

# Mathematical optimization: applications to water management

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# study cases

groundwater abstraction

urban water networks

hydroelectricity production

# Groundwater



# ex: sustainable abstraction

place pumps and plan pumping  
to prevent aquifer depletion (then land subsidence or seawater intrusion)  
and quality degradation (temperature, salinity)  
while maximizing the abstraction value

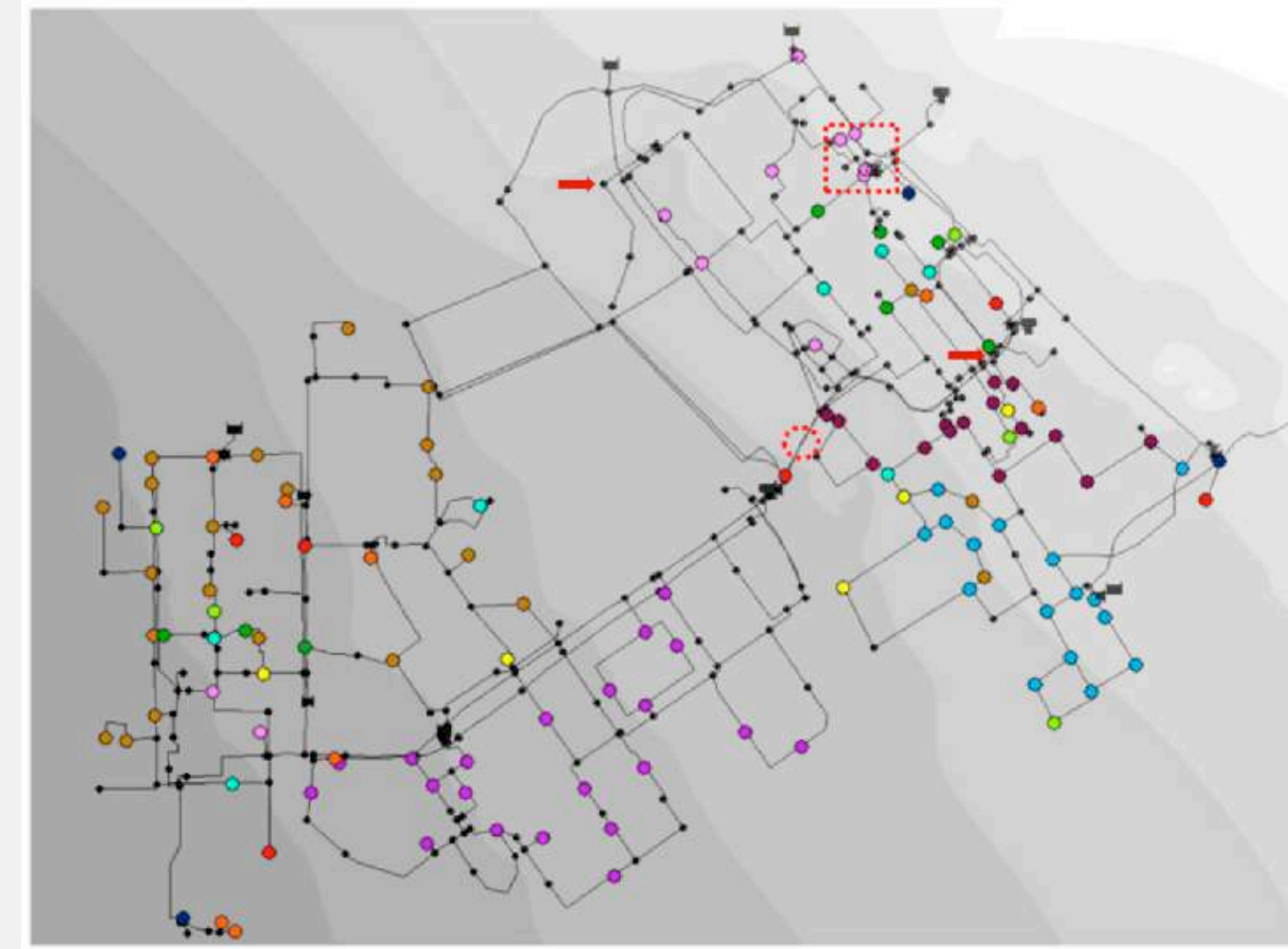
strong uncertainties (aquifer recharge rate), approximate dynamics(quality) and sustainability models

# Urban networks

← DRINKING WATER

# ex: pipe sizing

select the **size** of the pipes in a gravity-fed network to **satisfy the demand** at each delivery node while **minimizing the installation costs**



finite catalog of pipes:

size 

capacity 

cost 

# ex: pipe sizing

$x_{ak} \in \{0,1\}$  assign size  $k$  to pipe  $a$

$q_a$  flow in pipe  $a$ ,  $v_a = h_i - h_j$  head loss in pipe  $a$ , quadratic resistance  $v_a = \phi_a(q_a)$

$(q, h) = NAP(D, H, \phi)$  hydraulic equilibrium w.r.t demand  $D$ , head  $H$ , resistance  $\phi$

$$\min_{x,q,h} \sum_a \sum_k c_{ak} x_{ak}$$

$$\text{s.t. } x_{ak} = 0 \implies q_{ak} = v_{ak} = 0$$

$$\sum_k x_{ak} = 1, h_i - h_j = \sum_k v_{ak}$$

$$(q_{AK}, h_S) \in NAP(D_S, H_R, \phi_{AK(x)}).$$

$$\forall a \in A, k \in K$$

$$\forall a = (i, j) \in A$$

bilevel program or  
simulation-based genetic algorithm

nonconvex MINLP or approximate MILP

# ex: pipe sizing

convex MINLP reformulation

$$\min_{x,q,h} \sum_a \sum_k c_{ak} x_{ak}$$

$$\text{s.t. } x_{ak} = 0 \implies q_{ak} = v_{ak} = 0$$

$$\forall a \in A, k \in K$$

$$\sum_k x_{ak} = 1, h_i - h_j = \sum_k v_{ak}$$

$$\forall a = (i,j) \in A$$

$$\sum_{ak} E_{as} q_{ak} = D_s$$

$$\forall s \in S$$

$$\sum_{ak} (f_{ak}(q_{ak}) + f_{ak}^*(v_{ak})) + H_R^\top q_R + D_S^\top h_S \leq 0$$

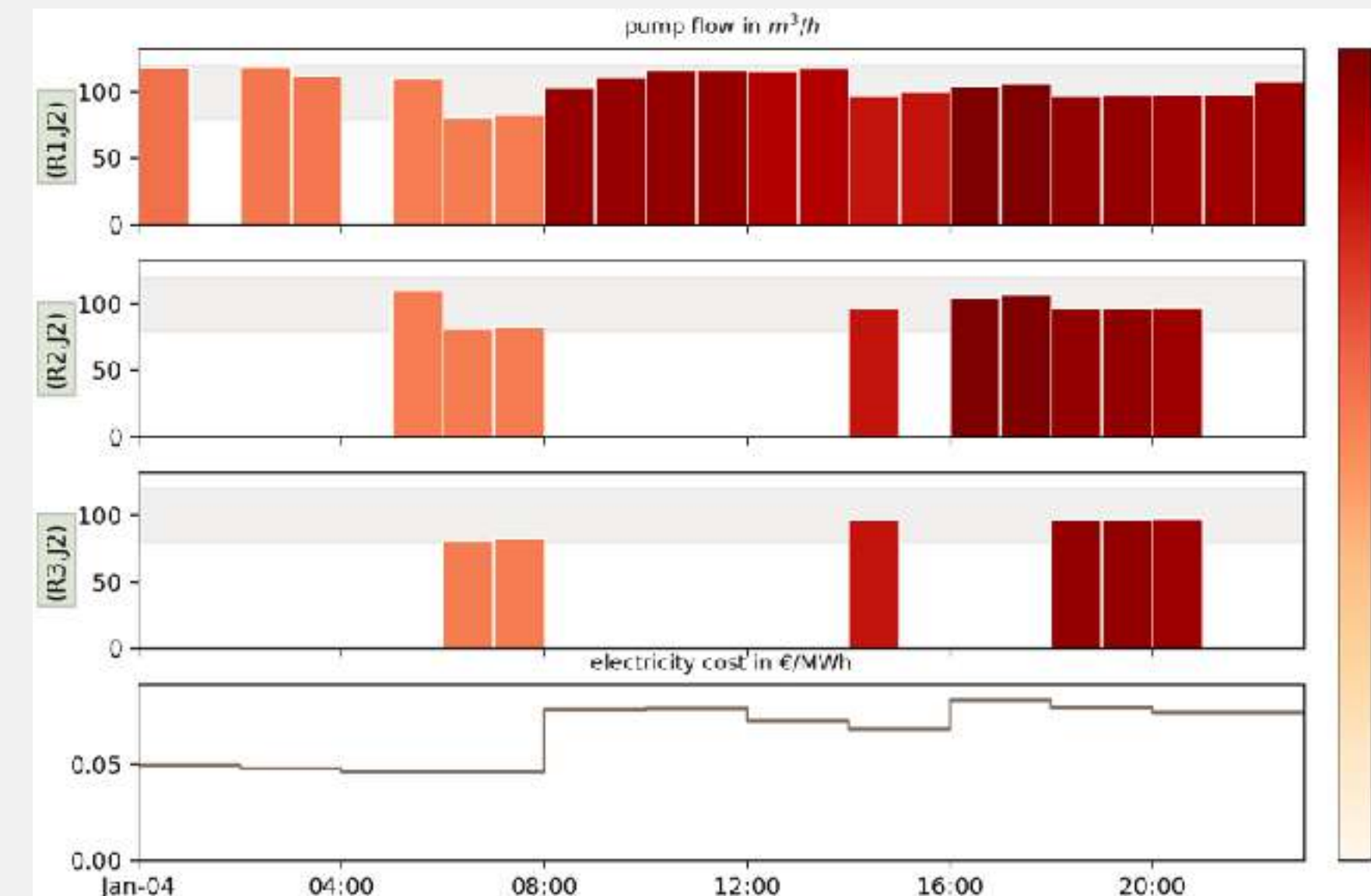
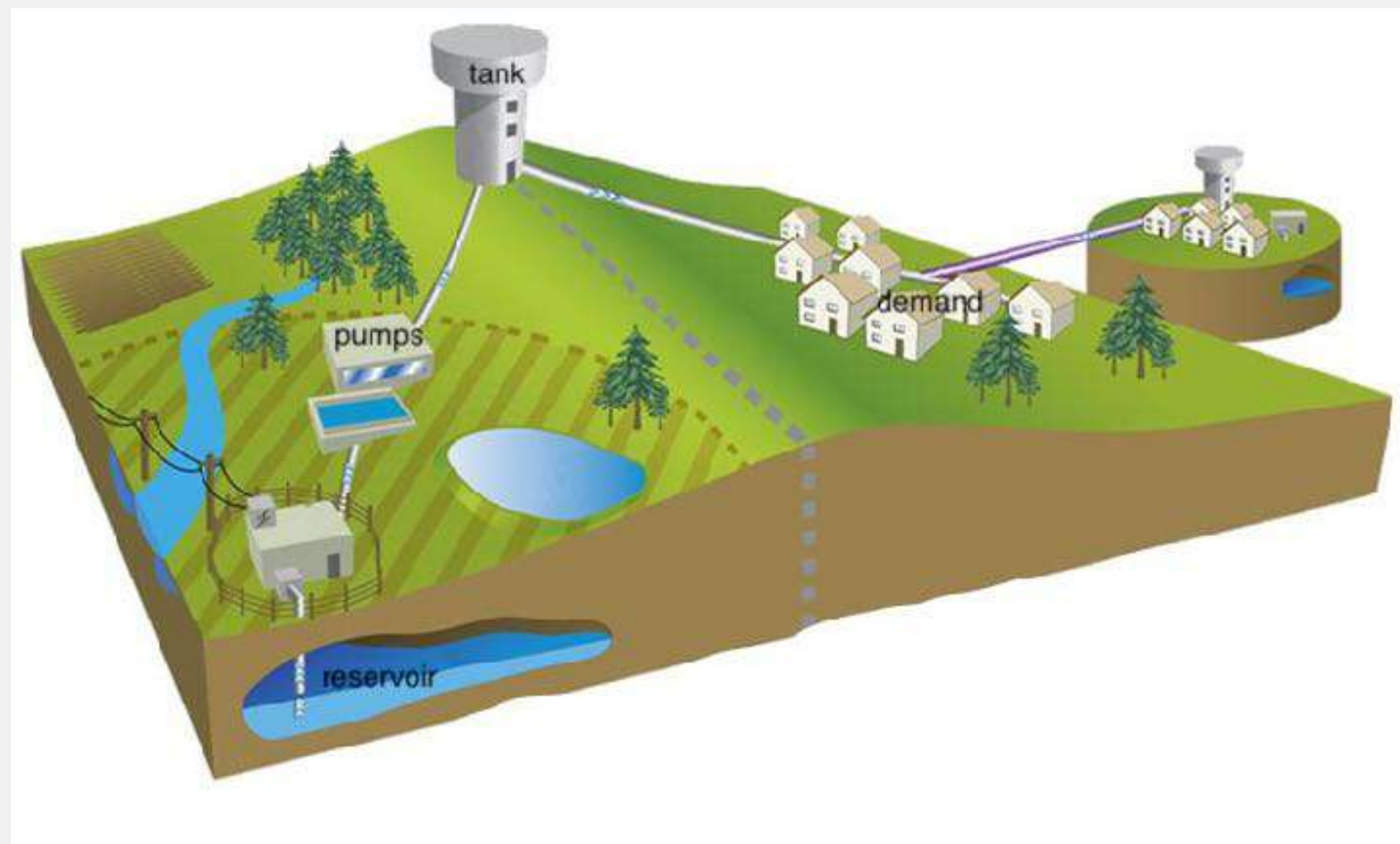
$$(SD)$$

$f = \int \phi, f^* = \int \phi^{-1}$  are convex but not quadratic

# ex: pump scheduling

(load shifting in pressurized networks)

schedule pumps and valves in a pressurized network on a time horizon to satisfy the varying demand at each delivery node and the capacity of the water tanks while minimizing the electricity bill



# ex2: pump scheduling

$x_{at} \in \{0,1\}$  activate pump/valve  $a$  at time  $t$   
hydraulic equilibrium in the active subnetwork  
limit the water tank level  $H$

$$\min \sum_a \sum_t c_{at}^0 x_{at} + c_{at}^1 q_{at}$$

$$s.t. (q_{At}, h_{St}) \in NAP(D_{St}, H_{Rt}, \phi_{A(x_t)})$$

$$\forall t \in T$$

$$x_{at} = 0 \implies q_{at} = 0$$

$$\forall a \in A, t \in T$$

$$H_{R(t+1)} = H_{Rt} + s_R^\top q_{Rt}$$

$$\forall t \in T$$

$$\underline{H}_{Rt} \leq H_{Rt} \leq \bar{H}_{Rt}$$

$$\forall t \in T.$$

additional complexity: temporal inter-dependency

# water network optimization

(drinking, waste, irrigation)

## decisions

- dimension
- renovation
- extension
- sectorization
- scheduling operations
- scheduling maintenance
- place equipments and controllers
- calibrate hydraulic models

## concerns

- demand: standard, worst-case, emergency
- network topology
- energy consumption
- leakage, over-pressure
- flow conservation
- pressure-flow relation
- chlorine consumption
- water quality, treatment
- storage capacity
- resilience to failures or storms
- sewer overflow

[Bello, et al. Solving Management Problems in Water Distribution Networks: A Survey of Approaches and Mathematical Models. Water 2019]

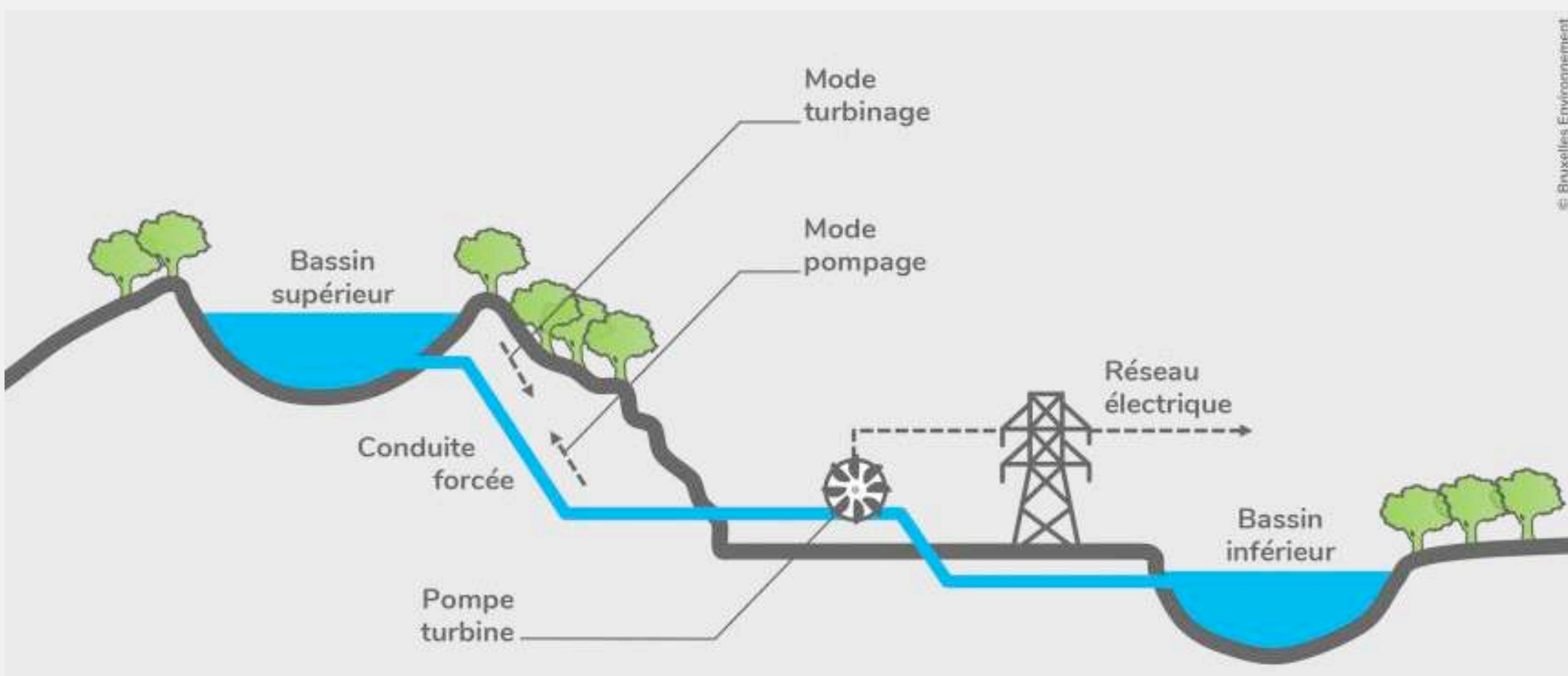
[Mala-Jetmarova, Sultanova, Savic. Lost in Optimisation of Water Distribution Systems? A Literature Review of System Design. Water 2018]

# Hydropower



# ex: hydro unit commitment

schedule pumps and turbine  
to ensure flow conservation  
and maintain reservoir level in their limits  
w.r.t strategic constraints (load balance, ramp, irrigation)  
while maximizing the power production value



(lagrangian) subproblem of day-to-day unit commitment encompassing national power systems

# ex4: hydro unit commitment

flow  $q_{it}$ , volume  $v_{it}$ , power production/consumption  $p_{it}$  in plant  $i$  at time  $t$   
nonlinear flow-power relation  $\phi$  (turbine), disjunctive flow domains  
volume conservation and limits in reservoirs

$$\max \sum_{i \in I} \sum_{t \in T} \lambda_{it} p_{it} \quad (1)$$

$$p_{it} = \Phi(q_{it}, v_{it}) \quad \forall t, \forall i \quad (2)$$

$$v_{it} = v_{i(t-1)} + I_{it} + \Delta T \left( -q_{it} + \sum_{r \in I_i^+} q_{r(t-1)} - \sum_{r \in I_i^-} q_{r(t-1)} \right) \quad \forall t, \forall i \quad (3)$$

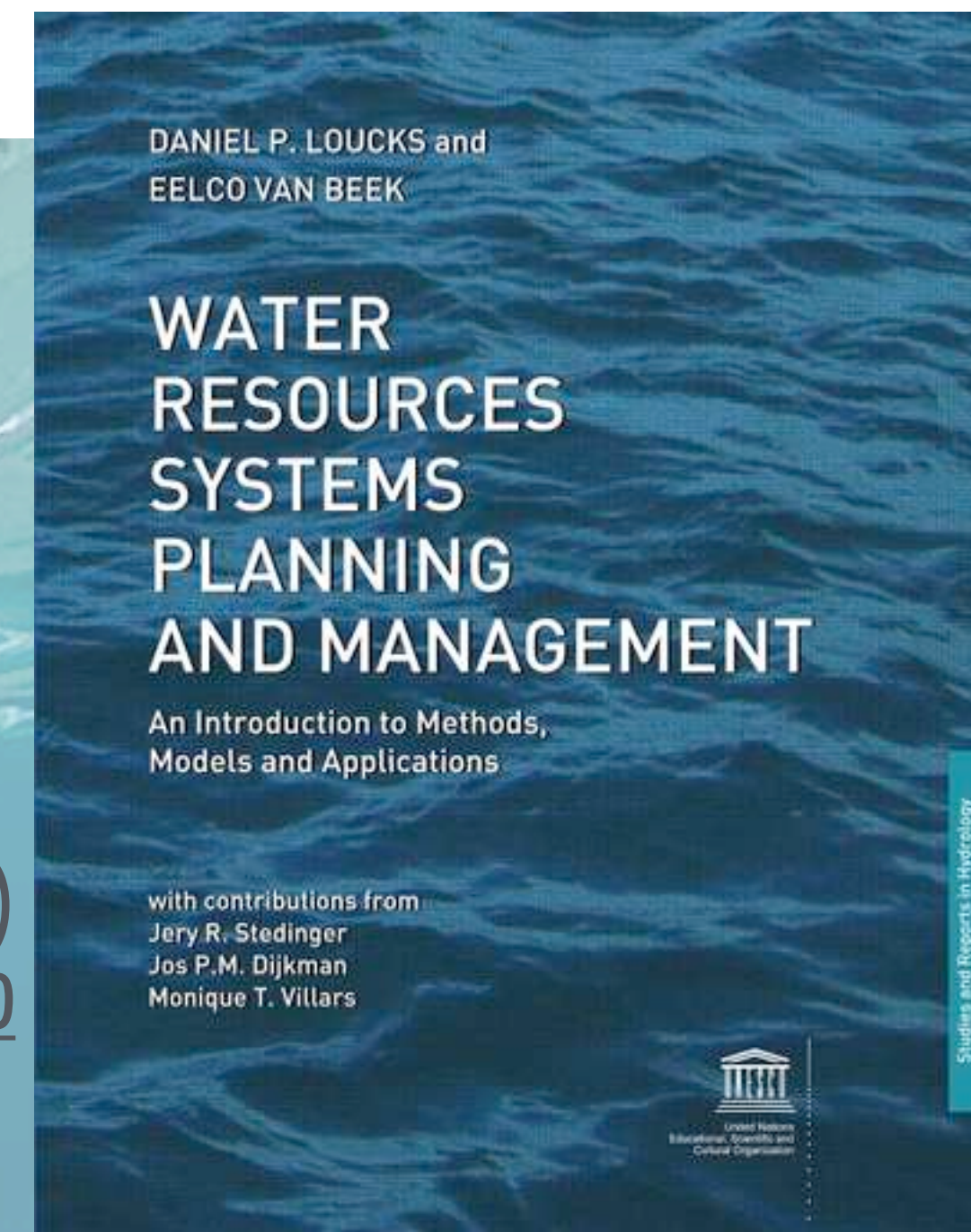
$$q_{it} \in \{Q_i^-\} \cup \{0\} \cup [Q_i, \bar{Q}_i] \quad \forall t, \forall i \quad (4)$$

$$\underline{V}_i \leq v_{it} \leq \bar{V}_i \quad \forall t, \forall i \quad (5)$$

# conclusion

- **diversity** of water systems & processes
- management involves **decision**
- from simulation (*what if*) to **optimization** (*what should*)
- **difficulties**: nonlinear dynamics, uncertain forecasts, intricate systems, fuzzy objectives
- trade-off between **accurate** models and efficient algorithms

Loucks & Beek (2005)  
<https://unesdoc.unesco.org/ark:/48223/pf0000143430>



DANIEL P. LOUCKS and  
EELCO VAN BEEK

## WATER RESOURCES SYSTEMS PLANNING AND MANAGEMENT

An Introduction to Methods,  
Models and Applications

with contributions from  
Jery R. Stedinger  
Jos P.M. Dijkman  
Monique T. Villars



# Mathematical optimization: introduction and application to water management

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