Alexandar Mihaylov

Luisa Rojas

PARALLEL
GENETIC ALGORITHMS

OVERVIEW

WHAT IS IT?

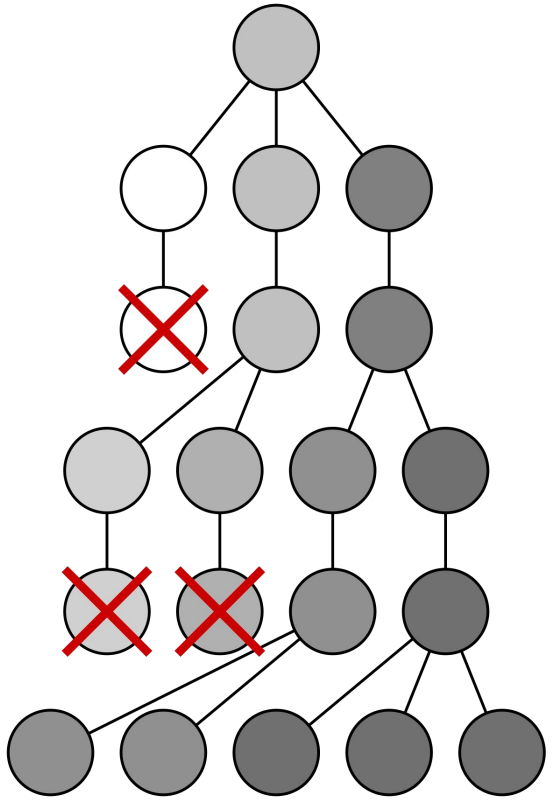
An adaptive heuristic **search algorithm** based on natural selection.

WHAT'S THE GOAL?

Find the target.

HOW?

It modifies a given population. At each step, it selects individuals at random from said population and uses them to produce a new child.



TERMINOLOGY

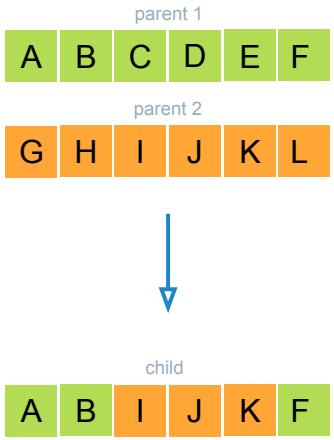
SELECTION

Select the individuals [*parents*], that will be used to create a new candidate for the next generation.

Randomized, but prioritizing the best candidates in the population [*genepool*].

CROSSOVER

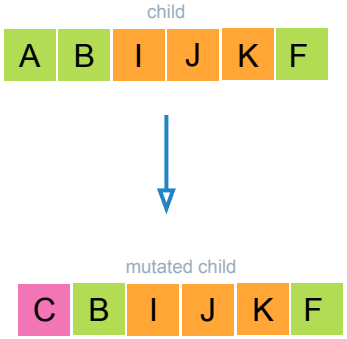
Combine two parents to form children for the next generation.



MUTATION

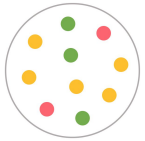
Apply random changes to the resulting child.

This is to prevent the loss of potentially relevant data.



Sequential

1.
GENERATE GENEPOOL



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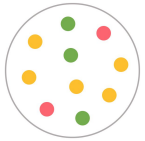

2.
MODIFY POPULATION

1.
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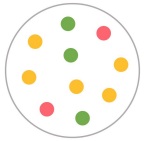

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MODIFY POPULATION

- ➔ Sort genepool.

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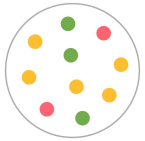

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- ➔ Sort genepool.
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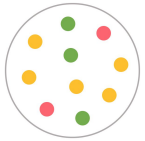

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MODIFY POPULATION

- ➔ Sort genepool.
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- ➔ Select two (2) random parents to create new child.

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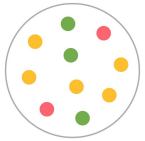

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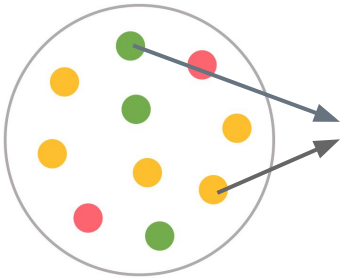

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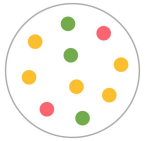

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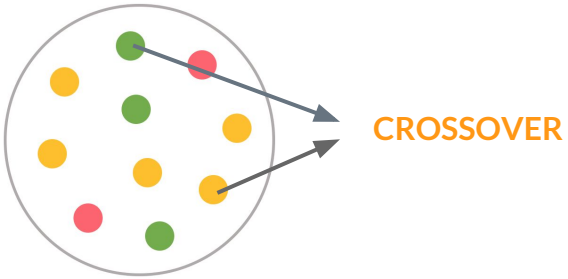

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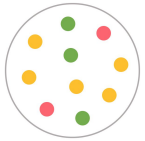

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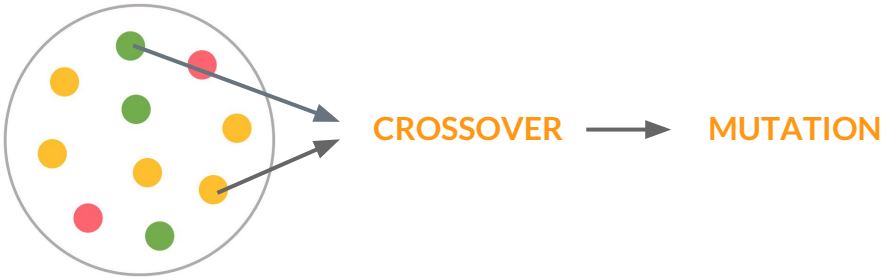

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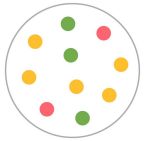

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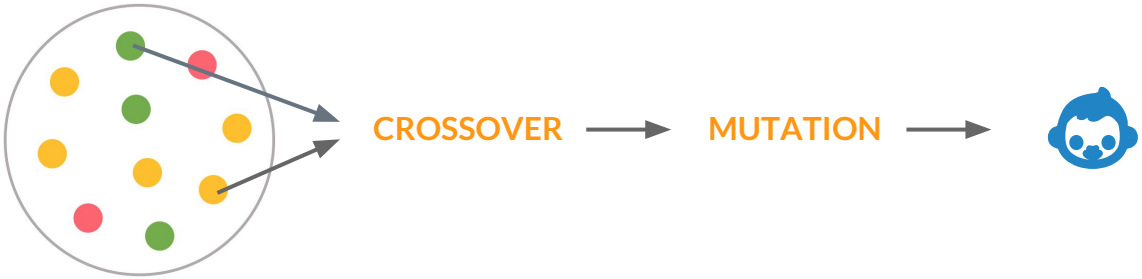

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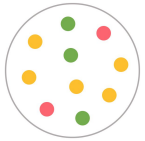

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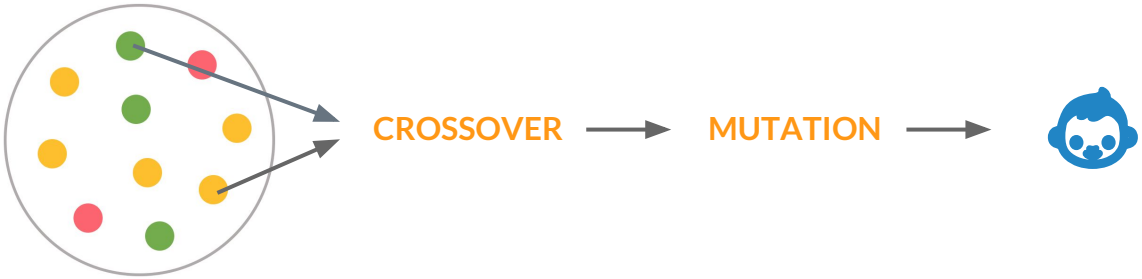

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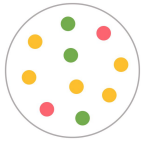

`while (true)`

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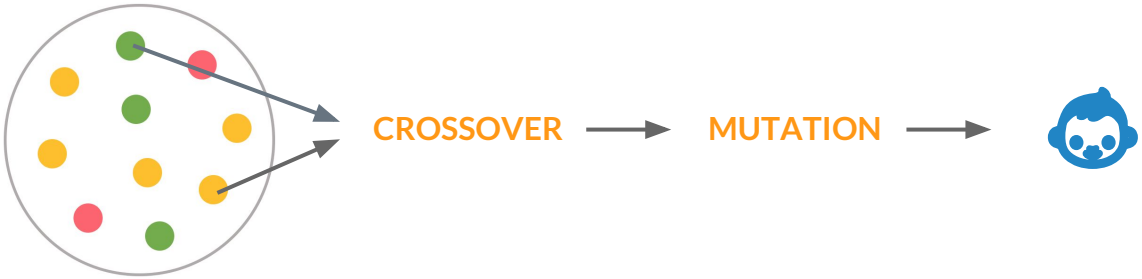

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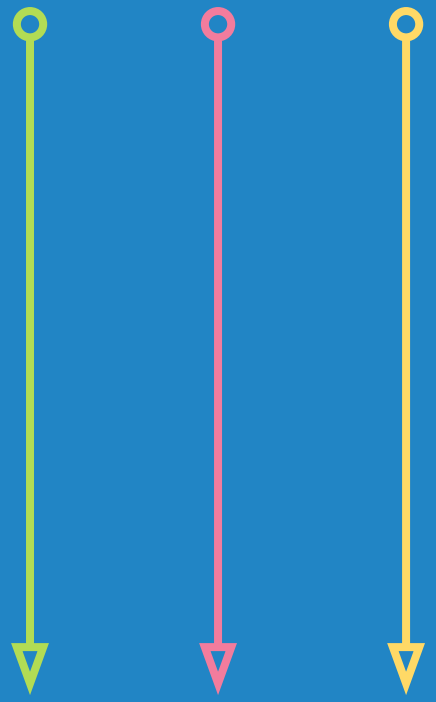
Parallel



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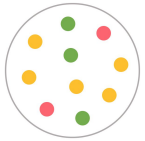

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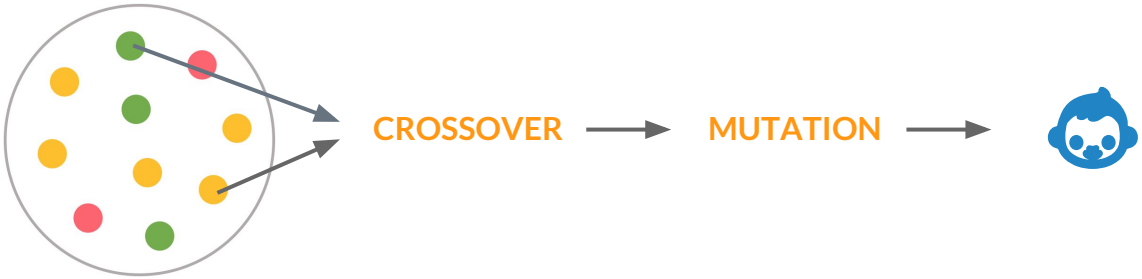

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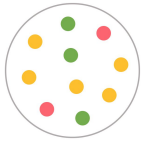

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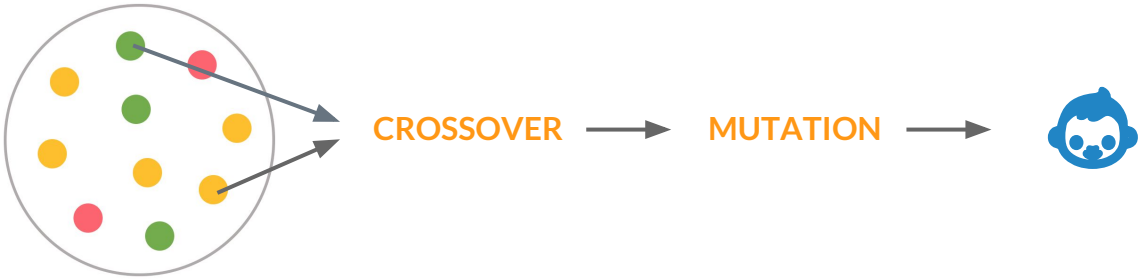

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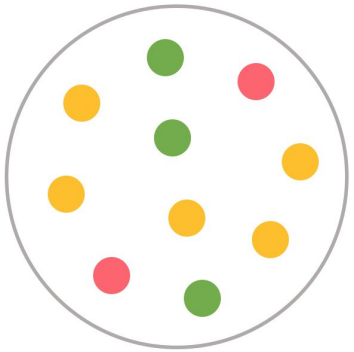
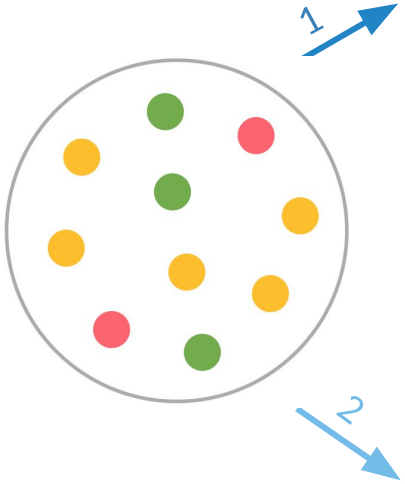
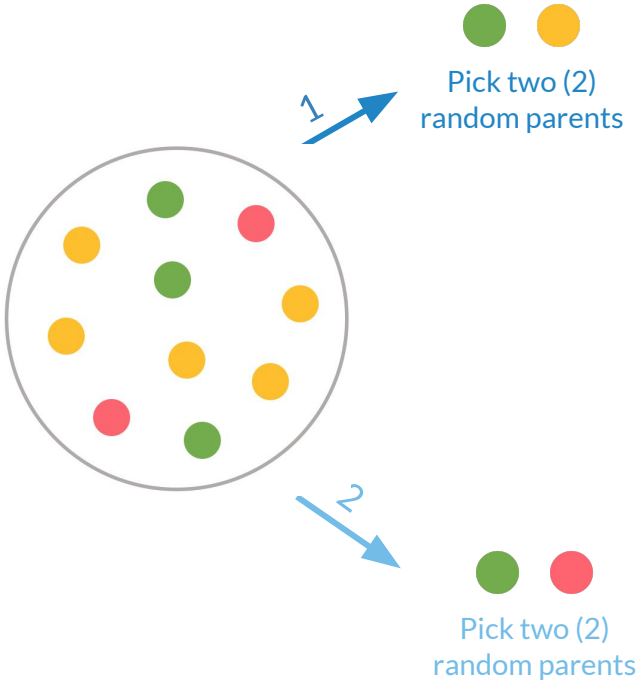
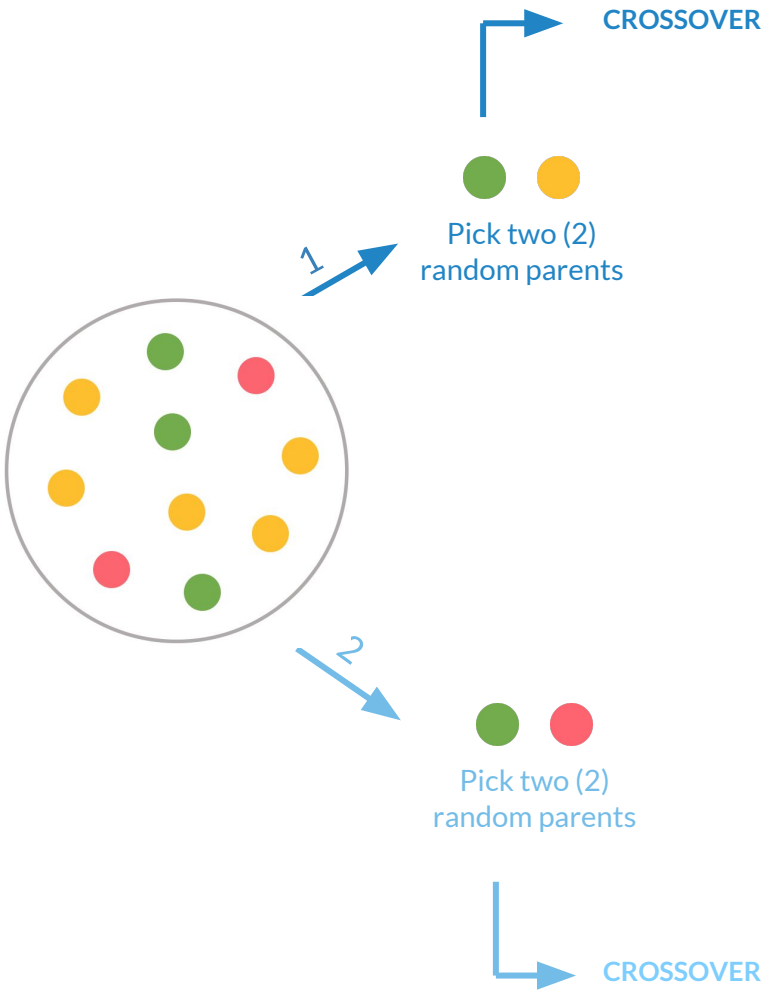
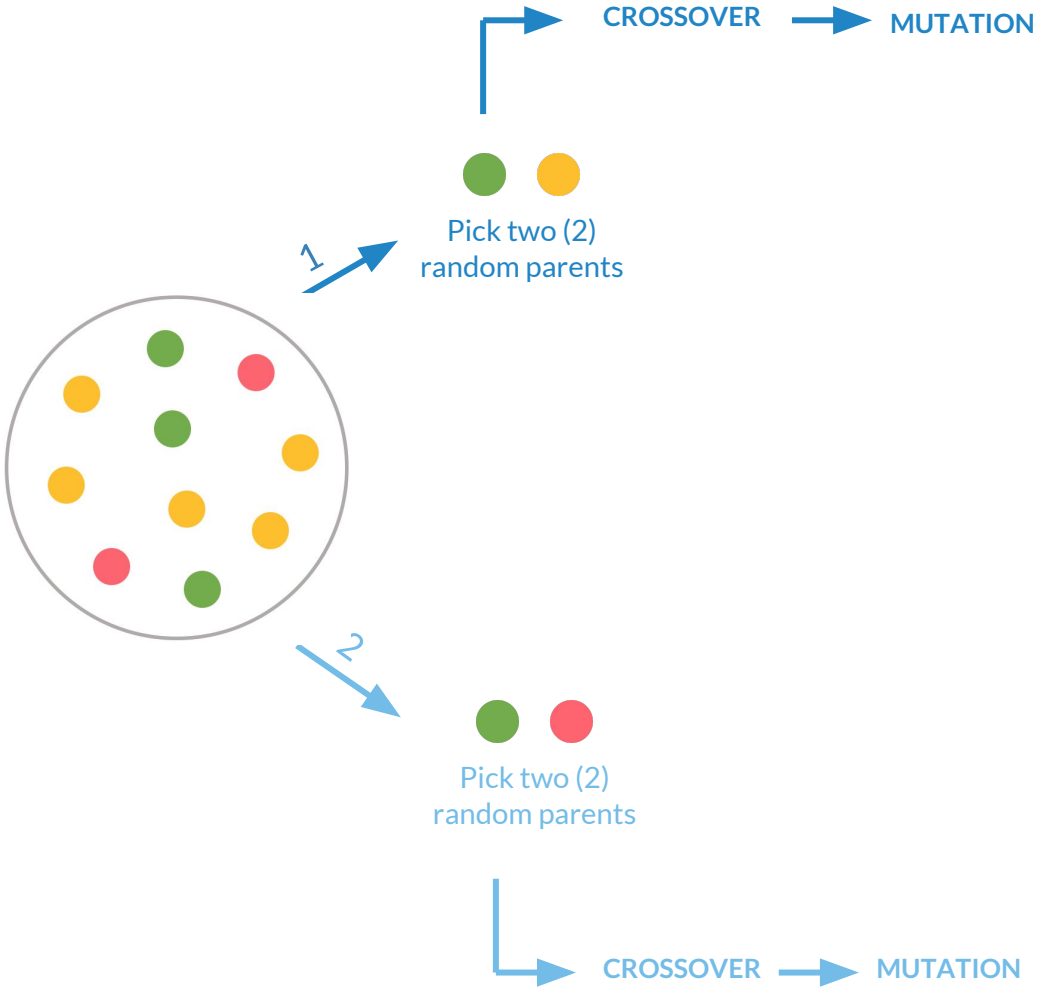
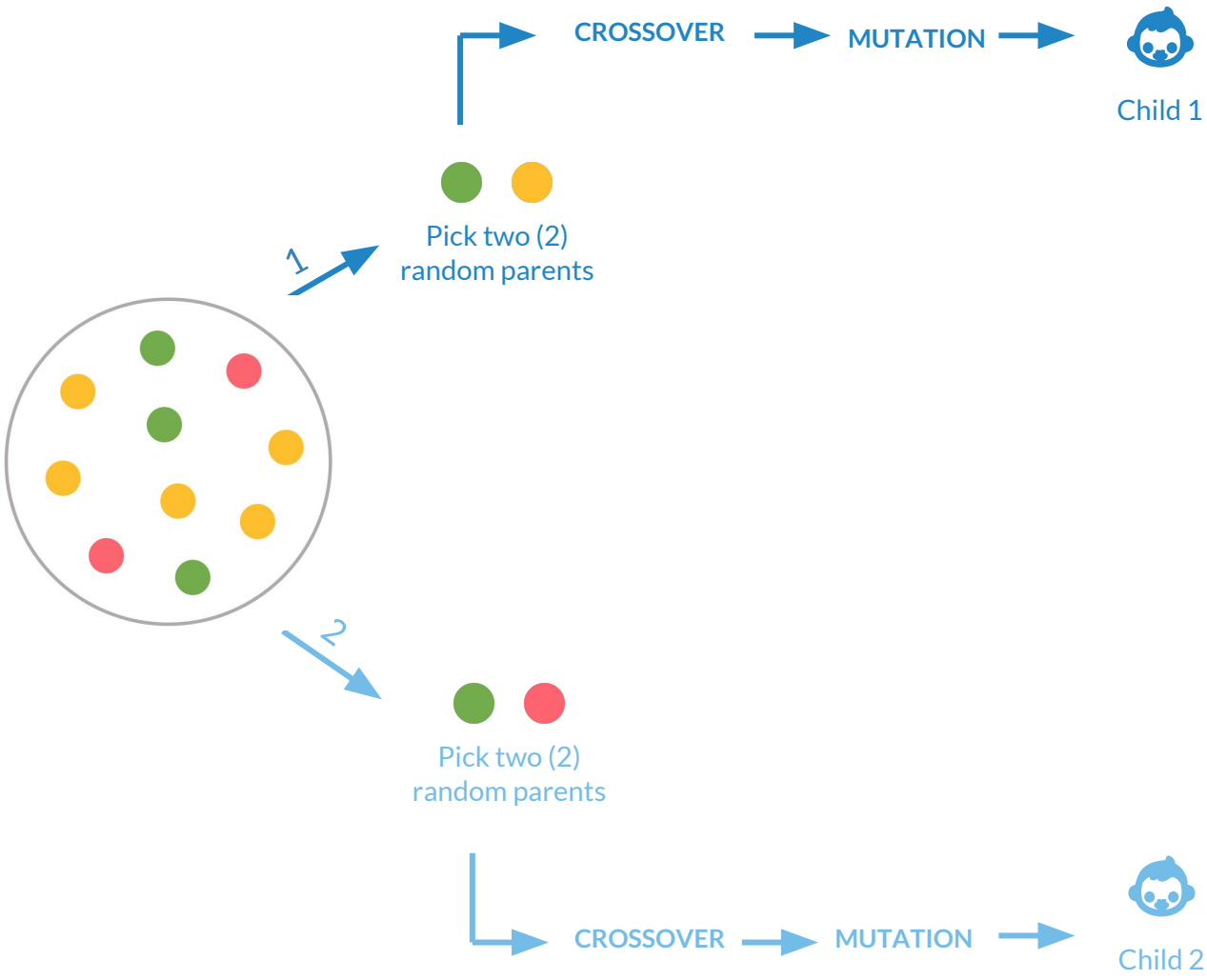


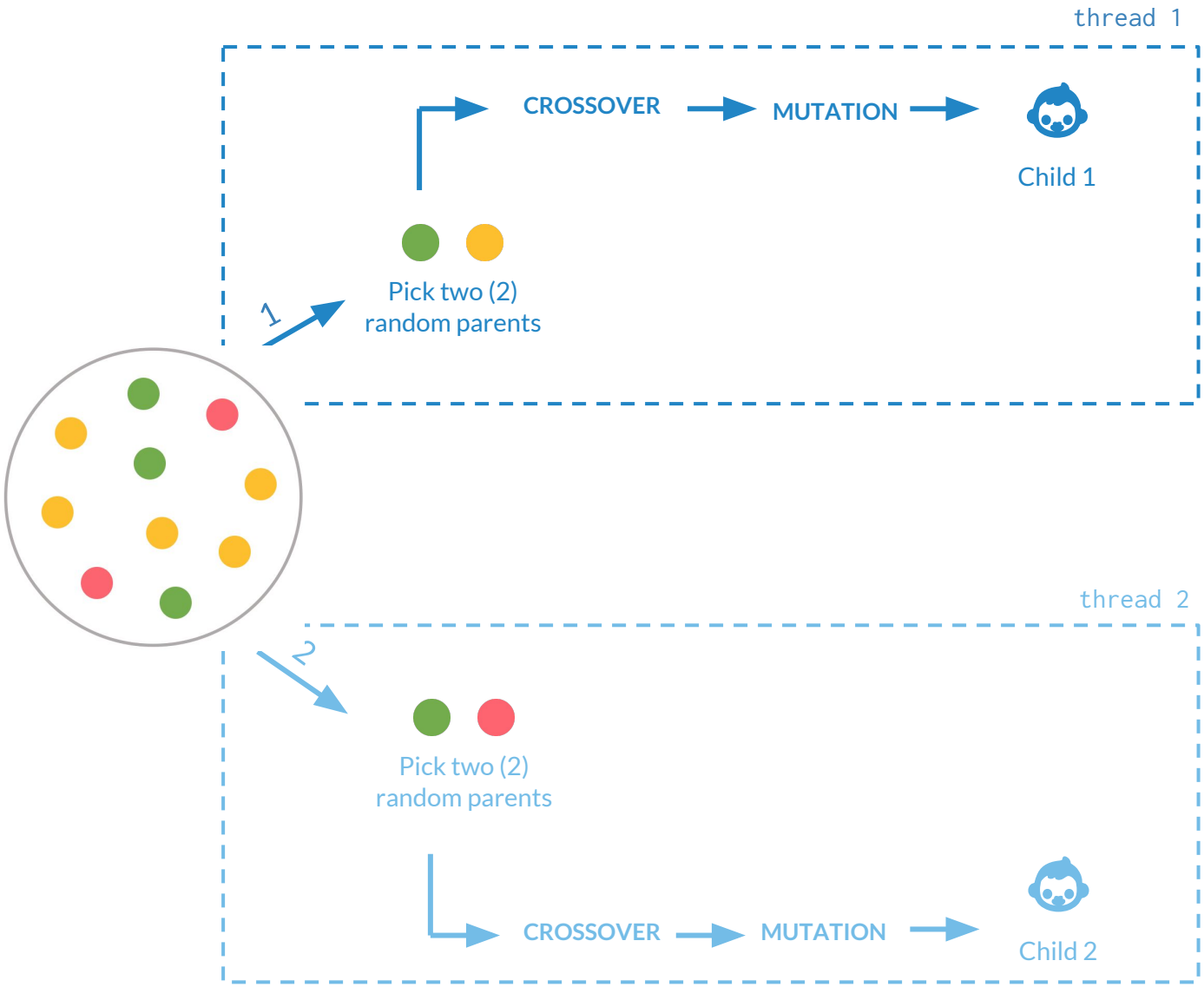

1
2

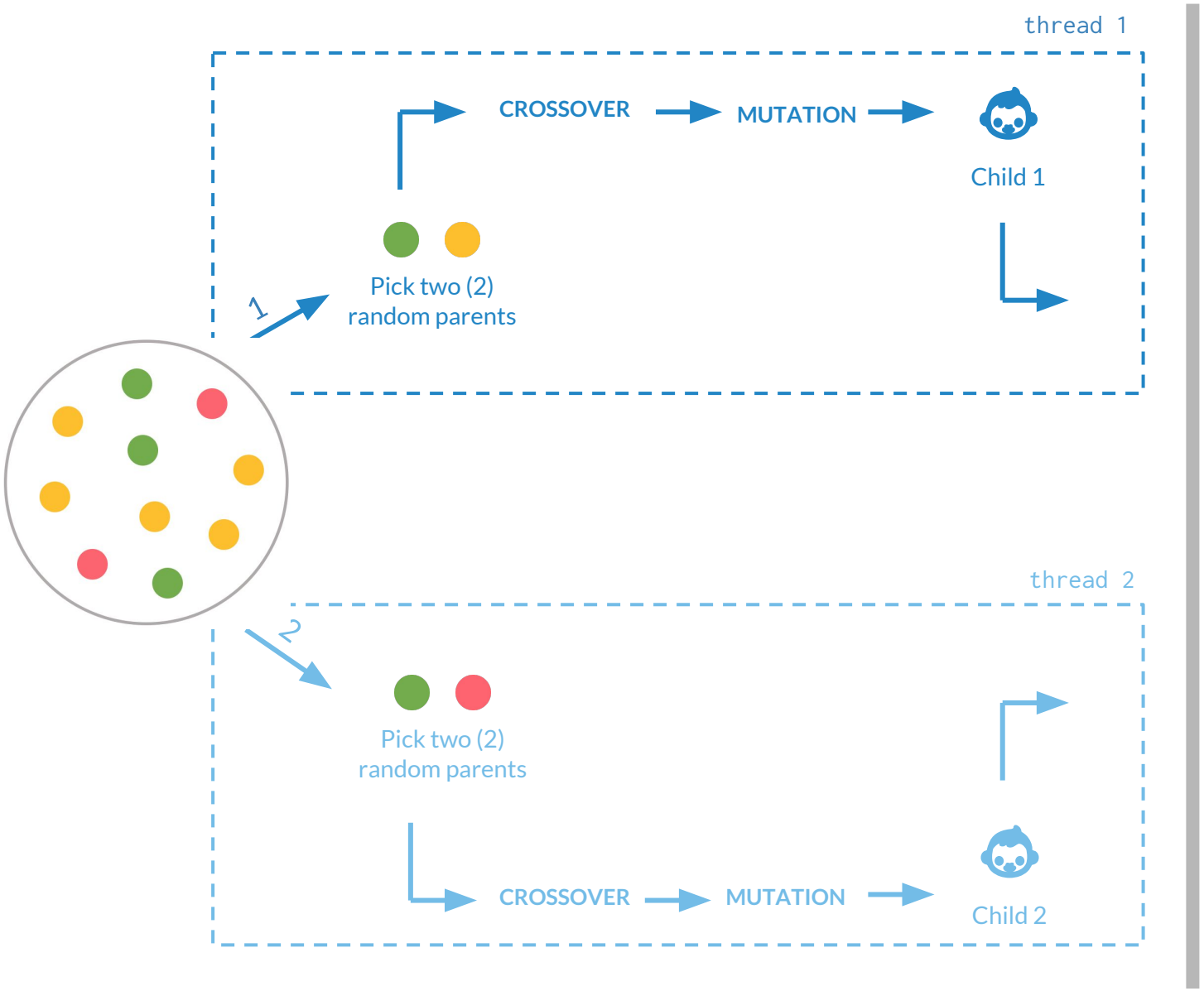

1
Pick two (2)
random parents
2
Pick two (2)
random parents

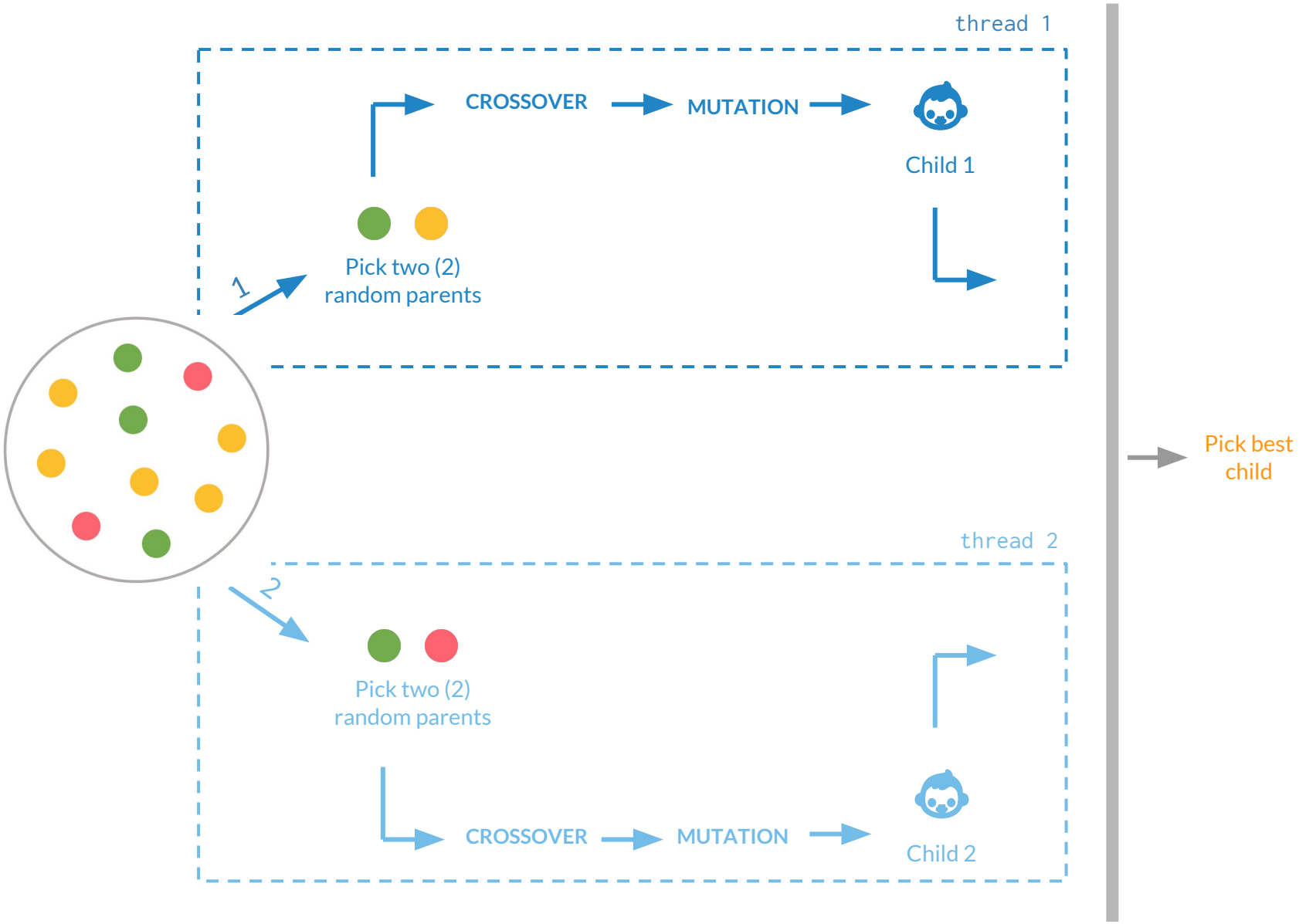

CROSSOVER
Pick two (2)
random parents
1
2
Pick two (2)
random parents
CROSSOVER


CROSSOVER
MUTATION
Pick two (2)
random parents
1
2
Pick two (2)
random parents
CROSSOVER
MUTATION


CROSSOVER
MUTATION
Child 1
Pick two (2)
random parents
1
2
Pick two (2)
random parents
CROSSOVER
MUTATION
Child 2

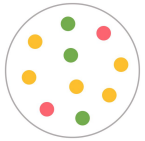

thread 1
CROSSOVER
MUTATION
Child 1
Pick two (2)
random parents
1
thread 2
2
Pick two (2)
random parents
CROSSOVER
MUTATION
Child 2


thread 1
CROSSOVER
MUTATION
Child 1
Pick two (2)
random parents
1
thread 2
2
Pick two (2)
random parents
CROSSOVER
MUTATION
Child 2


thread 1
CROSSOVER
MUTATION
Child 1
Pick two (2)
random parents
1
Pick best
child
thread 2
2
Pick two (2)
random parents
CROSSOVER
MUTATION
Child 2

METHOD **B**

1.
GENERATE GENEPOOL



```
while (true)
```

2.
MODIFY POPULATION

- ➔ Sort genepool.
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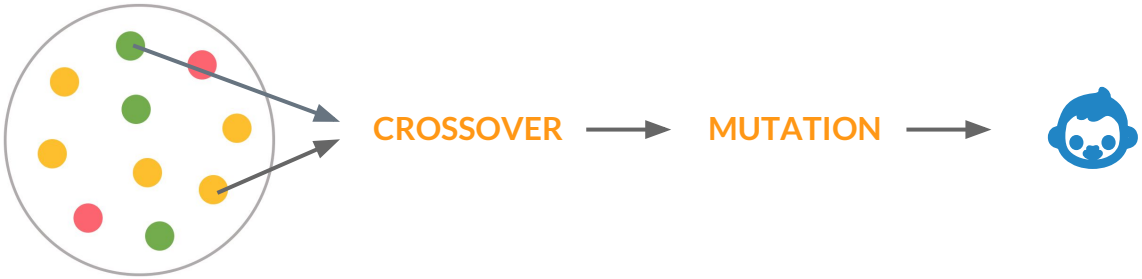

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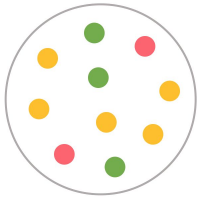
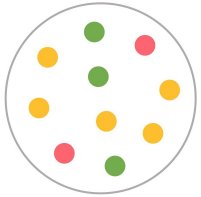
1

2

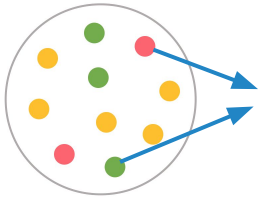
1



2

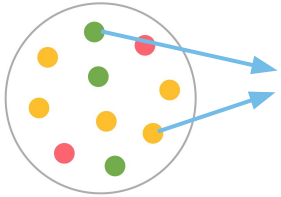


1

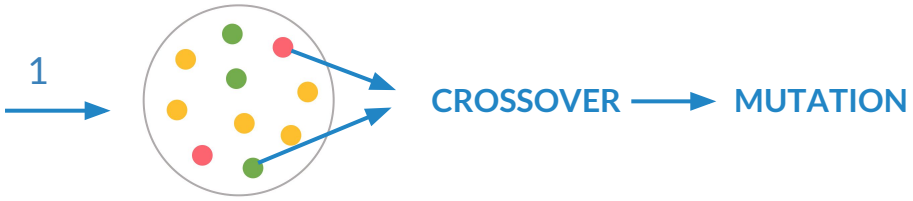


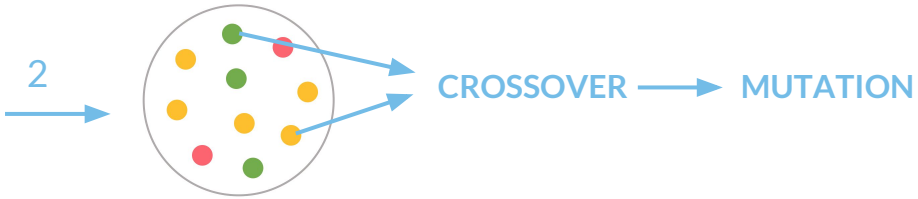
CROSSOVER

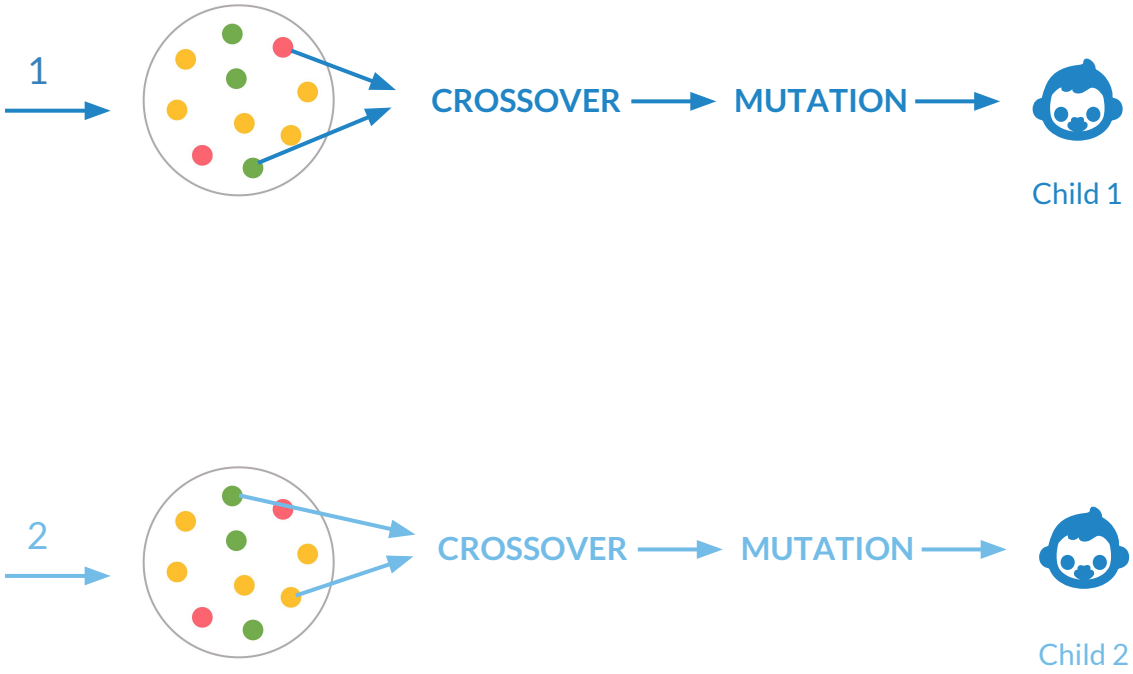
2

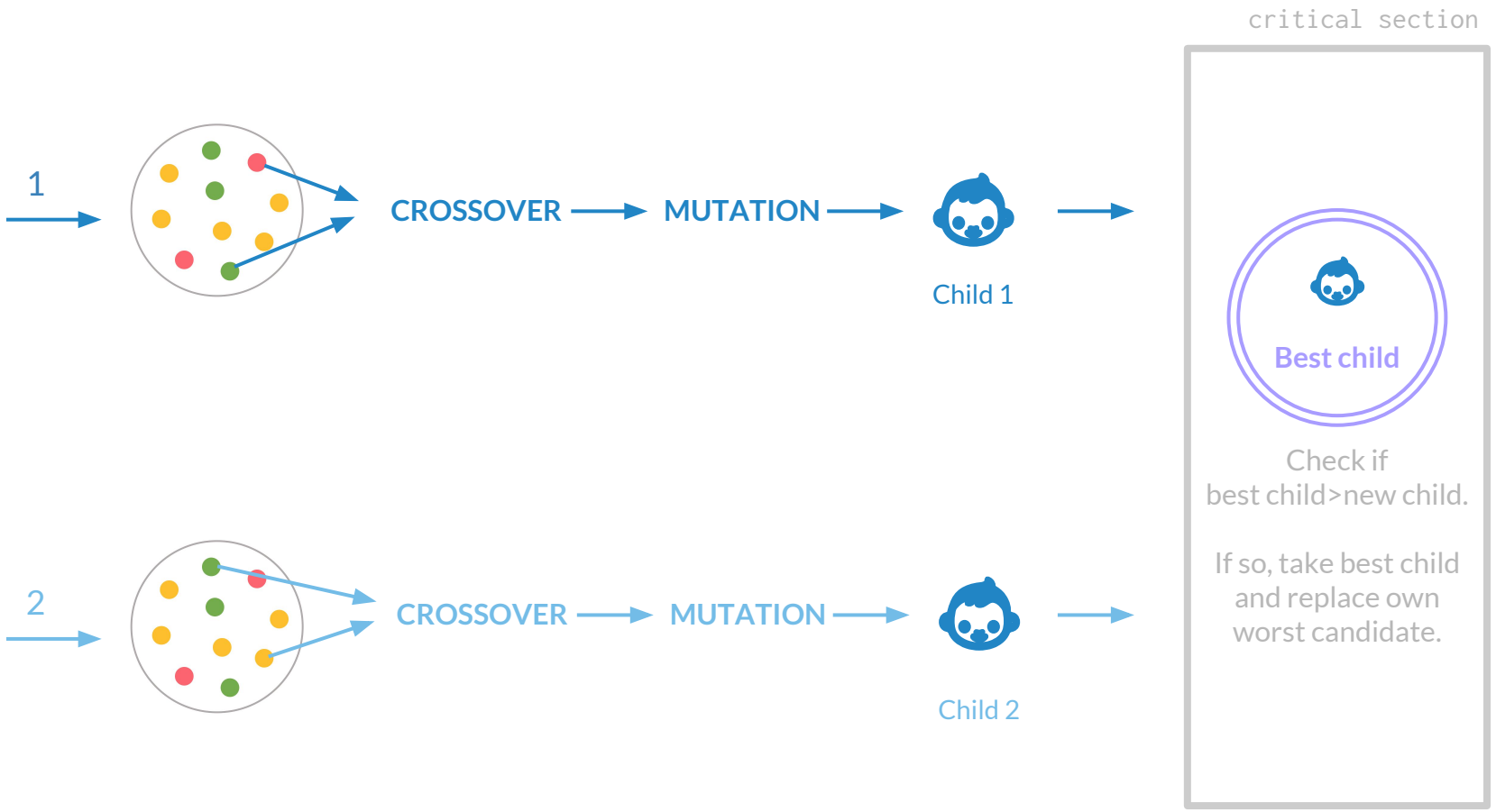


CROSSOVER


1
CROSSOVER
MUTATION


2
CROSSOVER
MUTATION


1
CROSSOVER
MUTATION
Child 1
2
CROSSOVER
MUTATION
Child 2


critical section
1
CROSSOVER
MUTATION
Child 1
Best child
Check if
best child>new child.
If so, take best child
and replace own
worst candidate.
2
CROSSOVER
MUTATION
Child 2

Results & Analysis

TOOLS USED

Python

Prototyping of sequential genetic algorithm.

Java

- Java Threads

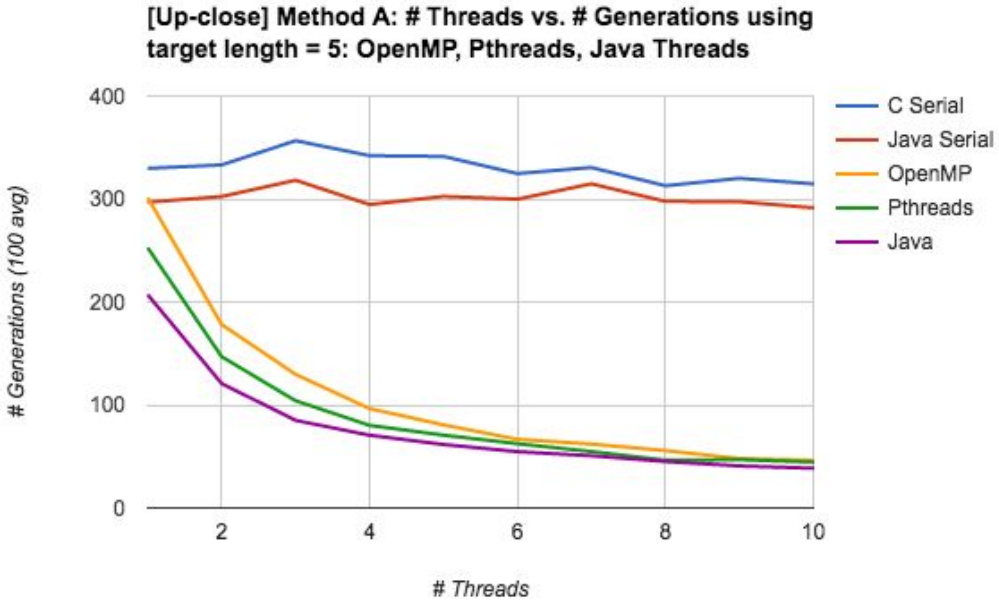
C

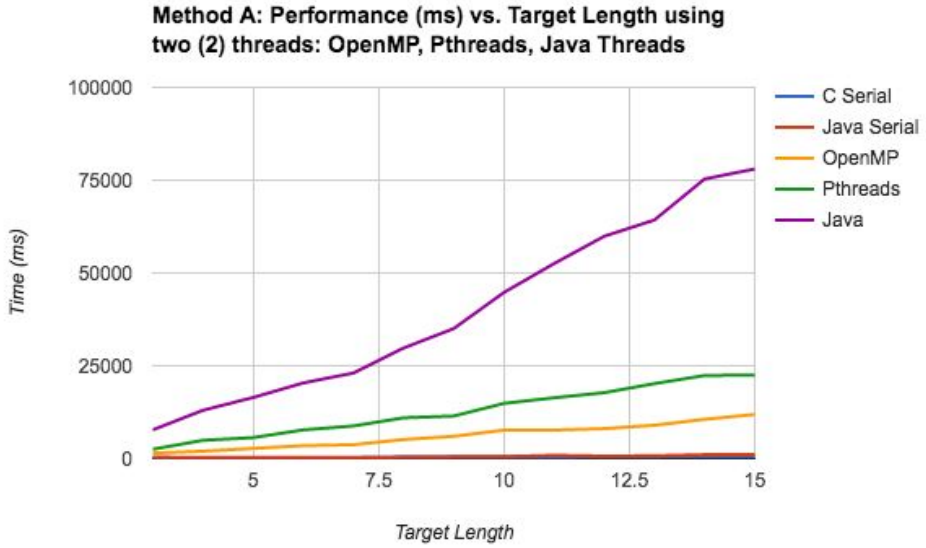
- OpenMP
- Pthreads

HOW WAS THE DATA EVALUATED?

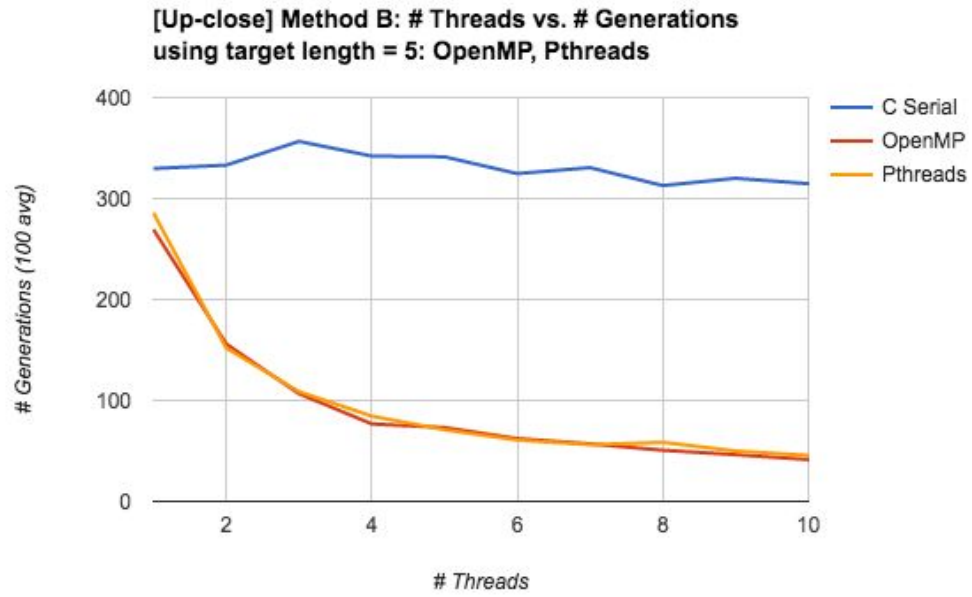
- Number of generations vs. Number of threads
- Time performance vs. Length of target

METHOD A


[Up-close] Method A: # Threads vs. # Generations using target length = 5: OpenMP, Pthreads, Java Threads
400
300
200
100
0
Generations (100 avg)
2
4
6
8
10
Threads
C Serial
Java Serial
OpenMP
Pthreads
Java

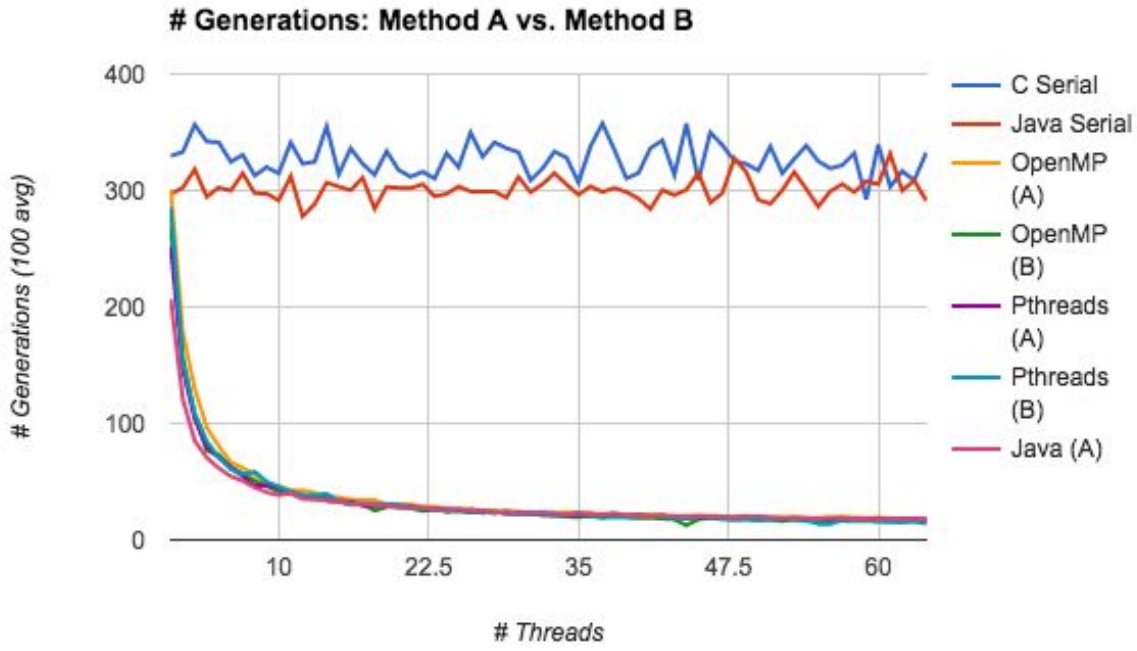

Method A: Performance (ms) vs. Target Length using two (2) threads: OpenMP, Pthreads, Java Threads
100000
75000
50000
25000
0
Time (ms)
5
7.5
10
12.5
15
Target Length
C Serial
Java Serial
OpenMP
Pthreads
Java

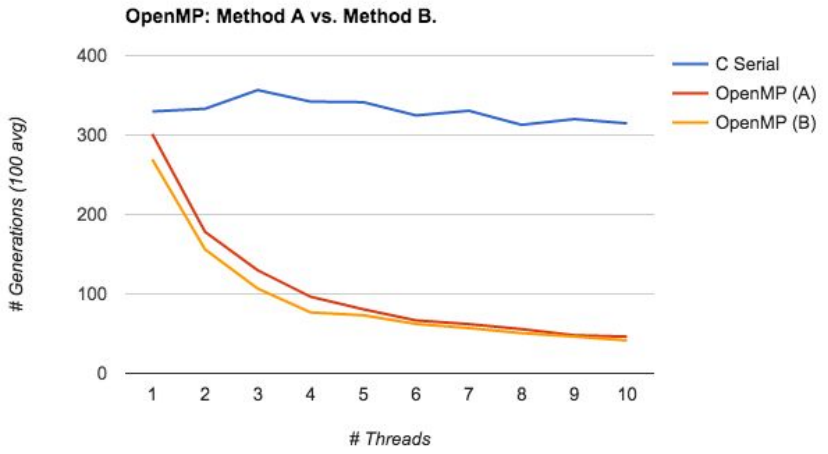
METHOD B

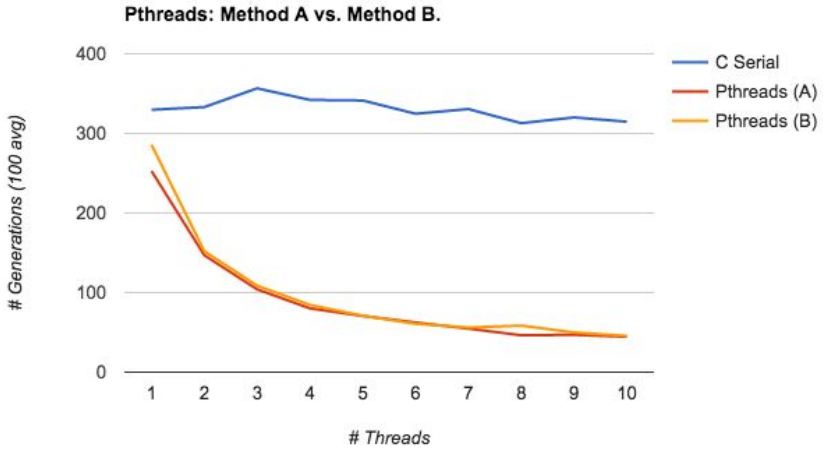

[Up-close] Method B: # Threads vs. # Generations using target length = 5: OpenMP, Pthreads
400
300
200
100
0
Generations (100 avg)
2
4
6
8
10
Threads
C Serial
OpenMP
Pthreads


Method B: Performance (ms) vs. Target Length using two (2) threads: OpenMP, Pthreads
1600
1200
800
400
0
Time (ms)
5
7.5
10
12.5
15
Target Length
C Serial
OpenMP
Pthreads

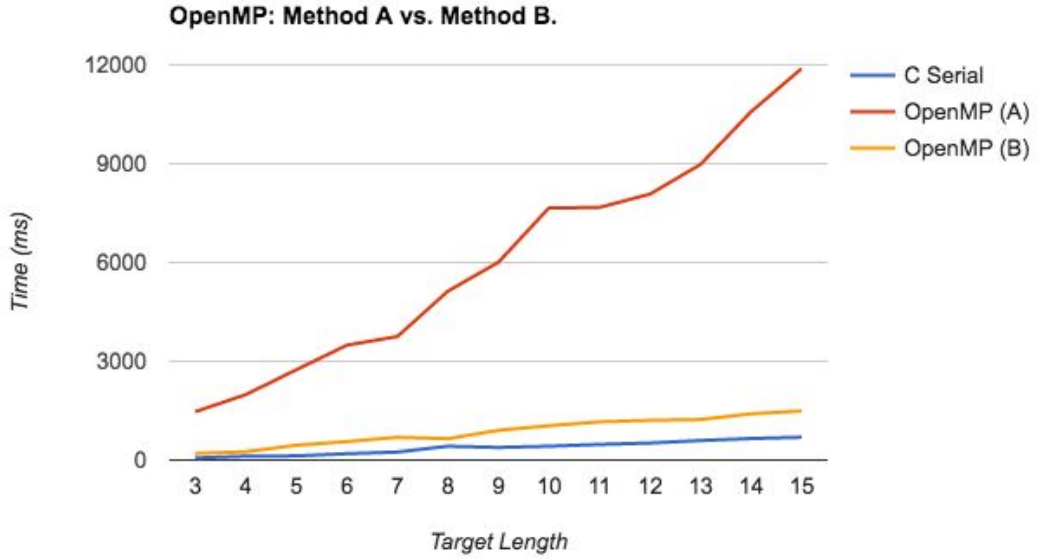
METHOD A vs. METHOD B (Gens)

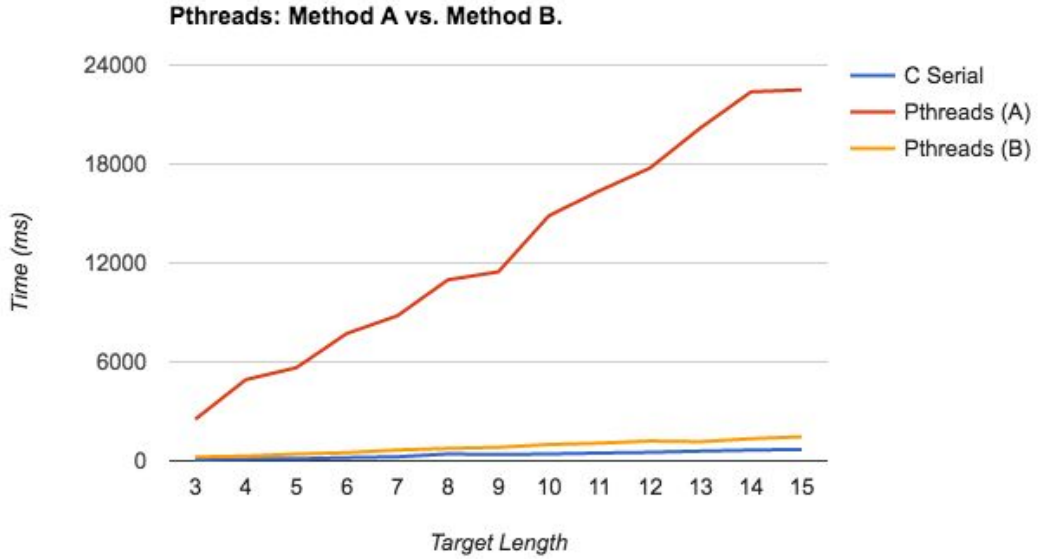






METHOD A VS. METHOD B (Time)





CONCLUSION

	METHOD A	METHOD B
OpenMP		
Pthreads		
Java Threads		

* Time performance comparison in microseconds as a function of target length.

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Luisa Rojas

PARALLEL
GENETIC ALGORITHMS