

Example of Genetic algorithm

The MAXONE problem: Suppose we want to maximize the number of ones in a string of L binary digits.

An individual is encoded (naturally) as a string of L binary digits. Let's say $L = 10$.
Then, $L = 0000000001$ (10 bits)

The fitness function is:

$$f(\text{chromosome}) = \text{COUNTONE}(S_i)$$

We start with a population of n random strings. Suppose that $L = 10$ and $n = 6$
We toss a fair coin 60 times and get the following initial population:

S1 = 1111010101
S2 = 0111000101
S3 = 1110110101
S4 = 0100010011
S5 = 1110111101
S6 = 0100110000

Solution No.	Solution	$f(\text{chromosome}) = \text{COUNTONE}(S_i)$	$\%p_i = f_i / \sum f_i * 100$
S1	1111010101	7	20.59
S2	0111000101	5	14.71
S3	1110110101	7	20.50
S4	0100010011	4	11.76
S5	1110111101	8	23.52
S6	0100110000	3	8.82
Σ		34	100

Reproduction:

Roulette Wheel selection is used for generating four chromosomes for the next generation.
Suppose that, after performing selection, we get the following population:

S1' = 1111010101 (S1)
S2' = 1110110101 (S3)
S3' = 1110111101 (S5)
S4' = 0111000101 (S2)
S5' = 0100010011 (S4)
S6' = 1110111101 (S5)

Crossover

Suppose that we decide to actually perform crossover only for couples (S1', S2') and (S5', S6'). For each couple, we randomly extract a crossover point, for instance 2 for the first and 5 for the second.

Before Crossover:

S1' = 1111010101

S2' = 1110110101

S5' = 0100010011

S6' = 1110111101

After Crossover:

S1'' = 1110110101

S2'' = 1111010101

S5'' = 0100011101

S6'' = 1110110011

Mutation

Before applying mutation:

S1`` = 1110110101

S2`` = 1111010101

S3`` = 1110111101

S4`` = 0111000101

S5`` = 0100011101

S6`` = 1110110011

After applying mutation:

S1''' = 1110100101 (6)

S2''' = 1111110100 (7)

S3''' = 1110111101 (8)

S4''' = 0111000101 (5)

S5''' = 0000011101 (4)

S6''' = 1111110111 (9)

In one generation, the total population fitness changed from 34 to 39, thus improved by ~13%.

At this point, we go through the same process all over again, until a stopping criterion is met.

Solution No.	Solution	$f(\text{chromosome}) = \text{COUNTONE}(S_i)$	$\%pi = f_i / \sum f_i * 100$
S1	1110100101	6	15.38
S2	1111110100	7	17.95
S3	1110111101	8	20.51
S4	0111000101	5	12.82
S5	0000011101	4	10.26
S6	1111110111	9	23.08
Σ		39	100

Reproduction:

Roulette Wheel selection is used for generating four chromosomes for the next generation. Suppose that, after performing selection, we get the following population:

$S1' = 1110100101$ (S1)
 $S2' = 1110111101$ (S3)
 $S3' = 1111110111$ (S6)
 $S4' = 0000011101$ (S5)
 $S5' = 1111110111$ (S6)
 $S6' = 1111110100$ (S2)

Crossover

Suppose that we decide to actually perform crossover only for couples ($S1'$, $S2'$) and ($S5'$, $S6'$). For each couple, we randomly extract a crossover point, for instance 2 for the first and 5 for the second.

Before Crossover:

$S1' = 1110100101$
 $S2' = 1110111101$

$S5' = 1111110111$
 $S6' = 1111110100$

After Crossover:

$S1'' = 1110111101$
 $S2'' = 1110100101$

$S5'' = 1111110100$
 $S6'' = 1111110111$

Mutation:**Before applying mutation:**

$S1'' = 11101\mathbf{1}1101$
 $S2'' = 1110100111$
 $S3'' = 1111110111$
 $S4'' = 0000011101$
 $S5'' = 11111101\mathbf{00}$
 $S6'' = 111111\mathbf{0}111$

After applying mutation:

$S1''' = 11101\mathbf{0}1101$ (7)
 $S2''' = 1110100111$ (7)
 $S3''' = 1111110111$ (9)
 $S4''' = 0000011101$ (4)
 $S5''' = 11111101\mathbf{10}$ (8)
 $S6''' = 111111\mathbf{1}111$ (10)

Thus the solution $S6'''$ is {1111111111} that has highest fitness value has been found.

Example 2

Using genetic algorithm maximize $f(x) = x^2$
over $\{0, 1, 2, \dots, 15\}$ with initial x value
of $\{1, 6, 8, 10\}$

	x -value	Initial	$f(x) = x^2$	$\%P_i = f_i / \sum f_i * 100$
S_1	1	0001	1	0.49
S_2	6	0110	36	17.91
S_3	8	1000	64	31.84
S_4	10	1010	100	49.75
Σ			201	

Reproduction

- Roulette wheel selection is used for generating four chromosomes for the next generation
- Suppose after performing selection, we get the following population

$$S'_1 = 1000 (S_3)$$

$$S'_2 = 1010 (S_4)$$

$$S'_3 = 0110 (S_2)$$

$$S'_4 = 1010 (S_4)$$

Crossover

- Suppose that we decide to perform crossover for couples (s_2', s_3')

⇒ Before crossover

$$s_2' = 1 \mid 0 \mid 0$$

$$s_3' = 0 \mid 1 \mid 0$$

⇒ After crossover

$$s_2'' = 1 \mid 1 \mid 0$$

$$s_3'' = 0 \mid 0 \mid 0$$

Mutation

Before applying mutation

$$s_1'' = 1 \underline{0} 0 0$$

$$s_2'' = 1 1 1 0$$

$$s_3'' = 0 \underline{0} 1 0$$

$$s_4'' = 1 0 1 0$$

After applying mutation

$$s_1''' = 1 1 0 0$$

$$s_2''' = 1 1 1 0$$

$$s_3''' = 0 1 1 0$$

$$s_4''' = 1 0 1 0$$

Mutation
x-value

$$f(x) = x^2$$

$$\%PI = f_i / \sum f_i \times 100$$

12

144

30.25

14

196

41.18

6

36

7.56

10

100

21

476