



Genetic Algorithms

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Agenda

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3. Recombination
4. RAR-Mutation
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Motivation

- Proposed by J. Holland [1975]
- Applicable to ill-defined problems
- Imitates *natural selection*:
 - Chromosom = particular solution
 - Evolution = Exclusion of worst solutions



Simple Genetic-Algorithm

Initial: $X^1 = \{x_1^1, \dots, x_N^1\}$

for t = 1 to T

for j = 1 to k

Step1: **Reproduction** (Selecting two parent chromosomes from X^t)

Step2: **Recombination** (Generate two offspring from the two parents chromosomes using a crossover operator.)

Step3: **Mutation** (Apply a random mutation to each offspring with small probability)

Step4: **Generation Replacement**

(removing the worst solution in X^t and replace by offspring.)



Recombination

One-point crossover

Parent 1	:	0	1	2	3	4	5
Parent 2	:	0	4	3	2	5	1
Offspring 1:		0	1	2	2	5	1
Offspring 2:		0	4	3	3	4	5

Order crossover(OX-Method)

Parent 1	:	0	1	2	3	4	5
Parent 2	:	0	4	3	2	5	1
Offspring 1:		-	-	-	3	4	-
Offspring 1:		0	2	5	3	4	1



OX-Crossover

Step 1: Select two random Parents

Step 2: Select a String between cut-points from Parent1 and copy it to offspring

Step 3: Filtering all variables existing in the cut String out of Parent2

Step 4: Fill the rest of the offspring with the filtered variables of Parent 2

$l \leftarrow 1$

$m \leftarrow 1$

► Step 1

create random i

create random j

select parent P1

select Parent P2

if ($i = j$) restart

if ($i > j$) $i \leftrightarrow j$

For $k \leftarrow i$ to j ► Step 2

Off[k] \leftarrow P1[k]

For $k \leftarrow 1$ to length P2 ► Step 3

if P2[k] is not Element of Off []

X[l] \leftarrow P2[k]

$l \leftarrow l+1$

For $K \leftarrow 1$ to $i-1$ ► Step 4

Off[k] \leftarrow X[m]

$m \leftarrow m+1$

For $K \leftarrow j+1$ to length P2

Off[k] \leftarrow X[m]

$m \leftarrow m+1$



RAR-Mutation

Pseudocode:

create random i; create random j

if (i = j) Then restart

if (i < j) Then

temp \leftarrow A[i]

For k \leftarrow i to j-1

A[k] \leftarrow A[k+1]

A[j] \leftarrow temp

Elseif (i > j) Then [analog...]

Offspring 1:	0	1	<u>2</u>	3	4	5
Offspring 1:	0	1	3	4	<u>2</u>	5



What is the VRP ?

- Everybody knows the Traveling Salesman Problem(TSP)
- A Expansion of the TSP, is the mTSP (multiple TSP), where the Cities witch must be visit, are divided to many Travelers.
- The Vehicle Routing Problem(VRP) is a mTSP with additive Capacities.

(A specialization for the VRP is the capacitated VRP (CVRP), where all Transporters have the same Capacity.)



VRP-Solution

- Given a solution to VRP with multiple routes contains multiple copies of the depot, with each copy acting as a separator between two routes
- Example: The String would correspond to a VRP Solution.
- The first route contains vertices 1 and 2, the second route contain vertice 4 and the last route only contains vertex 5.
- A classical crossover operator and a RAR mutation operator are then adapted for this representation.
- Working until the required number of feasible offspring is produced (infeasible offspring are discarded)

- **Representation:**

String	:	0	1	2	0	4	0	5
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Conclusion

- Solutions of GA, Simulated Annealing and Tabu-Search are of comparable quality
 - GA was more computationally expensive than other methods like simple construction heuristics with improvement procedures
 - GA are not yet competitive on VRP but on some other similar problems
- ➔ Further research on VRP could lead to competitive implementations.