

# Traveling Salesman Problem

#EX14: LP with subtours

- 1) Try to solve the TSP with a LP matching model. Use the `scipy.linprog` package. For the cities coordinates use random points.
- 2) Plot the resulting network with the `matplotlib` library.
- 3) Understand the outputs. What happens to the optimal path?
- 4) What are the alternatives to this formulation and their disadvantages?

$$\min \sum_{ij \in A} c_{ij} x_{ij}$$

$$\sum_j x_{ij} = 1$$

$$\sum_i x_{ij} = 1$$

$$x_{ij} \geq 0 \quad \forall ij \in A$$

# Traveling Salesman Problem

## #EX14: Genetic Algorithm

- 1) Solve the TSP with an original implementation of the Genetic Algorithm (GA).

### Simplified Pseudocode:

X, Y = **GenerateCitiesCoordinates**(n<sup>o</sup> of cities)

initial\_population = **RandomPopulation**(population size)

fitness\_results = **RankRoutes**(initial\_population)

**while** no\_improvement below limit:

    parents = **PerformSelection**(fitness\_results, elite\_size)

    population = **GetNextGeneration**(parents, mutation\_rate)

    fitness\_results = **RankRoutes**(population)

    if max(fitness\_results) > best\_fitness:

        save route that corresponds to max(fitness\_results)

    else: increase no\_improvement

# Traveling Salesman Problem

## #EX14: Genetic Algorithm

Route: tour of cities depending on when will they be visited. For the GA, **chromosome** = route, **gene** = city

1	3	4	2	5	6	7	8
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Population: set of different routes to select from. This is the genome.

Always remember the TSP Rules!!:

- Each city should be visited only 1 time.
- After the tour is completed we have to reach the city from which we started from.

# Traveling Salesman Problem

## #EX14: Genetic Algorithm

Elite size: number of routes that will make it unchanged to the next generation.

Selection: select parents from a population to get children routes. **We use 'Fitness proportionate selection'**. Chromosomes with higher score have more chances to be selected (analog to a spinning wheel)



# Traveling Salesman Problem

## #EX14: Genetic Algorithm

### Next generation techniques:

1) Crossover: get a children route from two parents. **We use 'ordered crossover'** in order to preserve the TSP rules.

Parent 1	1	3	4	2	5	6	7	8
Parent 2	2	3	5	7	6	1	8	4
Child	3	7	4	2	5	6	1	8

2) Mutation: with a low rate, make a change in certain routes. **We use 'random swap'**.



# Traveling Salesman Problem

## #EX15: Greedy Randomize Adaptive Search Procedure

- 1) Solve the TSP with an original implementation of the Greedy Randomize Adaptive Search Procedure (GRASP).

### Simplified Pseudocode:

```
best_route = ConstructRandomSolution()
```

```
while no_improvement below limit:
```

```
    candidate = GreedyRandomizedConstruction(alpha)
```

```
    candidate = LocalSearch(candidate)
```

```
    if cost(candidate) < cost(best_route):
```

```
        best_route = candidate
```

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# Traveling Salesman Problem

## #EX15: Greedy Randomize Adaptive Search Procedure

### Greedy Randomized Procedure:

- Step-wise construction of a candidate solution. Construct and select route from restricted candidate list (RCL)

### Pseudocode:

candidate\_route = [initial\_city]

**while** length(candidate\_route) < length(city\_list):

**calculate** features costs (cost of adding feature\_i to solution)

**for** feat\_i in all features costs:

**if** (feat\_cost\_i <= feat\_cost\_min + alpha \* (feat\_cost\_max – feat\_cost\_min))

**add** feature\_i to **RCL**

**add** random feature from RCL to candidate\_route



# Traveling Salesman Problem

## #EX15: Greedy Randomize Adaptive Search Procedure

### Local Search procedure:

- Any heuristic could be selected to fulfill this procedure. **We will use the stochastic 2-opt heuristic.**

Given any route:



Select two random splitting points:



The tour comprised between them will be swapped:

