



Routing and Frequency Selection in Mesh Network using Genetic Algorithms

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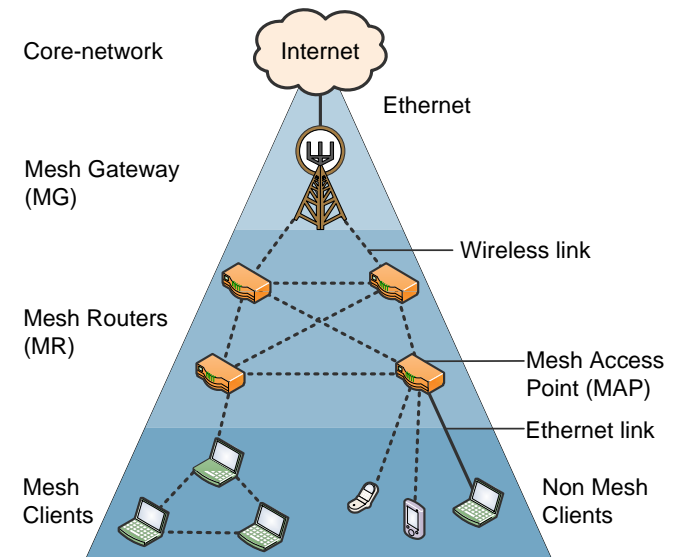
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Overview

- ▶ Motivation
- ▶ Problem Formulation
- ▶ Genetic Algorithms
 - Introduction
 - Application to Mesh Networks
- ▶ Numerical Results
- ▶ Outlook and Conclusion

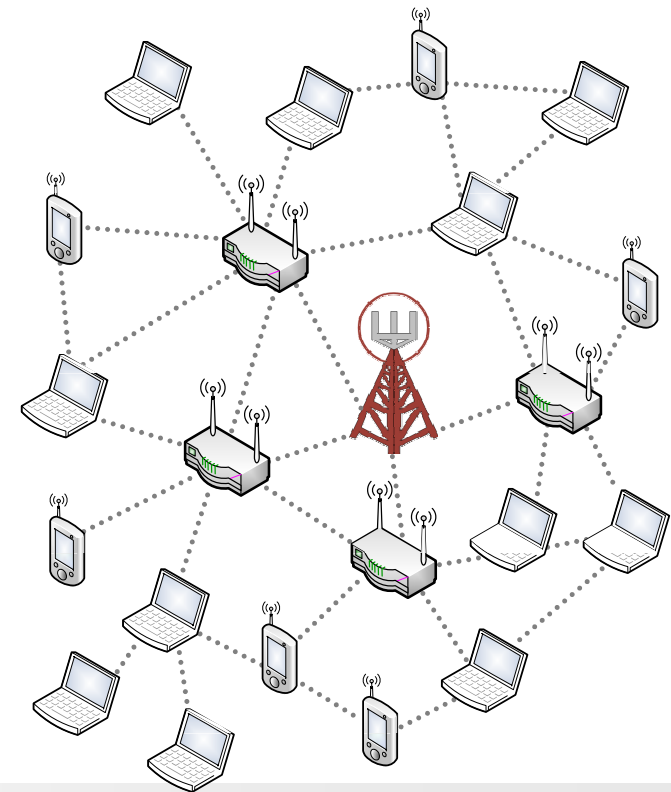
Mesh Network Planning

- ▶ Context: Characteristics of mesh networks
 - Multi*
 - Self-organized: routing, resource allocation, medium access
 - Static mesh routers
- ▶ Problem for commercial mesh network
 - Mesh routers have to be installed
 - Good service quality
- ▶ Planning of a self-organized network
 - fast evaluation of network qualitypossible solution:
 - plan static and idealistic
 - operate self-organized, dynamic



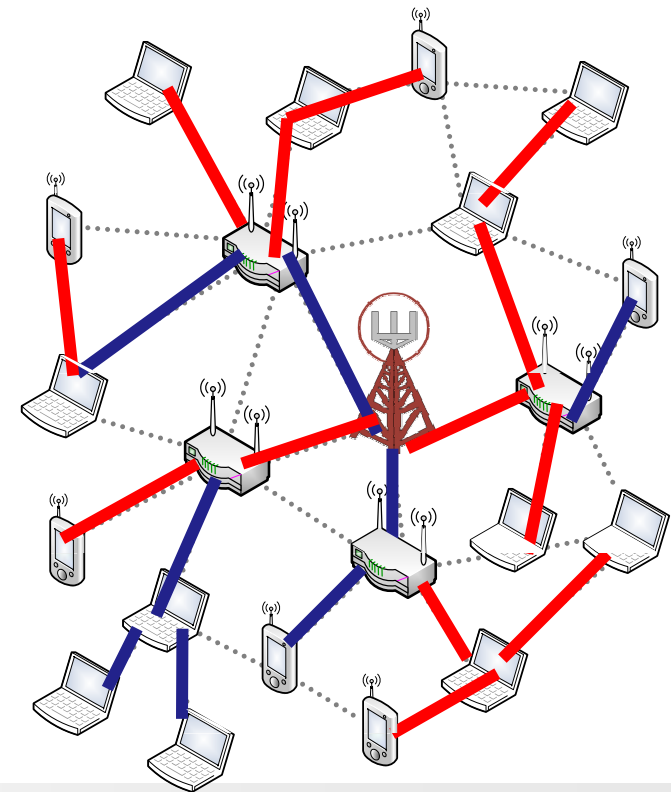
Problem Formulation

- ▶ Starting point:
 - optimization of routing and channel allocation
- ▶ Given:
 - set of mesh nodes (with number of interfaces)
 - set of gateways with access speeds
 - connectivity and pair-wise collision matrix
 - link rate matrix
 - number of parallel channels
- ▶ Output:
 - routing
 - channel allocation
- ▶ Objective:
 - maximize minimal or total throughput

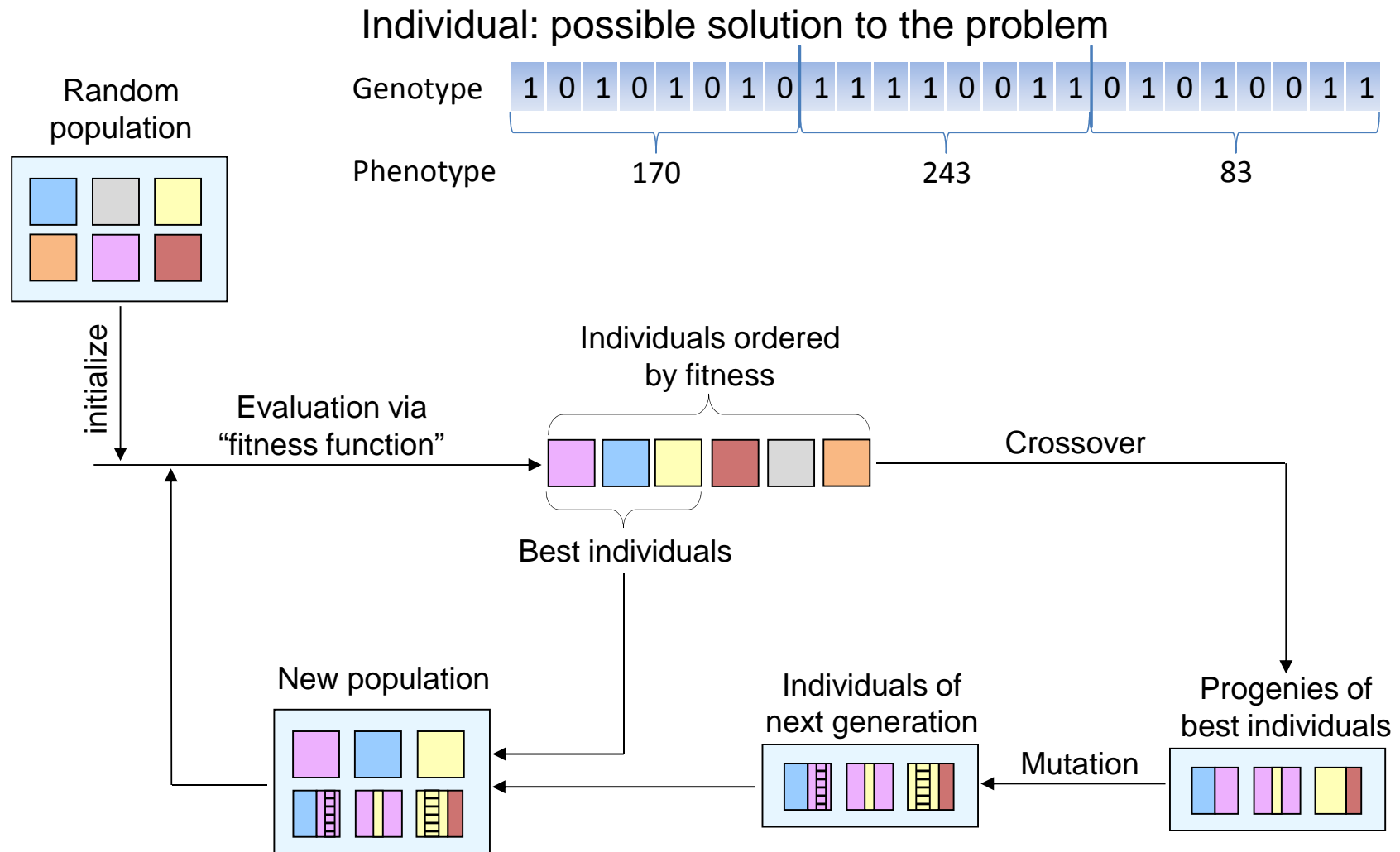


Problem Formulation

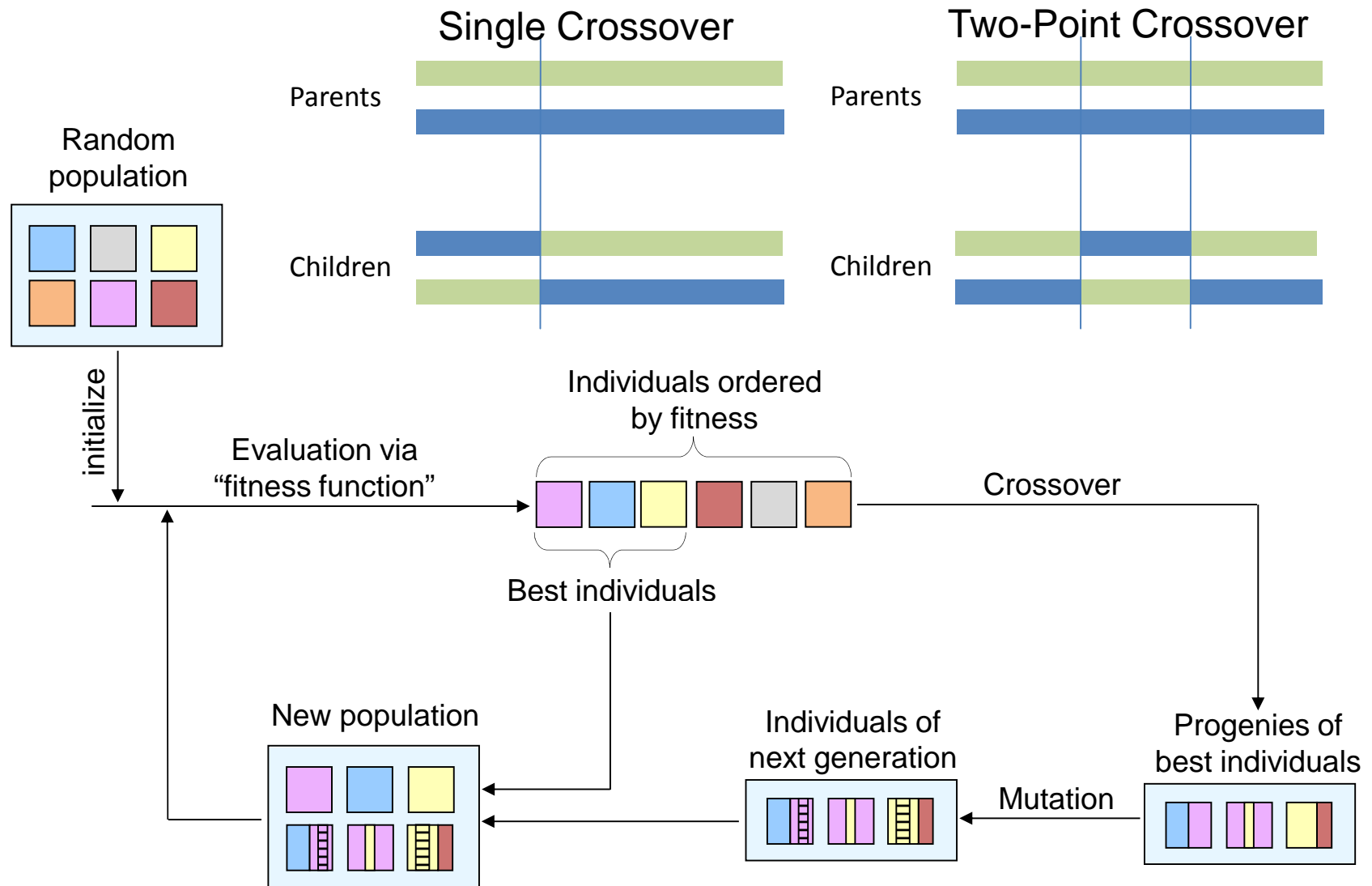
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Genetic Algorithms – Main Principles

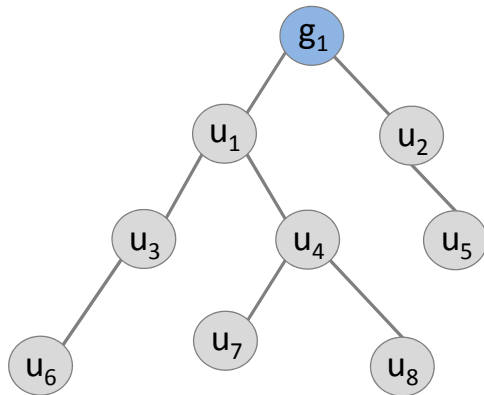


Genetic Algorithms – Main Principles



Wireless Mesh Networks: Individual

Possible routing

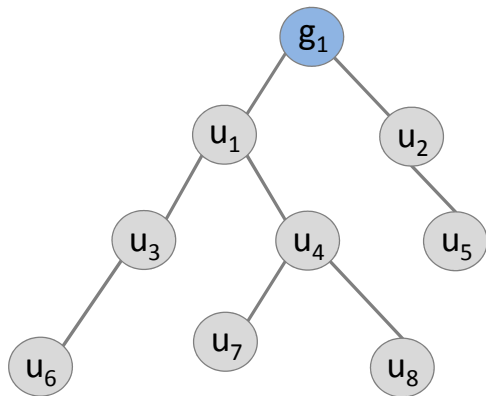


Corresponding individual

user	u ₁	u ₂	u ₃	u ₄	u ₅	u ₆	u ₇	u ₈
next hop	g ₁	g ₁	u ₁	u ₁	u ₂	u ₃	u ₄	u ₄

Wireless Mesh Networks: Individual

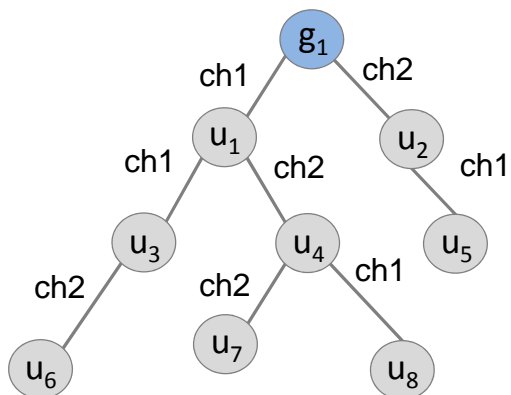
Possible routing



Corresponding individual

user	u ₁	u ₂	u ₃	u ₄	u ₅	u ₆	u ₇	u ₈
next hop	g ₁	g ₁	u ₁	u ₁	u ₂	u ₃	u ₄	u ₄

Channel allocation



Corresponding individual

user	u ₁	u ₂	u ₃	u ₄	u ₅	u ₆	u ₇	u ₈
next hop	g ₁	g ₁	u ₁	u ₁	u ₂	u ₃	u ₄	u ₄
channel	ch ₁	ch ₂	ch ₁	ch ₂	ch ₁	ch ₂	ch ₁	ch ₁

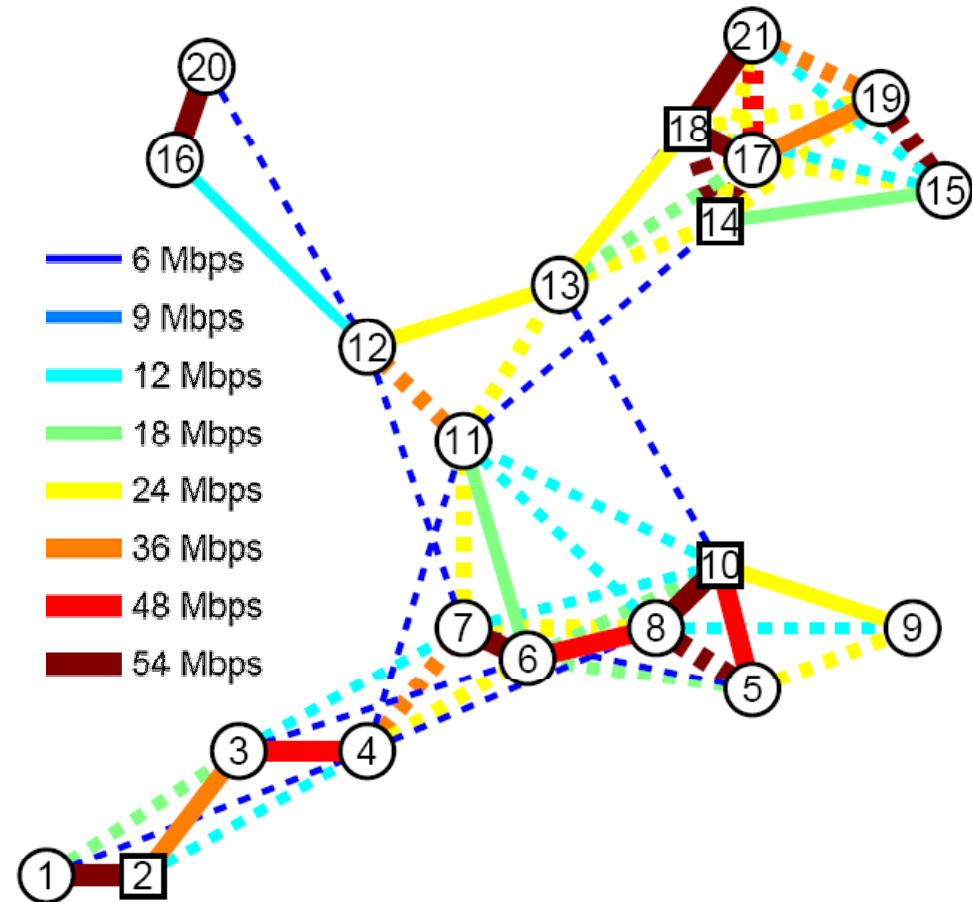
Fitness Function

► Problem:

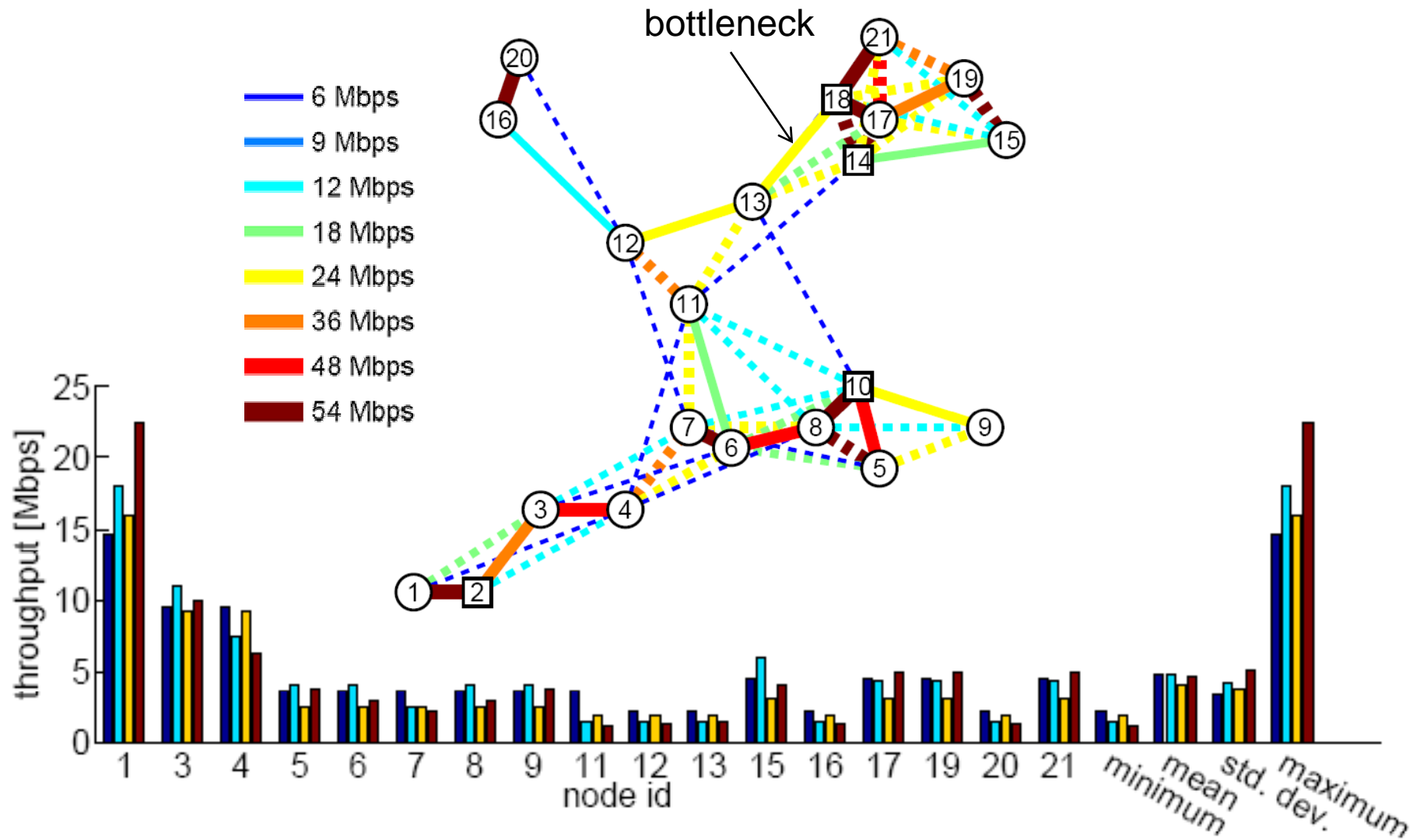
- Throughput for saturated traffic from the Internet to the mesh nodes?
- No **realistic** solution available e.g. for IEEE 802.11 or 802.16
- Idealistic solution

Max-min fair rate allocation

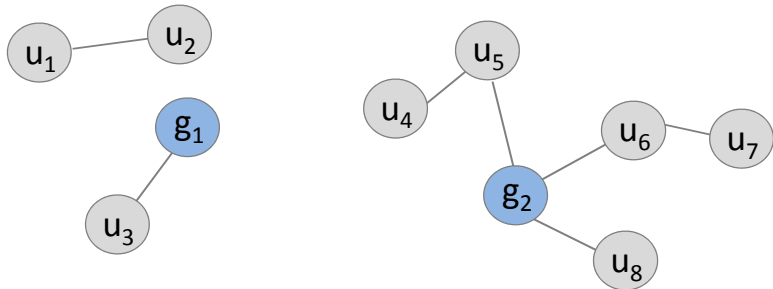
- Development of algorithm for
 - effective and nominal load
 - multiple rates
 - multiple gateways
 - multiple channels
- Fitness Function depends on rate statistics



Results for Example Network

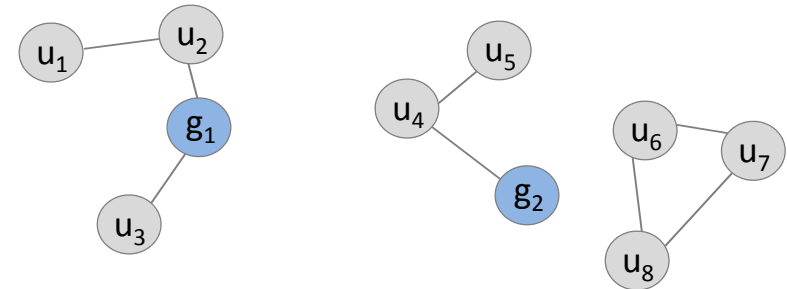
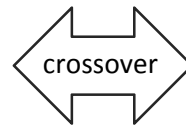


Two-Point Crossover



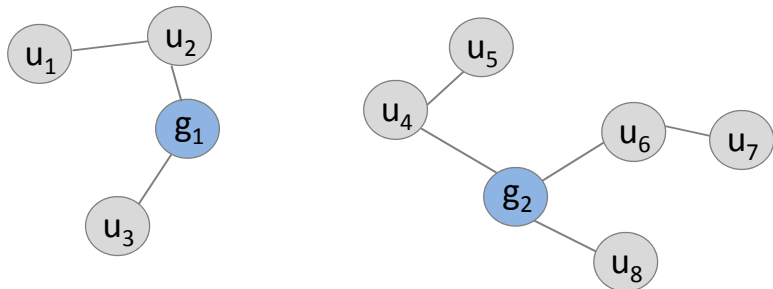
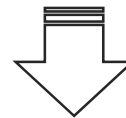
user	u ₁	u ₂	u ₃	u ₄	u ₅	u ₆	u ₇	u ₈
next hop	u ₂	u ₁	g ₁	u ₅	g ₂	g ₂	u ₆	g ₂
channel	ch ₁	ch ₂	ch ₂	ch ₂	ch ₂	ch ₁	ch ₂	ch ₁

individual 1



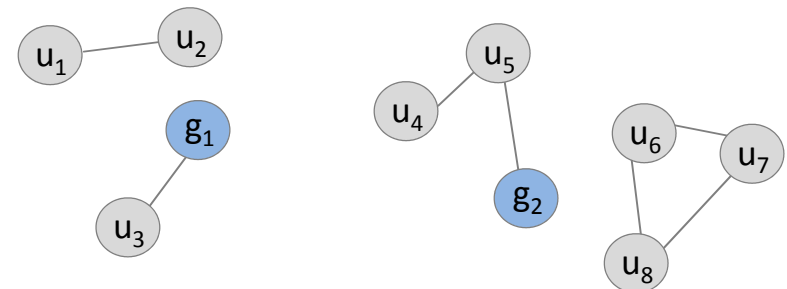
user	u ₁	u ₂	u ₃	u ₄	u ₅	u ₆	u ₇	u ₈
next hop	u ₂	g ₁	g ₁	g ₂	u ₄	u ₇	u ₈	u ₆
channel	ch ₂	ch ₂	ch ₁	ch ₂	ch ₁	ch ₂	ch ₁	ch ₁

individual 2



user	u ₁	u ₂	u ₃	u ₄	u ₅	u ₆	u ₇	u ₈
next hop	u ₂	g ₁	g ₁	g ₂	u ₄	g ₂	u ₆	g ₂
channel	ch ₁	ch ₂	ch ₁	ch ₂	ch ₁	ch ₁	ch ₂	ch ₁

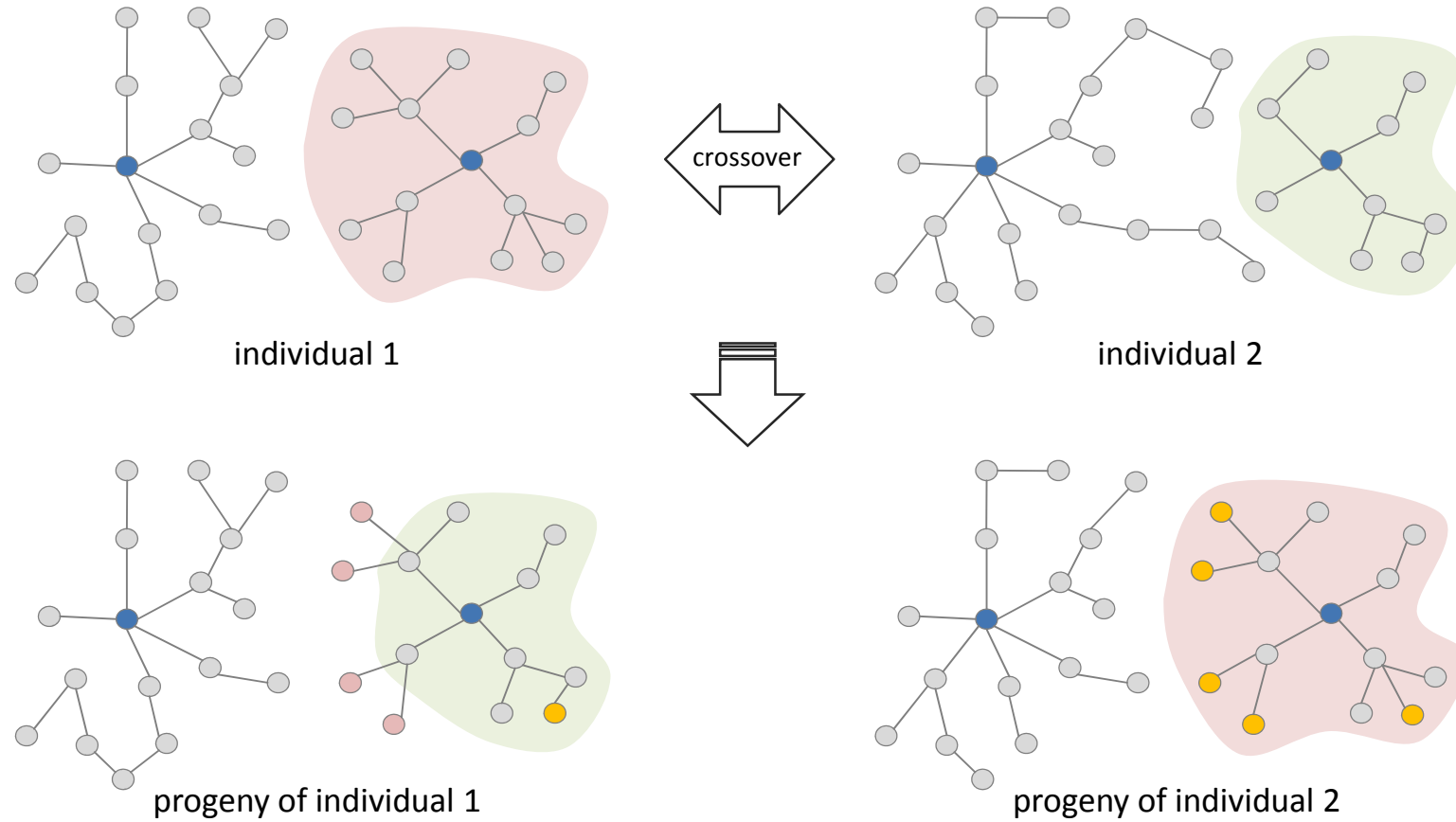
progeny of individual 1



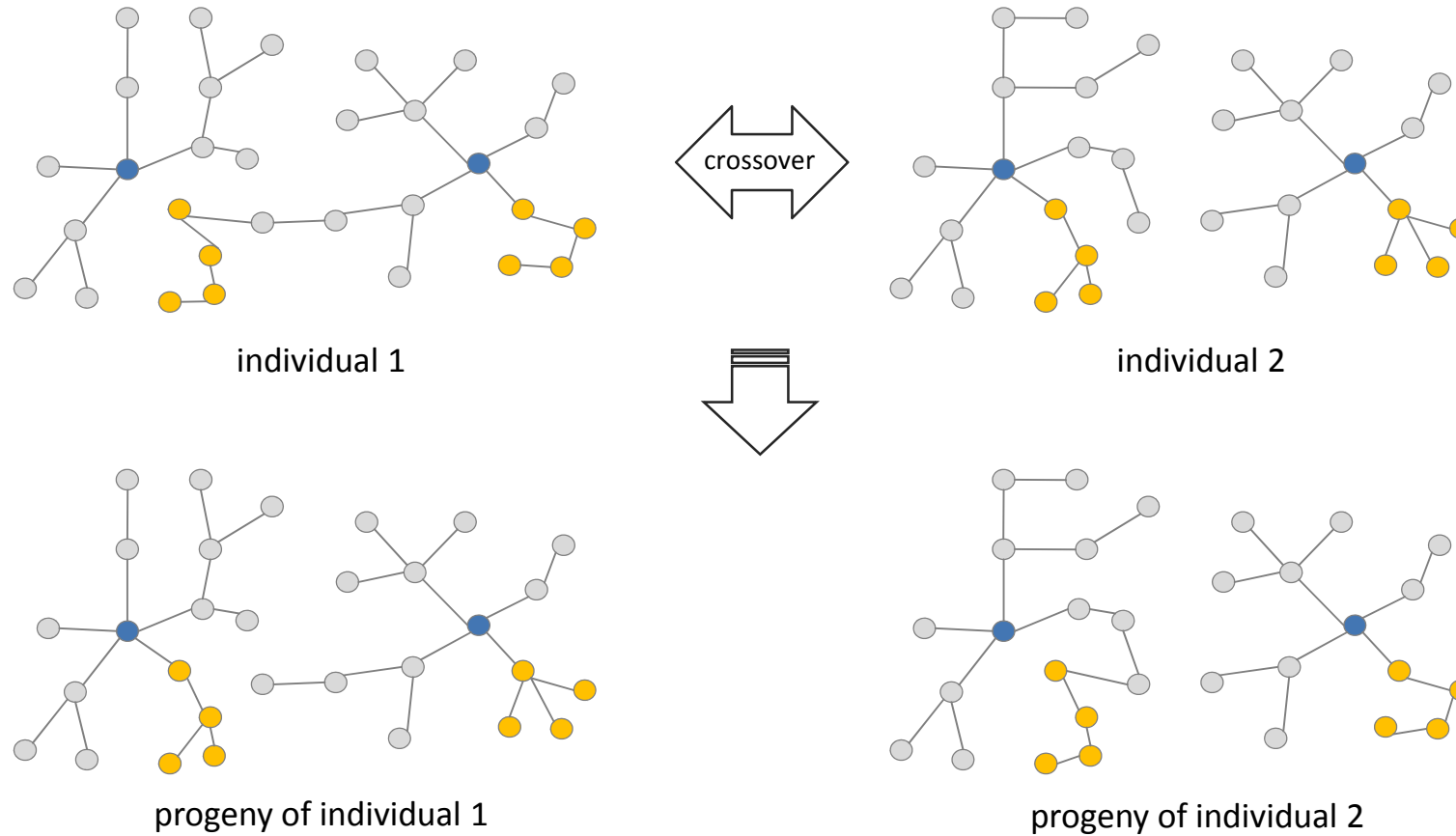
user	u ₁	u ₂	u ₃	u ₄	u ₅	u ₆	u ₇	u ₈
next hop	u ₂	u ₁	g ₁	u ₅	g ₂	u ₇	u ₈	u ₆
channel	ch ₂	ch ₂	ch ₂	ch ₂	ch ₂	ch ₂	ch ₁	ch ₁

progeny of individual 2

Cell Crossover

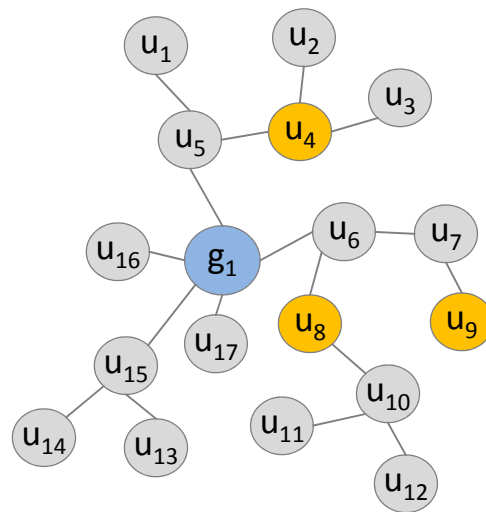


Subtree Crossover

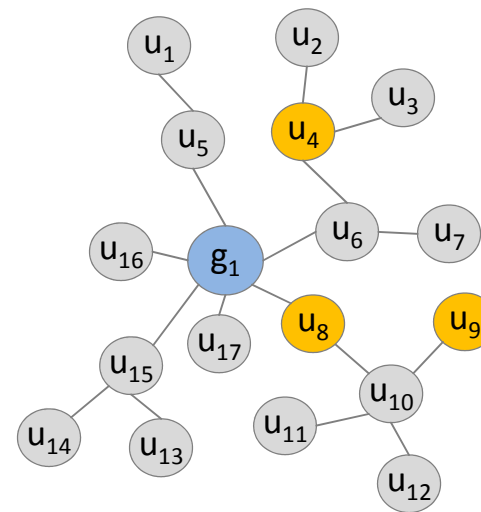


Mutation

- ▶ Changes within a single individual
- ▶ Number of mutations per individual can be controlled
- ▶ Disconnected parts are not allowed

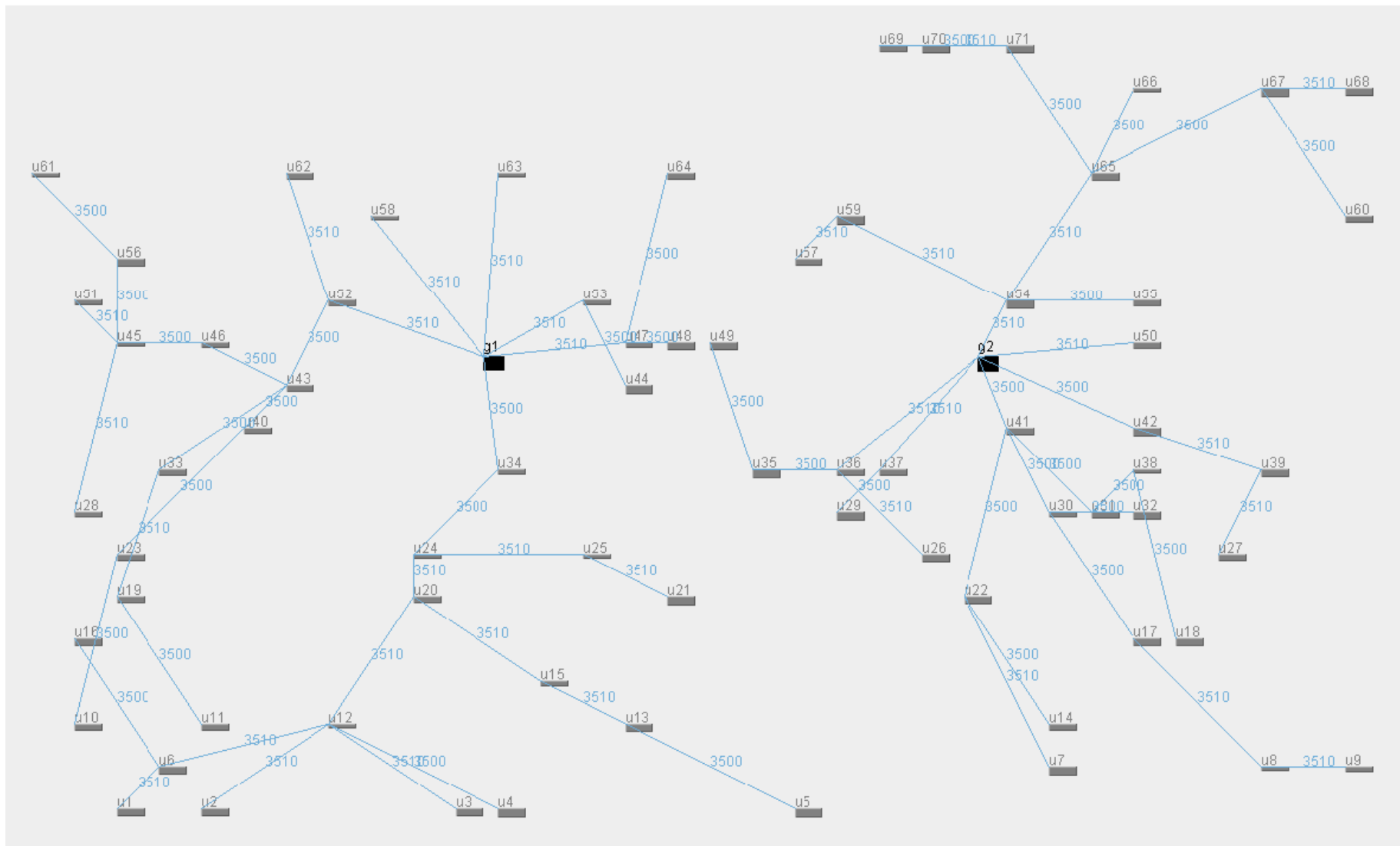


individual



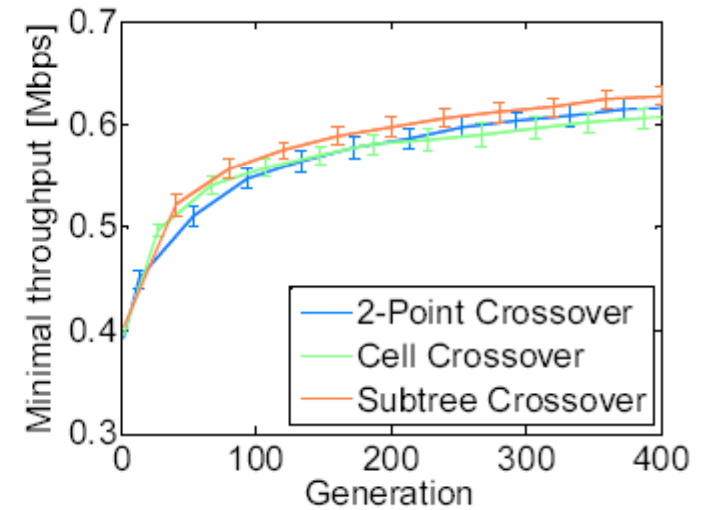
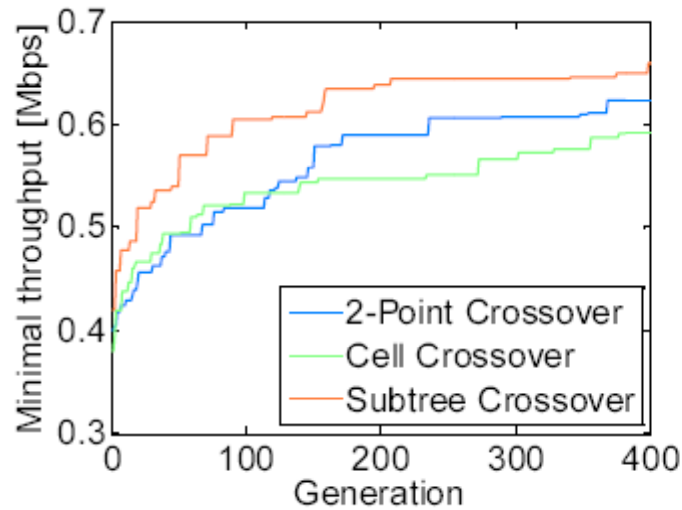
mutated individual

Result of Example Network 1

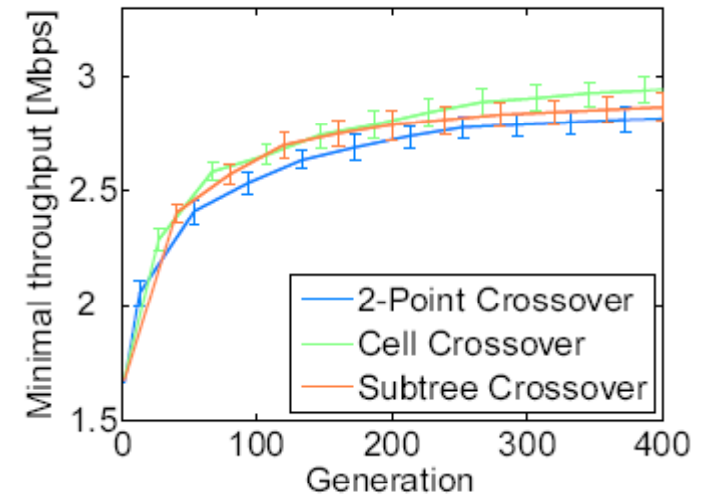
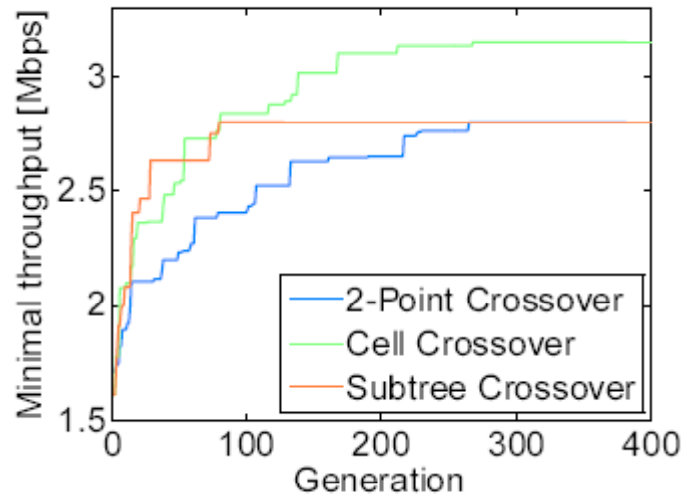


Impact of Crossover

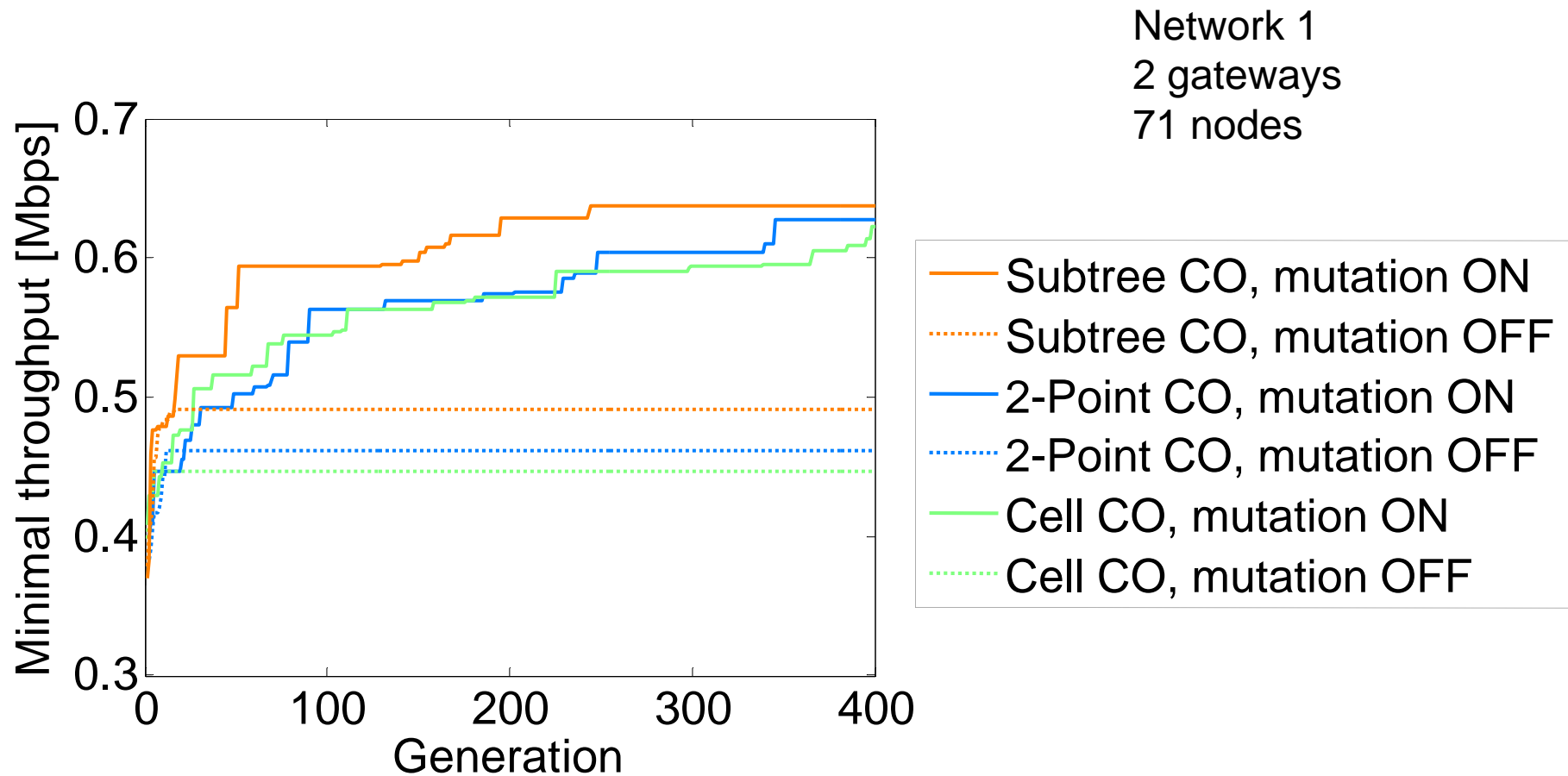
Network 1
2 gateways
71 nodes



Network 2
6 gateways
38 nodes



Impact of Mutation



Impact of Different Fitness Functions

$$f_1(\mathcal{N}) = \min(\mathcal{R}_{\mathcal{N}})$$

$$f_2(\mathcal{N}) = \text{median}(\mathcal{R}_{\mathcal{N}})$$

$$f_3(\mathcal{N}) = \text{mean}(\mathcal{R}_{\mathcal{N}})$$

$$f_4(\mathcal{N}) = \min(\mathcal{R}_{\mathcal{N}}) + \frac{\text{median}(\mathcal{R}_{\mathcal{N}})}{8}$$

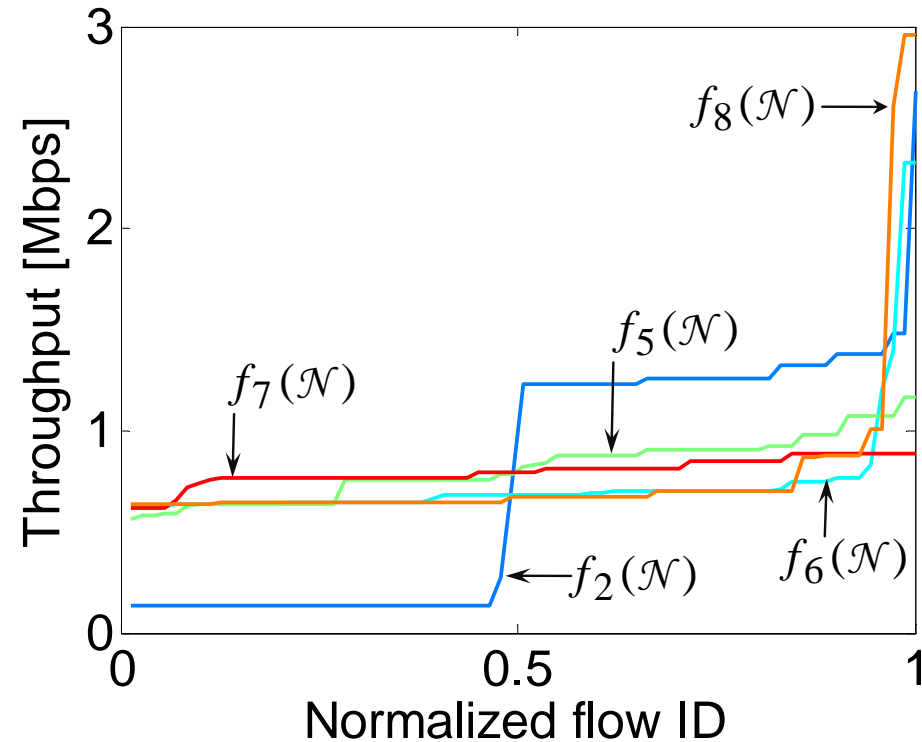
$$f_5(\mathcal{N}) = \text{mean}(\mathcal{R}_{\mathcal{N}}) - \text{var}(\mathcal{R}_{\mathcal{N}})$$

$$f_6(\mathcal{N}) = \min(\mathcal{R}_{\mathcal{N}}) + \frac{\text{median}(\mathcal{R}_{\mathcal{N}})}{8} + \frac{\text{mean}(\mathcal{R}_{\mathcal{N}})}{|\mathcal{L}|}$$

$$f_7(\mathcal{N}) = \sum_{i=0}^{|\tilde{T}|-1} (|\tilde{T}| - i) \cdot \tilde{T}(i)$$

$$f_8(\mathcal{N}) = \sum_{i=0}^{|\tilde{T}|-1} k^{|\tilde{T}|-i} \cdot \tilde{T}(i)$$

idea: stronger weight for smaller throughputs



Conclusion

- ▶ Target: Mesh Network Planning
- ▶ Subtarget: Optimal/Good Routing and Channel Allocation
- ▶ Genetic algorithms
 - need to be adapted to the problem
 - crossover variants: subtree crossover best/most robust
 - different fitness functions
- ▶ A lot of work to do
 - performance evaluation of mesh networks
 - planning of “self-organized” mesh networks

Next Steps

1. Comparison with other heuristics
2. Improve evaluation of mesh networks with static resource assignment
 - closer to actual technology
 - heterogeneous traffic scenarios, stochastic traffic
3. Proceed towards network planning
 - selection of node locations and gateway node
 - adapt genes, mutation, crossover, fitness function

Direction 1:

- extend routing and channel assignment problem

Direction 2:

- develop more abstract fitness function for “self-organized” mesh networks
- network configuration/gene does not determine routing and channel allocation but only node and gateway location