# CSE/ECE 848 Introduction to Evolutionary Computation

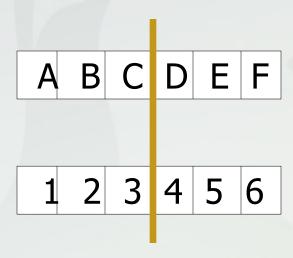
Module 3 - Lecture 11 - Part 2

Genetic Programming - Operators

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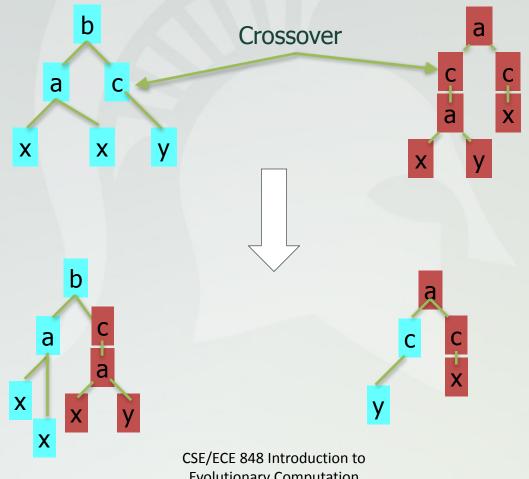
### Difference 4: Crossover, GA Style

In GA, crossover selects the same random point on two strings,
 then recombines the strings into two new strings



## Crossover, GP Style

 In GP, two different random points can be selected, and two new trees created

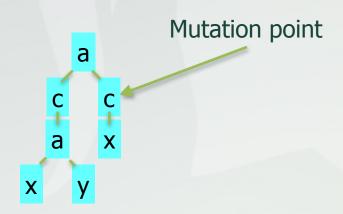


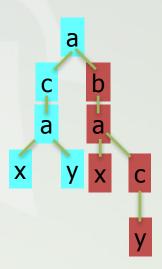
#### Crossover II

- Thus the functions must be carefully written so that any combination of functions produces an answer (for example, division by zero returns 0)
- This is called the Closure Principle
- As compared to GA crossover, GP crossover seems very disruptive (random insertion of a subprogram into a program at an arbitrary point)
- It generates many issues in GP

#### **Difference 5: Mutation**

- A GA simply selects a random position and changes the feature value there
- A GP selects a random tree position and grows a new tree there



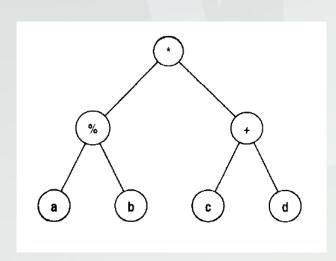


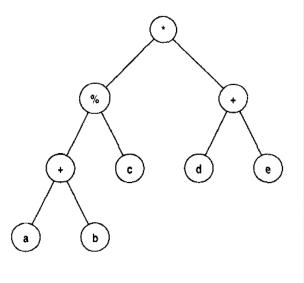
#### **Mutation II**

- Typically a max depth is set for the size of the tree
- Further, restrictions can be placed on the kind of the tree that is created
- Also, the probability of mutation (as for crossover) can be adjusted to the depth of the tree (e.g. by treating nodes deeper in the tree differently)

#### Difference 6: Initialization

- In making an initial population of trees, you can make either full trees or grow trees
- Full trees are indeed full trees (all leaves at the same level)
- Grow trees are trees grown randomly from a root node, creating a random (non-full) shape







- To avoid prejudicing the initial population towards full or grow trees, you typically do ramped-half-and-half using user determined minDepth and maxDepth parameters.
- At each depth D between minDepth and maxDepth, create:
  - popsize/(maxDepth-minDepth)/2 full trees
  - popsize/(maxDepth-minDepth)/2 grow trees each of depth
     D.