

CC484 – Constraint Satisfaction Genetic Programming

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Outline (1/1)

- ◆ What is GP?
- ◆ Biological concepts
- ◆ Flowchart of GP
 - Population
 - Fitness Function
 - Selection
 - Genetic Operators
- ◆ Research Points.
- ◆ Applications

What is GP? (1/1)

- ◆ Genetic Programming (GP) has been highly successful as a technique for getting computers to automatically solve problems without having to tell them explicitly how to do it.
- ◆ GP is considered a branch of Genetic Algorithms.

Previous work (1/1)

- ◆ Friedberg – 1950.
- ◆ Lynn Cramer – 1980.
- ◆ John Koza – 1990.



Fig. 1. John Koza

Inspiration of GP (1/1)

- ◆ In GP, hundreds or thousands of individuals are genetically bred.
- ◆ It has its inspiration from Darwinian Theory.
- ◆ Darwinism is a term used for evolution and natural selection.

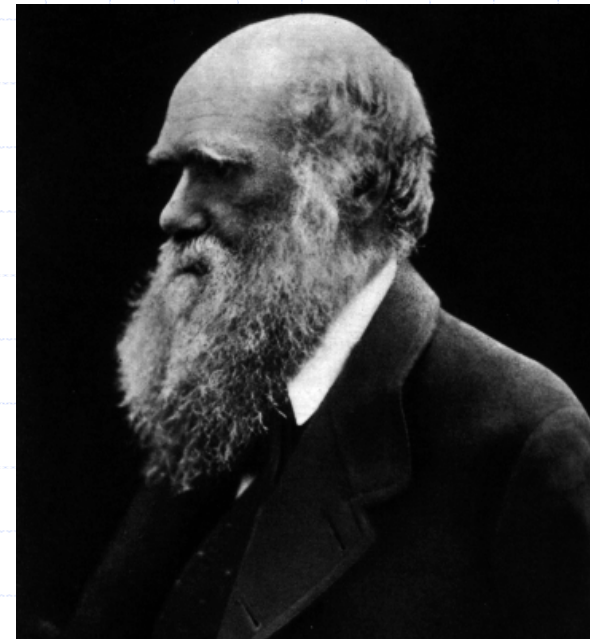


Fig. 2. Charles Darwin

Evolution and Natural Selection (1/1)

◆ What is Evolution?

Evolution = COOL!

◆ What is Natural Selection?

Natural Selection = COOL!

Some biological concepts (1/5)

- ◆ **Deoxyribonucleic acid (DNA)** is a nucleic acid that contains the genetic instructions specifying the biological development of all cellular forms of life.
- ◆ DNA is often referred to as molecule of **heredity**.
- ◆ During reproduction, DNA is replicated and **transmitted** to the offspring.

Some biological concepts (2/5)

- ◆ DNA is encoded with four bases, which can be abbreviated **A, T, C and G**.
- ◆ A strand of DNA contains **genes**.
- ◆ The DNA is normally packed in the form of one or more large macromolecules called **chromosomes**.

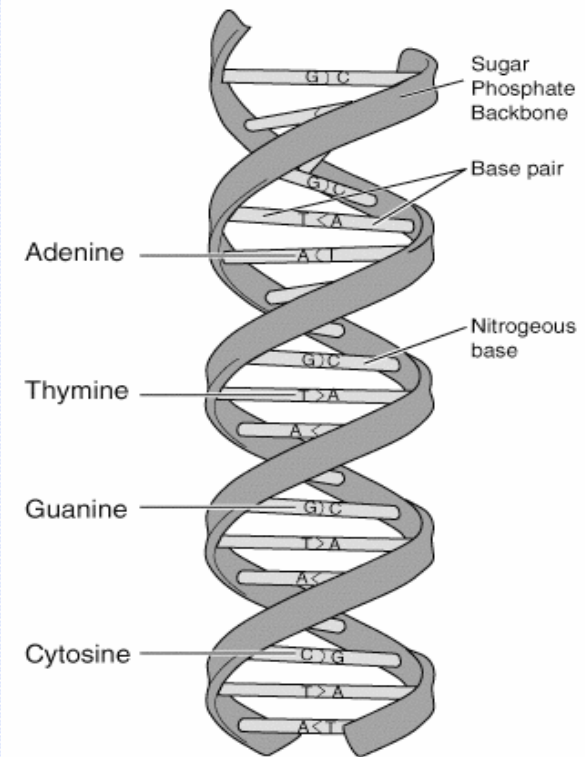


Fig. 3. Structure of DNA.

Some biological concepts (3/5)

- ◆ Each **gene** is able to occupy a single position in the chromosome.
- ◆ The **genome** of an organism is the whole hereditary information of an organism that is encoded in the DNA.
- ◆ An individual is a member of a population.
- ◆ **Many Individuals = Population.**

Some biological concepts (4/5)

- ◆ The **phenotype** of an individual is its total physical appearance and constitution.
- ◆ The **genotype** is the genetic composition of an individual.
- ◆ The **fitness** of an individual refers to individual's ability to propagate its genes.
- ◆ **Reproduction** is the biological process by which new individuals are produced.

Some biological concepts (5/5)

◆ **Reproduction:**

- Sexual (two individuals)
- Asexual (one individual)

◆ **Selection** is based in the fitness of each individual.

Flowchart for GP (1/1)

Flowchart for Genetic Programming

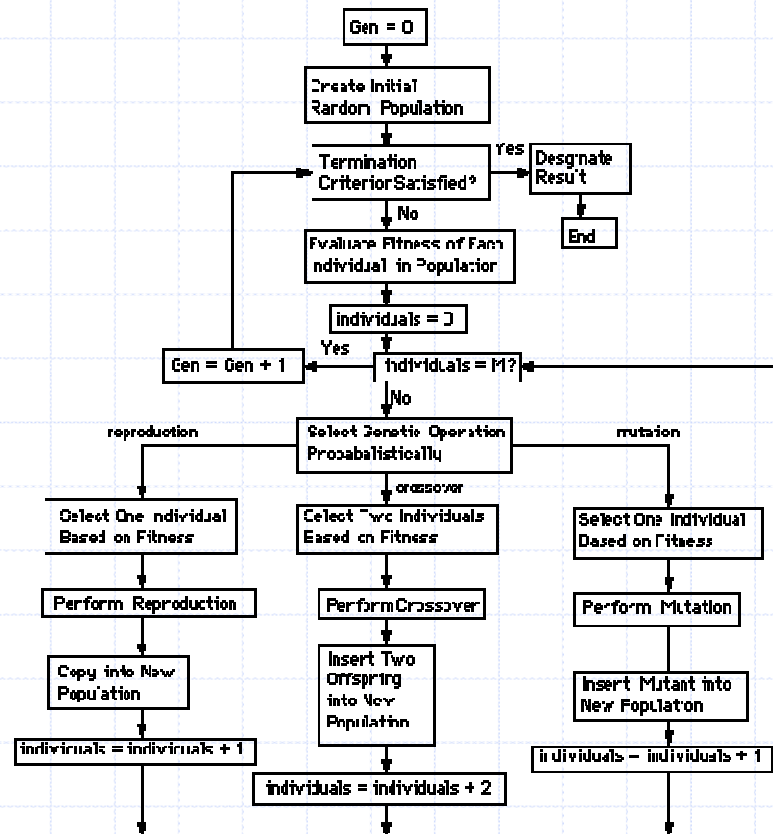


Fig. 4. Flowchart for the GP Paradigm

Terminal and Functional Sets (1/1)

- ◆ The **functions** in the function set may include: arithmetic operations (+, -, *, /), mathematical functions (sin, cos, exp), Boolean operations (and, or, not), and more.
- ◆ The **terminals** are typically either variable atoms or constant atoms.

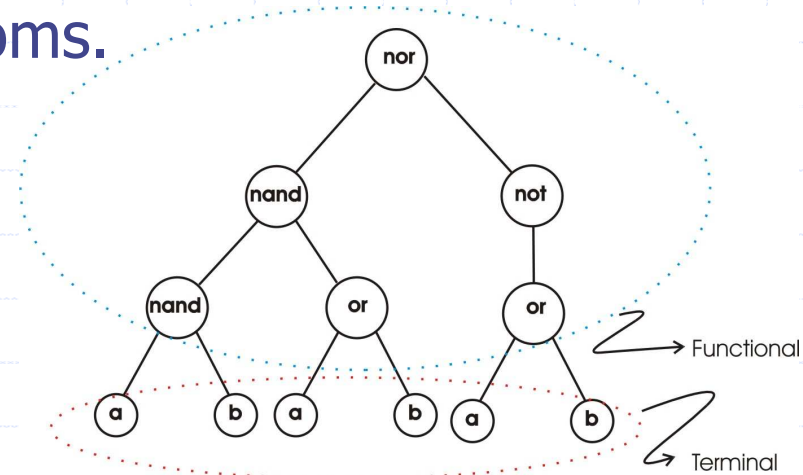


Fig. 5. A typical individual in GP.

Closure and Sufficiency (1/1)

- ◆ The **closure** that each of the functions in the function set be able to accept, as its arguments, any value and data type that may be possible returned by any function.
- ◆ The **sufficiency** requires that the terminal and functional sets be capable of expressing a solution to the problem.

Initialization of individuals (1/1)

- ◆ The “**full**” method involves creating trees for which the length of every nonbacktracking path between an endpoint and the root is equal to the specified maximum depth.
- ◆ The “**grow**” method involves growing trees that are variably shaped.
- ◆ The “**ramped half-and-half method**” is mixed method of full method and grow method.

Genotype-Phenotype (1/1)

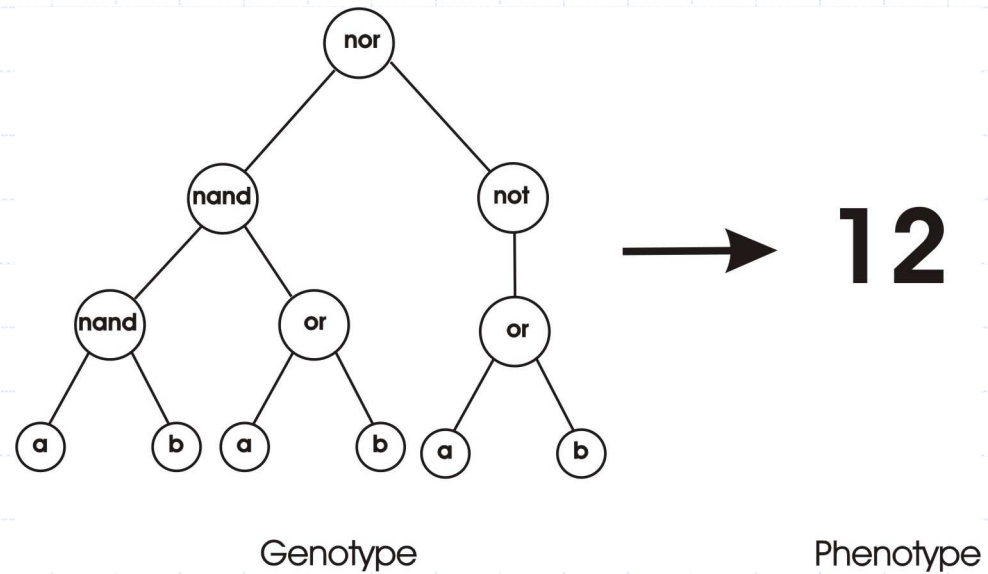


Fig. 6. Genotype-Phenotype of an Individual.

Selection (1/1)

Population		Shuffle		New Population	
Individuals	Values		Values	Individuals	Values
Ind1	= 10	Ind4 (30)	> Ind4 (30)	Ind4	= 30
Ind2	= 20	Ind1 (10)	> Ind3 (22)	Ind3	= 22
Ind3	= 22	Ind2 (20)	> Ind2 (20)	Ind2	= 20
Ind4	= 30	Ind3 (22)	> Ind4 (30)	Ind4	= 30

Fig. 7. Tournament Selection.

Crossover Operator (1/1)

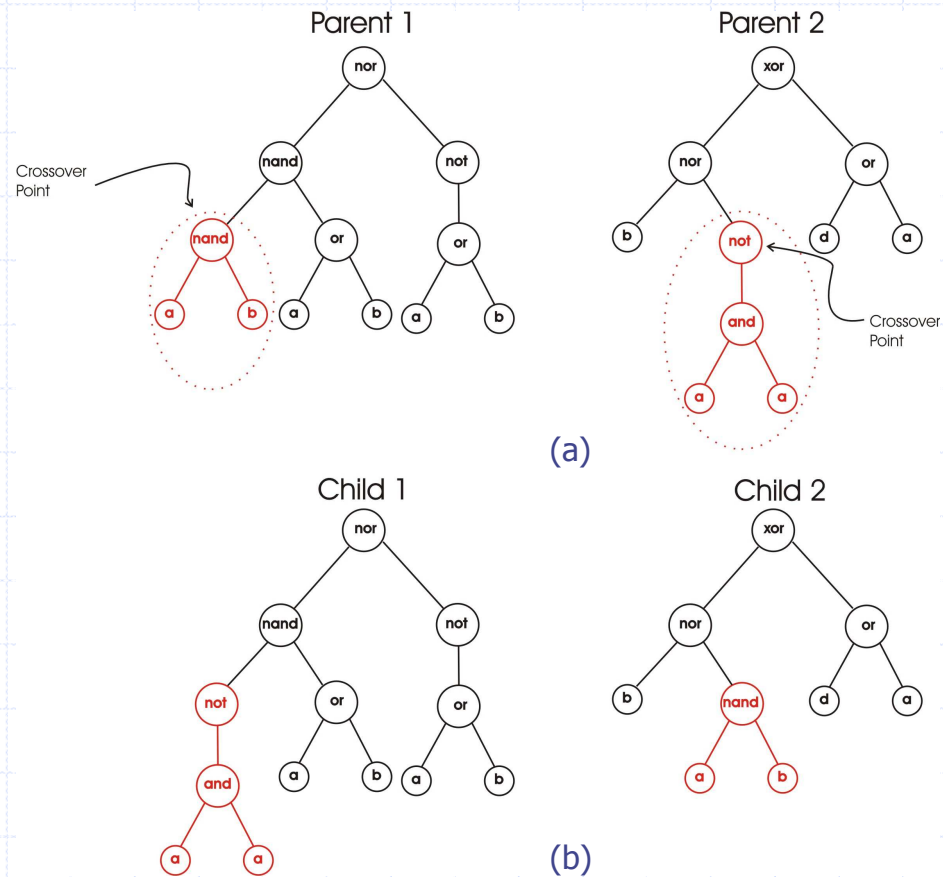


Fig. 8. Two parents before applying the crossover operator (a) and the children obtained after applying the crossover operator (b).

Mutation Operator (1/1)

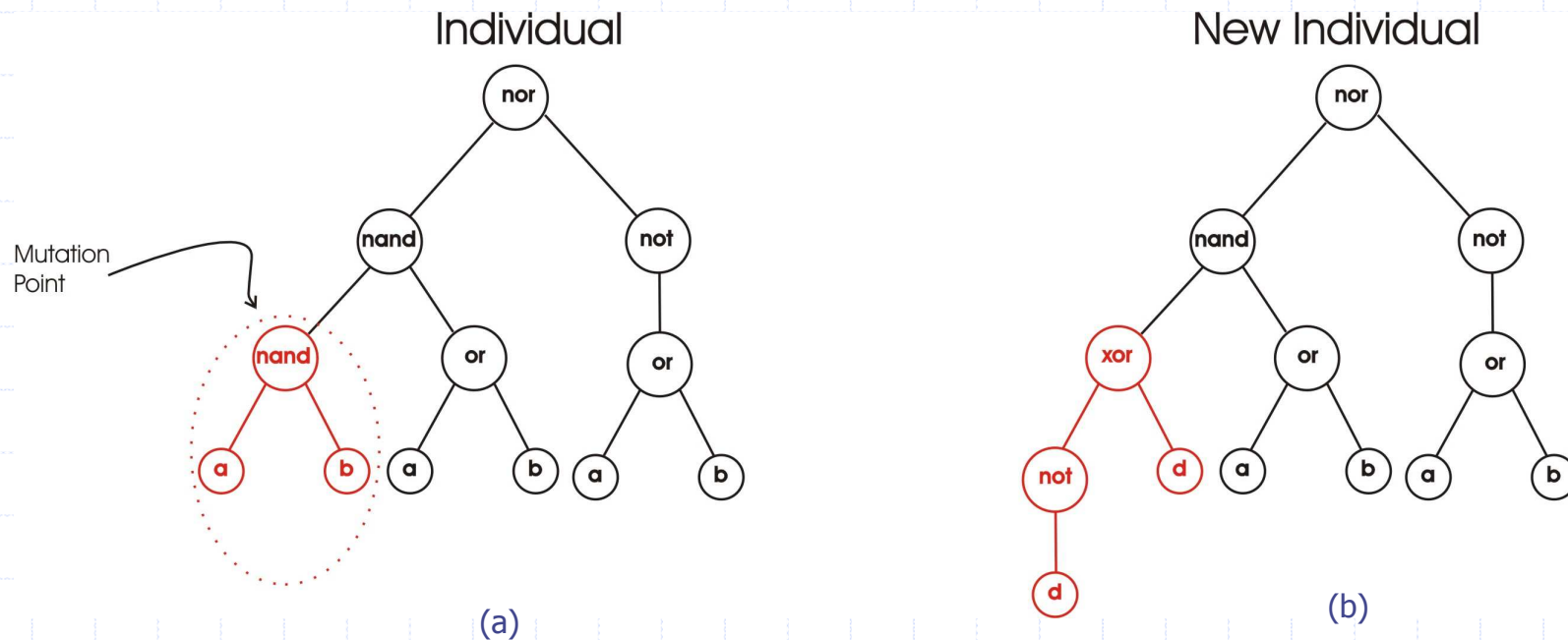
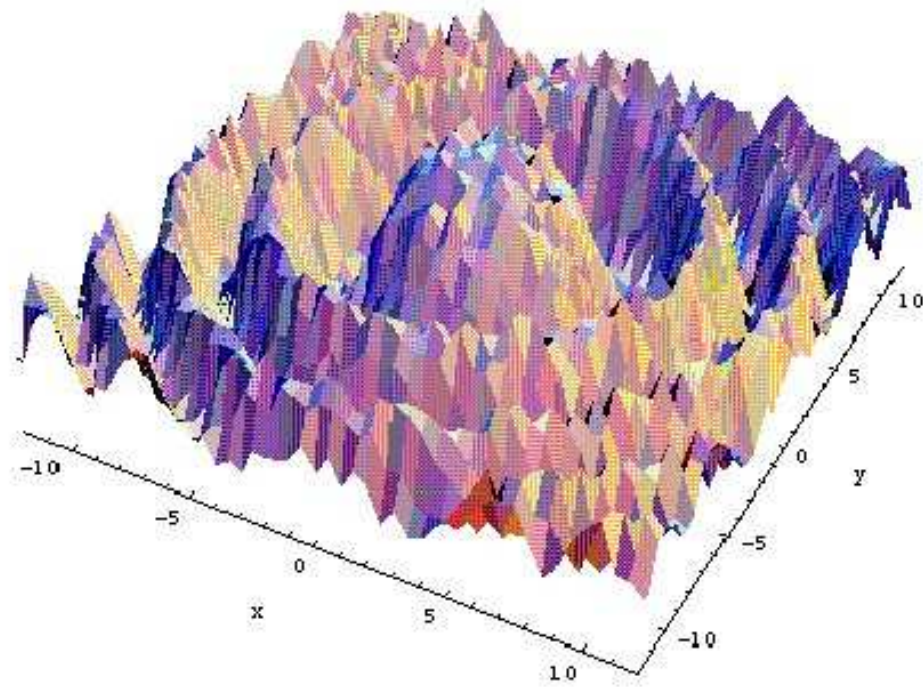


Fig. 9. One individual before applying the mutation operator (a) and the new individual obtained after applying the mutation operator (b).

Search Space (1/1)



Research Points (1/1)

- ◆ Introns.
- ◆ Bloat.
- ◆ New genetic operators.
- ◆ Mapping genotype-phenotype.
- ◆ Neutral Networks.

Applications (1/1)

- ◆ Robotics.
- ◆ Analysis of signals.
(video)
- ◆ Generation of music.
- ◆ Compression of
images.
- ◆ Tracking.

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References (1/1)

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- ◆ Banzhaf, W., Nordin, P., Keller, R.E., Francone, F.D. (1997), *Genetic Programming: An Introduction: On the Automatic Evolution of Computer Programs and Its Applications*, Morgan Kaufmann
- ◆ William Langdon and Riccardo Poli (2002), *Foundations of Genetic Programming*.