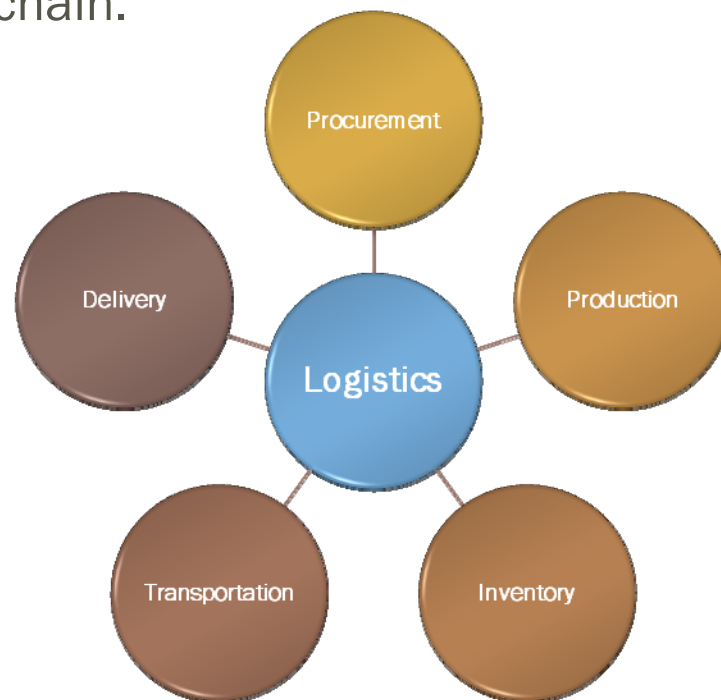
- ❑ The distribution function
- ❑ Transportation modes and costs
- ❑ Distribution network design and planning
- ❑ Review of important routing and scheduling problems (TSP, VRP, PDP)
- ❑ The PDP with transshipment (PDPT)
- ❑ The VRP in multi-echelon networks with crossdocking
- ❑ Conclusions

# WHAT IS LOGISTICS ?

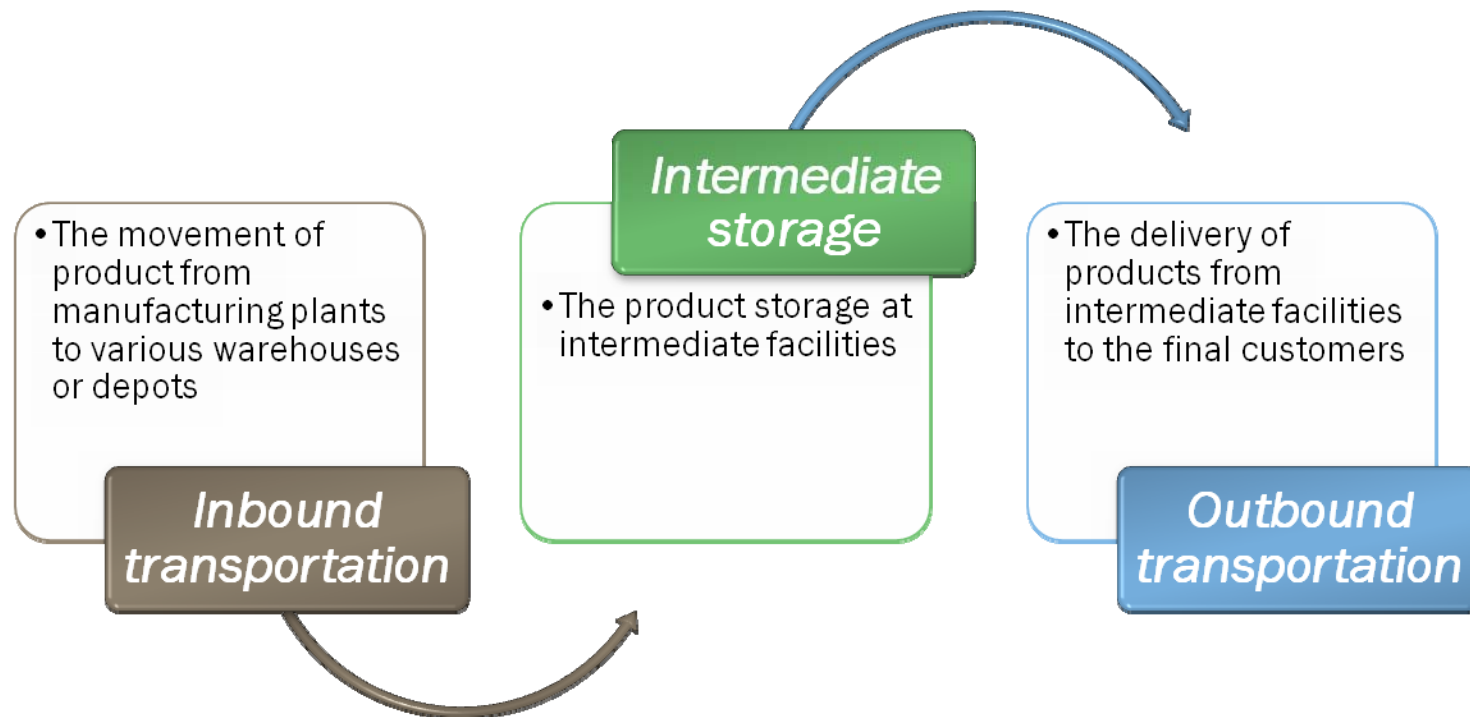
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- ❑ **Logistics function:** provision of goods and services from supply points to demand points.
- ❑ It involves the management of a wide range of **business operations:** acquisition, production, storage, transportation and delivery of goods along the supply chain.



- It comprises all movements and storage of goods “downstream” from the manufacturing plants.



# THE ROLE OF TRANSPORTATION

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- ❑ Transportation play a key role because **products are rarely produced and consumed at the same location.**
- ❑ The last transportation step from distribution centers to customers (i.e. the outbound transportation), is usually **the most costly link of the distribution chain.**
- ❑ Distribution costs accounts for about **16% of the sale value of an item; approximately one fourth** is due to the outbound transportation.

# KEY PLAYERS IN TRANSPORTATION



- There are **two key players** in any transportation that takes place within a supply chain:

## THE SHIPPER

- ✓ It is the party requiring the movement of products between two points in the supply chain.
- ✓ He seeks to minimize the total cost, while providing an appropriate level of responsiveness to the customer.

## THE CARRIER

- ✓ It is the party that moves the products.
- ✓ He makes operating decisions trying to maximize the return from its assets

- For example, DELL uses UPS as the carrier to ship its computers from the factory to the customer.

## □ Types of transportation costs

<b><i>Vehicle-related cost</i></b>	It is the cost a carrier incurs for the purchase or lease of the vehicle used to transport goods.
<b><i>Fixed operating cost</i></b>	It includes the cost associated with terminals, airport gates that are incurred whether the vehicles are used or not.
<b><i>Trip-related variable cost</i></b>	This cost is incurred each time a vehicle leaves on a trip and includes the price of labour and fuel.
<b><i>Quantity related cost</i></b>	This category includes loading and unloading costs and a portion of the fuel cost that varies with the quantity being transported.
<b><i>Overhead cost</i></b>	It includes the cost of planning and scheduling a transportation network as well as any investment in information technology.

# MODES OF TRANSPORTATION

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□ Listed by decreasing freight market share, the modes of transportation include:

- **TRUCK**
  - TRUCKLOAD (TL)
  - LESS THAN TRUCKLOAD (LTL)
- **WATER**
- **RAIL**
- **AIR**
- **PIPELINE**

or a combination of them,

- **INTERMODAL TRANSPORTATION**





# TRUCK

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- ❑ Dominant mode of transportation in USA
- ❑ Two major segments:
  - **full truckload (TL):** charge for the full truck, and rates vary with the distance travelled.
  - **less-than truckload (LTL):** charge based on the quantity loaded and the distance travelled.
- ❑ Trucking is more expensive than rail but offers the advantage of :
  - door-to-door shipment
  - shorter delivery time
  - no transfer between pickup and delivery points



# OTHERS MODES OF TRANSPORTATION

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## Rail



- High fixed cost in terms of rails, locomotives, cars, and yards
- Large, heavy, low-value shipments that are not very time-sensitive over long distances

## Water



- Global Trade
- Very large loads
- Low costs
- Delays at ports and terminal

## Air



- Very fast and fairly expensive
- Small, high-value items or time-sensitive emergency shipments

## Pipeline



- Crude petroleum, refined petroleum products, and natural gas

- **Response Time (RT).** The time between the placement and the delivery of a customer order.
  - Location of warehouses closer to the market reduce RT.
  - *Trade-off between response time and inventory costs.* A decrease of RT produces an increase of both the number and cost of facilities, and the inventory costs.
  - Major issue to solve the trade-off: *Degree of inventory aggregation*

## □ Transportation costs

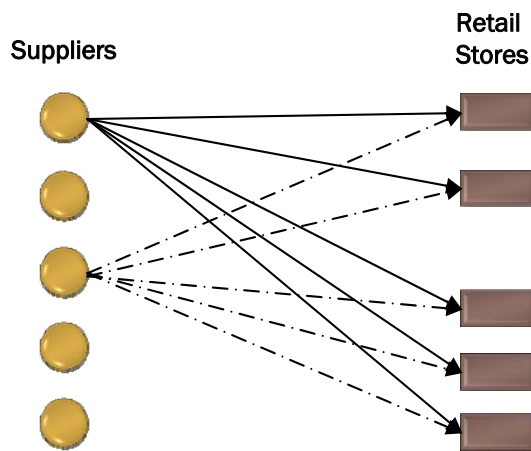
- A higher number of warehouses lowers average distance to customers and outbound transportation costs.
- Warehousing allows **consolidation of shipments** from multiple suppliers in the same truck, to get lower inbound costs.
- Product customization at the delivery stage is postponed until receiving customer orders at the warehouse.
- *Major issues:* **Consolidation of inbound shipments and temporal order aggregation** (frequency of visits vs. full truckload) at the delivery stage.
- **Trade-off between customer service level and outbound transportation costs.**

- **Product Availability (PA).** It is the probability of having the requested product in stock when an order arrives.
  - **Direct shipping centralizes inventories** at the manufacturer site, and guarantees a high level of PA with lower amounts of inventories.
  - **Warehousing disaggregates inventories at intermediate facilities**, to lower response time and transportation costs, but decreasing the product availability.
  - For products with low/uncertain demand, or high-value products, all inventories are better aggregated at the manufacturer storage.
  - For low value, high-demand products, all inventories are better disaggregated and hold close to the customers.

- ❑ A well-designed transportation network allows a supply chain to achieve the desired degree of responsiveness at a low cost.
- ❑ According to the **number of stocking levels**, transportation network designs can be classified into two categories:
  1. **Single-echelon networks:** Goods are directly shipped from suppliers to retail stores or customers.
  2. **Multi-echelon networks:** Goods are shipped from suppliers to retail stores via intermediate stocking points

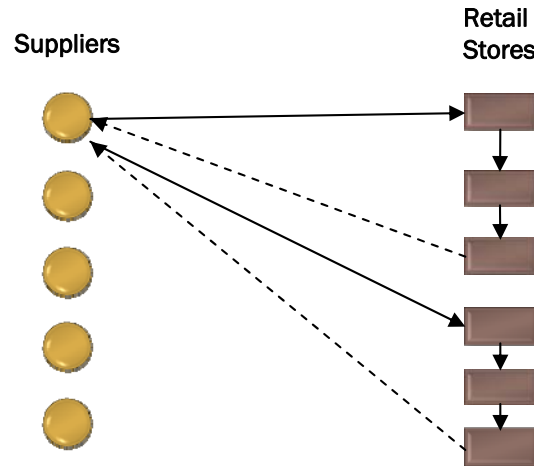
# SINGLE-ECHELON TRANSPORTATION NETWORKS

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Direct shipping network

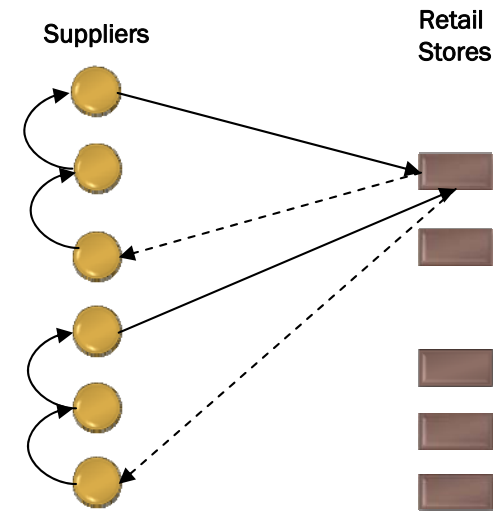
All shipments come directly from suppliers to retail stores



Direct shipping with milk runs (A)

A truck converging products from a supplier to multiple retail stores

Consolidation of shipments from a supplier to different destinations



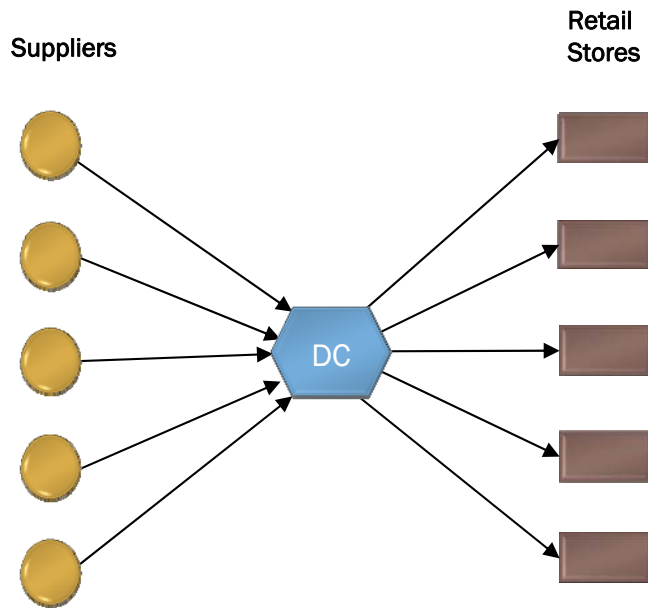
Direct shipping with milk runs (B)

A truck converging products to a retail store from multiple suppliers

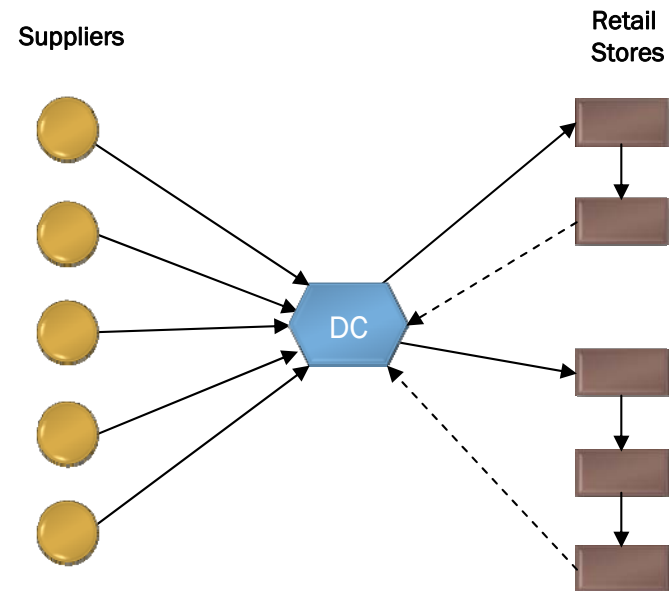
Consolidation of shipments to a retail store from different suppliers

# MULTI-ECHELON TRANSPORTATION NETWORKS

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All shipments via a central DC



All shipments via distribution center using milk runs



- ❑ **Consolidation** operations combine shipments from different suppliers and destined for multiple customers in the same truck.
- ❑ **Break-bulk** operations split a large shipment from various origins into multiple, smaller shipments.
- ❑ **Cross-docking** operations consist of performing break-bulk operations over ingoing, consolidated shipments right after their arrival at the intermediate facility, and immediately dispatching the customized parcels to their destinations.

- ❑ **Distribution management** involves a variety of decision-making problems at **three levels**: *strategic, tactical, and operational planning*.
- ❑ **Strategic decisions** deal with the distribution network design, including the number, location and size of facilities.
- ❑ **Tactical decisions** include: a) the area served by each depot; b) the fleet size and composition; c) inventory decisions at each facility; d) customer service levels.
- ❑ **Operational decisions** are concerned with the routing and scheduling of vehicles on a day-to-day basis.

# VEHICLE ROUTING AND SCHEDULING PROBLEMS

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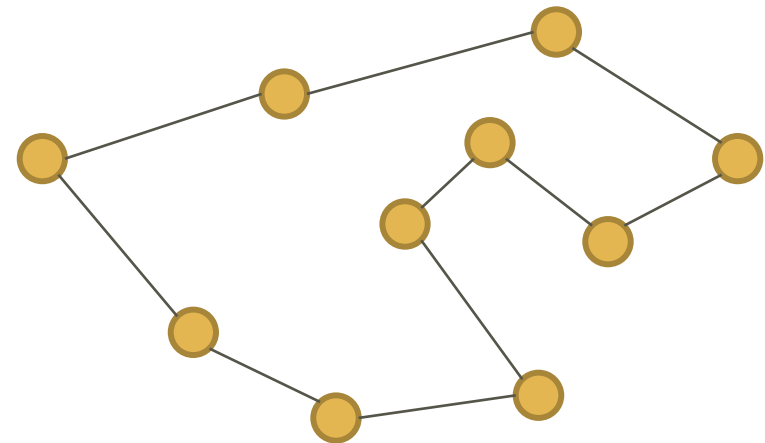
<b>TSP</b>	Travelling salesman problem
<b>MTSP</b>	M-travelling salesman problem
<b>VRP/VRPTW</b>	Single depot, multi-vehicle, node routing problem without or with time windows
<b>m-VRPTW</b>	Multi-depot, multi-vehicle, node routing problem with time windows
<b>PDPTW</b>	Pickup and delivery problem with time windows
<b>PDPT</b>	Pickup and delivery problem with transshipment
<b>VRP-SCM</b>	Vehicle routing and scheduling problem in a multi-echelon supply chain
<b>VRPCD-SCM</b>	Vehicle routing and scheduling problem with crossdocking in a multi-echelon supply chain

# TRAVELLING SALESMAN PROBLEM (TSP)

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- Given a set of cities and the distances between them, determine the shortest path starting from a given city, passing through all the other cities and returning to the first town.
- It can be modeled as an undirected weighted graph, at which cities are the vertices, and paths are the edges.



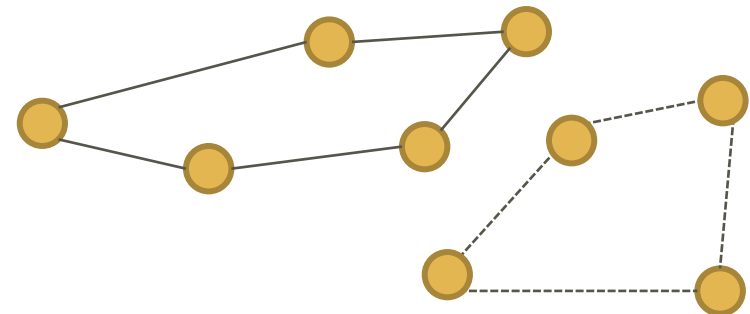
# MULTIPLE TRAVELING SALESMAN PROBLEM (m-TSP)

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- It is a **generalization of the travelling salesman problem** where there is a need to account for more than one salesman.
- Given a set of cities and a set of salesmen, find the set of routes for the salesmen with a minimum total length so that:
  - each salesman travels to a unique set of cities and completes the route by returning to the starting city
  - each city is visited by exactly one salesman.



## 1. Model-based exact approaches

- There is a single incident arc to each node.
- There is a single leaving arc from each node.
- Sub-tour elimination constraints guarantee that the cycle passes through all the cities and ends at the starting city.
- The problem variables  $x_{ij}$  indicate whether an arc connecting nodes  $i$  and  $j$  is or is not in the selected tour (direct predecessor).

# TSP OPTIMAL APPROACH

## Variables

$$x_{ij} = \begin{cases} 1, & \text{if arc}(i, j) \text{ is in the tour} \\ 0, & \text{otherwise} \end{cases}$$

$c_{ij}$  = cost of the route (i, j)

$$c_{ij} = c_{ji} \quad ; \quad c_{ii} = +\infty$$

## Constraints

(R1) Each node has exactly a single incident arc

$$\sum_{i=1}^n x_{ij} = 1, \quad j = 1, 2, \dots, n$$

(R2) Each node has exactly a single leaving arc

$$\sum_{j=1}^n x_{ij} = 1, \quad i = 1, 2, \dots, n$$

(R3)

$$x_{ij} = 0, 1 \quad ; \quad x = (x_{ij}) \in S$$

(Objective function)

$$\text{Min } Z = \sum_{i=1}^n \sum_{j=1}^n c_{ij} x_{ij}$$

The set  $S$  can be any restrictions that prohibit sub-tour solutions satisfying the assignment constraints (subtour-breaking constraints)

$$\sum_{i \in Q} \sum_{j \notin Q} x_{ij} \geq 1, \text{ for any subset } Q \text{ of } N$$

$$\sum_{j=1}^n y_{ij} - \sum_{j=1}^n y_{ji} = -1 \quad (i = 2, \dots, n)$$

$$y_{ij} \leq U x_{ij}$$

$$y_{ij} \geq 0$$

# m-TSP FORMULATION

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(OF)

$$\text{Min } z = \sum_{i=1}^n \sum_{j=1}^n c_{ij} x_{ij}$$

subject to:

$$(R1) \quad \sum_{i=1}^n x_{ij} = b_j = \begin{cases} M, & \text{if } j = 1 \\ 1, & \text{if } j = 2, 3, \dots, n \end{cases}$$

$$(R2) \quad \sum_{j=1}^n x_{ij} = a_i = \begin{cases} M, & \text{if } i = 1 \\ 1, & \text{if } i = 2, 3, \dots, n \end{cases}$$

$$(R3) \quad X = (x_{ij}) \in S$$

$$(R4) \quad x_{ij} = 0, 1 ; i, j = 1 \dots n$$



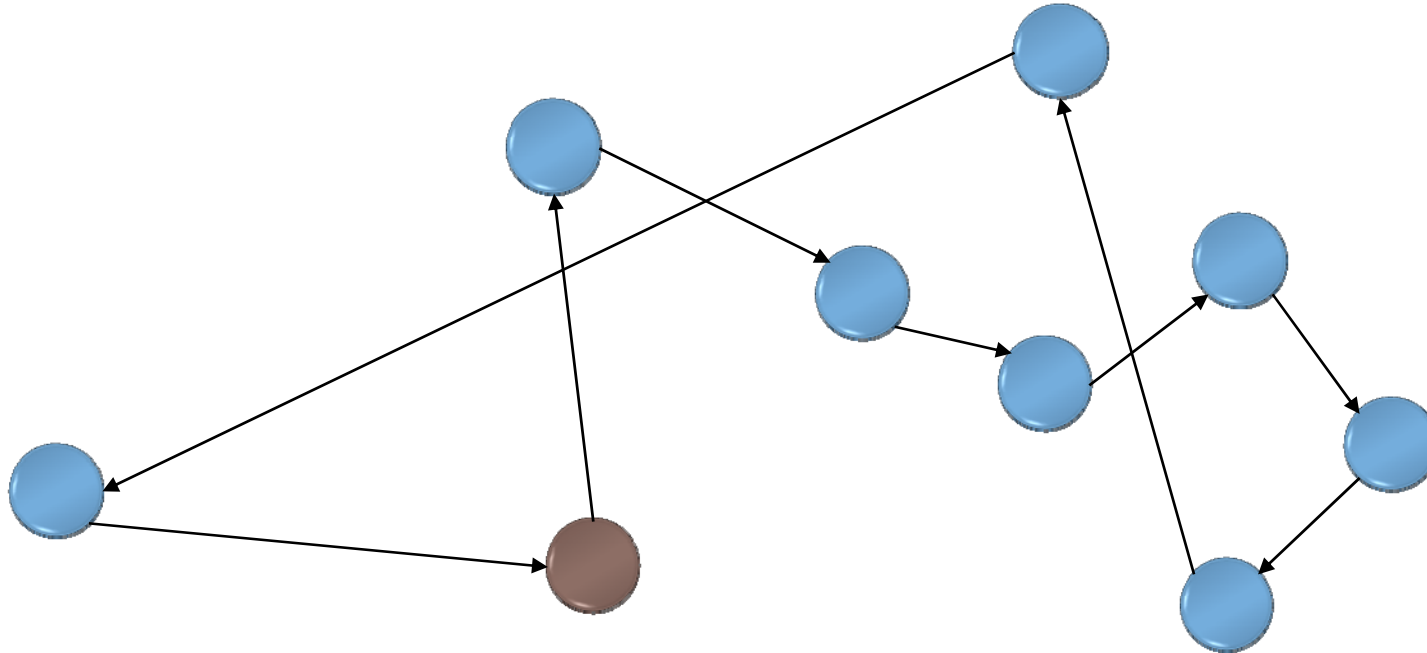
1. **Tour construction procedures.** Generate a feasible tour from the distance and saving matrices.
2. **Tour improvement procedures.** Find a better tour assuming that an initial tour is given, and perform arc/node exchanges between routes.
3. **Composite procedures.** Construct a starting tour using a tour construction procedure and find a better tour using a tour improvement procedure.

# TOUR CONSTRUCTION PROCEDURES FOR THE TSP

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## □ Nearest neighbour



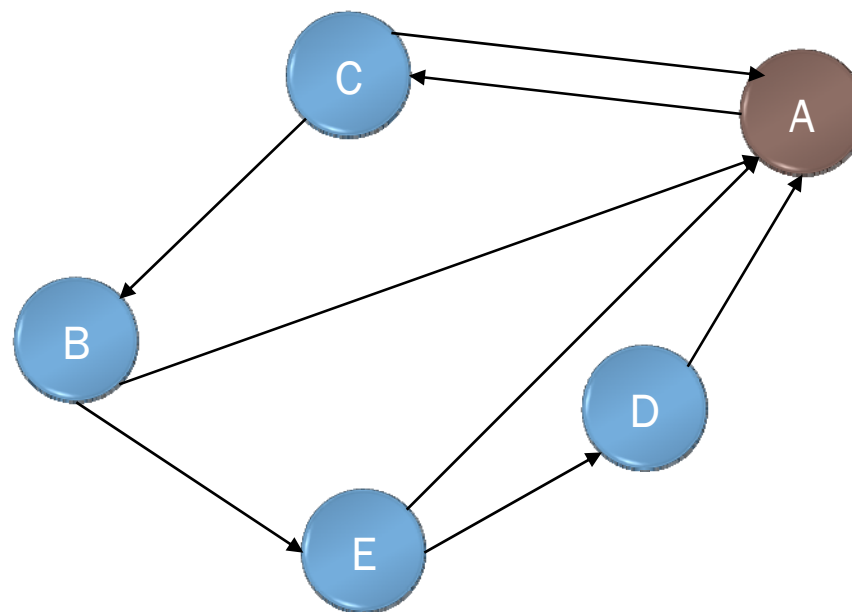
# TOUR CONSTRUCTION PROCEDURES FOR THE TSP

I N T E C



## □ Nearest insertion

	A	B	C	D	E
A	0	85	47	57	87
B	85	0	43	52	38
C	47	43	0	48	58
D	57	52	48	0	32
E	87	38	58	32	0



# TOUR IMPROVEMENT PROCEDURES FOR THE TSP

I N T E C



## *2-OPT procedure*

- Break the initial tour at two points.
- The resulting 2 paths can be reconnected in two ways.
- Choose the shortest one as the new tour.

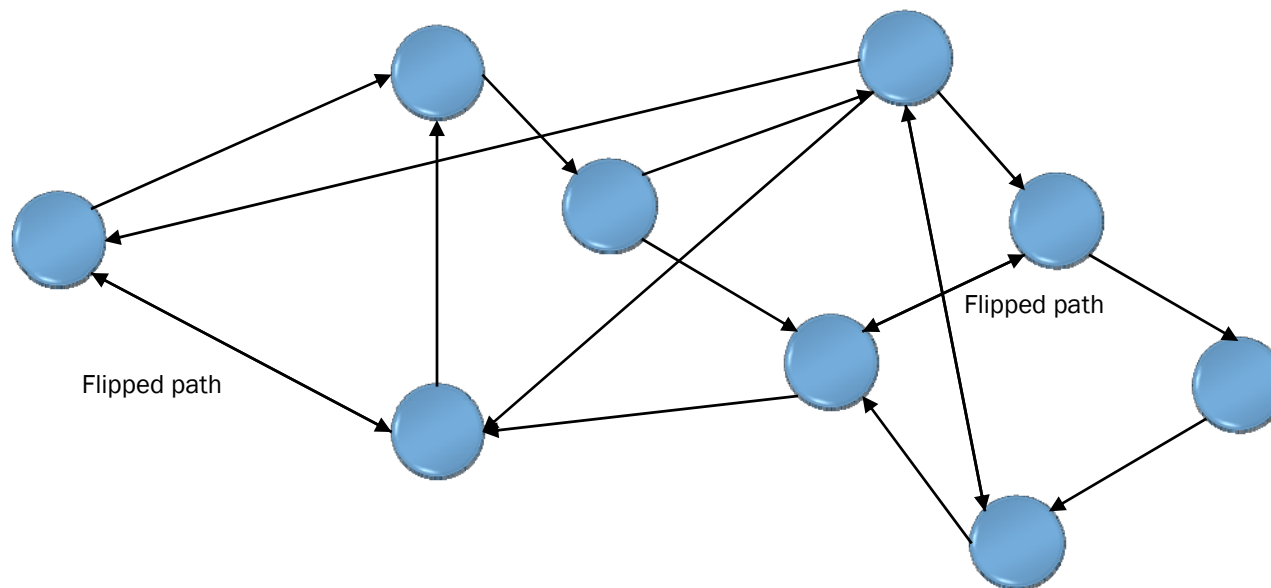
## *3-OPT procedure*

- Break the initial tour at three points.
- The resulting 3 paths can be reconnected in 8 ways.
- Choose the shortest one as the new tour.

## *k-OPT procedure*

- Break the initial tour at k points.

## □ 2-OPT procedure

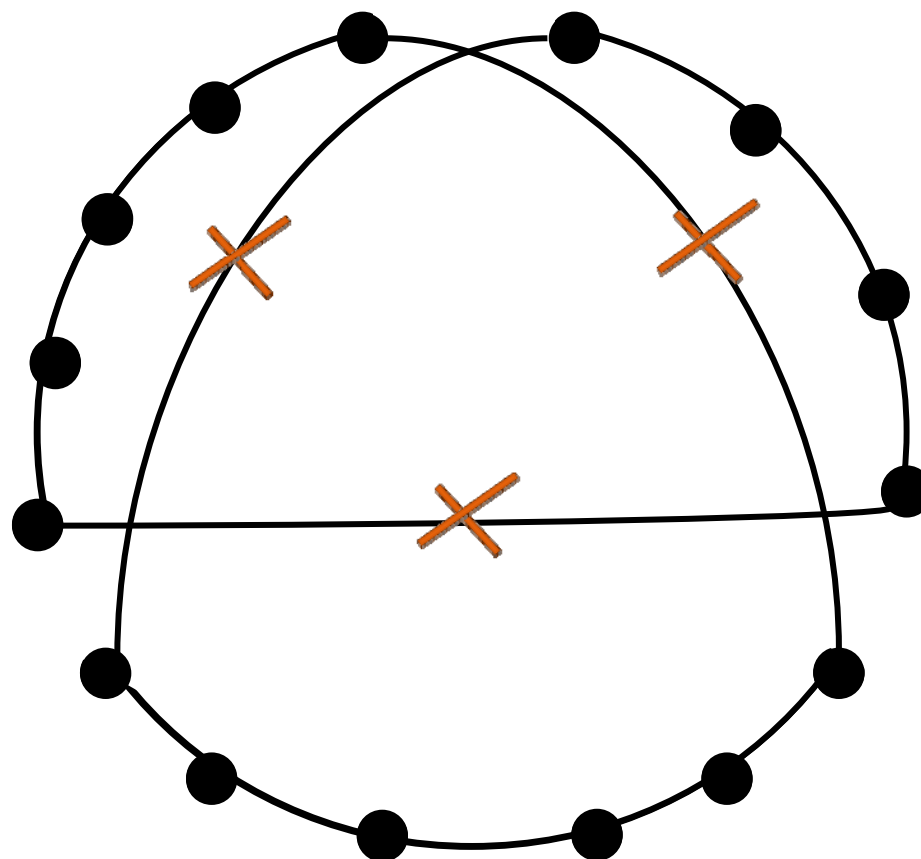


# TOUR IMPROVEMENT PROCEDURES FOR THE TSP

I N T E C



## □ 3-OPT procedure



# VEHICLE ROUTING AND SCHEDULING PROBLEMS

I N T E C



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**TSP** Travelling salesman problem

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**MTSP** M-travelling salesman problem

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**VRP/VRPTW** Single depot, multi-vehicle, node routing problem without or with time windows

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**PDPTW** Pickup and delivery problem with time windows

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**PDPTWT** Pickup and delivery problem with transshipment

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**VRP-SCM** Vehicle routing and scheduling problem in a multi-echelon supply chain

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**VRPCD-SCM** Vehicle routing and scheduling problem with crossdocking in a multi-echelon supply chain

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- **Generalization of the m-TSP**, where a demand is associated with each node and every vehicle has a finite capacity.
- In VRP, the sum of fixed costs (associated to the number of used vehicles) and variable costs (associated to the total distance traveled) is minimized.

## GOAL

Generate *optimal routes for the vehicle fleet* based on a given road network so as to *meet customers demands* while *satisfying capacity and time constraints* at *minimum transportation cost*

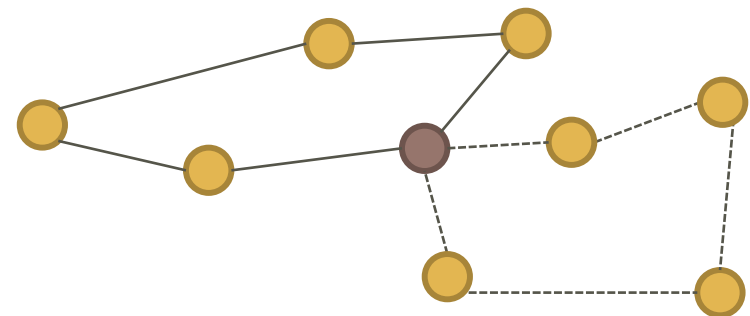


# THE CLASSICAL VRP ASSUMPTIONS

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- ❑ The **demand** at each node is assumed to be **deterministic**.
- ❑ Each vehicle has a **known capacity** that cannot be exceeded.
- ❑ Each vehicle route **must start and end at the central depot**.
- ❑ Each node **must be visited by exactly one vehicle**.



## 1. Routing Problem

- **A spatial problem. Temporal considerations are ignored.** No a priori restrictions on delivery times (i.e. no TW constraints) and goods can be delivered within a short period of time (i.e. non-active maximum service time constraints).

## 2. Routing and Scheduling Problem

- **Visiting times to various locations are of primary importance.** Temporal considerations may no longer be ignored and time restrictions guide the routing and scheduling activities. The movement of each vehicle must be traced through both time and space.

# SOLUTION TECHNIQUES FOR VRP PROBLEMS

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## Heuristic methods

- a) Tour-construction procedures
- b) Tour-improvement procedures
- c) Composite procedures

## Metaheuristic techniques

- ✓ *Heuristics*
- ✓ *Metaheuristics*



Heuristic Techniques



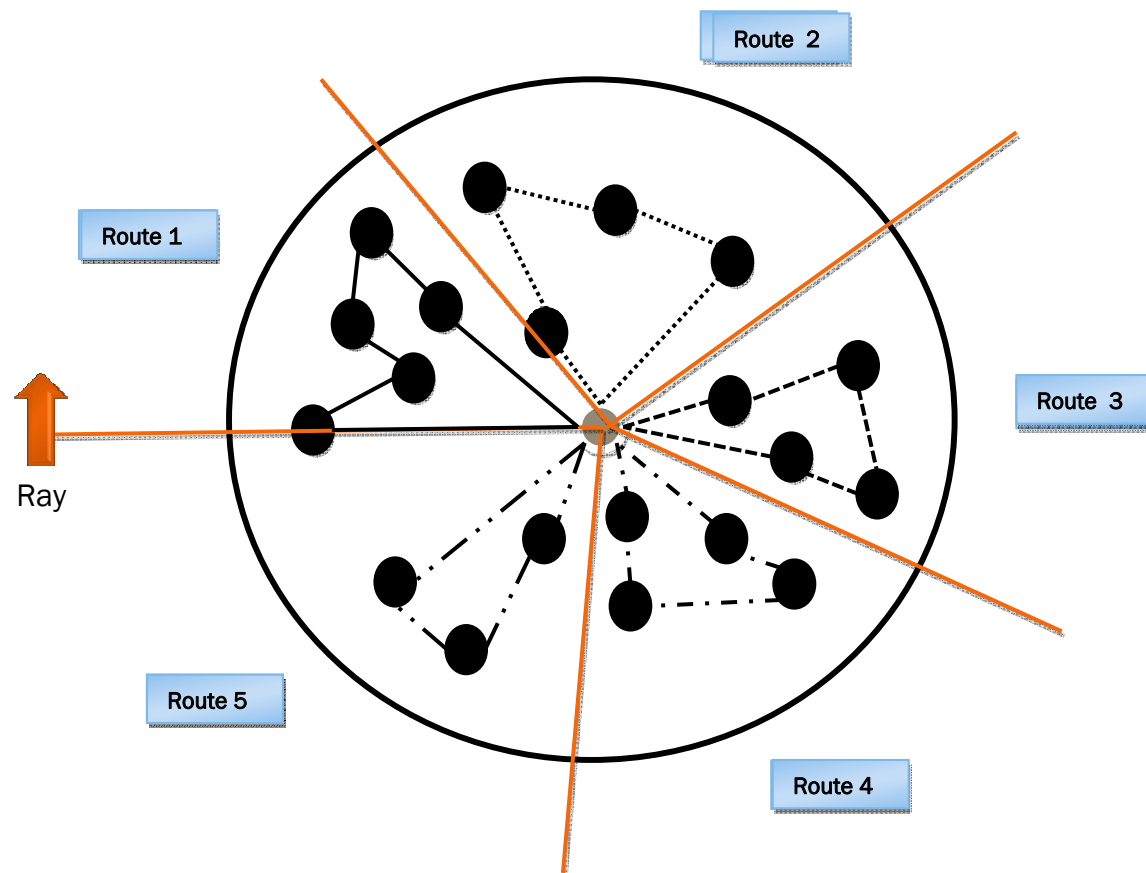
Exact Optimization

## Exact Approaches

- ✓ *Branch-and-price*
- ✓ *Branch-and-cut*

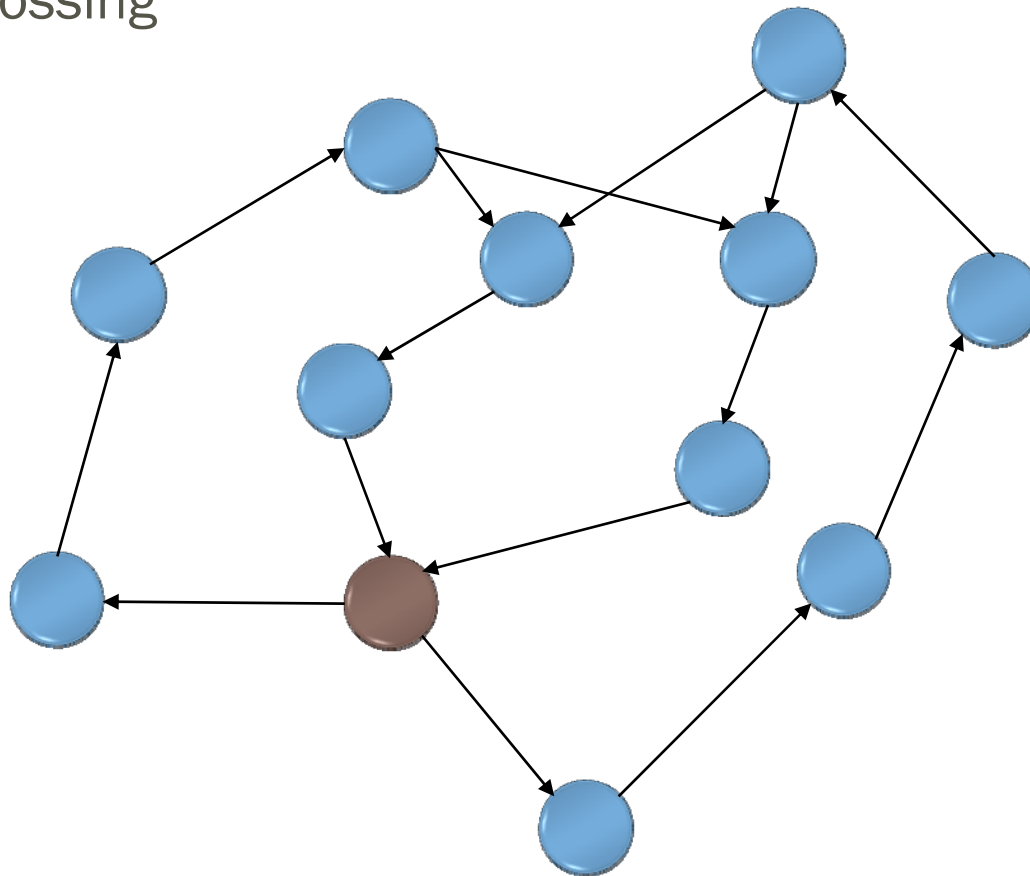
1. **Cluster first- route second procedures.** Group first demand nodes into clusters and then design economical routes over each cluster.
2. **Route first-cluster second procedures.** A long route or cycle that includes all the demand nodes is constructed. Next, the long route is partitioned into a number of shorter, feasible routes by defining clusters.
3. **Saving/insertion procedures.** Build a solution by moving from the current one to an alternative configuration that yields the largest savings in terms of some criterion function like the total cost.
4. **Interactive optimization.** It is a general-purpose approach in which a high degree of human interaction is incorporated into the problem-solving process.

## Cluster First – Route Second

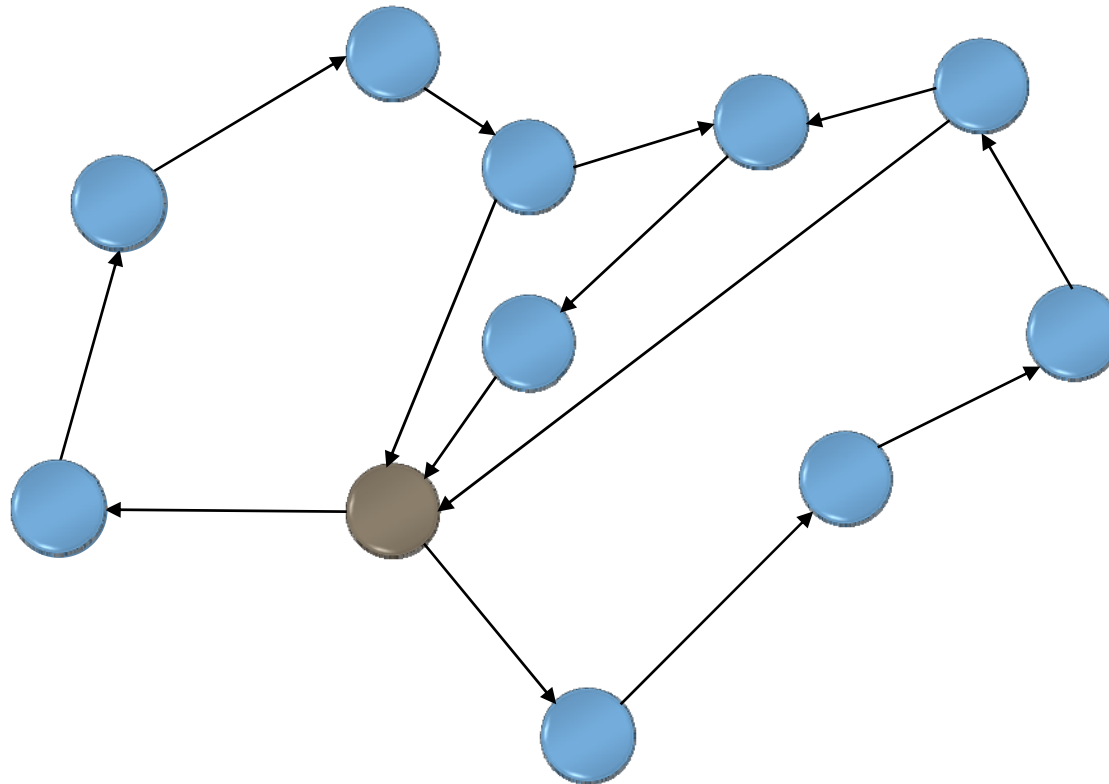


- **k-string exchange.** Exchange of two strings with at most  $k$  nodes within the same route or between neighboring routes.
- **k-node exchange.** Exchange of a certain number of nodes between routes.
- **k-string relocation.** Moving a string of at most  $k$  nodes (with  $k = 1-2$ ) from one to another route.
- **k-OPT procedure.** It randomly breaks a trip at  $k$  points into  $k$  paths and reconnecting them in all possible ways.
- **string cross.** Exchange of two node-strings on two routes by crossing two edges of such routes.
- **k-cyclic transfer.** Given routes  $(r_1, r_2, r_3)$ , move  $k$  nodes from  $r_1$  to  $r_2$ , a similar number from  $r_2$  to  $r_3$  and, finally,  $k$  customers from  $r_3$  to route  $r_1$ .

## □ String Crossing

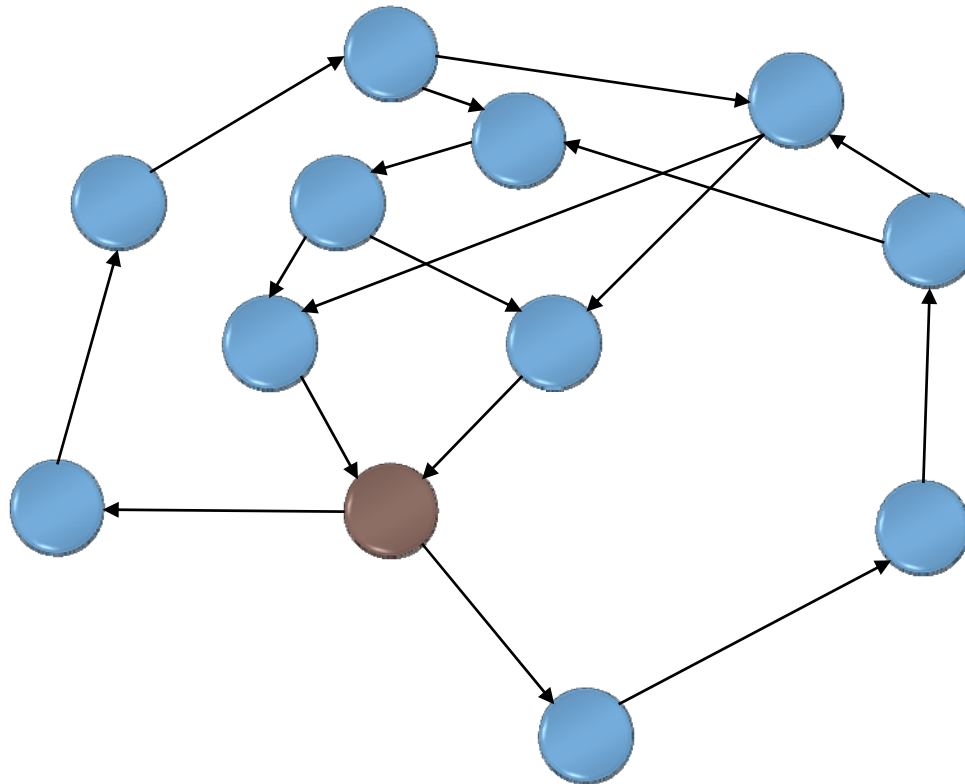


## □ String Relocation





## □ String Exchange

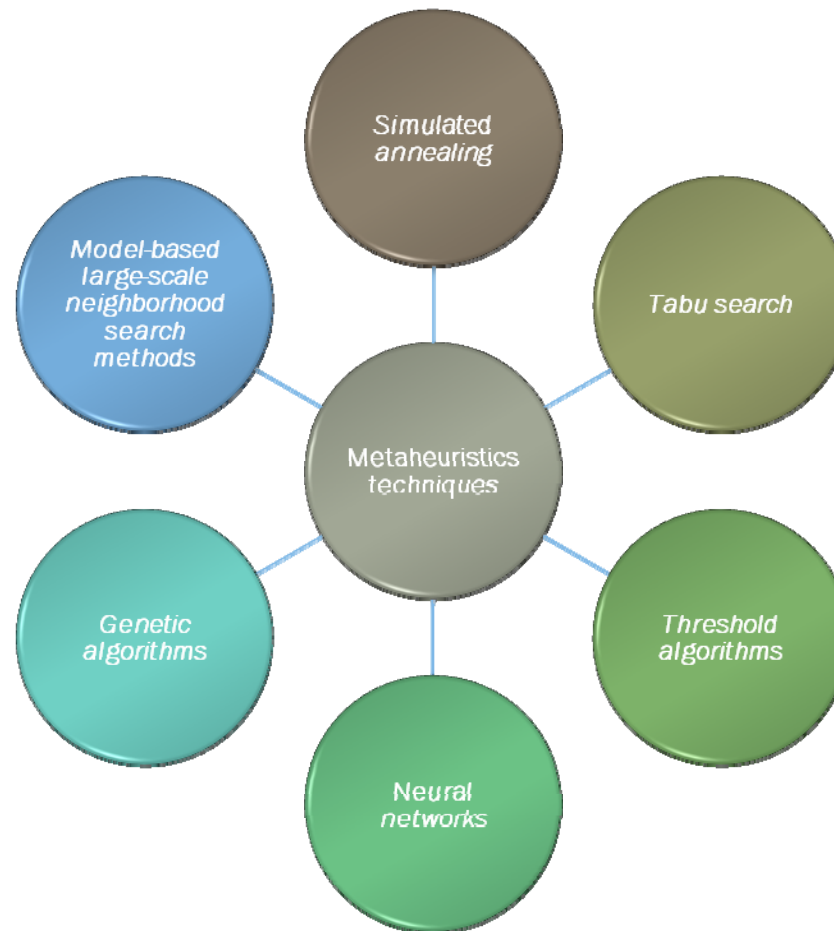


- Apply first a tour construction procedure and then a tour improvement procedure.
  1. **Savings matrix method:** Use the cost savings matrix to generate the initial routes.
  2. **Generalized assignment method:** Use the notion of seed point of a tour to generate the initial routes.

- ❑ Metaheuristic is an **iterative process driven by some subordinate heuristic**.
- ❑ They are mostly **tour improvement procedures**. Start with a non-optimal set of feasible tours and seek out a better solution through local perturbations.
- ❑ Iteratively use some version of a **local search method** to obtain a new set of lower-cost, feasible vehicle routes.
- ❑ A critical issue is the **choice of the neighborhood structure**.

# METAHEURISTIC TECHNIQUES FOR THE VRP

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- ❑ Explore a set of neighbors obtained from the current solution by doing a *limited number of moves*.
- ❑ The larger the neighborhood,
  - the better is the quality of the best neighbor and the higher is the likelihood of converging to the truly optimal solution.
  - But the longer the time it takes to complete the search.
- ❑ A large neighborhood is not always the best option unless it is explored in a very efficient manner.
- ❑ Four parameters influence the computational behavior of local improvement procedures:
  - the initial solution.
  - the type of string moves and the string length  $k$  allowed
  - the improvement strategy used for choosing the next incumbent solution, i.e. the first-improved neighbor (FI) or the best neighbor (BI).

## □ Cross Point

Parent 1

1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---

Proto Child

1	2	3	4	--	--	--	--	--
---	---	---	---	----	----	----	----	----

Final Child

1	2	3	4	7	8	5	9	6
---	---	---	---	---	---	---	---	---

Parent 2

7	3	1	8	5	2	9	6	4
---	---	---	---	---	---	---	---	---

## □ Inversion Mutation

1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---

1	2	3	4	8	7	6	5	9
---	---	---	---	---	---	---	---	---

# MODEL-BASED LARGE-SCALE NEIGHBORHOOD SEARCH METHOD

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- It steadily improves an initial solution by iteratively applying a sequence of two evolutionary steps: the route improvement and the route reoptimization steps.
- The neighborhood is defined through an MILP formulation that allows multiple nodal exchanges between neighboring trips. The best neighbor is the new incumbent solution (*the MILP improvement step*).
- Next, a new neighborhood and a new MILP formulation just allowing the repositioning of nodes on the same tour are defined (*the MILP route reoptimization step*).
- In both steps, the best neighbor is the one minimizing the overall routing cost, including fixed and variable costs.
- *A perturbation mode* is activated whenever no better neighbor is found through the normal procedure. It explores a larger neighborhood by allowing nodal exchanges among close trips and node reordering on every route.



1. **Optimization algorithms based on Lagrangian relaxation**
2. **Branch-and-price algorithms** (column generation methods)
3. **Branch-and-cut algorithms** applied to MILP rigorous formulations of the VRPTW problem

- They apply to MILP mathematical formulations and guarantee the optimality of the solution found. They are regarded as route construction methods.

### Objective Function

$$\text{Min} \sum_{i=1}^n \sum_{j=1}^n \sum_{v=1}^{NV} c_{ij} x_{ij}^v + f_v \sum_{j=1}^n x_{ij}^v$$

### (R1) A single leaving arc from each node

$$\sum_{i=1}^n \sum_{v=1}^{NV} x_{ij}^v = 1, \quad j = 2, \dots, n$$

### (R2) A single incident arc from each node

$$\sum_{j=1}^n \sum_{v=1}^{NV} x_{ij}^v = 1, \quad i = 2, \dots, n$$

### (R3) Each node including the depot has a similar number of incident and leaving arcs

$$\sum_{i=1}^n x_{ip}^v - \sum_{j=1}^n x_{pj}^v = 0, \quad v = 1..NV, p = 1..n$$

### (R4) Vehicle capacity constraints

$$\sum_{i=1}^n d_i \left( \sum_{j=1}^n x_{ij}^v \right) \leq k_v, \quad v = 1..NV$$

### (R5) Total elapsed routing time constraint

$$\sum_{i=1}^n t_{iv} \sum_{j=1}^n x_{ij}^v + \sum_{i=1}^n \sum_{j=1}^n t_{ij}^v x_{ij}^v \leq T_v$$

### (R6) At most a leaving arc from the depot on each route

$$\sum_{j=2}^n x_{ij}^v \leq 1, \quad v = 1..NV$$

### (R7) At most an incident arc to the depot on each route

$$\sum_{i=2}^n x_{ij}^v \leq 1, \quad v = 1..NV$$

### (R8) Subtour breaking constraints

$$x \in S$$

$$x_{ij}^v = 0, 1$$

# VEHICLE ROUTING AND SCHEDULING PROBLEMS

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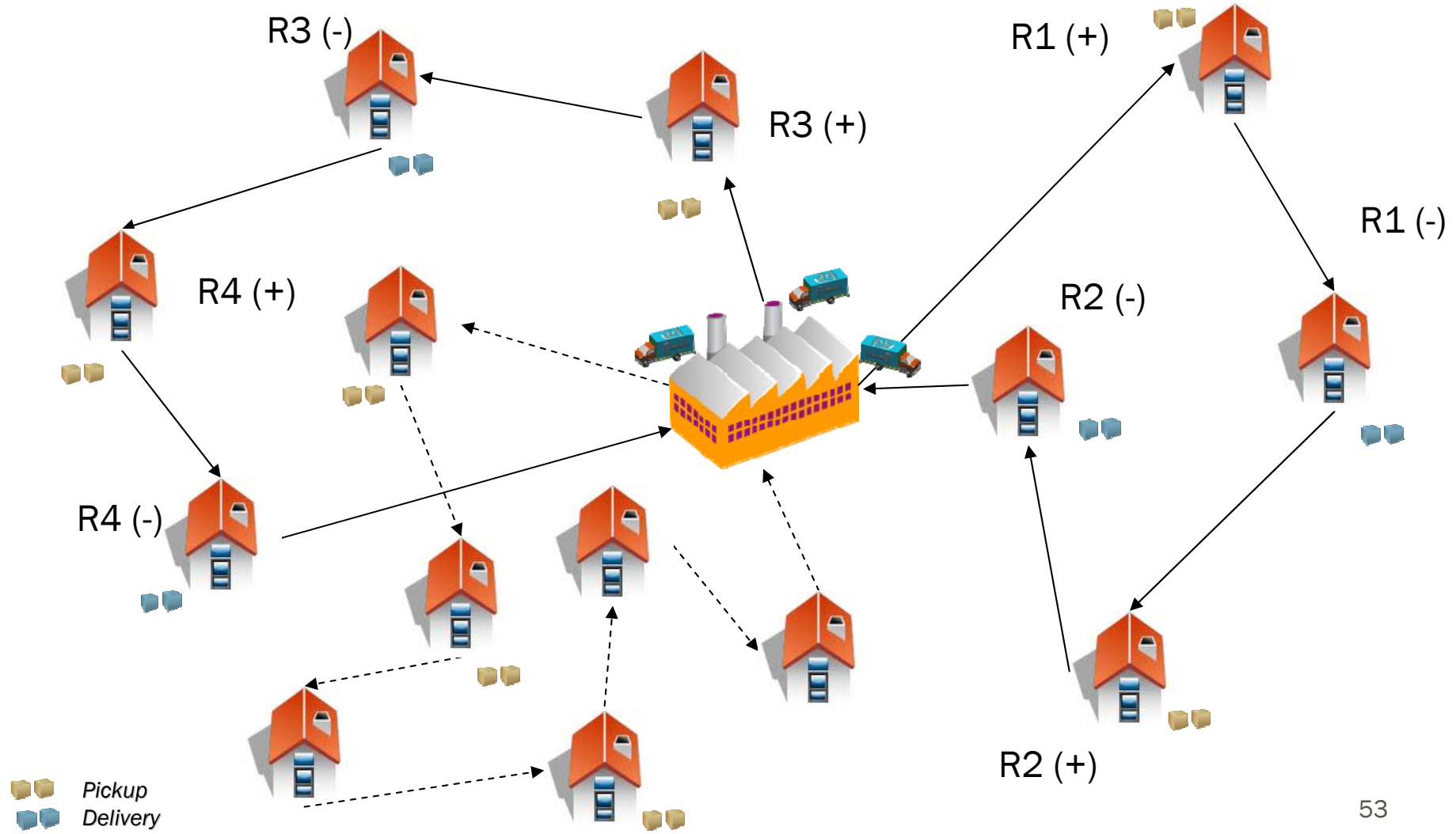


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<i>VRPCD-SCM</i>	Vehicle routing and scheduling problem with crossdocking in a multi-echelon supply chain

# PICKUP & DELIVERY PROBLEM (PDP)



- ❑ A generalization of the VRP where *pickup and delivery operations* are done by a fleet of vehicles.
- ❑ It is the **multi-vehicle pickup and delivery problem with time-windows (m-PDPTW)**.
- ❑ It is a **single-echelon transportation problem** involving pickup and delivery tasks, but accomplishing a single type of operation at each node.
- ❑ Involve a set of **transportation requests**  $r \in R$  , each defined by:
  - a pickup location (the origin),
  - a delivery location (the destination),
  - a load to be delivered from one to the other site, and
  - a service time at each location.
- ❑ All the requests are known in advance.

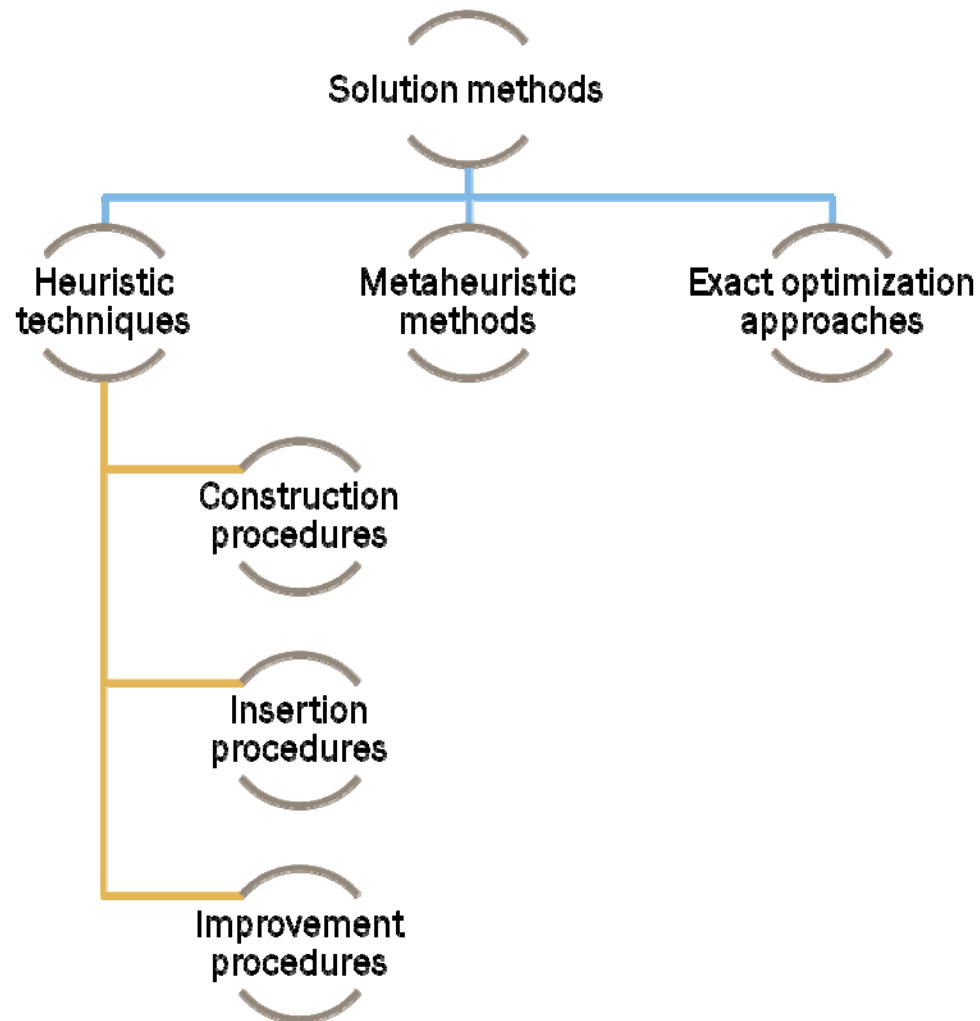


- ❑ Vehicles depart and return to the central depot (**tour constraint**).
- ❑ Each transportation request must be serviced by a single vehicle. Related pickup and delivery locations are then visited by the same vehicle (**pairing constraint**).
- ❑ Each pickup location has to be visited prior to the corresponding delivery location (**precedence constraint**).
- ❑ Each vehicle can satisfy one or more customer requests.

- ❑ A vehicle capacity must never be exceeded after visiting a pickup node (**capacity constraint at pickup nodes**).
- ❑ A vehicle must transport enough load to meet customer demand when servicing a delivery node (**capacity constraint at delivery nodes**).
- ❑ The service at each node must be started within the specified time window (**time window constraints**).
- ❑ The total time/distance travelled from the depot to a certain node must be greater than the one required to reach a preceding node on the tour (**compatibility between routes and schedules**).

- The **problem goal** is to minimize:
  - the total distance
  - the total time required to service all customer requests
  - the total customers' inconvenience
  - a weighted combination of total service time and customers' inconvenience.
  
- Customer inconvenience is usually a linear function of a customer's waiting time (**time window violation**).

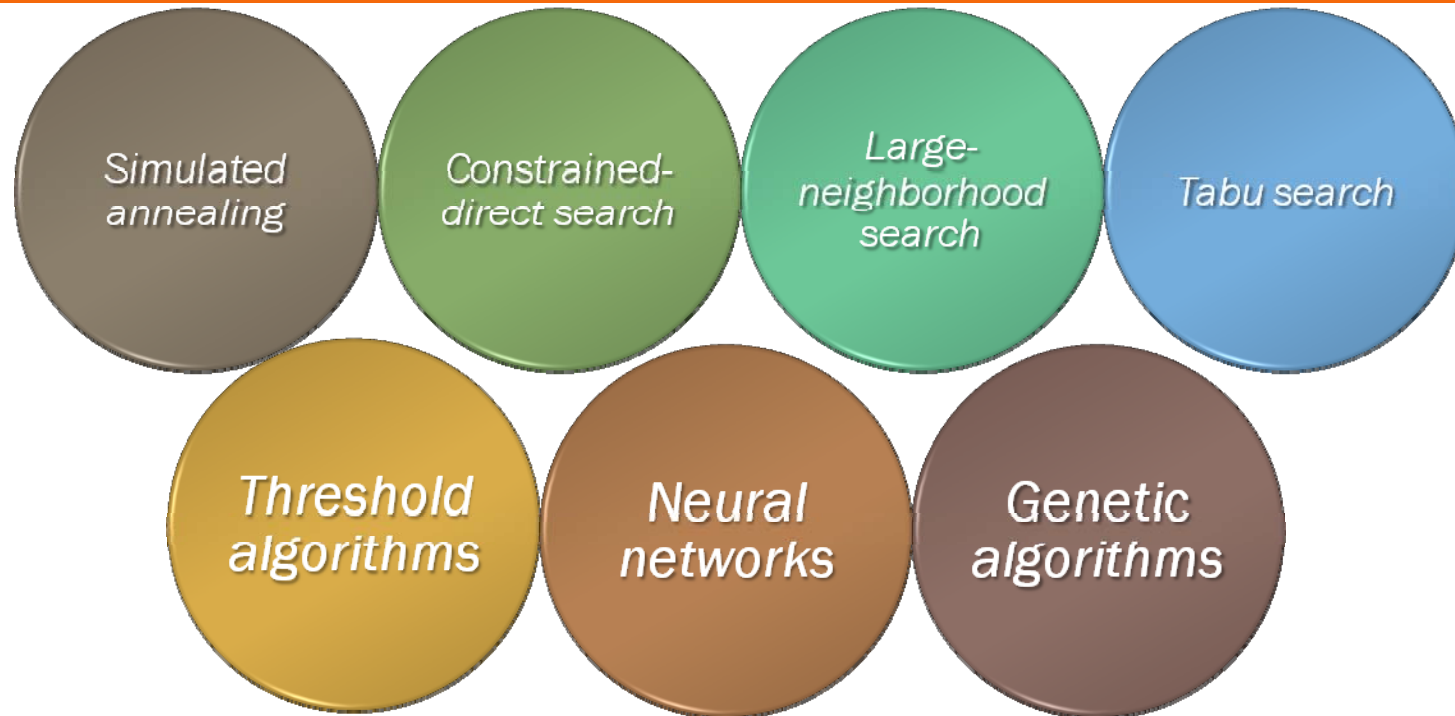




- ❑ The best construction heuristic methods are **decomposition techniques** based on the idea of dividing the problem into three phases:
  - clustering
  - routing
  - scheduling
  
- ❑ Decomposition is based on the notion of *mini-clustering*.
  
- ❑ Routing and scheduling are accomplished using methodologies proposed for the VRP subject to the pairing and precedence constraints.

- ❑ These methods develop a set of routes by inserting one request at a time into a given route.
- ❑ Two types of insertion procedures have been proposed:
  - **Sequential procedures** inserting one customer at a time into a single route.
  - **Parallel procedures** inserting one customer at a time into one of several open routes.

- ❑ Start from a set of feasible routes and applied some kind of *local search algorithm* to improve the current solution.
- ❑ The neighborhood structure depends on the procedure.
- ❑ **Cyclic transfer procedure** improved the solution by **moving a number of requests** among routes.
- ❑ **Variable depth search** applied several **arc-exchange mechanisms** to improve the current solution.



- Most of these methods seek to **escape from a local optima** by:
  - **Restarting the search** procedure from the current best solution after several non-improving iterations.
  - **Redefining the solution space** and **doing re-optimization** to continually improve on the current best solution.

# m-PDPTW FORMULATION

I N T E C



## ASSIGNMENT CONSTRAINTS

$$\sum_{p \in P} X_{vp} \leq 1, \forall v \in V$$

$$\sum_{v \in V} Y_{rv} = 1, \forall r \in R$$

$$\sum_{r \in R} Y_{rv} \leq M_X \sum_{p \in P} X_{vp}, \forall v \in V$$

## ROUTING-COST DEFINING CONSTRAINTS

$$C_i \geq C_{pi} (X_{vp} + Y_{rv} - 1), \quad \forall i \in I^+, r \in R, v \in V, p \in P$$

$$C_{i'} \geq C_i + c_{ii'} - M_C (1 - S_{ii'}) - M_C (2 - Y_{rv} - Y_{r'v})$$

$$C_i \geq C_{i'} + c_{ii'} - M_C S_{ii'} - M_C (2 - Y_{rv} - Y_{r'v}) \quad \forall i \in I_r, i' \in I_r, i < i', (r, r') \in R, v \in V$$

$$OC_v \geq C_i + \sum_{p \in P} c_{ip} X_{vp} - M_C (1 - Y_{rv}) \quad \forall i \in I_r^-, r \in R, v \in V$$

## VEHICLE-LOAD DEFINING CONSTRAINTS

$$L_i - U_i \leq \sum_{v \in V_r} q_v Y_{rv}, \quad \forall i \in I_r, r \in R$$

$$L_i - U_i \geq 0$$

$$L_{i'} \geq L_i + \alpha_{i'} - M_T (1 - S_{ii'}) - M_T (2 - Y_{rv} - Y_{r'v})$$

$$L_i \geq L_{i'} + \alpha_i - M_C S_{ii'} - M_C (2 - Y_{rv} - Y_{r'v}) \quad \forall i \in I_r, i' \in I_r, i < i', (r, r') \in R, v \in V$$

$$U_{i'} \geq U_i + \beta_{i'} - M_T (1 - S_{ii'}) - M_T (2 - Y_{rv} - Y_{r'v})$$

$$U_i \geq U_{i'} + \alpha_i - M_C S_{ii'} - M_C (2 - Y_{rv} - Y_{r'v}) \quad \forall i \in I_r, i' \in I_r, i < i', (r, r') \in R, v \in V$$

$$L_i \leq \sum_{r \in R} q_v^0 Y_{rv} + \sum_{r \in R} \sum_{j \in I_r} \alpha_j Y_{rv} - M_L (1 - Y_{rv}) \quad \forall i \in I_r, r \in R$$

$$U_i \leq \sum_{r \in R} \sum_{j \in I_r} \beta_j Y_{rv} - M_L (1 - Y_{rv}) \quad \forall i \in I_r, r \in R$$

$$U_i \geq \beta_i \quad \forall i \in I_r, r \in R$$

$$L_i \geq \sum_{r \in R} q_v^0 Y_{rv} + \alpha_i$$

## ARRIVAL-TIME DEFINING CONSTRAINTS

$$T_i \geq T_{pi} (X_{vp} + Y_{rv} - 1), \quad \forall i \in I^+, r \in R, v \in V, p \in P$$

$$T_{i'} \geq T_i + st_i + c_{ii'} - M_T (1 - S_{ii'}) - M_T (2 - Y_{rv} - Y_{r'v})$$

$$T_i \geq T_{i'} + st_{i'} + c_{ii'} - M_C S_{ii'} - M_C (2 - Y_{rv} - Y_{r'v}) \quad \forall i \in I_r, i' \in I_r, i < i', (r, r') \in R, v \in V$$

$$T_j \geq T_i + st_i + t_{ij} \quad (i, j) \in I_r, i \in I^+, j \in I^-, r \in R$$

$$OT_v \geq T_i + st_i + \sum_{p \in P} c_{ip} X_{vp} - M_C (1 - Y_{rv}) \quad \forall i \in I_r^-, r \in R, v \in V$$

$$E_i \geq a_i - T_i \quad \forall i \in I$$

$$B_i \geq T_i - b_i \quad \forall i \in I$$

$$OD_v \geq OT_v - t_v^{\max} \quad \forall v \in V$$

## OBJECTIVE FUNCTION

$$\text{Min} \sum_{v \in V} (OC_v + \Gamma OT_v + \Lambda OD_v) + \sum_{i \in I} (\lambda E_i + \omega B_i)$$

# VEHICLE ROUTING AND SCHEDULING PROBLEMS

I N T E C



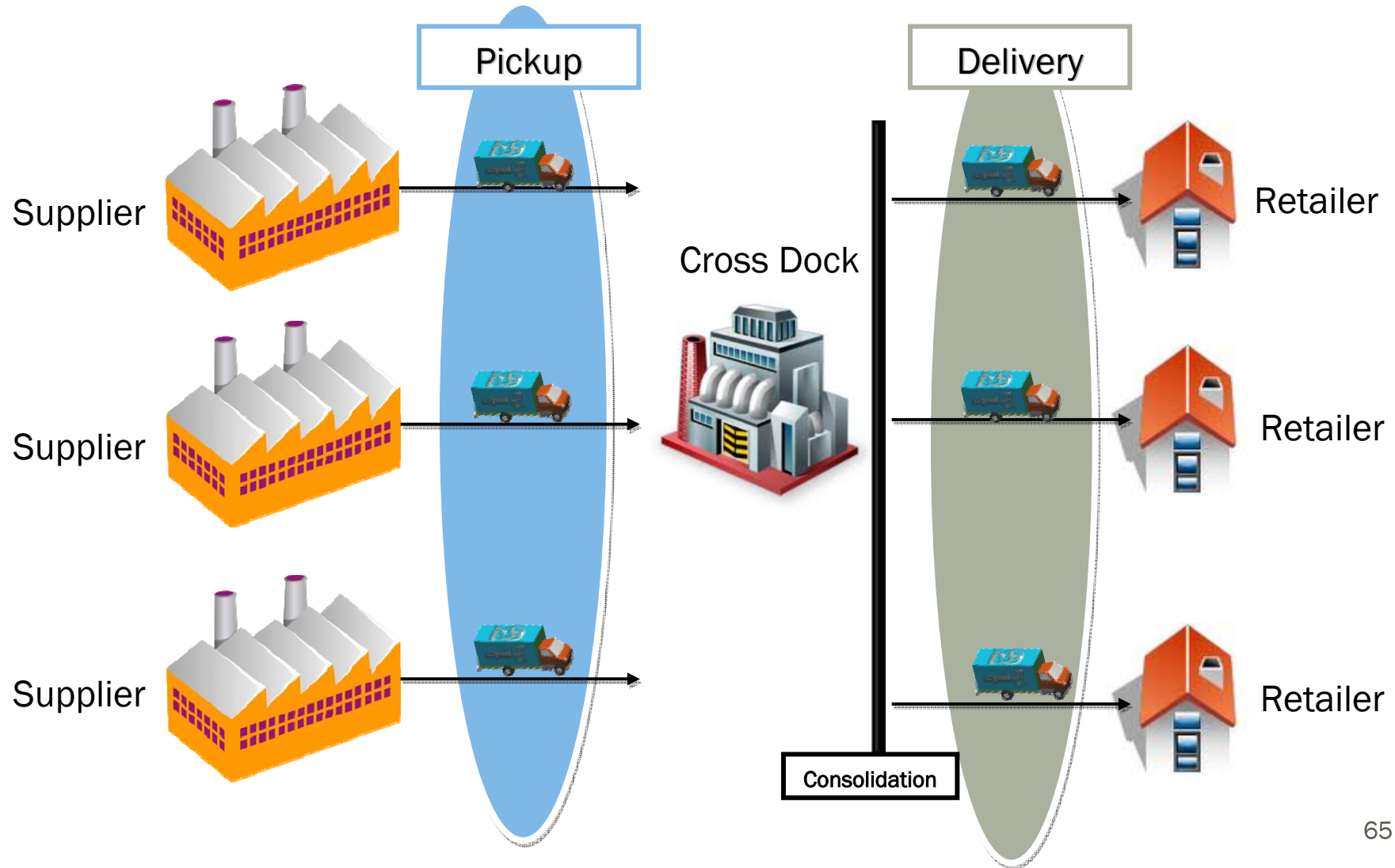
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<i>MTSP</i>	M-travelling salesman problem
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- ❑ Loads are transported from suppliers (pickup nodes) to customers (delivery nodes) **via a single cross-dock**.
- ❑ **Each request is split into two sub-requests**, i.e. a pickup and a delivery sub-request that may be handled by two different vehicles.
- ❑ The incorporation of transshipment points may yield solutions with shorter travel distances or fewer vehicles.
- ❑ Loads from suppliers are picked up by a fleet of vehicles, consolidated at the cross-dock facility, and immediately delivered to customers by the same set of vehicles, without intermediate storage.



# PDPTW WITH TRANSHIPMENT

I N T E C



- ❑ Each node must be visited by a single vehicle only once.
- ❑ Each vehicle can pick up or deliver more than one supplier or customer.
- ❑ Pickup and delivery routes **start and end at the cross-dock.**
- ❑ Loads to pickup/deliver at problem nodes are known data.
- ❑ The total amounts unloaded at the receiving dock and loaded in the shipping dock should be equal. There is **no end inventory at the cross-dock facility.**
- ❑ Service time windows for the nodes are usually specified.
- ❑ The problem goal is to minimize the total transportation cost while satisfying all customer requests.

# VEHICLE ROUTING AND SCHEDULING PROBLEMS

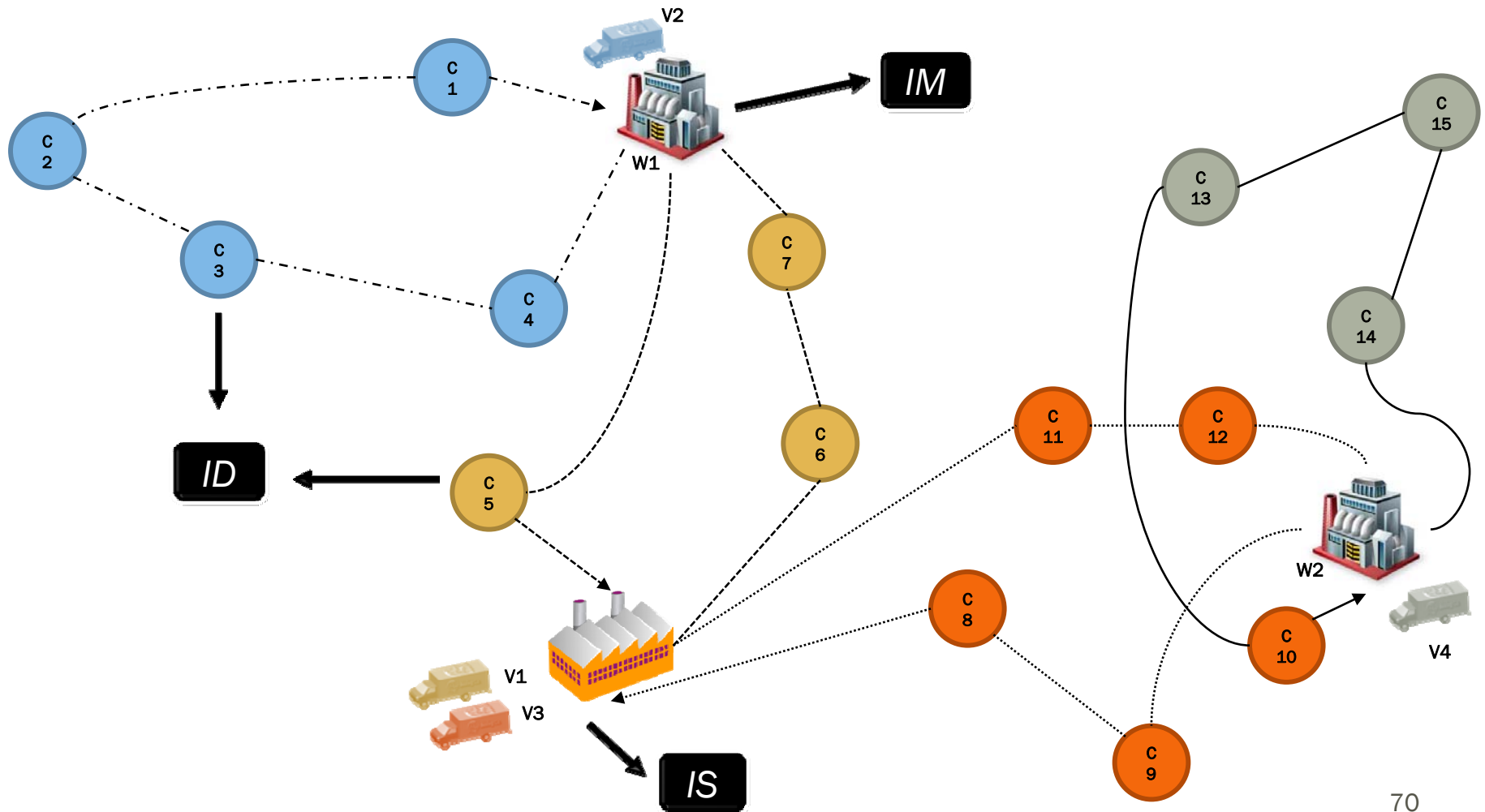
I N T E C



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- ❑ Determine the best short-term operational planning of **multi-echelon transportation networks** comprising factories, warehouses, and customers.
- ❑ Handle different types of distribution strategies like direct shipping, shipping via DC or regional warehouses, and hybrid networks.
- ❑ Resemble the logistics activities at multi-site manufacturing firms by allowing multiple events at every location.

- **Types of nodes**
  - **“Pure” source nodes (IS)**, usually manufacturer storages, where vehicles carry out pickup operations
  - **Mixed nodes (IM)**, like DCs, where visiting vehicles can accomplish pickup and/or unloading operations.
  - **Destination nodes (ID)**, like consumer zones, where visiting trucks just perform delivery operations
  
- **Number of events.** The proposed number of events for a location must be at least equal to the optimal number of vehicles stops at that node to accomplish pickup/delivery operations.
  
- **Global precedence.** For each vehicle stop(n,i), the model provides all the visits the vehicle has made before.

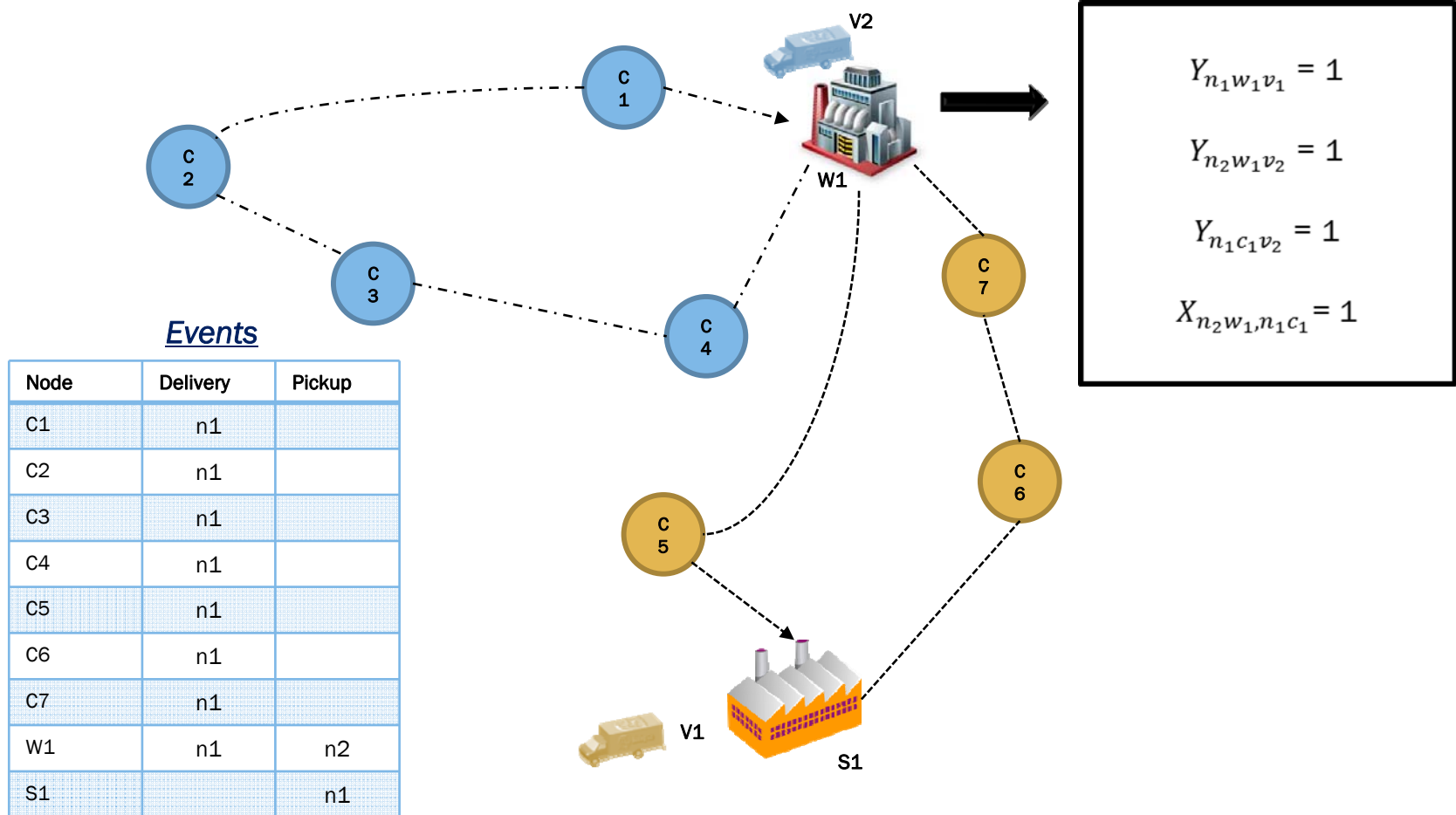


## Binary variables

- **Assignment variable**  $Y_{niv}$ : the event  $n$  at location  $i$  has been allocated to vehicle  $v$  whenever  $Y_{niv} = 1$ .
- **Sequencing variable**  $X_{ni,n'i'}$ : the vehicle stop  $(n,i)$  at node  $i$  will occur earlier than the event  $n'$  at site  $i'$  whenever  $X_{ni,n'i'} = 1$  and both nodes  $(i,i')$  nodes are visited by the same vehicle.

## Continuous variables

- **Cost-variable**  $C_{ni}$ : distance-based transportation cost incurred by the visiting vehicle to move from the base up to stop  $(n,i)$  along the assigned route.
- **Time-variable**  $T_{ni}$ : total time required by the assigned vehicle to travel from the base up to stop  $(n,i)$ .
- **Pickup-variable**  $L_{ni,pv}$ : amount of product  $p$  picked up by vehicle  $v$  during stop  $(n,i)$
- **Delivery-variable**  $U_{ni,pv}$ : amount of product  $p$  delivered by vehicle  $v$  to location  $i$  at event  $n$ .
- **Accumulated-variables**  $AL_{ni,pv} / AU_{ni,pv}$ : accumulated amount of product  $p$  picked up/delivered by vehicle  $v$  along the assigned route from the base to stop  $(n,i)$ ,





- ❑ **Multiple products** are distributed from manufacturing plants and warehouses to customers.
- ❑ Customer requests may involve several products and do not have predefined suppliers
- ❑ The amounts of products to be picked-up by a vehicle at source nodes are not predefined.
- ❑ Multiple partial shipments to a customer location are allowed
- ❑ Milk runs are performed on both sides, i.e. inbound and outbound sides.

- ❑ Problem events are the vehicle stops at DCs and customer locations.
- ❑ Pre-specified events for each site are timely ordered and its number is chosen by the user.
- ❑ Several events can sequentially occur at any site so that a location can be visited either several times by the same vehicle or by multiple trucks.
- ❑ A vehicle can accomplish pickup and delivery operations during a stop at DCs.
- ❑ The magnitude and composition of the cargo transported by a vehicle at any stop must be traced in order to meet:
  - *capacity constraints at pickup locations*
  - *product availability constraints at delivery points*

- ❑ Each vehicle must finally return to the assigned depot (**tour constraint**).
- ❑ Customer time windows and the specified maximum service time must be respected.
- ❑ **Finite inventories at manufacturer storage and distribution centers at the initial time are known.**
- ❑ In addition to customer demands, **specific replenishment orders from DCs** are to be fulfilled.
- ❑ Cross-docking at DCs is not permitted. Customer demands should be satisfied using the initial inventories.
- ❑ **A DC may be predefined as the supplier of products to some customers** close to this facility.

- The **problem goal** is to **minimize the total transportation cost** while satisfying the customer service-level requirements.
  
- Transportation costs include:
  - fixed expenses incurred by used vehicles,
  - distance-based variable costs, mainly fuel costs
  - time-based variable costs, mainly driver wages.

- ❑ **Route building constraints** assigning a particular stop  $(n,i)$  to at most a single vehicle, and ordering vehicle stops  $(n,i)$  on the same route.
- ❑ **Product inventory constraints** restraining the overall amount of products loaded by visiting vehicles at source nodes accounting for product availability.
- ❑ **Additional inventory constraints** monitoring the amount of every product received at each warehouse over the planning horizon.
- ❑ **Product demand constraints** ensuring that customer requests are satisfied.

- ❑ **Null in-transit inventory constraints** requiring that every product unit picked up by a vehicle must be delivered to a customer before the end of the vehicle trip.
- ❑ **Loading/unloading constraints** monitoring the total amount of products transported by each vehicle to prevent from overcapacity or product shortages.
- ❑ **Time window and maximum service time constraints** ensuring that the customer service begins within the specified TW, and each vehicle returns to its base within the allowed working period.

## Vehicle routing constraints in SCM

### Allocating vehicles to depots

$$\sum_{l \in B_v} W_{lv} \leq 1 \quad \forall v \in V$$

### Assigning the event $n$ at node $i$ to vehicle $v$

$$\sum_{v \in V_i} Y_{nv} \leq 1 \quad \forall n \in N_i, i \in I$$

### Preordering of time events predefined for node $i$

$$\sum_{v \in V_i} Y_{nv} \geq \sum_{v \in V_i} Y_{n'v} \quad \forall (n, n') \in N_i, i \in I : n < n'$$

### Activated vehicle condition

$$\sum_{i \in I_v} \sum_{n \in N_i} Y_{nv} \leq M \sum_{l \in B_v} W_{lv} \quad \forall v \in V$$

### Travel cost and time from the vehicle depot to the first visited node

$$\left\{ \begin{array}{l} C_n \geq \sum_{l \in B_v} dc_v d_{li} W_{lv} - M_c (1 - Y_{nv}) \\ T_n \geq \sum_{l \in B_v} \left( \frac{d_{li}}{sp_v} \right) W_{lv} - M_T (1 - Y_{nv}) \end{array} \right\} \quad \forall n \in N_i, i \in I, v \in V_i$$

### Travel cost and time from the base to vehicle stop $(i, n)$

$$\left\{ \begin{array}{l} C_{n'} \geq C_n + dc_v d_{ii'} - M^c (1 - X_{nn'}) - M^c (2 - Y_{nv} - Y_{n'v}) \\ C_n \geq C_{n'} + dc_v d_{ii'} - M^c X_{nn'} - M^c (2 - Y_{nv} - Y_{n'v}) \\ T_{n'} \geq T_n + ft_i + \sum_{p \in P_i} vt_{ip} (L_{npv} + U_{npv}) + \frac{d_{ii'}}{sp_v} - M^T (1 - X_{nn'}) - M^T (2 - Y_{nv} - Y_{n'v}) \\ T_n \geq T_{n'} + ft_{i'} + \sum_{p \in P_{i'}} vt_{i'p} (L_{n'pv} + U_{n'pv}) + \frac{d_{ii'}}{sp_v} - M^T X_{nn'} - M^T (2 - Y_{nv} - Y_{n'v}) \end{array} \right\} \quad \forall n \in N_i, n' \in N_{i'}, i, i' \in I, v \in V_{ii'} : i < i'$$

### Bound on the routing cost and time for the tour assigned to vehicle $v$

$$\left\{ \begin{array}{l} CV_v \geq C_n + \sum_{l \in B_v} dc_v d_{il} W_{lv} - M_c (1 - Y_{nv}) \\ TV_v \geq T_n + ft_i + \sum_{p \in P_i} vt_{ip} (L_{npv} + U_{npv}) + \sum_{l \in B_v} \frac{d_{il}}{sp_v} W_{lv} - M_T (1 - Y_{nv}) \end{array} \right\}$$

$$\forall n \in N_i, i \in I, v \in V_i$$

### Time-window and maximum service time constraints

$$a_i \leq T_n \leq b_i \quad n \in N_i, i \in ID$$

$$TV_v \leq t_v^{\max} \quad v \in V$$

## Vehicle cargo constraints in SCM

### Product availability constraints

$$\sum_{v \in V_i} \sum_{n \in N_i} L_{npv} \leq INV_{ip} \quad \forall i \in (IS_p \cap IM_p), p \in P$$

### Product demand constraints

$$\sum_{v \in V_i} \sum_{n \in N_i} U_{npv} = DEM_{ip} - BL_{ip} \quad \forall i \in (ID_p \cap IM_p), p \in P$$

### Null in-transit inventory constraints

$$\sum_{n \in N_i} \sum_{i \in IS \cup IM} L_{npv} = \sum_{n \in N_i} \sum_{i \in IM \cup ID} U_{npv} \quad , p \in P, v \in V$$

### Vehicle loading/unloading operation constraints

$$\begin{cases} L_{npv} \leq INV_{ip} Y_{nv} \\ U_{npv} \leq DEM_{ip} Y_{nv} \end{cases} \quad \forall n \in N_i, i \in (IS_p \cap IM_p), p \in P, v \in V_i$$

$$\forall n \in N_i, i \in (ID_p \cap IM_p), p \in P, v \in V_i$$

### Accumulated amount of product p picked-up by vehicle v up to the stop (i,n)

$$\begin{cases} AL_{n'pv} \geq AL_{npv} + L_{n'pv} - M_L(1 - X_{nn'}) - M_L(2 - Y_{nv} - Y_{n'v}) \\ AL_{npv} \geq AL_{n'pv} + L_{npv} - M_L X_{nn'} - M_L(2 - Y_{nv} - Y_{n'v}) \end{cases}$$

$$\forall n \in N_i, n' \in N_{i'}, i, i' \in I, p \in P_{i i'}, v \in V_{i i'} : (i, n) < (i', n')$$

### Accumulated amount of product p delivered by vehicle v up to the stop (i,n)

$$\begin{cases} AU_{n'pv} \geq AU_{npv} + U_{n'pv} - M_L(1 - X_{nn'}) - M_L(2 - Y_{nv} - Y_{n'v}) \\ AU_{npv} \geq AU_{n'pv} + U_{npv} - M_L X_{nn'} - M_L(2 - Y_{nv} - Y_{n'v}) \end{cases}$$

$$\forall n \in N_i, n' \in N_{i'}, i, i' \in I, p \in P_{i i'}, v \in V_{i i'} : (i, n) < (i', n')$$

### Maximum volumetric and weight vehicle capacity constraints

$$\begin{cases} \sum_{p \in P} uv_p (AL_{npv} - AU_{npv}) \leq vq_v Y_{nv} \\ \sum_{p \in P} uw_p (AL_{npv} - AU_{npv}) \leq wq_v Y_{nv} \end{cases} \quad \forall n \in N_i, i \in I, p \in P, v \in V_i$$

### Lower bounds on the cargo transported by vehicle v after stop (i,n)

$$\begin{cases} AL_{npv} \geq AU_{npv} \\ AL_{npv} \geq L_{npv} \\ AU_{npv} \geq U_{npv} \end{cases} \quad \forall n \in N_i, i \in I, p \in P, v \in V_i$$

### Upper bounds on the accumulated amount of product p loaded/unloaded by vehicle v after stop (i,n)

$$\begin{cases} AL_{npv} \leq \sum_{i' \in I} \sum_{n' \in N_{i'}} L_{n'pv} \\ AU_{npv} \leq \sum_{i' \in I} \sum_{n' \in N_{i'}} U_{n'pv} \end{cases} \quad \forall n \in N_i, i \in I, p \in P, v \in V_i$$



## Objective Function

*The sum of distance-based travel costs and vehicle fixed costs*

$$\text{Min} \sum_{v \in V} CV_v + \sum_{v \in V} \sum_{l \in B_v} fc_v W_{lv}$$

*The weighted sum of distance-based and time-based travel costs plus vehicle fixed costs*

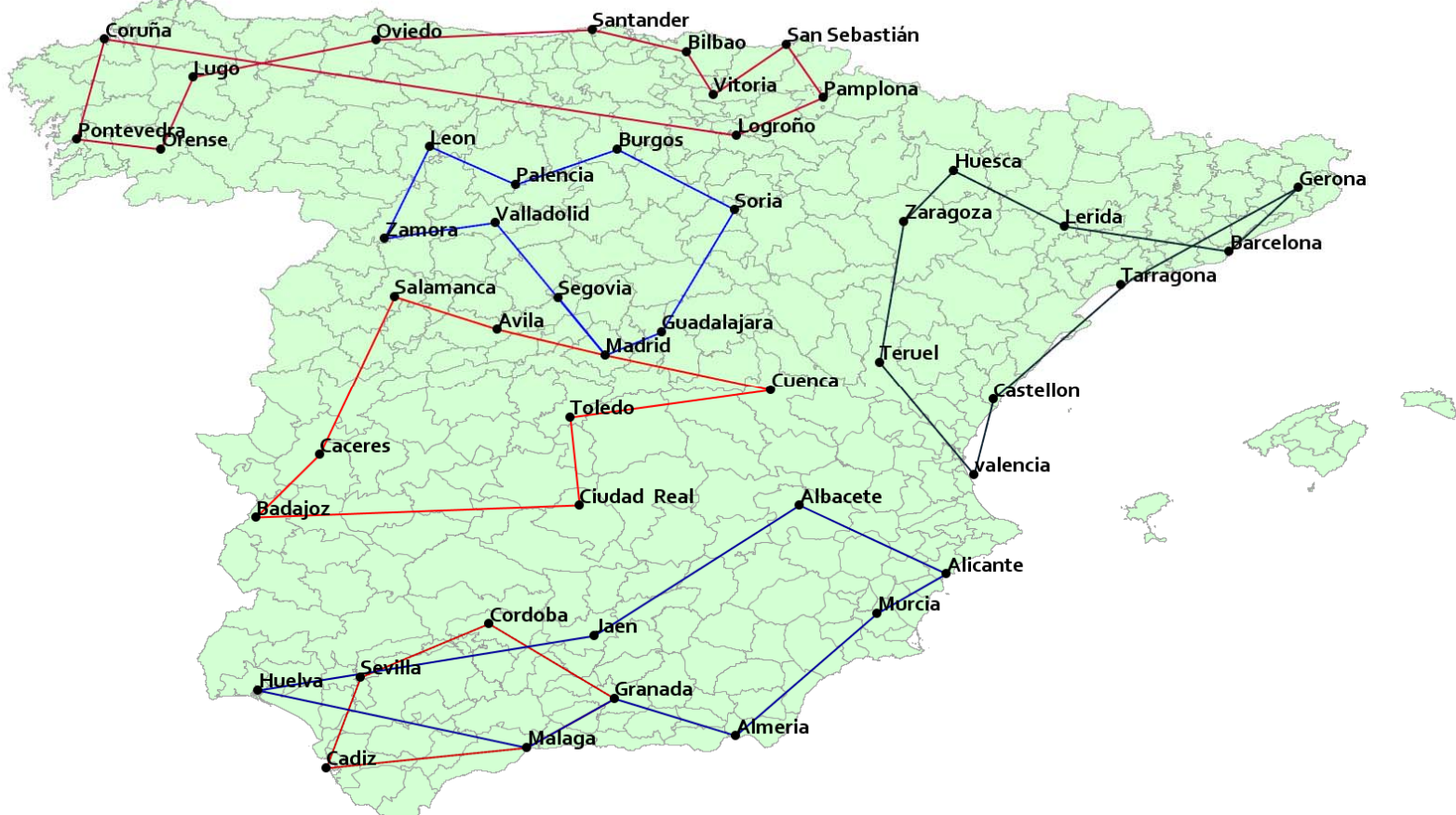
$$\text{Min} \sum_{v \in V} CV_v + \sum_{v \in V} \sum_{l \in B_v} fc_v W_{lv} + \sum_{v \in V} utc_v TV_v$$

*Fixed and variable transportation costs plus the penalties for unsatisfied demands, late services and overtime journeys*

$$\text{Min} \sum_{v \in V} CV_v + \sum_{v \in V} \sum_{l \in B_v} fc_v W_{lv} + \sum_{v \in V} utc_v TV_v + \sum_{v \in V} (co_v OVT_v + \sum_{i \in ID_v} \sum_{n \in N_i} cl_i TD_n) + \sum_{p \in Pi} \sum_{i \in I} c_{B,i} B_{ip}$$

# VRP-SCM SOLUTION

I N T E C



# VEHICLE ROUTING AND SCHEDULING PROBLEMS

I N T E C



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- ❑ **Generalization of the VRP-SCM problem** to consider the possibility of cross-docking.
- ❑ **Intermediate depots may keep finite stocks** of fast-moving products (warehousing) and act as cross-dock platforms for slow-moving, high-value items.
- ❑ **Replenishment orders and cross-docking operations** are triggered **when the initial stock in a warehouse is insufficient** to meet the demand of the assigned customers.
- ❑ Inbound and outbound vehicles must stay in receiving/shipping docks of DCs until they complete their delivery/pickup tasks.
- ❑ Target product inventories at the end of the planning horizon may be considered.

- ❑ **Product inventories at cross-dock facilities** must be traced over the planning horizon.
- ❑ The problem goal aims to **minimize fixed and variable transportation costs.**

## Route building constraints

### Allocating base nodes to vehicles

$$\sum_{l \in IB_v} \sum_{n \in N_l} Y_{nlv} \leq 1 \quad v \in V$$

### Allocating events at every node to vehicles

$$\sum_{v \in V_i} Y_{niv} \leq 1 \quad n \in N_i, i \in I$$

### Pre-ordering events occurring at the same node

$$\sum_{v \in V_i} Y_{niv} \geq \sum_{v \in V_i} Y_{n'iv} \quad (n, n') \in N_i : n' > n, i \in I$$

### Used vehicle condition

$$\sum_{i \in I_v} \sum_{n \in N_i} Y_{niv} \leq M_v \left( \sum_{l \in IB_v} \sum_{n \in N_l} Y_{nlv} \right) \quad v \in V$$

## Travelling cost constraints

### Travelling cost from the base node $l$ to the first serviced node $i$ for vehicle

$$C_{ni} \geq \sum_{l \in IB_v} \sum_{n' \in N_l} c_{ln'} Y_{n'lv} - M_C (1 - Y_{niv}) \quad n \in N_i, i \in I, v \in V_i$$

### Accumulated travelling cost for vehicle $v$ up to the stop $(n, i)$

$$\left\{ \begin{array}{l} C_{n'i'} \geq C_{ni} + c_{ii'} - M_C (1 - X_{ni, n'i'}) - M_C (2 - Y_{niv} - Y_{n'i'v}) \\ C_{ni} \geq C_{n'i'} + c_{i'i} - M_C X_{ni, n'i'} - M_C (2 - Y_{niv} - Y_{n'i'v}) \end{array} \right\}$$

$$n \in N_i, n' \in N_{i'}, (i, i') \in I, v \in V_{ii'} : i < i'$$

### Overall travelling cost for vehicle $v$

$$CV_v \geq C_{ni} + \sum_{l \in IB_v} \sum_{n' \in N_l} c_{ln'} Y_{n'lv} - M_C (1 - Y_{niv})$$

$$n \in N_i, i \in I, v \in V$$

## Travelling time constraints

Travelling cost from the assigned base node  $l \in IB_v$  to the first serviced node for vehicle  $v$

$$T_{ni} \geq \sum_{l \in IB_v} \sum_{n' \in N_l} t_{li} Y_{n'lv} + ft_l + vt_l \sum_{p \in P_i} L_{nlpv} - M_C(1 - Y_{niv})$$

$n \in N_i, i \in I, v \in V$

Travelling time for vehicle  $v$  from the assigned base node to the stop  $(n,i)$

$$\left\{ \begin{array}{l} T_{n'i'} \geq T_{ni} + ft_i + vt_i \left( \sum_{p \in P_i} L_{ni,pv} + U_{ni,pv} \right) + t_{ii'} - M_C(1 - S_{ni,n'i'}) - M_C(2 - Y_{niv} - Y_{n'i'v}) \\ T_{n'i'} \geq T_{ni} + ft_{i'} + vt_{i'} \left( \sum_{p \in P_{i'}} L_{n'i',pv} + U_{n'i',pv} \right) + t_{i'i} - M_C S_{ni,n'i'} - M_C(2 - Y_{niv} - Y_{n'i'v}) \end{array} \right.$$

$n \in N_i, n' \in N_{i'}, (i, i') \in I, v \in V_{ii'} : i < i'$

Overall travelling time for vehicle  $v$

$$OT_v \geq T_{ni} + ft_i + vt_i \left( \sum_{p \in P_i} L_{ni,pv} + U_{ni,pv} \right) + \sum_{l \in IB_v} \sum_{n' \in N_l} t_{il} Y_{n'lv} - M_C(1 - Y_{niv}) \quad n \in N_i, i \in I, v \in V$$

Time window and maximum service time constraints

$$a_i \leq T_{ni} \leq b_i \quad n \in N_i, i \in I$$

$$OT_v \leq t_v^{\max} \quad v \in V$$

## Vehicle-related constraints

### Overall product balance for every vehicle

$$\sum_{i \in IS \cup IM} \sum_{n \in N_i} L_{ni,pv} = \sum_{i \in (IM \cup ID)} \sum_{n \in N_i} U_{ni,pv} \quad p \in P, v \in V$$

### Accumulated amount of product $p$ picked up by vehicle $v$ up to the stop $(n,i)$

$$\left\{ \begin{array}{l} AL_{n'i',pv} \geq AL_{ni,pv} + L_{n'i',pv} - M_L (1 - S_{ni,n'i'}) - M_L (2 - Y_{niv} - Y_{n'i'v}) \\ AL_{ni,pv} \geq AL_{n'i',pv} + L_{ni,pv} - M_L S_{ni,n'i'} - M_L (2 - Y_{niv} - Y_{n'i'v}) \end{array} \right\} \quad n \in N_i, n' \in N_{i'}, (i, i') \in I, p \in P, v \in V_{ii'} : n < n', i \neq i'$$

$$AL_{n'i,pv} \geq AL_{ni,pv} + L_{n'i,pv} - M_L (2 - Y_{niv} - Y_{n'i'v}) \quad (n, n') \in N_i, i \in I, v \in V_i : n < n'$$

### Accumulated amount of product $p$ delivered by vehicle $v$ up to the stop $(n,i)$

$$\left\{ \begin{array}{l} UL_{n'i',pv} \geq UL_{ni,pv} + U_{n'i',pv} - M_L (1 - S_{ni,n'i'}) - M_L (2 - Y_{niv} - Y_{n'i'v}) \\ UL_{ni,pv} \geq UL_{n'i',pv} + U_{ni,pv} - M_L S_{ni,n'i'} - M_L (2 - Y_{niv} - Y_{n'i'v}) \end{array} \right\} \quad n \in N_i, n' \in N_{i'}, (i, i') \in I, p \in P, v \in V_{ii'} : n < n', i \neq i'$$

### Vehicle capacity constraints

$$\left\{ \begin{array}{l} \sum_{p \in P} uw_p (AL_{ni,pv} - AU_{ni,pv}) \leq qw_v \\ \sum_{p \in P} uv_p (AL_{ni,pv} - AU_{ni,pv}) \leq qv_v \\ AL_{ni,pv} - AU_{ni,pv} \geq 0 \end{array} \right\} \quad n \in N_i, i \in I, v \in V$$

### Bounds on variables $AU_{ni,pv}$ and $AL_{ni,pv}$

$$\left\{ \begin{array}{l} L_{ni,pv} \leq AL_{ni,pv} \leq \sum_{i' \in IS \cup IM} \sum_{n' \in N_{i'}} L_{n'i',pv} \\ U_{ni,pv} \leq AU_{ni,pv} \leq \sum_{i' \in IS \cup IM} \sum_{n' \in N_{i'}} U_{n'i',pv} \end{array} \right\} \quad n \in N_i, i \in I, v \in V, p \in P$$



Additional inventory received at cross-docking facilities from other sources

*Additional inventory received at cross-docking facilities from other sources*

$$AI_{n'ip} \geq AI_{nip} + \sum_{v \in V_i} U_{n'i,pv} \quad (n, n') \in N_i, i \in IM, p \in P : n < n'$$

*Bounds for the value of  $AI_{nip}$*

$$\sum_{v \in V_i} U_{ni,pv} \leq AI_{nip} \leq \sum_{n' \in N_i} \sum_{v \in V_i} U_{n'i,pv} \quad n \in N_i, i \in IM, p \in P$$

Objective Function

$$\text{Min} \left[ \sum_{v \in V} CV_v + \sum_{v \in V} \sum_{l \in IB_v} \sum_{n \in N_l} fc_v Y_{nlv} \right]$$

$$\text{Min} \left[ \sum_{v \in V} OT_v \right]$$

- ❑ Transportation is a **significant link between different stages** in a global supply chain.
- ❑ Small reductions in transportation expenses could result in **substantial total savings** over a number of years.
- ❑ The use of **vehicle routing and scheduling models and techniques** can be instrumental in realizing those savings.
- ❑ Different types of vehicle routing problems have been studied over the years; most of them dealing **with single-echelon networks and a single type of operation** (pickup or delivery) at every location.
- ❑ Since they are NP-hard, solution methods based on **metaheuristic techniques** are generally applied.
- ❑ Recently, **new model-based approaches** have been developed for the operational planning of **multi-echelon distribution networks**
- ❑ The **so-called VRPCD-SCM** problem includes many features usually arising in the operation **of real-world distribution networks**.
- ❑ Further work on this area is still under way in order to **address current industrial needs**

I N T E C



**THANKS FOR YOUR ATTENTION**

**QUESTIONS?**