

A playground for evolutionary computation in Julia

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Outline

- A brief overview of Evolutionary Computation
- The problem
- The framework
- An example
- Future work

Evolutionary Computation

It is a branch of Computational Intelligence (the older term for AI [the true AI, not statistical function approximators])¹ that solves optimisation problems using evolution-inspired algorithms.

¹: browse AI Intro syllabus if you think otherwise

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"I want a tool for prototyping evolutionary solvers such that I can swap a thing or two and see how it affects the run"

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The problem

1. DEAP was old and very inefficient
 - a. They sort the population to get top k when $k \ll$ population
 - b. It was for Python 2
2. Python is slow
 - a. Vectorising (numpy/scipy) EC feels *unnatural*
 - b. Conda is a mess
3. C++ is great but
 - a. I did not want to deal with memory addresses (again)
 - b. I hate objects. Functions are way cooler

Therefore, Julia.

There was *Evolutionary.jl*

- Inconsistent
- Very odd software patterns (a type for an iteration of an algorithm???)
- Documentation was lackluster
- Focused too much on solvers

EvoLP – The taxonomy

A computational unit for each *step* in the evolution process:

- Initialisation
- Selection
- Crossover
- Mutation
- Survival

EvoLP – The taxonomy

A computational unit for each *step* in the evolution process:

- Initialisation (generic)
- Selection (generic)
- Crossover (generic)
- Mutation (generic)
- Survival (algorithm dependent)

EvoLP – The taxonomy

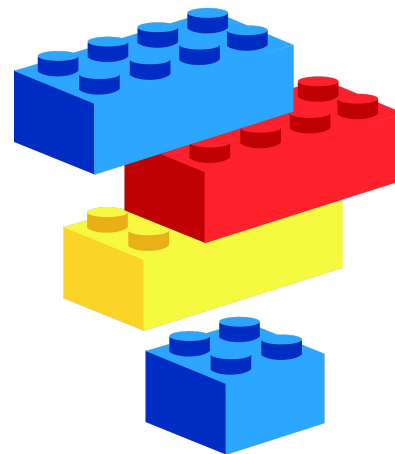
A computational unit for each *step* in the evolution process:

- Population Generators
- Selectors
- Recombinators
- Mutators

EvoLP – The taxonomy

A **block** for each *step* in the evolution process:

- Population Generators
- Selectors
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EvoLP – The taxonomy

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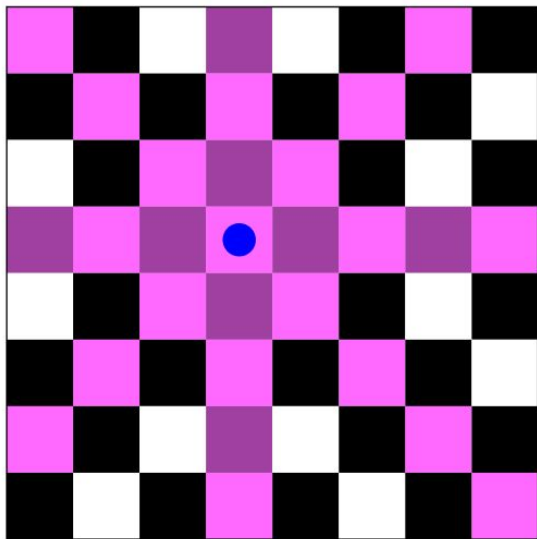
- Population Generators
- Selectors
- Recombinators
- Mutators
- Test functions
- Result reporting
- Statistics computing
- Built-in solvers

EvoLP – The taxonomy

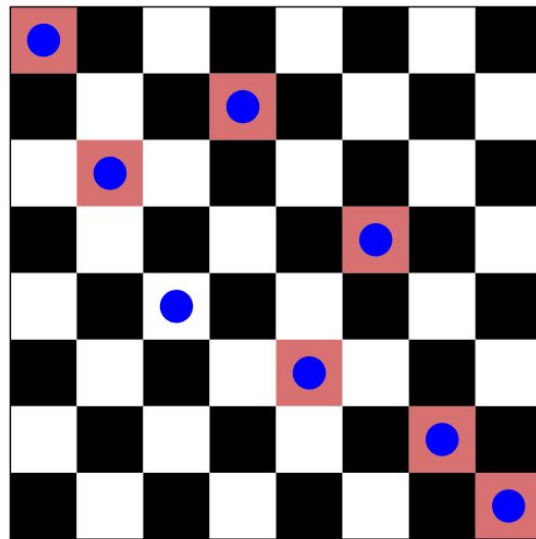
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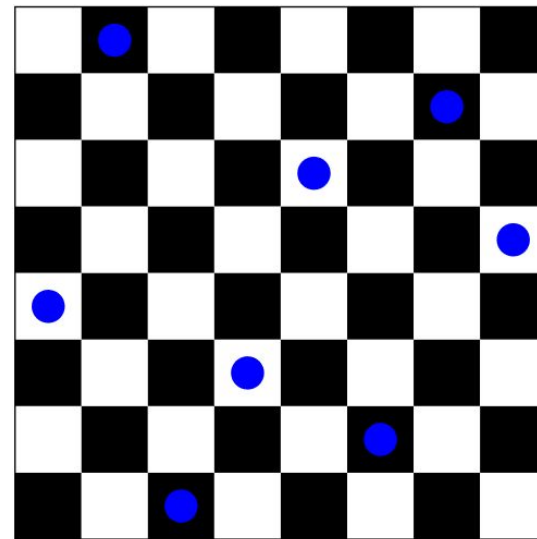
An example: 8-queens



Constraints of 1 queen



Conflicts of 8 queens

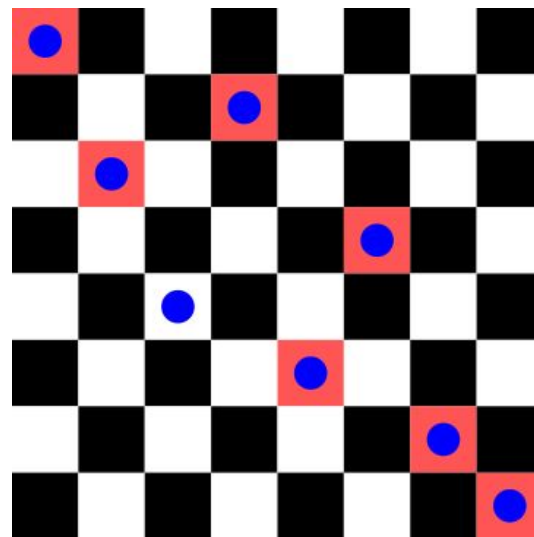


A solution

An example: 8-queens

A **block** for each *step* in the evolution process:

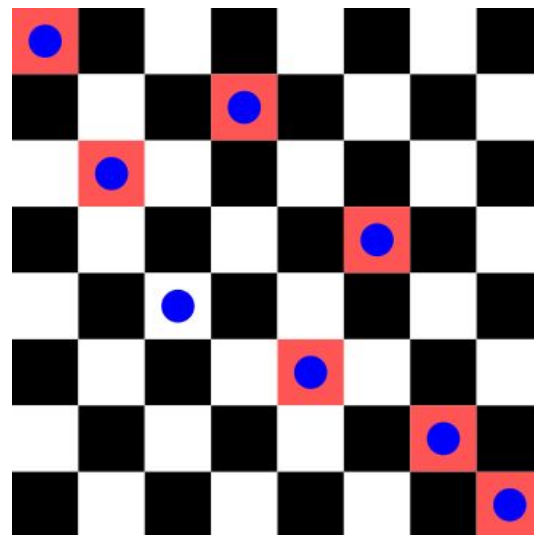
- Generator: random permutation
 - $x = [1, 3, 5, 2, 6, 4, 7, 8]$
- Selector: Random tournament
 - Tourney size of 5; choose 2
- Recombinator: OX1 crossover
- Mutator: Random swap



An example: 8-queens

A **block** for each *step* in the evolution process:

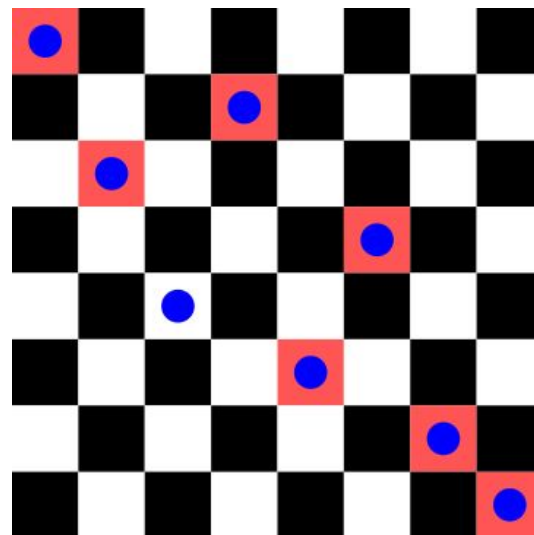
- Objective function: sum of conflicts
 - $\sum_i \text{DiagConstraints}(q_i), i=[1..8]$
- Statistics computing
 - Max, min, mean and median of $f(\mathbf{x})$



An example: 8-queens

A **block** for each *step* in the evolution process:

- Custom solver: Steady GA
 - 2 offspring per generation
 - population size = 100
 - termination: 500 generations
 - Crossover probability: 1.0
 - Mutation probability: 0.8



EvoLP – Future work

- More examples
- Multi-objective support
- More test functions
- **Parallelisation**
 - Planning an MPI approach to simulate Islands on HPC clusters



EvoLP.jl

Thank you!



Project repo at <https://github.com/ntnu-ai-lab/EvoLP.jl>



Documentation at <https://ntnu-ai-lab.github.io/EvoLP.jl/stable>



```
julia> import Pkg  
julia> Pkg.add("EvoLP")
```

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