

# Project V

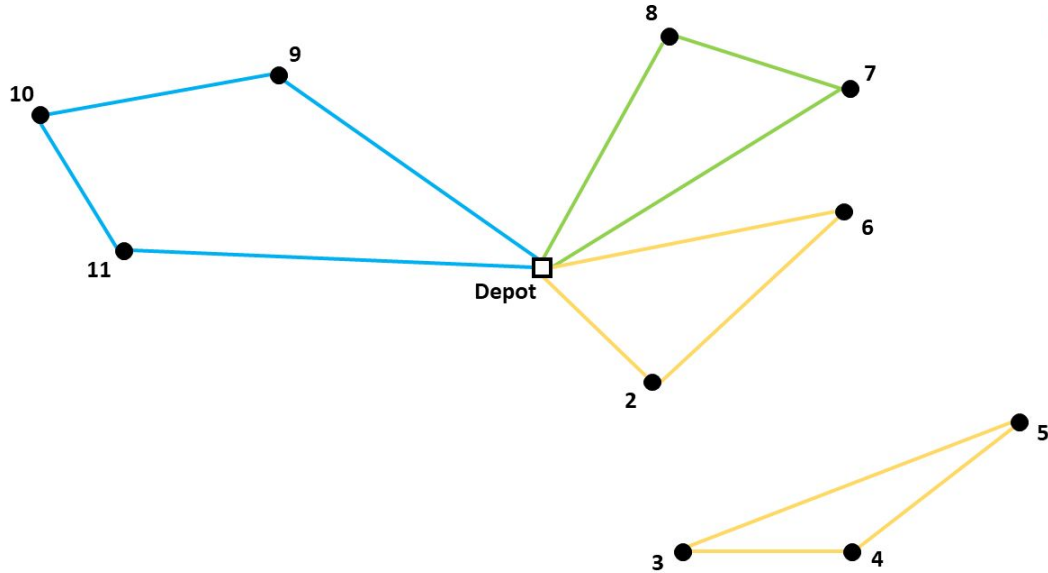
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# Initial Approach...

- $n$  is the number of clientes
- $N$  is set of clients, with  $N = \{1, 2, \dots, n\}$
- $V$  is set of vertices (or nodes), with  $V = \{0\} \cup N$
- $A$  is set of arcs, with  $A = \{(i, j) \in V^2 : i \neq j\}$
- $c_{ij}$  is cost of travel over arc  $(i, j) \in A$
- $Q$  is the vehicle capacity
- $q_i$  is the amount that has to be delivered to customer  $i \in N$

$$\begin{aligned} \min \quad & \sum_{i,j \in A} c_{ij} x_{ij} \\ \text{s.t.} \quad & \sum_{j \in V, j \neq i} x_{ij} = 1 & i \in N \\ & \sum_{i \in V, i \neq j} x_{ij} = 1 & j \in N \\ & \text{if } x_{ij} = 1 \Rightarrow u_i + q_j = u_j & i, j \in A : j \neq 0, i \neq 0 \\ & q_i \leq u_i \leq Q & i \in N \\ & x_{ij} \in \{0, 1\} & i, j \in A \end{aligned}$$

# Subtour Problem

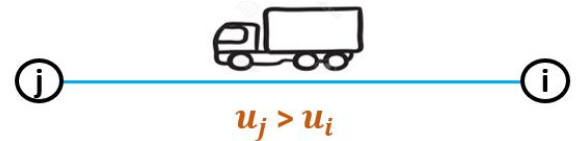


$$\begin{aligned}
 \min \quad & \sum_{i,j \in A} c_{ij} x_{ij} \\
 \text{s.t.} \quad & \sum_{j \in V, j \neq i} x_{ij} = 1 & i \in N \\
 & \sum_{i \in V, i \neq j} x_{ij} = 1 & j \in N
 \end{aligned}$$

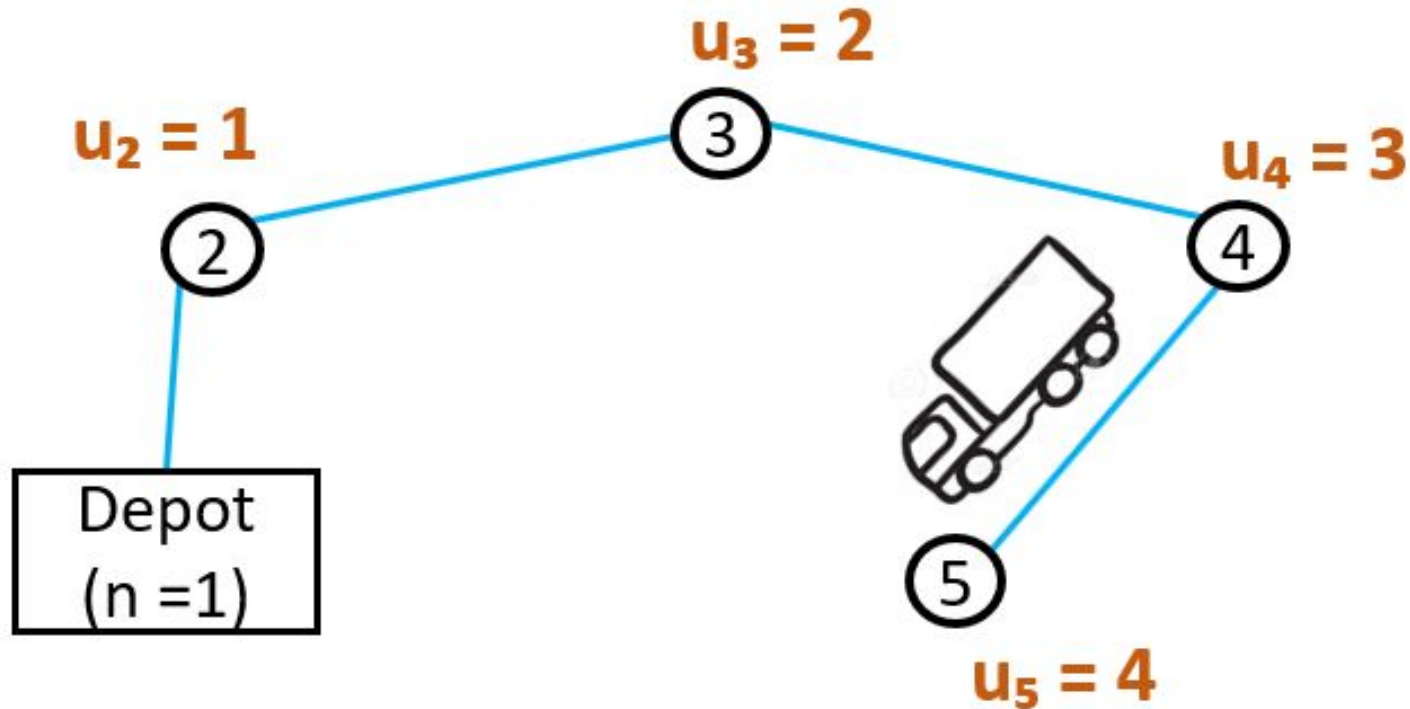
$$\text{if } x_{ij} = 1 \Rightarrow u_i + q_j = u_j \quad i, j \in A : j \neq 0, i \neq 0$$

$$q_i \leq u_i \leq Q \quad i \in N$$

$$x_{ij} \in \{0, 1\} \quad i, j \in A$$



# Miller-Tucker-Zemlin (Subtour Constraint)



# Performance

	Nodes	IDFJ	MTZ	Best Solution
Data31	40	683	691	IDFJ
Data32	40	651	651	-
Data33	40	571	612	IDFJ
Data34	60	936	813	MTZ
Data35	60	687	687	-
Data36	60	924	864	MTZ
Data37	80	920	839	MTZ
Data38	80	1249	1027	MTZ
Data39	80	1201	978	MTZ
Data40	100	1314	912	MTZ
Data41	100	1386	1246	MTZ

**Nodes** = Nodes in instance

**IDFJ** = Implicit  
Dantzig-Fulkerson-Johnson  
formulation

**MTZ** = Miller-Tucker-Zemlin  
formulation

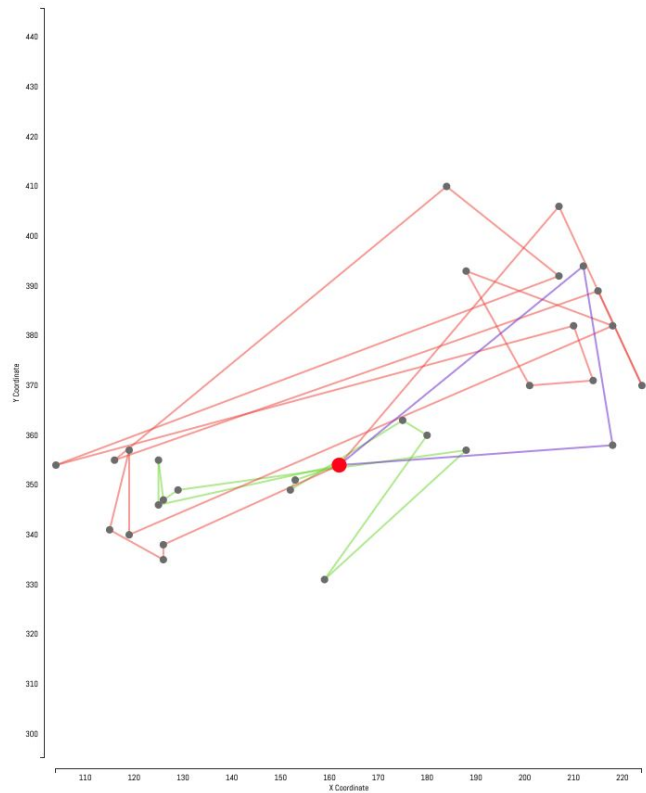
# Transitioning to Simulated Annealing

The first mathematical formulation and algorithm for the solution of the CVRP was proposed by Dantzig and Ramser [2] in 1959 and five years later, Clarke and Wright [1] proposed the first heuristic for this problem. To date, many solution methods for the CVRP have been published. General surveys can be found in Toth and Vigo [11] and Laporte [7]. The CVRP belongs to the category of NP hard problems that can be exactly solved only for small instances of the problem. Therefore, researchers have concentrated on developing heuristic algorithms to solve this problem (for example [6], [3]).

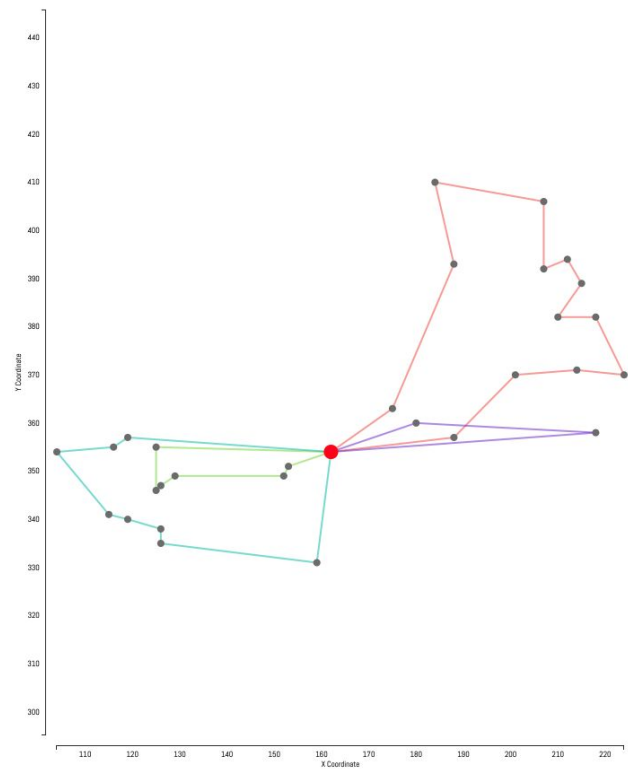
# Simulated Annealing

1. Get starting feasible solution (greedy bin-packing)
2. For each route in solution, solve TSP via Simulated Annealing
  - a. Neighborhood does random swaps between points
3. Overall Simulated Annealing
  - a. Neighborhood = Replace Highest Average
4. Repeat until 10,000 iterations
5. Random restart 4 times

# Simulated Annealing



Simulated  
Annealing





# Lessons Learned

- Always read literature before diving in
- CPLEX can't solve everything
- Having a good neighborhood function is important for S.A.
- Starting solution very important for ensuring quality results form S.A.
- Simulated-Annealingception!

