

# An Optimization Approach for the Network Synthesis of Distributed Embedded Systems

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# Outline

- Context & background
- Current limitations
- Methodology
- Experimental results
- Conclusions & Future developments

# Context & Background

# Distributed Embedded Systems (DESs)

- Distributed applications of Networked Embedded Systems (NESs) interacting together
  - Example: Distributed control of building temperature
- Different types of channels and protocols
- Each NES acts as a **node** of the network
- New design goal
  - *Good behavior of the global application*

# Network Synthesis

- Design process starting from a high-level specification of DES
- It finds the actual configuration in terms of
  - mapping of application tasks onto network nodes
  - their spatial displacement
  - the type of channels and protocols among them, and the network topology

# CASSE (1)

- Communication Aware Specification and Synthesis Environment (CASSE), is an extended design flow, which addresses the network synthesis, in terms of nodes, tasks, data flows, abstract channels, zones and contiguities.
  - **Tasks**
    - A task represents a basic functionality of the whole application; it takes some data as input and provides some output.
    - Relevant attributes: *computational requirements, mobility.*
  - **Data flows**
    - A data flow (DF) represents communication between two tasks; output from the source task is delivered as input for the destination task.
    - Relevant attributes: *communication requirements.*
  - **Nodes**
    - A node can be seen as a container of tasks.
    - Relevant attributes: *available computational resources, intrinsic power consumption, power consumption due to tasks, mobility, economic cost.*

# CASSE (2)

## – Abstract Channels

- An abstract channel (AC) interconnects two or more nodes.
- Relevant attributes: available communication resources, economic cost, wireless/wired.

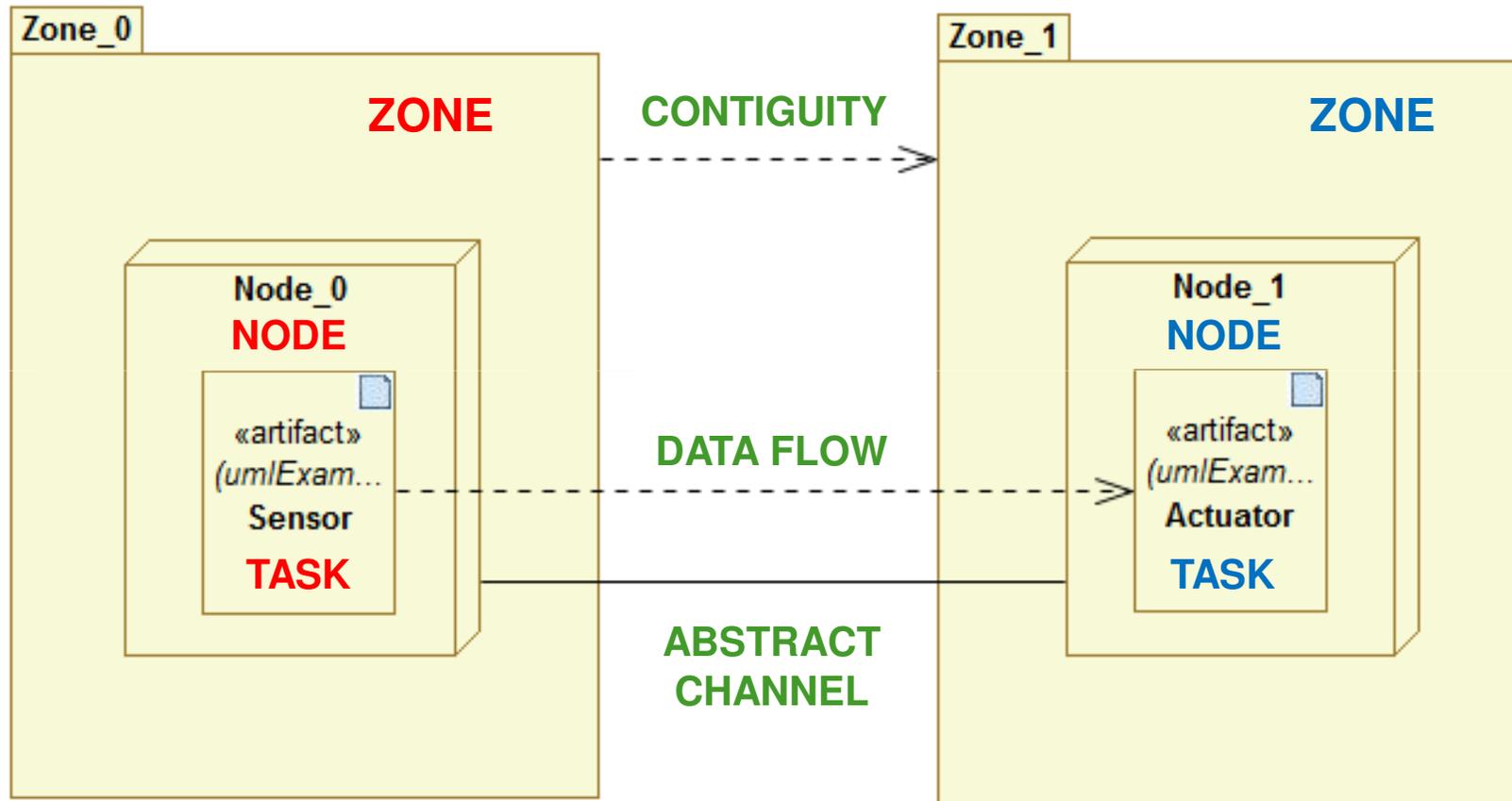
## – Zones

- A zone is a partition of the space which contains nodes; each zone is characterized by environmental attributes which are application-specific.

## – Contiguities

- Zones are related by the notion of contiguity defined as follows:
  - Two zones are contiguous if nodes belonging to them can communicate each other.
  - Contiguity represents not only the physical distance between zone, but it can be used also to model environmental obstacles like walls.
- Relevant attributes: resistance.

# UML Deployment Diagram



# Purely analytical Optimization

- Process that explores the solutions using techniques unaware of the network context.
- Formulation of the network optimization problem in the form of MILP (Mixed Integer Linear Programming) problem, whose optimization techniques are well known in literature (e.g. Simplex method, Branch-and-bound method).

# Current limitations

- The increase of the complexity of distributed applications
  - Computer-aided design for the communication infrastructure between nodes of a DES
- Low scalability of pure analytical approaches (e.g., MILP) to the size of a real application
  - Analytical modeling could be combined with **Network Manipulation** driven by an optimization process
- Gap between the ideal model of the network, and the real network
  - Mixed analytical and simulation-based methodology is needed

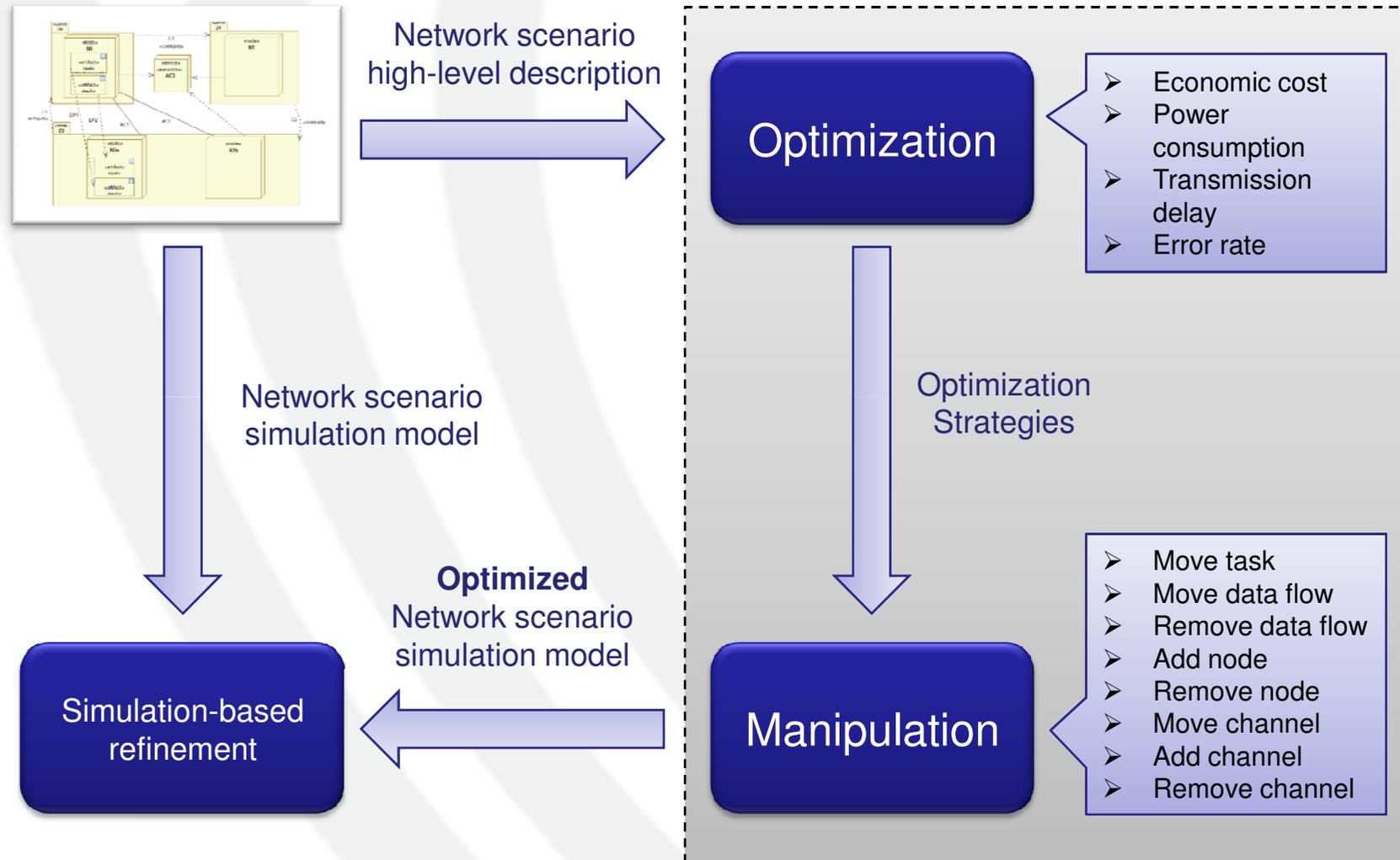


# Methodology

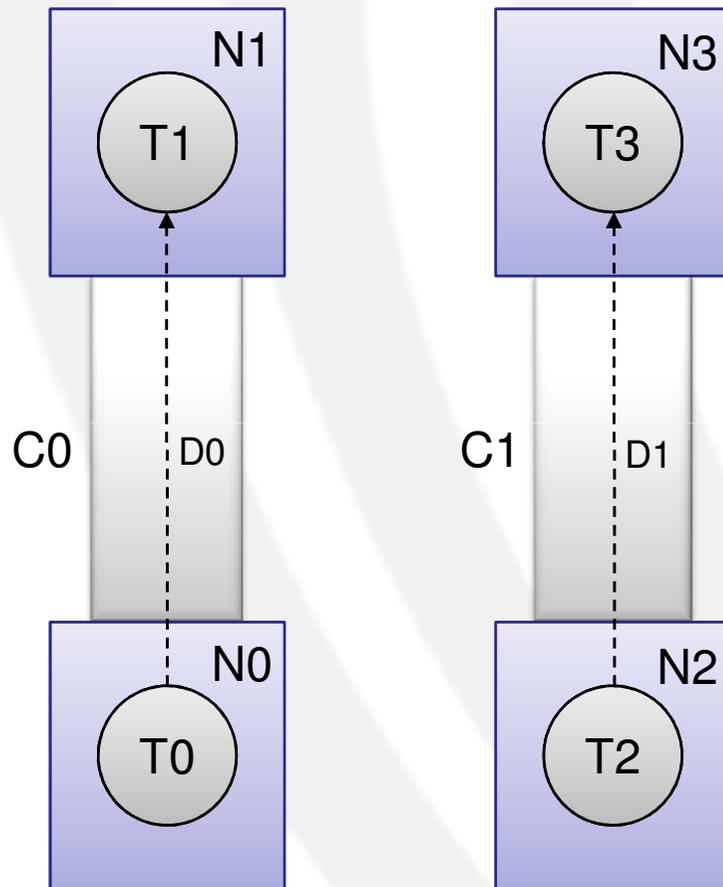
# Contributions

- NW-aware approach for the optimal Network Synthesis of DES.
- Methodology to manipulate the DES description from a high level specification to simulation.
- Definition of manipulation rules to alter the network setup according to given optimization goals.
- Use of the network simulation to validate the optimization results and explore other possible solutions.

# Flow for optimal Network Synthesis

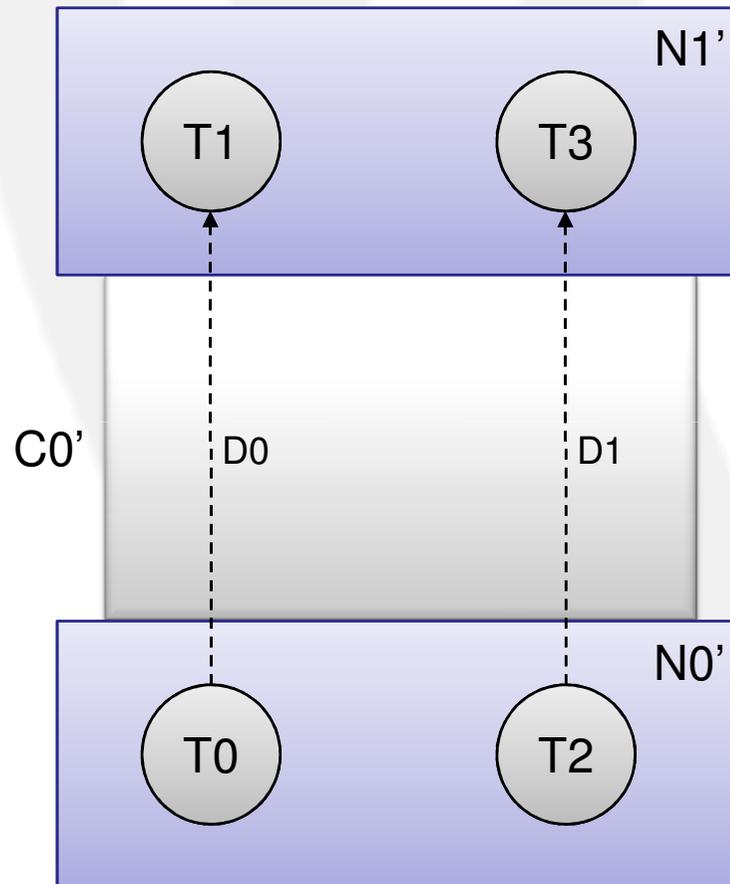


# Optimization problem (1)



- nodes N0, N1, N2, N3
- tasks T0, T1, T2, T3
- channels C0, C1
- data flows D0, D1

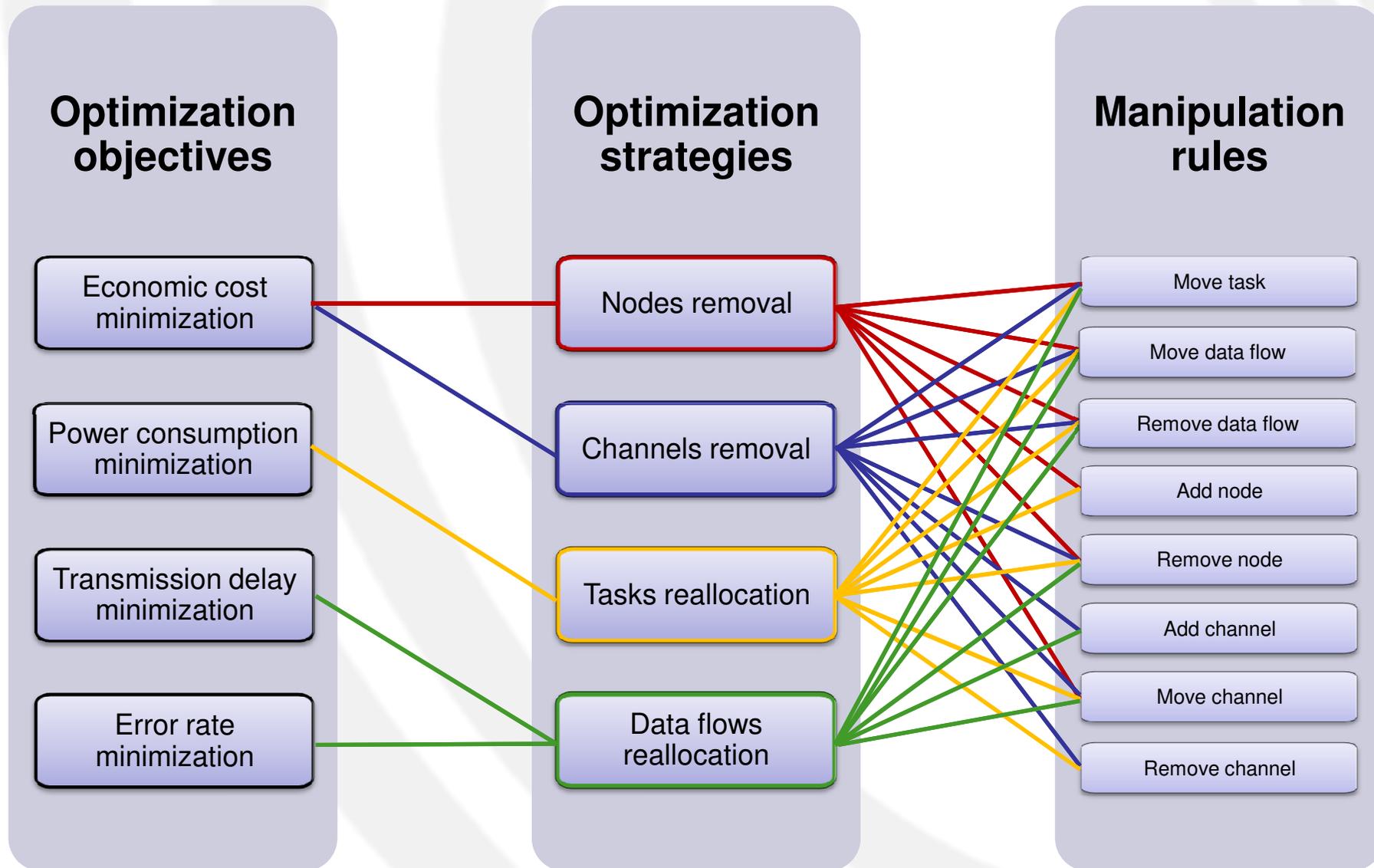
# Optimization problem (2)



## PROBLEMS:

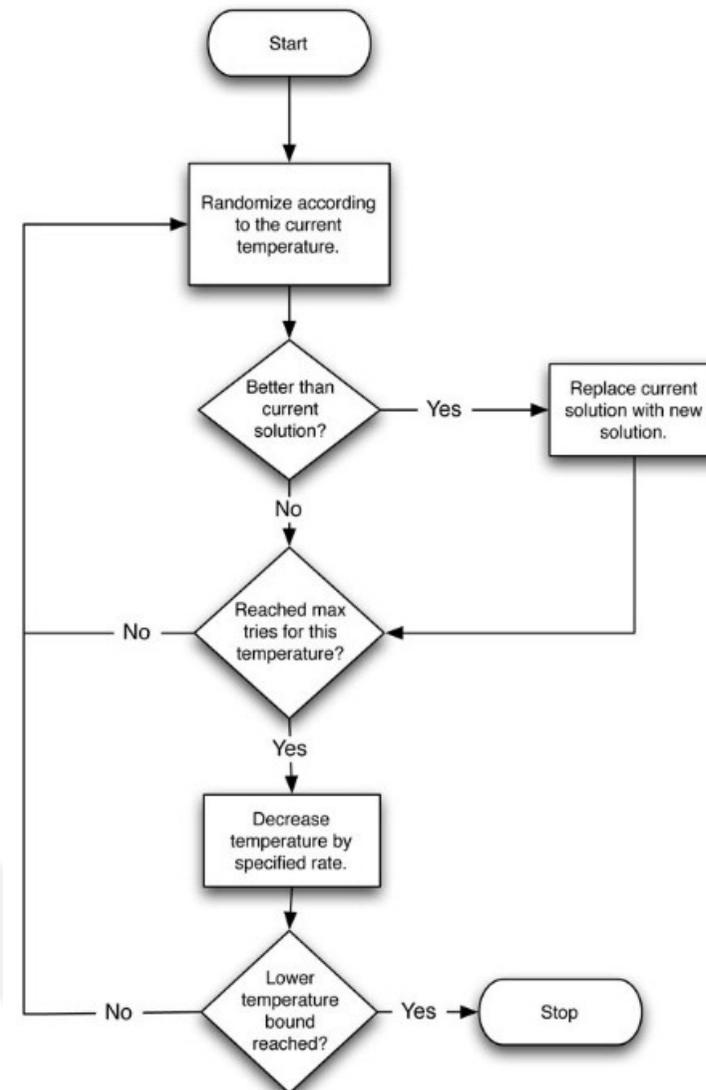
- How to split this transformations into elementary steps?
- How to link elementary transformations to optimization goals?

# NW-Aware Optimization

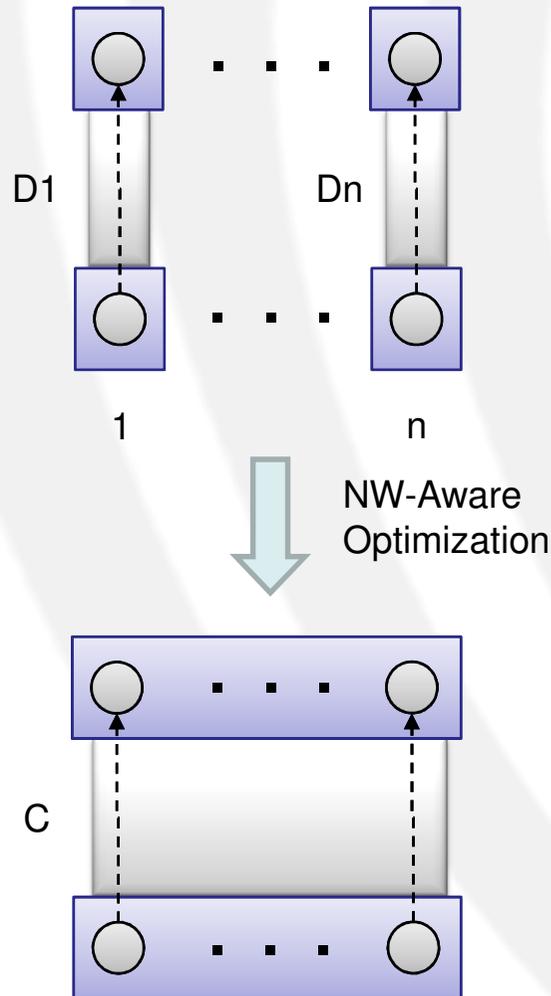


# Simulated Annealing

- Generic probabilistic metaheuristic for the global optimization problem of locating a good approximation to the global optimum of a given function.
- Aims to find a global optimum when many local optima are present.
- Often used when the search space is large and also discrete.



# Ideal model vs. Actual behavior (1)



For each  $i$ -th data flow we define its throughput as:

$$Th(D_i)$$

Ideally, the used capacity of channel  $C$  should be:

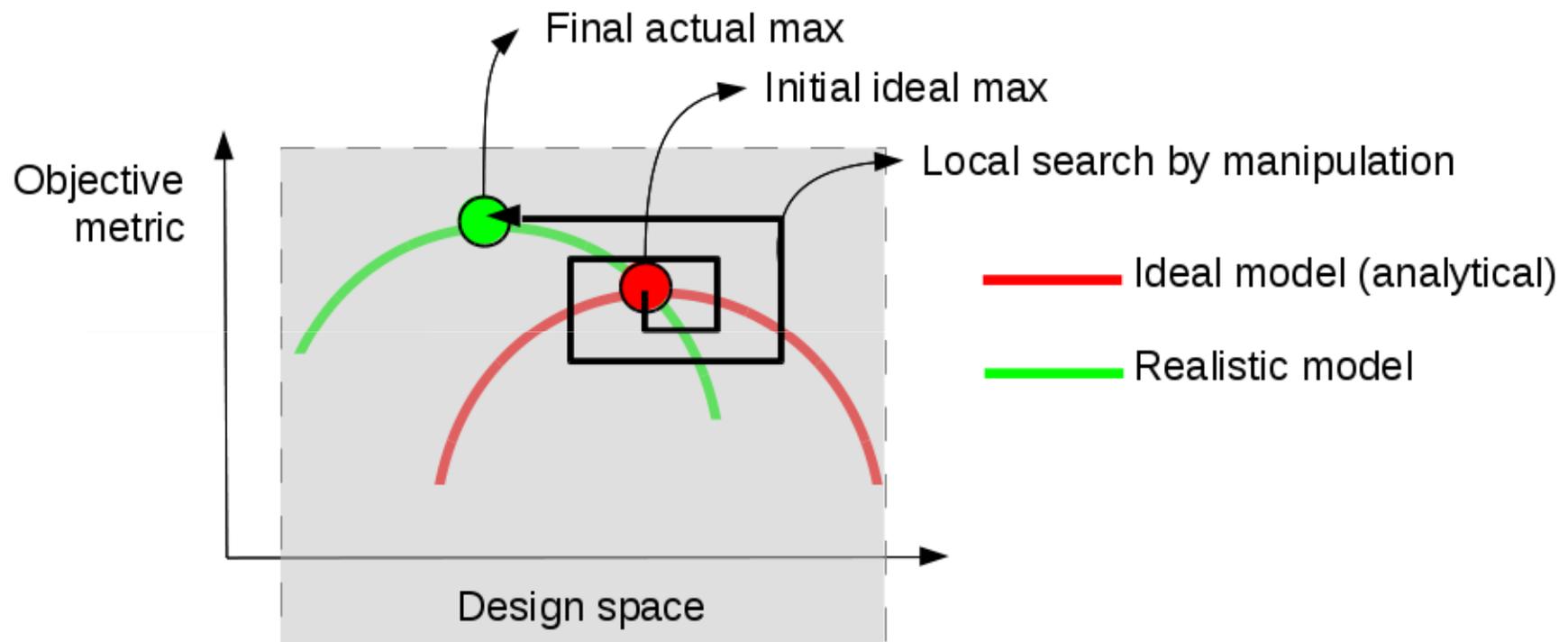
$$\sum_{i=1}^n Th(D_i)$$

**NOT ALWAYS TRUE!**  
e.g., overhead of the wireless protocols

## Non-idealities

- In the Network-aware Optimization process we make some ideality assumptions which often don't correspond to reality.
- For this reason we make a list of non-ideality factors that we are not able to take fully into account in the Network-aware optimization approach:
  - from the point of view of the Network
  - from the point of view of the Nodes
  - from the point of view of the Power consumption
  - from the point of view of the HW Architecture

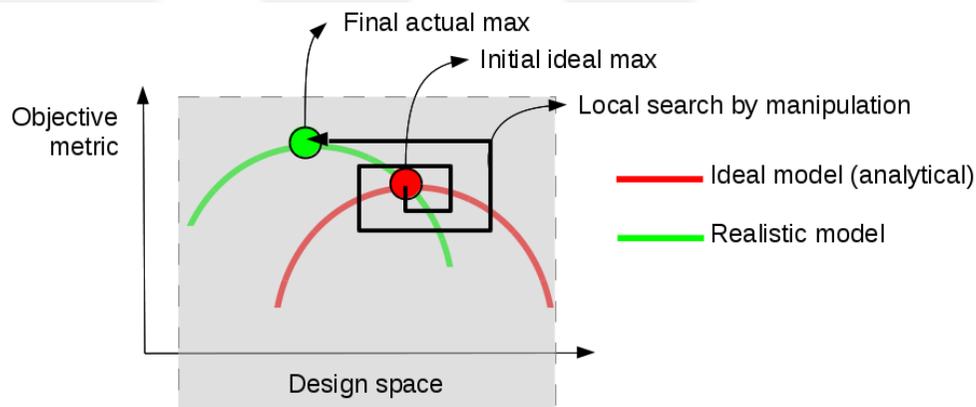
# Ideal model vs. Actual behavior (2)



# Simulation

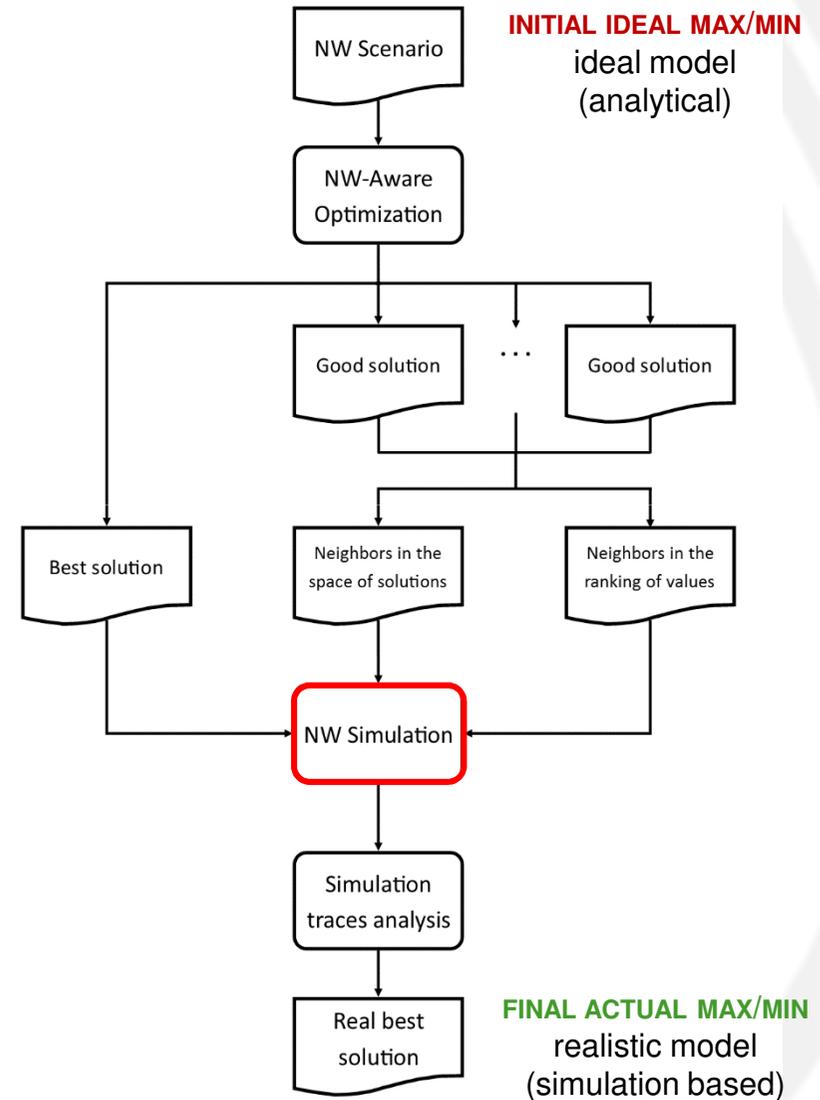
- To take into account the non-ideality factors in the optimization process, we are going to use the simulation applied to:
  - Points close to the optimal obtained with the manipulations
    - Neighbors in the solution space
  - Points close to the optimal obtained with the manipulations
    - Neighbors in the ranking of the best solutions found
- Network Simulation lets us to refine the choice of candidate solutions for those objectives that operate on parameters verifiable through simulation (e.g. delay, error rate).

# Simulation-based refinement

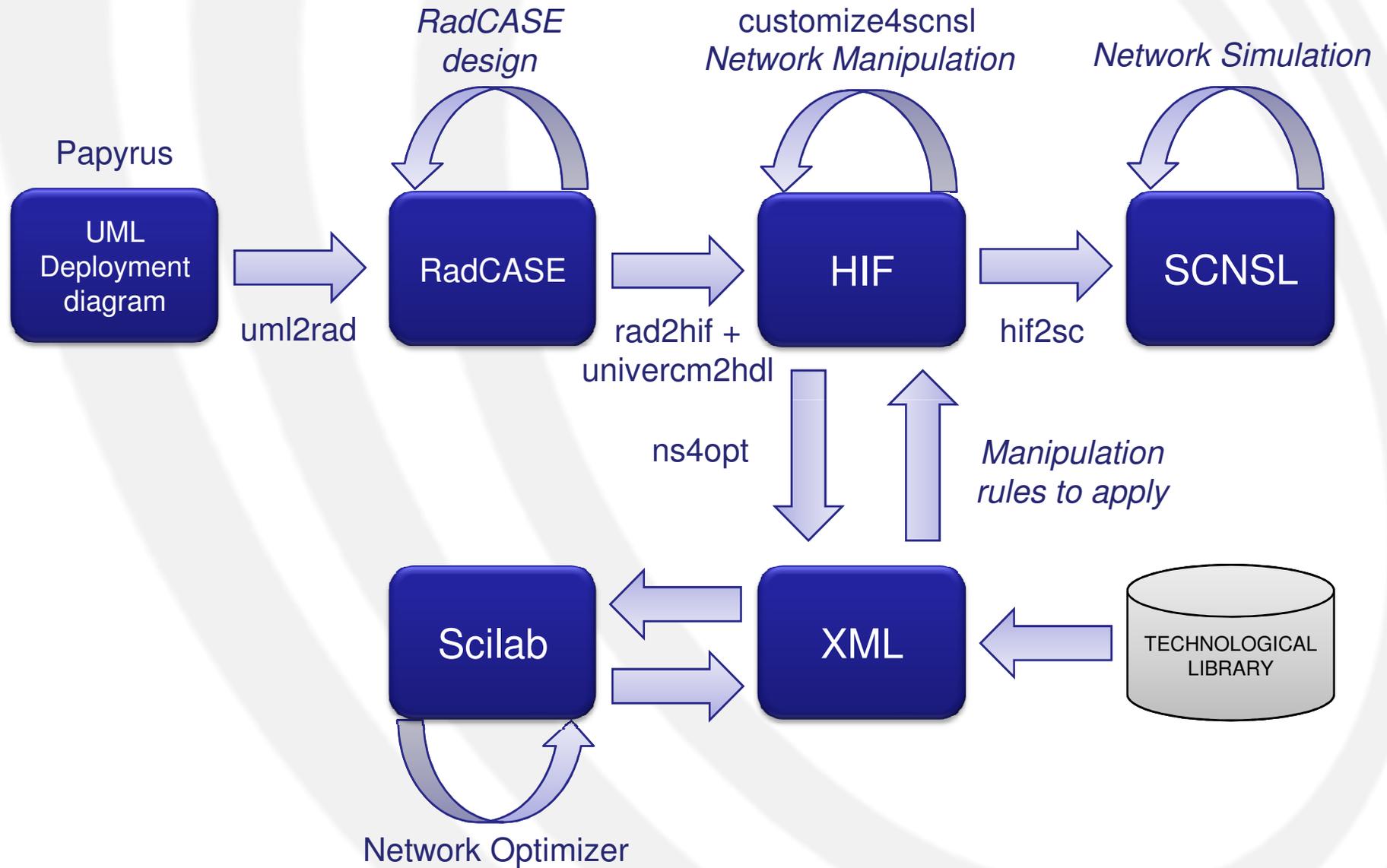


Considering neighbors of the optimum ideal max in

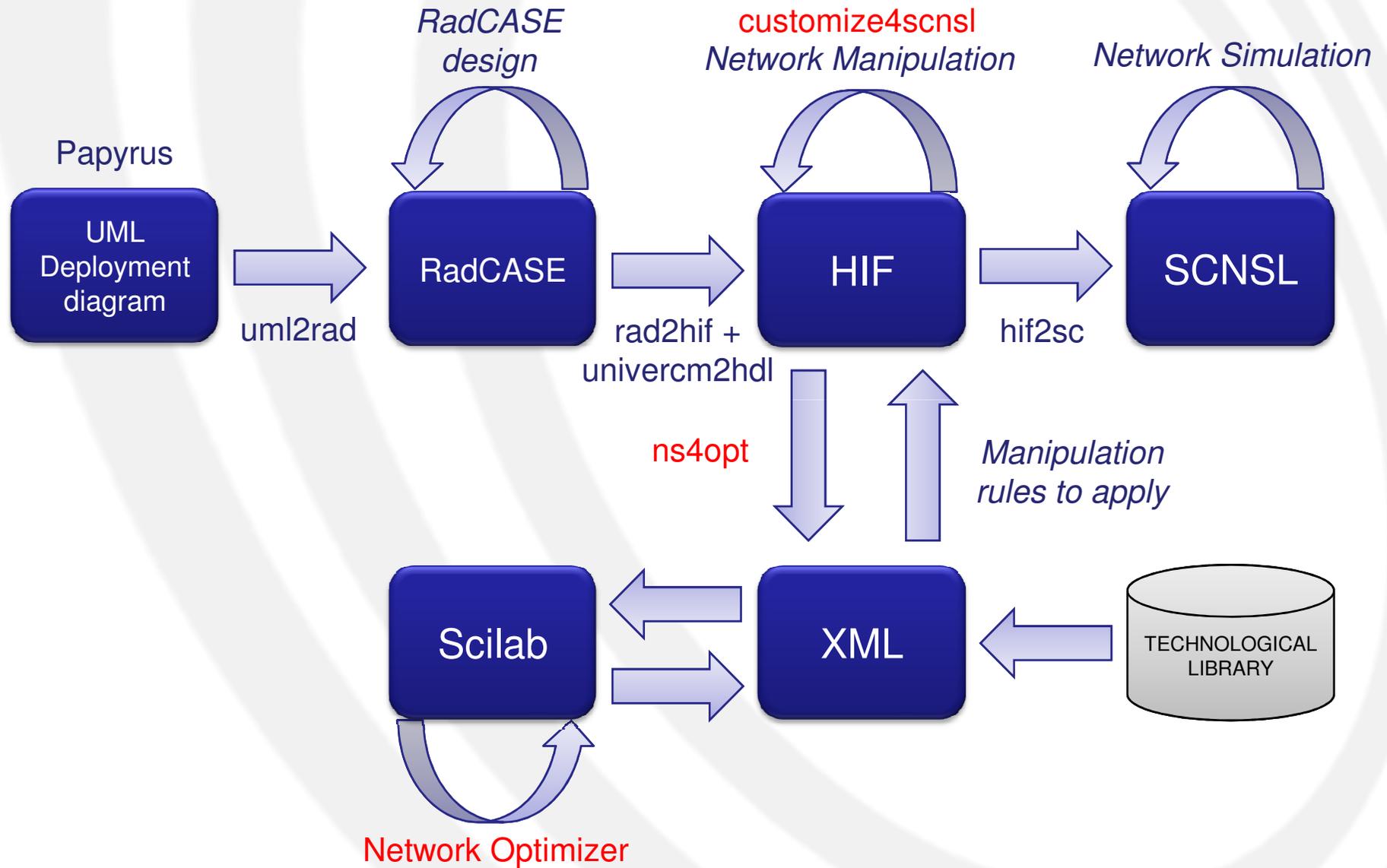
1. the space of solutions
2. the ranking (with respect to the optimization metric)



# Toolchain

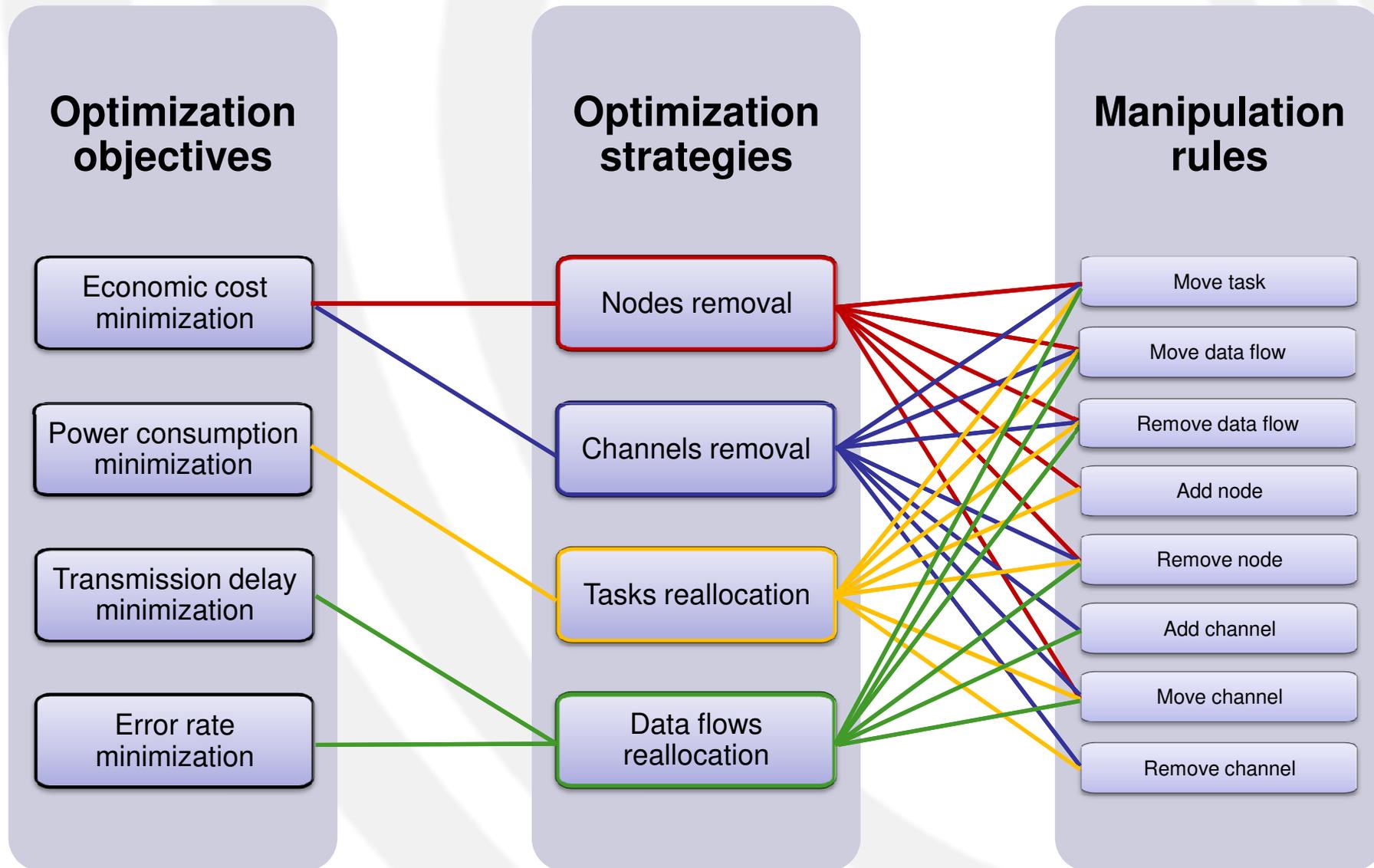


# Toolchain

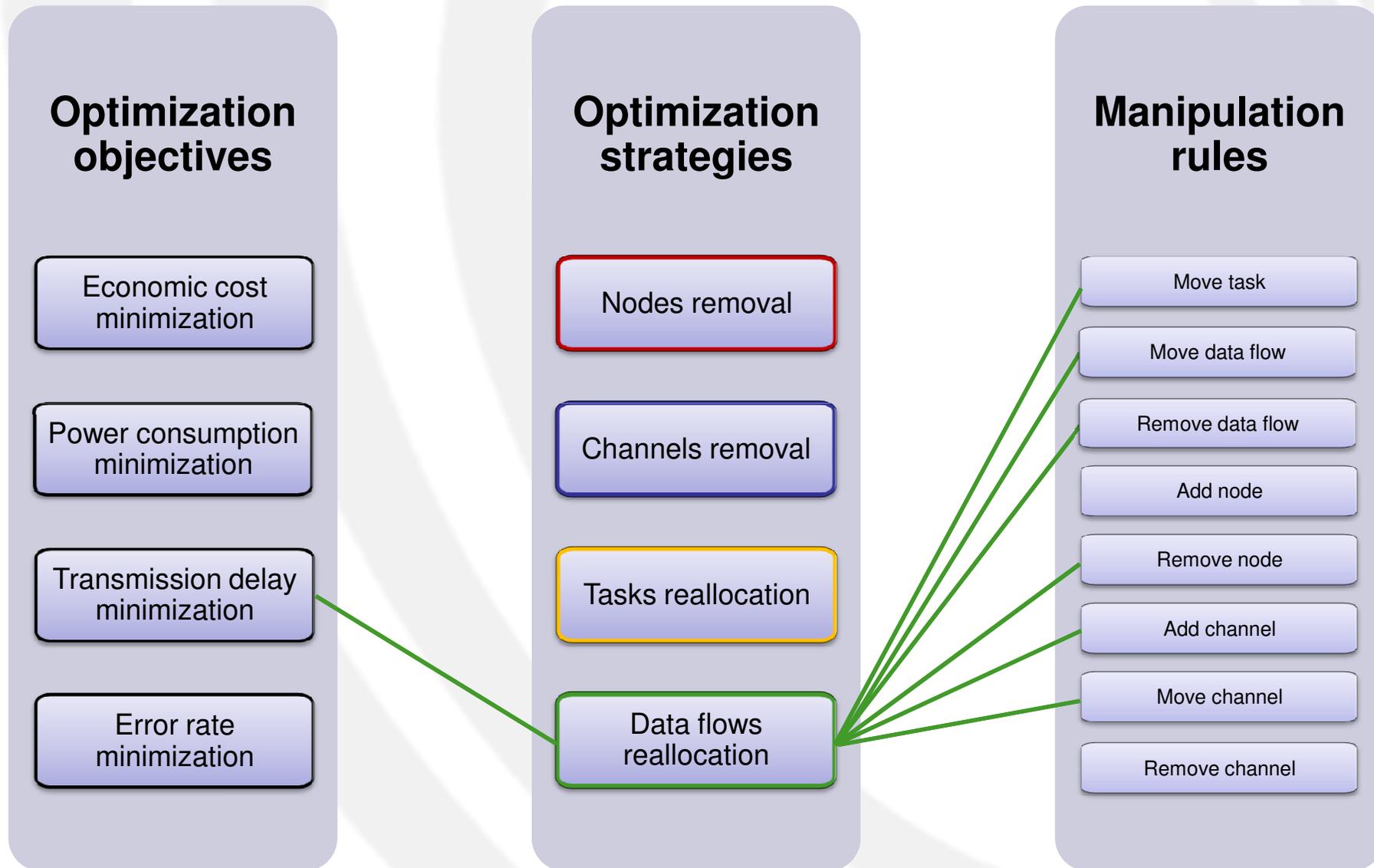


# Experimental results

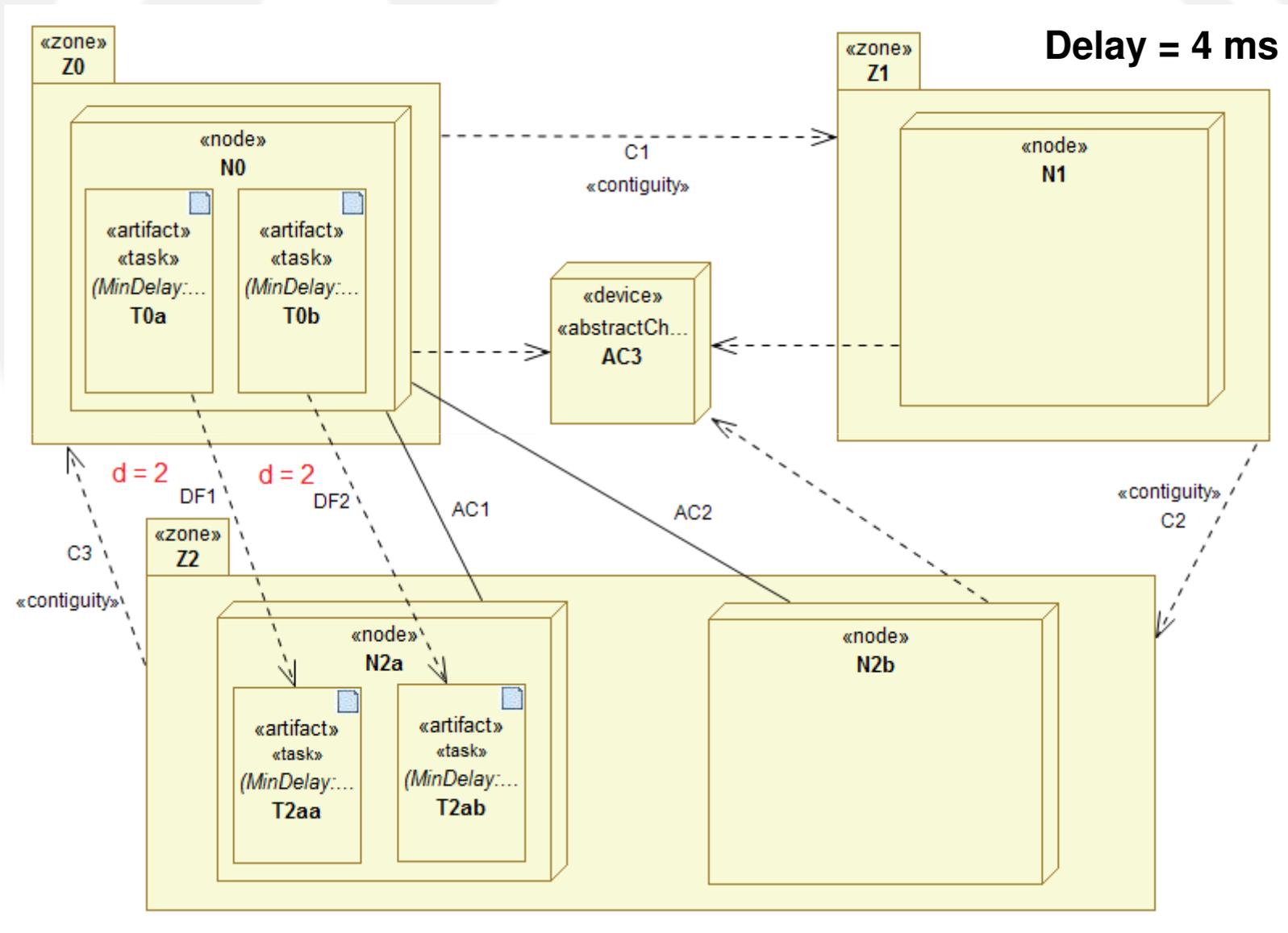
# NW-Aware Optimization



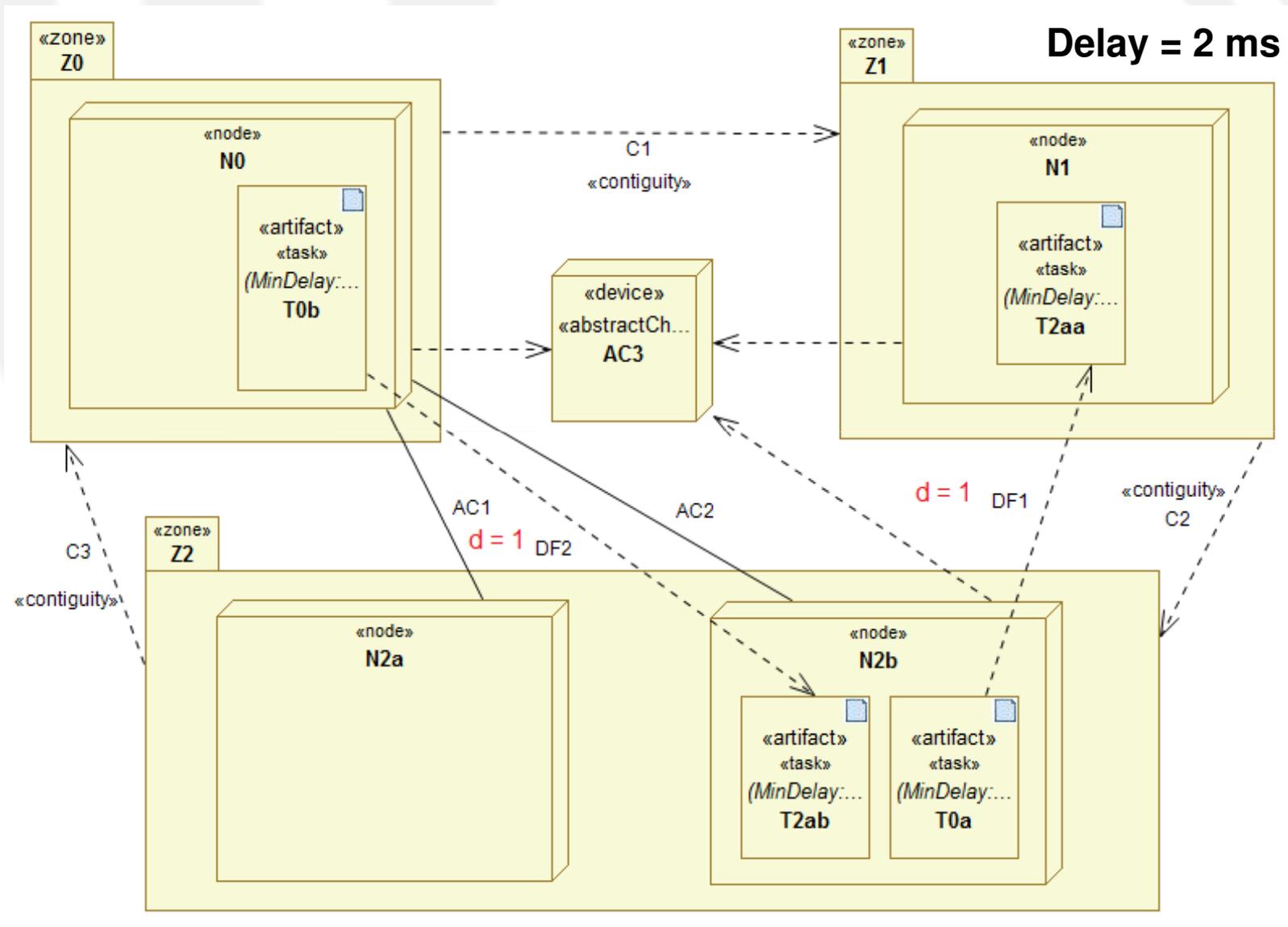
# Transmission delay minimization



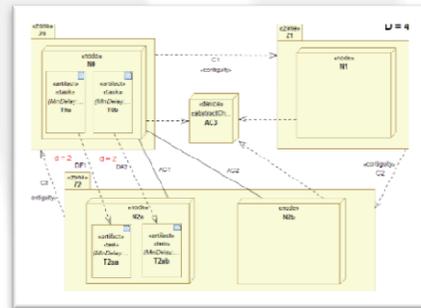
# Experimental results (before)



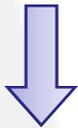
# Experimental results (after)



# Validation through simulation



Network scenario  
high-level description



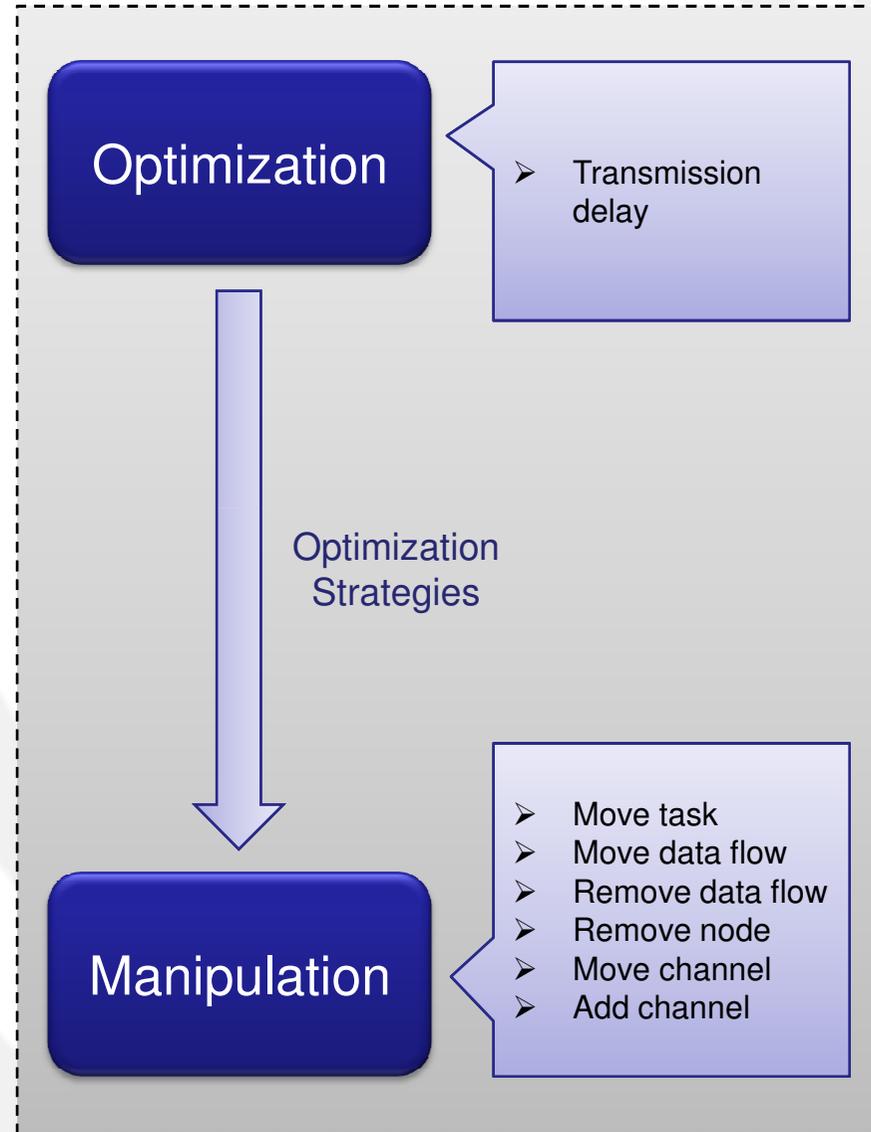
Network scenario  
simulation model

```
800 us T0a data sent: A bytes: 1  
800 us T0b data sent: B bytes: 1  
2800 us T2aa data received: A bytes: 1  
2800 us T2ab data received: B bytes: 1
```

```
800 us T0a data sent: A bytes: 1  
800 us T0b data sent: B bytes: 1  
1800 us T2aa data received: A bytes: 1  
1800 us T2ab data received: B bytes: 1
```



**Optimized**  
Network scenario  
simulation model





# Conclusions & Future developments

## Conclusions

- New methodology for the optimal network synthesis of Distributed Embedded Systems.
- Validation of the optimization process results through network simulation.
- Set of tools in support of the optimization process from the UML description to the SCNSL simulation model.

## Future developments

- Extension of the set of optimization objectives
  - Introduction of new optimization strategies
  - Introduction of new manipulation rules
- Further integration of the network simulation in the optimization process.
- Adaptation of the methodology for a Multi-objective optimization.