

KU LEUVEN

GENETIC ALGORITHMS

TSP

Author:

Alejandro RODRÍGUEZ SALAMANCA: r0650814@student.kuleuven.be
Fernando COLLADO EGEA: r0650814@student.kuleuven.be

January 6, 2017

Contents

1	Experiments	1
2	Appendix	1
2.1	tsp_ImprovePopulation.m	1
2.2	run_ga.m	2
2.3	insertion.m	4
2.4	order_crossover.m	5
2.5	order_low_level.m	6
2.6	tspgui.m	8
2.7	tspfun.m	8
2.8	mutateTSP.m	9

1 Experiments

no loop detection, 50 individuals, 100 generations, 5 pr mutation, 95 pr crossover, 5% elite.
16 cities 5.328203 3.5417 8.262045 3.7098 8.712387 3.6799 8.569090 3.5928
Same with 18 cities 14.058956 3.526 9.053208 3.4481 8.518912 3.1463 8.703639 3.4115
23 cities 8.469464 4.4202 8.421920 4.9056 8.751834 4.9177 8.352938 4.9312
25 cities 9.033588 6.4734 8.593667 6.0601 8.544754 6.4646 9.093625 6.0974
48 cities 9.284919 11.3248 8.837234 11.1833 8.765404 11.3676 9.322479 11.4889
50 cities 9.372256 15.883 9.060394 15.8207 8.916035 16.8945 9.168466 16.9276
51 cities 8.821235 15.6717 8.918025 15.5546 9.583848 14.8687 9.635809 15.8326
67 cities 9.603053 15.6171 9.084740 16.1501 9.176364 15.6805 9.108434 16.27
70 cities 9.888628 25.9827 10.043178 25.2098 9.517789 24.5681 9.443164 24.6575
100 cities 10.273545 39.1235 9.884619 39.5773 10.742947 37.024 9.888532 39.4329
127 cities 10.772273 23.7809 10.371431 24.283 10.233814 24.0806 10.217393 23.8229s

2 Appendix

- Path representation - Order Crossover (<http://www.dca.fee.unicamp.br/~gomide/courses/EA072/artigos/>)
- Insertion mutation (<http://mnemstudio.org/geneticalgorithmsmutation.htm>)

2.1 tsp_ImprovePopulation.m

```
1 % tsp_ImprovePopulation.m
2 % Author: Mike Matton
3 %
4 % This function improves a tsp population by removing local loops
   from
5 % each individual.
6 %
```

```

7 % Syntax: improvedPopulation = tsp_ImprovePopulation(popsiz ,
  ncities , pop , improve , dists)
8 %
9 % Input parameters:
10 %   popsize           – The population size
11 %   ncities           – the number of cities
12 %   pop               – the current population (adjacency
  representation)
13 %   improve           – Improve the population (0 = no improvement
  , <>0 = improvement)
14 %   dists             – distance matrix with distances between the
  cities
15 %
16 % Output parameter:
17 %   improvedPopulation – the new population after loop removal (
  if improve
18 %                       <> 0, else the unchanged population).
19
20 function newpop = tsp_ImprovePopulation(popsiz , ncities , pop ,
  improve , dists)
21
22 if (improve)
23   for i=1:popsiz
24
25     result = improve_path(ncities , pop(i,:) , dists);
26
27     pop(i,:) = path2adj(result);
28
29   end
30 end
31
32 newpop = pop;

```

2.2 run_ga.m

```

1 function run_ga(x, y, NIND, MAXGEN, NVAR, ELITIST, STOP_PERCENTAGE
  , PR_CROSS, PR_MUT, CROSSOVER, LOCALLOOP, ah1 , ah2 , ah3)
2 % usage: run_ga(x, y,
3 %             NIND, MAXGEN, NVAR,
4 %             ELITIST, STOP_PERCENTAGE,
5 %             PR_CROSS, PR_MUT, CROSSOVER,
6 %             ah1 , ah2 , ah3)
7 %
8 %

```

```

9 % x, y: coordinates of the cities
10 % NIND: number of individuals
11 % MAXGEN: maximal number of generations
12 % ELITIST: percentage of elite population
13 % STOP_PERCENTAGE: percentage of equal fitness (stop criterium)
14 % PR_CROSS: probability for crossover
15 % PR_MUT: probability for mutation
16 % CROSSOVER: the crossover operator
17 % calculate distance matrix between each pair of cities
18 % ah1, ah2, ah3: axes handles to visualise tsp
19 {NIND MAXGEN NVAR ELITIST STOP_PERCENTAGE PR_CROSS PR_MUT
    CROSSOVER LOCALLOOP};

20
21     tic;
22     GGAP = 1 - ELITIST;
23     mean_fits=zeros(1,MAXGEN+1);
24     worst=zeros(1,MAXGEN+1);
25     Dist=zeros(NVAR,NVAR);
26     for i=1:size(x,1)
27         for j=1:size(y,1)
28             Dist(i,j)=sqrt((x(i)-x(j))^2+(y(i)-y(j))^2);
29         end
30     end
31     % initialize population
32     Chrom=zeros(NIND,NVAR);
33     for row=1:NIND
34         %Chrom(row,:)=path2adj(randperm(NVAR));
35         Chrom(row,:)=randperm(NVAR);
36     end
37     gen=0;
38     % number of individuals of equal fitness needed to stop
39     stopN=ceil(STOP_PERCENTAGE*NIND);
40     % evaluate initial population
41     ObjV = tspfun(Chrom, Dist);
42     best=zeros(1,MAXGEN);
43     % generational loop
44     while gen<MAXGEN
45         sObjV=sort(ObjV);
46         best(gen+1)=min(ObjV);
47         minimum=best(gen+1);
48         mean_fits(gen+1)=mean(ObjV);
49         worst(gen+1)=max(ObjV);
50         for t=1:size(ObjV,1)
51             if (ObjV(t)==minimum)
52                 break;

```

```

53         end
54     end
55
56     %visualizeTSP(x,y,adj2path(Chrom(t,:)), minimum, ah1,
57         gen, best, mean_fits, worst, ah2, ObjV, NIND, ah3);
58     visualizeTSP(x,y,Chrom(t,:), minimum, ah1, gen, best,
59         mean_fits, worst, ah2, ObjV, NIND, ah3);
60
61     if (sObjV(stopN)-sObjV(1) <= 1e-15)
62         break;
63     end
64     %assign fitness values to entire population
65     FitnV=ranking(ObjV);
66     %select individuals for breeding
67     SelCh=select('sus', Chrom, FitnV, GGAP);
68     %recombine individuals (crossover)
69     SelCh = recomb(CROSSOVER,SelCh,PR_CROSS);
70     %SelCh=mutateTSP('inversion',SelCh,PR_MUT);
71     SelCh=mutateTSP('insertion',SelCh,PR_MUT); % <— line
72     changed, now insertion mutation is used
73     %evaluate offspring, call objective function
74     ObjVSel = tspfun(SelCh, Dist);
75     %reinsert offspring into population
76     [Chrom, ObjV]=reins(Chrom, SelCh, 1, 1, ObjV, ObjVSel);
77
78     Chrom = tsp_ImprovePopulation(NIND, NVAR, Chrom,
79         LOCALLOOP, Dist);
80     %increment generation counter
81     gen=gen+1;
82 end
83 toc;
84 minimum
85 end

```

2.3 insertion.m

```

1 % low level function for TSP mutation
2 % Representation is an integer specifying which encoding is used
3 % 1 : adjacency representation
4 % 2 : path representation
5 %
6
7 function NewChrom = insertion(OldChrom)
8

```

```

9      NewChrom = OldChrom;
10     % select two positions in the tour
11     rndi = zeros(1,2);
12     while rndi(1) == rndi(2)
13         rndi=rand_int(1,2,[1 size(NewChrom,2)]);
14     end
15     rndi = sort(rndi);
16
17     % get the value of the first random position
18     temp = NewChrom(rndi(1));
19     % insert this value in the second random position
20     NewChrom = insertAt(NewChrom, temp, rndi(2));
21     % remove the first random position
22     NewChrom(rndi(1)) = [];
23     % End of function
24 end
25
26 function arrOut = insertAt(arr, val, index)
27     if index == numel(arr)+1
28         arrOut = [arr val];
29     else
30         arrOut = [arr(1:index-1) val arr(index:end)];
31     end
32 end

```

2.4 order_crossover.m

```

1 % Syntax: NewChrom = order_crossover(OldChrom, XOVR)
2 %
3 % Input parameters:
4 %     OldChrom  - Matrix containing the chromosomes of the old
5 %                population. Each line corresponds to one
6 %                individual
7 %                (in any form, not necessarily real values).
8 %     XOVR      - Probability of recombination occurring between
9 %                pairs
10 %                of individuals.
11 %
12 % Output parameter:
13 %     NewChrom  - Matrix containing the chromosomes of the
14 %                population
15 %                after mating, ready to be mutated and/or
16 %                evaluated,
17 %                in the same format as OldChrom.

```

```

14 %
15
16 function NewChrom = order_crossover (OldChrom, XOVR)
17
18 if nargin < 2, XOVR = NaN; end
19 [rows,~]=size (OldChrom) ;
20
21 maxrows=rows;
22 if rem(rows,2)~=0
23     maxrows=maxrows-1;
24 end
25
26 for row=1:2:maxrows
27
28     % crossover of the two chromosomes
29     % results in 2 offsprings
30     if rand<XOVR % recombine with a given probability
31         MatrixChrom = order_low_level ([OldChrom(row,:) ; OldChrom(
32             row+1,:)]) ;
33         NewChrom(row,:) = MatrixChrom(1, :) ;
34         NewChrom(row+1,:) = MatrixChrom(2, :) ;
35     else
36         NewChrom(row,:) = OldChrom(row,:) ;
37         NewChrom(row+1,:) = OldChrom(row+1,:) ;
38     end
39 end
40
41 if rem(rows,2) ~= 0
42     NewChrom(rows,:) = OldChrom(rows,:) ;
43 end
44 % End of function

```

2.5 order_low_level.m

```

1 % low level function for calculating an offspring
2 % given 2 parent in the Parents - argument
3 % Parents is a matrix with 2 rows, each row
4 % represent the genotype of the parent
5 %
6 % Returns a matrix containing the offspring
7
8
9 function Offspring=order_low_level(Parents)

```

```

10
11     cols = size(Parents,2);
12
13     Offspring=zeros(2,cols);
14
15     start_index = rand_int(1, 1, [1, cols - 1]);
16     end_index = rand_int(1, 1, [start_index + 1, cols]);
17
18     Offspring(1, start_index:end_index) = Parents(2, start_index:
19         end_index);
20     Offspring(2, start_index:end_index) = Parents(1, start_index:
21         end_index);
22
23     for off=1:2
24         Buff = Parents(off,:);
25         Buff = [Buff(end_index+1:end), Buff(1:end_index)];
26
27         members = ismember(Buff, Offspring(off, :));
28         Buff(members == 1) = 0;
29
30         ii = 1;
31         X = find(Buff);
32         for jj=1:start_index - 1
33             if Buff(X(ii)) ~= 0
34                 Offspring(off, jj) = Buff(X(ii));
35                 Buff(X(ii)) = 0;
36                 ii = mod(ii, cols) + 1;
37             end
38         end
39
40         ii = 1;
41         X = find(Buff);
42         for jj=end_index + 1:cols
43             if Buff(X(ii)) ~= 0
44                 Offspring(off, jj) = Buff(X(ii));
45                 Buff(X(ii)) = 0;
46                 ii = mod(ii, cols) + 1;
47             end
48         end
49         %Offspring(off, end_index+1:end) = Buff(start_index:end);
50         %Offspring(off, 1:start_index - 1) = Buff(1:start_index -
51             1);
52     end
53 % end function

```

2.6 tspgui.m

```
1 CROSSOVER = 'order_crossover'; % default crossover operator}
2 crossover = uicontrol(ph,'Style','popupmenu', 'String',{'
    order_crossover'}, 'Value',1,'Position',[10 50 130 20],'
    Callback',@crossover_Callback);
```

2.7 tspfun.m

```
1 %
2 % ObjVal = tspfun(Phen, Dist)
3 % Implementation of the TSP fitness function
4 % Phen contains the phenocode of the matrix coded in path
5 % representation
6 % Dist is the matrix with precalculated distances between each
    pair of cities
7 % ObjVal is a vector with the fitness values for each candidate
    tour
8 % (=each row of Phen)
9 %
10
11 function ObjVal = tspfun(Phen, Dist)
12     % the objective function works with adjacency representation.
    In this
13     % version, path representation is used, so the fitness
    function should
14     % be adapted. Now, the phenotype is converted to adjacency
    representation first, and then, the Objective Value is
15     % computed as it
    % was computed in the original version.
16     adj = zeros(size(Phen));
17     for row=1:size(Phen)
18         adj(row,:) = path2adj(Phen(row,:));
19     end
20
21
22     ObjVal = Dist(adj(:,1), 1);
23     for t=2:size(adj,2)
24         ObjVal=ObjVal + Dist(adj(:,t), t);
25     end
26
27 % End of function
```

2.8 mutateTSP.m

```
1 % MUTATE_TSP.M      (MUTATion for TSP high-level function)
2 %
3 % This function takes a matrix OldChrom containing the
4 % representation of the individuals in the current population,
5 % mutates the individuals and returns the resulting population.
6 %
7 % Syntax:  NewChrom = mutate(MUT_F, OldChrom, MutOpt)
8 %
9 % Input parameter:
10 %   MUT_F      - String containing the name of the mutation
11 %               function
12 %   OldChrom    - Matrix containing the chromosomes of the old
13 %               population. Each line corresponds to one
14 %               individual.
15 %   MutOpt      - mutation rate
16 % Output parameter:
17 %   NewChrom    - Matrix containing the chromosomes of the
18 %               population
19 %               after mutation in the same format as OldChrom.
20 %
21 function NewChrom = mutateTSP(MUT_F, OldChrom, MutOpt)
22 % Check parameter consistency
23 if nargin < 2, error('Not enough input parameters'); end
24 [rows, ~] = size(OldChrom);
25 NewChrom = OldChrom;
26
27 for r = 1:rows
28     if rand < MutOpt
29         NewChrom(r, :) = feval(MUT_F, OldChrom(r, :));
30     end
31 end
32
33 % End of function
```