

Programación genética

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A Field Guide to Genetic Programming

Genetic programming (GP) is an evolutionary computation (EC)¹ technique that automatically solves problems without requiring the user to know or specify the form or structure of the solution in advance. At the most abstract level GP is a *systematic, domain-independent* method for getting computers to solve problems *automatically* starting from a *high-level statement* of what needs to be done.

¹These are also known as *evolutionary algorithms* or EAs.

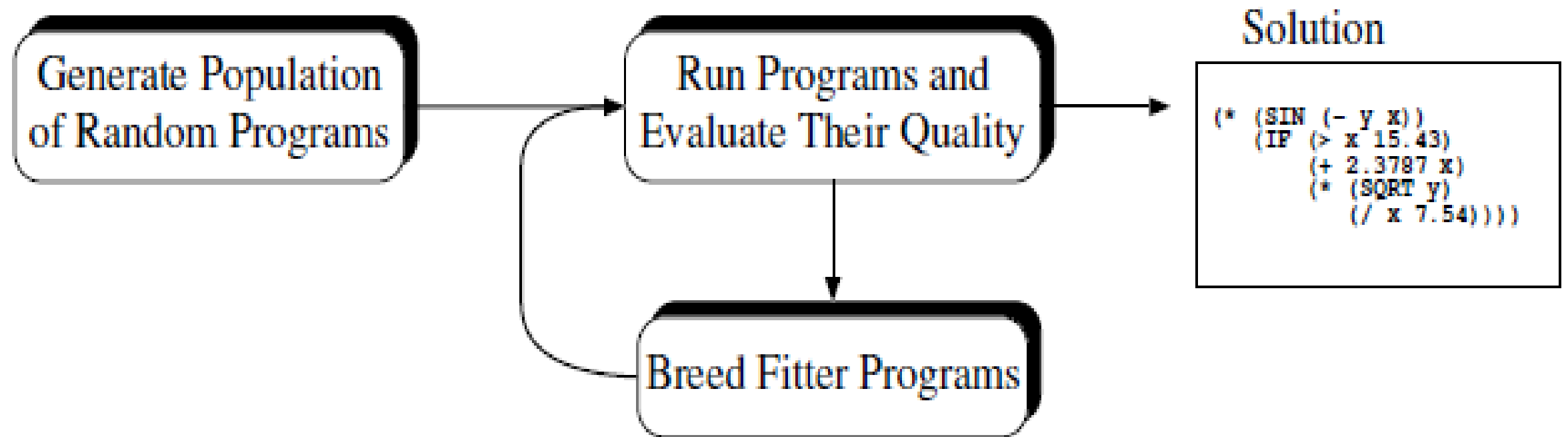
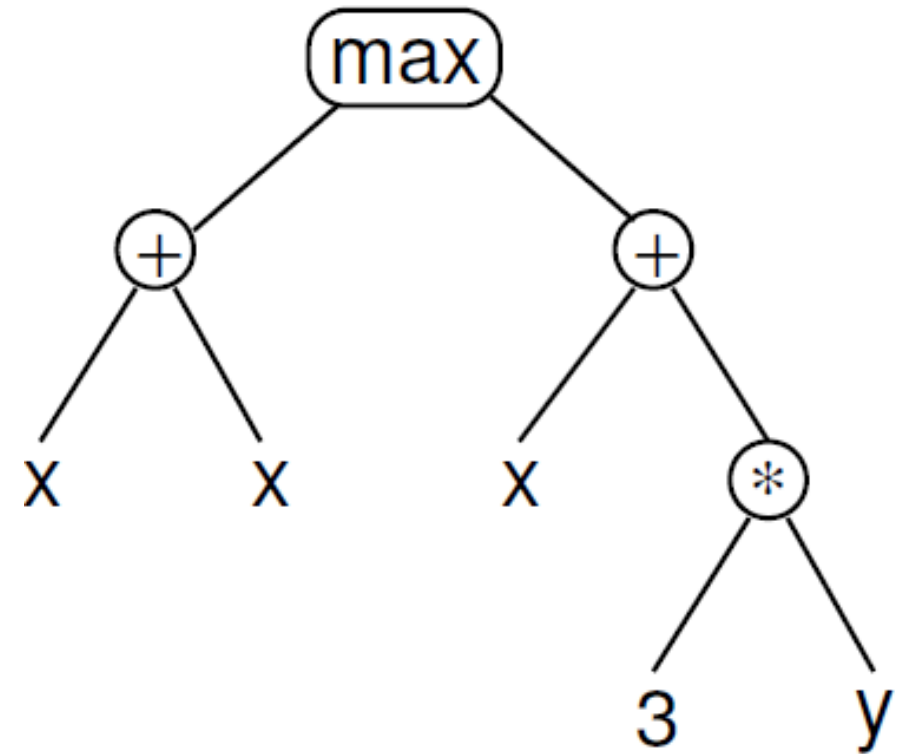


Figure 1.1: The basic control flow for genetic programming, where survival of the fittest is used to find solutions.

- 1: Randomly create an *initial population* of programs from the available primitives (more on this in Section 2.2).
- 2: **repeat**
- 3: *Execute* each program and ascertain its fitness.
- 4: *Select* one or two program(s) from the population with a probability based on fitness to participate in genetic operations (Section 2.3).
- 5: Create new individual program(s) by applying *genetic operations* with specified probabilities (Section 2.4).
- 6: **until** an acceptable solution is found or some other stopping condition is met (e.g., a maximum number of generations is reached).
- 7: **return** the best-so-far individual.

Algorithm 1.1: Genetic Programming

In GP, programs are usually expressed as *syntax trees* rather than as lines of code. For example Figure 2.1 shows the tree representation of the program $\max(x+x, x+3*y)$. The variables and constants in the program (x , y and 3) are leaves of the tree. In GP they are called *terminals*, whilst the arithmetic operations ($+$, $*$ and \max) are internal nodes called *functions*. The sets of allowed functions and terminals together form the *primitive set* of a GP system.



2.1: GP syntax tree representing $\max(x+x, x+3*y)$.

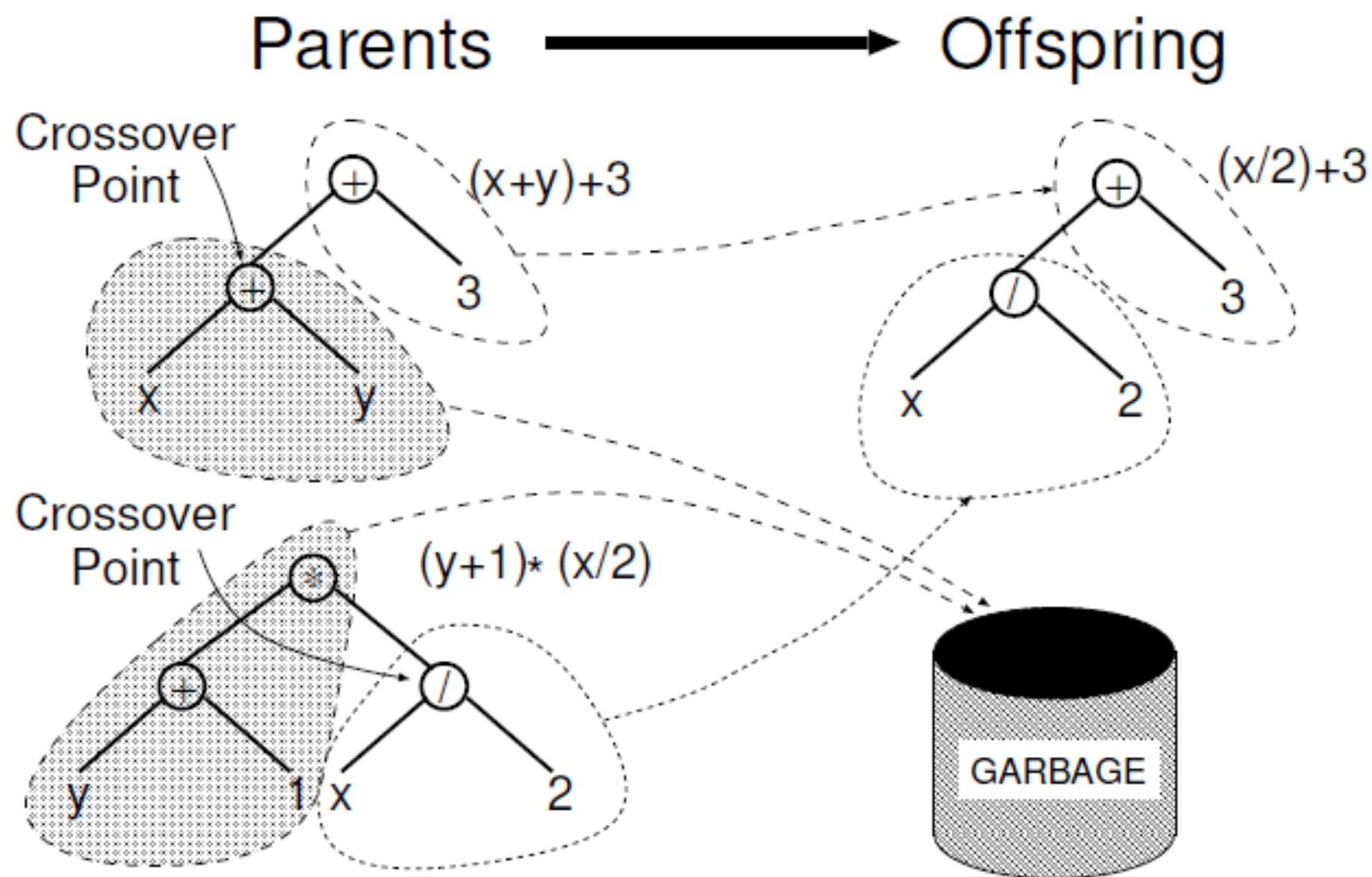


Figure 2.5: Example of subtree crossover. Note that the trees on the left are actually *copies* of the parents. So, their genetic material can freely be used without altering the original individuals.

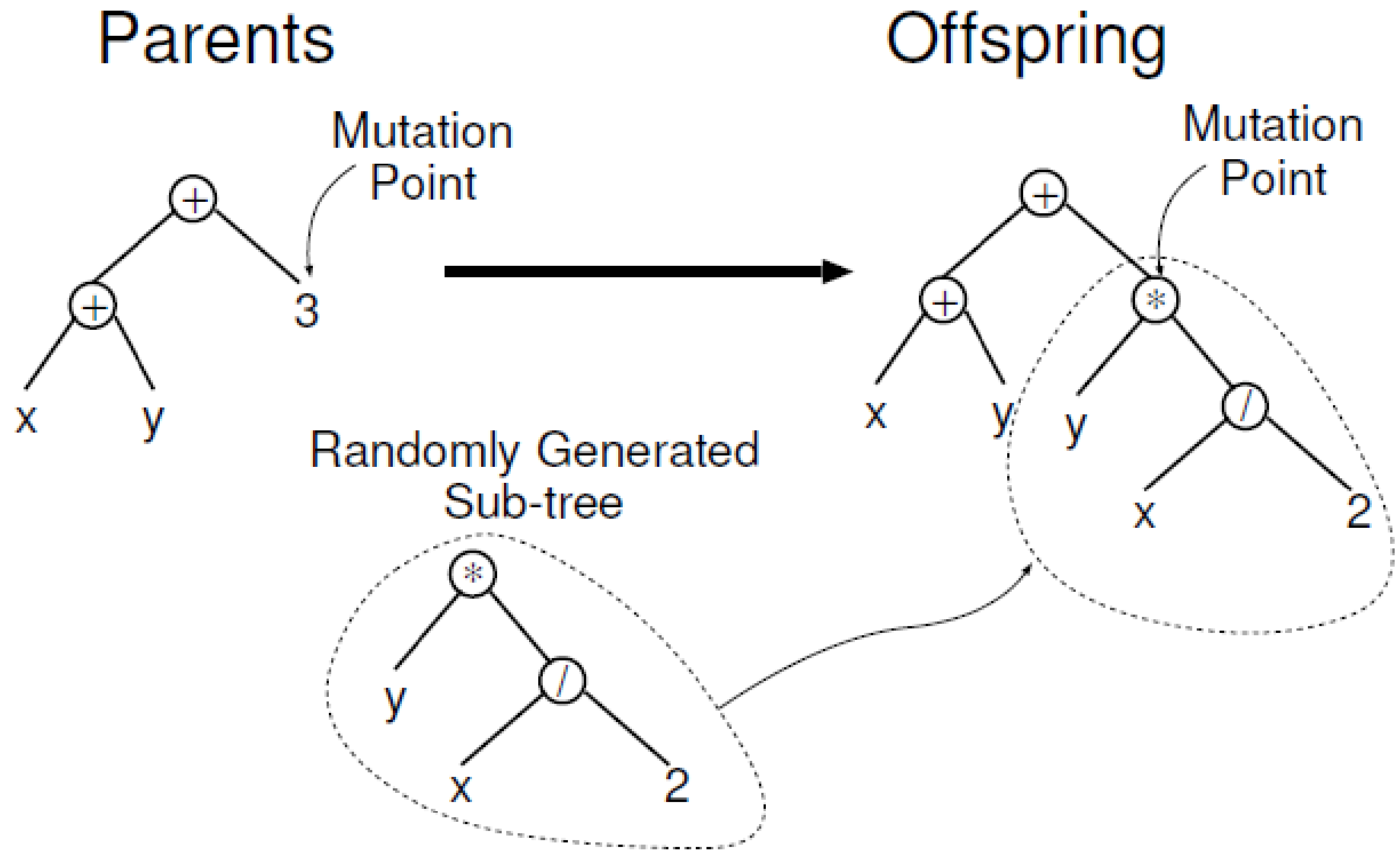


Figure 2.6: Example of subtree mutation.

To apply a GP system to a problem, several decisions need to be made; these are often termed the *preparatory steps*. The key choices are:

1. What is the *terminal set*?
2. What is the *function set*?
3. What is the *fitness measure*?
4. What *parameters* will be used for controlling the run?
5. What will be the *termination* criterion, and what will be designated the *result of the run*?

Examples of primitives in GP function and terminal sets.

| Function Set | |
|--------------------------|-------------------|
| <i>Kind of Primitive</i> | <i>Example(s)</i> |
| Arithmetic | +, *, / |
| Mathematical | sin, cos, exp |
| Boolean | AND, OR, NOT |
| Conditional | IF-THEN-ELSE |
| Looping | FOR, REPEAT |
| ⋮ | ⋮ |

| Terminal Set | |
|--------------------------|-------------------|
| <i>Kind of Primitive</i> | <i>Example(s)</i> |
| Variables | x, y |
| Constant values | 3, 0.45 |
| 0-arity functions | rand, go_left |

Referencias

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