

A composite background image showing a snowy mountain range. In the foreground, there are wind turbines on a rocky outcrop. To the left, an offshore oil rig is visible in the water. In the background, a city with modern buildings is nestled at the base of the mountains. The sky is blue with some clouds, and a small satellite or drone is visible in the upper right.

# MULTI-MARKET MODELING LONG- AND MEDIUM-TERM

Brukermøte Produksjonsplanlegging  
10.05.2017  
Arild Helseth

# SINTEF Projects on Multi-Market Topics

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## IBM

- Integrating Balancing Markets in Hydropower Scheduling Methods
- Producer's perspective

## PRIBAS

- Pricing Balancing Services in the Future Nordic Power Market
- Fundamental market modelling

# Integrating Balancing Markets in Hydropower Scheduling Methods (IBM)

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- Knowledge building project (KPN) 2014-2017
- 16 MNOK, research council supports 75 %
- One PhD at NTNU



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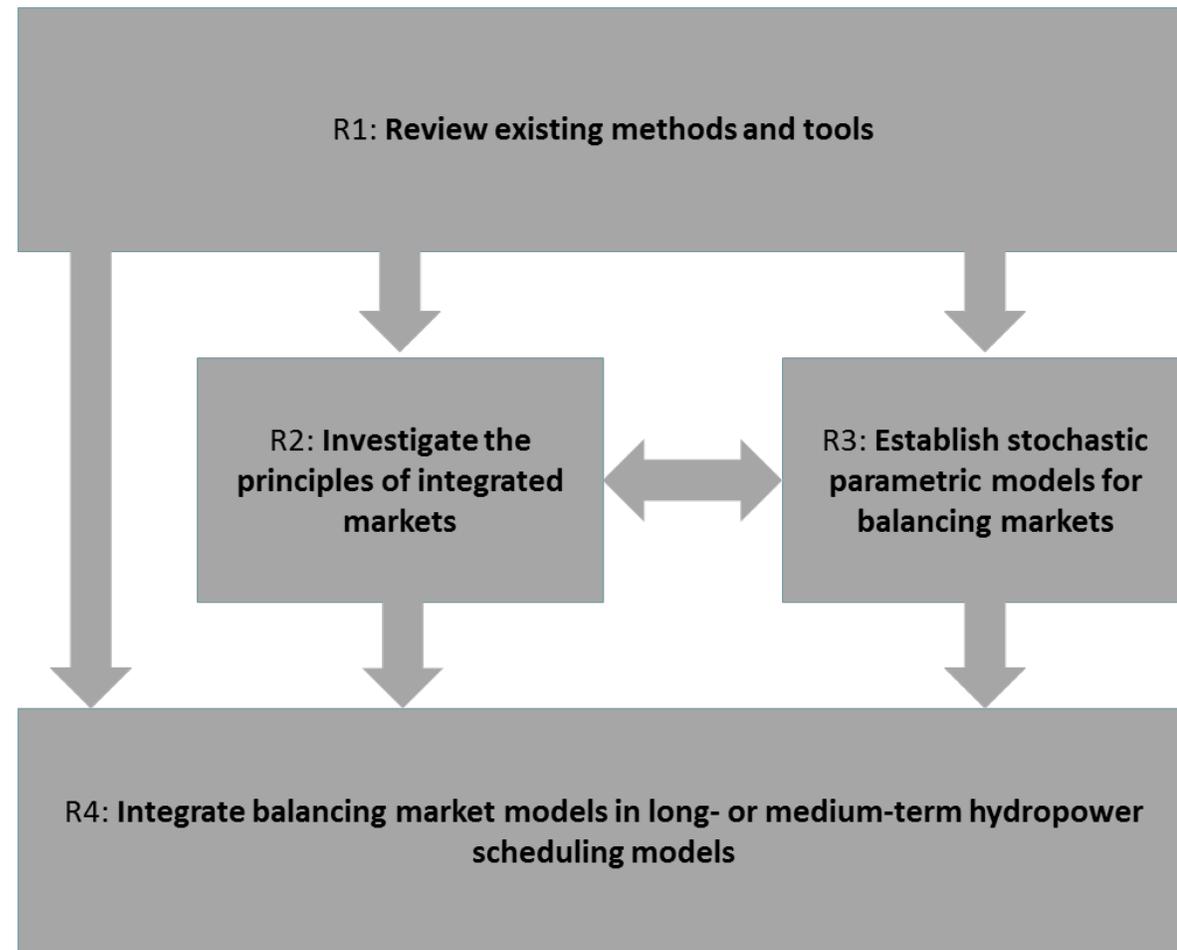


# Project Goal

Address the impact of integrating balancing markets in hydro scheduling methods by

- ✓ Reviewing existing approaches
- ✓ Illustrating concepts through simple models
- ✓ Extending current scheduling tools

How should the water values be calculated and interpreted?



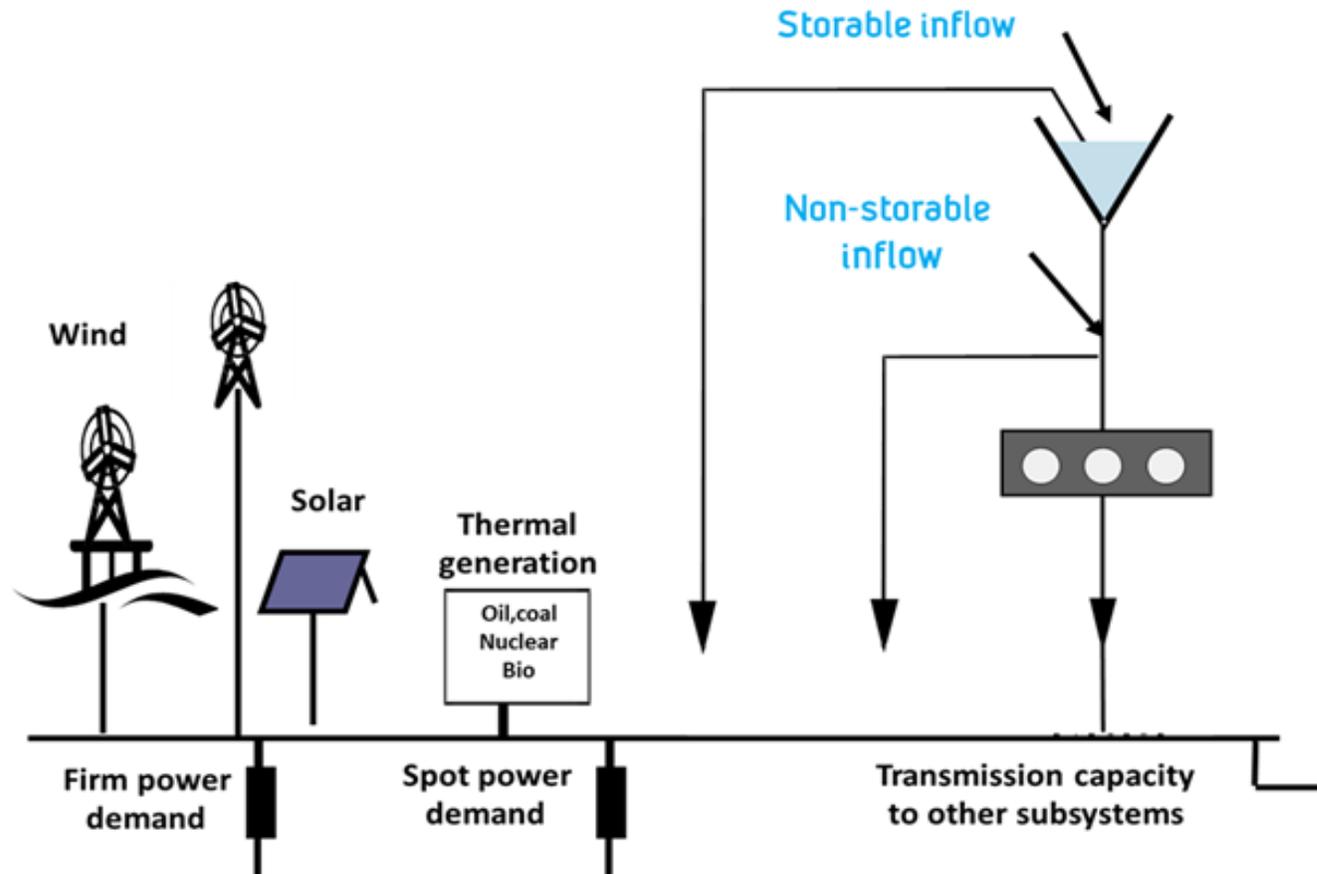
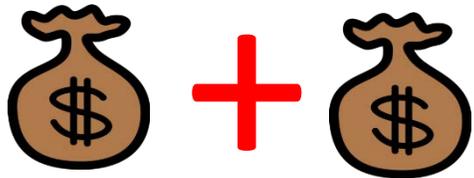
# Hydropower producer's perspective

## Energy only in the future?

- Multiple markets and prices
- More constraints
- Different decision stages

Impact on water values?

$$\max E \left\{ \sum_{t=1}^T \mathbf{c}_t^T \mathbf{x}_t + f(\mathbf{V}_t) \right\}$$





# Concerns & Challenges

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## Data:

- Balancing markets in the Nordics are 'under construction'
- Limited historical data
- Changing rules
- Low volumes
- Lack of fundamental models to create price forecasts for balancing markets

## Modeling:

- 'Linear' unit commitment. Cannot strictly enforce minimum production in linear models
- Concave production function. Stations are allowed to generate electricity at low rates at an artificially high efficiency for the purpose of delivering reserves

# Methodology Toolbox

Complexity ↓



SDP

New Prototype

SDDP

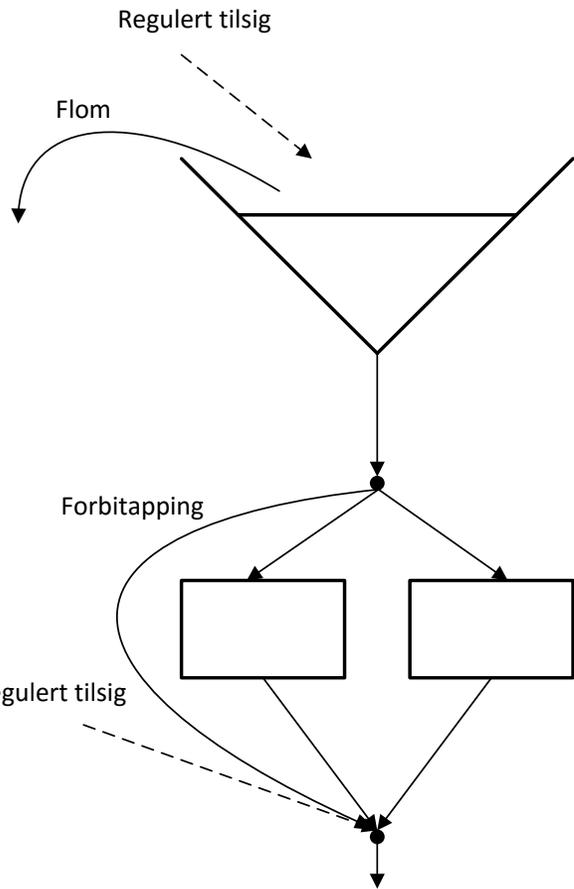
SDDiP

# SDP – Motivation

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- Competence building & education
- Allows computing water values considering physical details
- Benchmark new functionality → what is the approximation error

# SDP – Stochastic Dynamic Programming



Products:

- Energy
- Reserve capacity

## Discretize State Variables

- Limited to systems with "a few" reservoirs

## Nonlinearities

- Piecewise linear production function
- Head dependency
- Exact unit commitment

## Uncertainty - Markov model

- Inflow
- Energy price
- Reserve capacity price

# SDP – Test Case

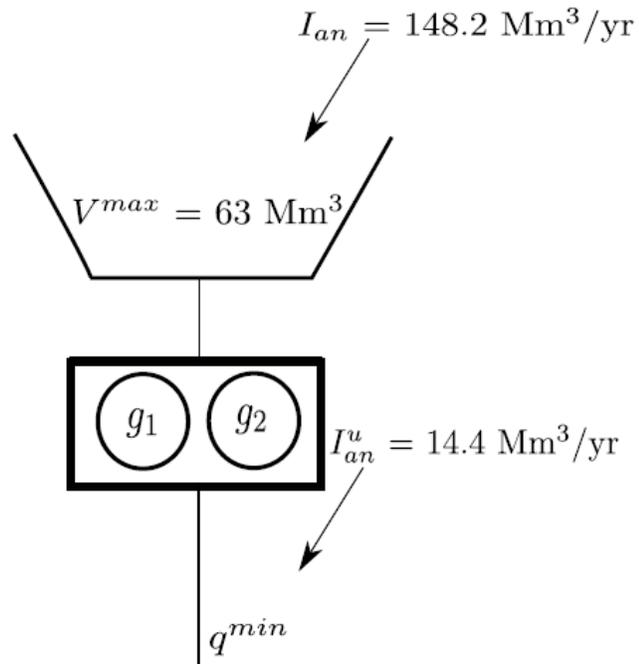


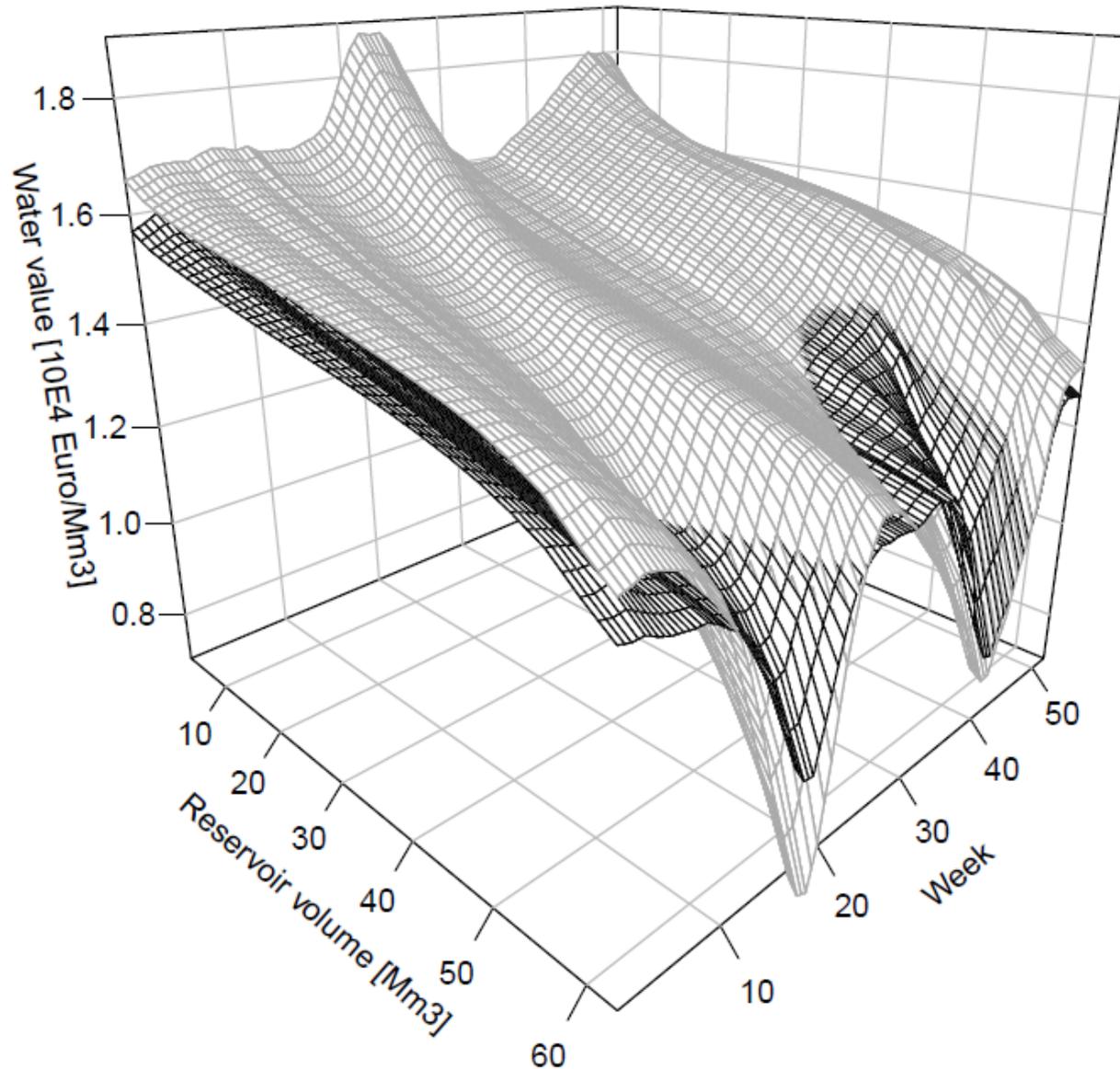
Table 1: Simulated cases

Case	unit no.	$P^{max}$	$P^{min}$	Type
A	$g_1$	21.11	6.57	Francis
A	$g_2$	3.71	0.49	Pelton
B	$g_1$	16.06	2.34	Pelton
B	$g_2$	8.79	0.97	Pelton

Products:

- Energy
- Reserve capacity
  - FCR – symmetric
  - NO2 prices

# SDP – Test Case



## Water values

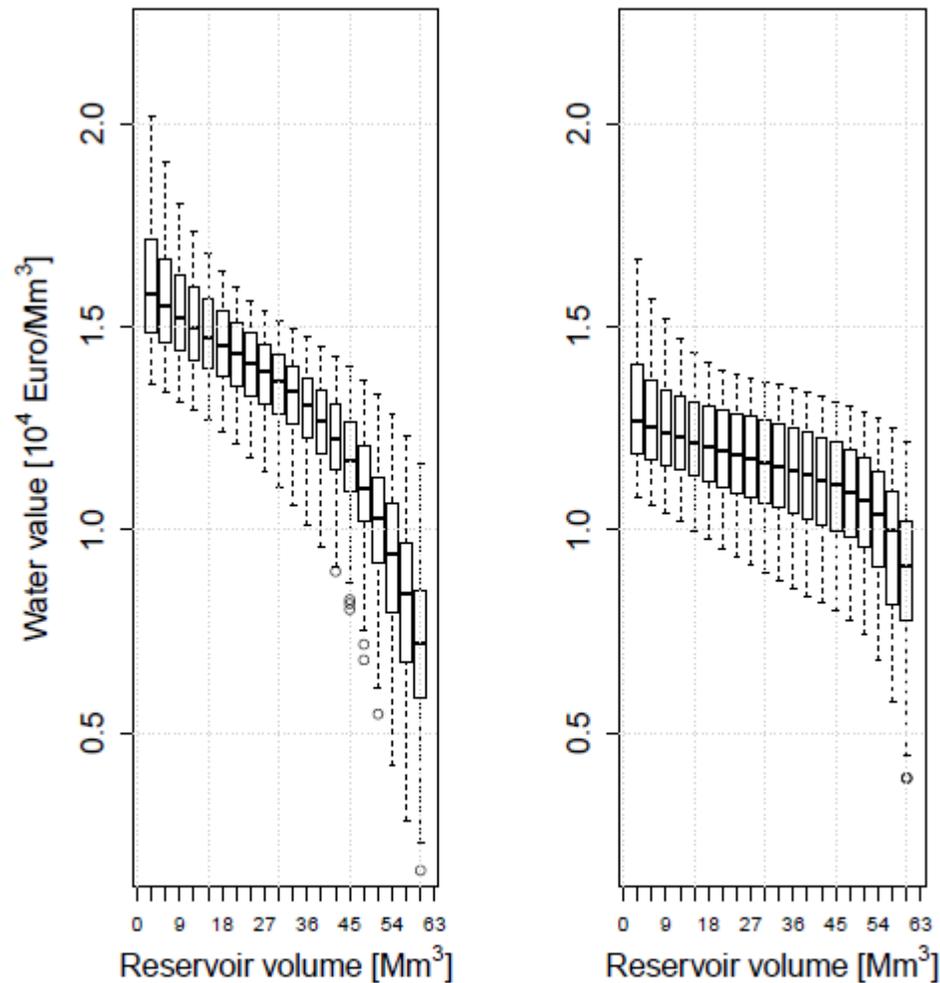
Depends more on reservoir level when selling two products

- Down-regulation gives increase
- Up-regulation gives decrease

More exposed to risk of

- Emptying reservoir (limit flexibility)
- Spillage

# SDP – Test Case



## Water values

Depends more on reservoir level when selling two products

- Down-regulation gives increase
- Up-regulation gives decrease

More exposed to risk of

- Emptying reservoir (limit flexibility)
- Spillage

Figure 3: Water values for case B for week 15. Values for the E+C mode (left) and the E

# Methodology Toolbox

Complexity ↓



SDP

SDDP  ProdRisk  
Prototyper

SDDiP



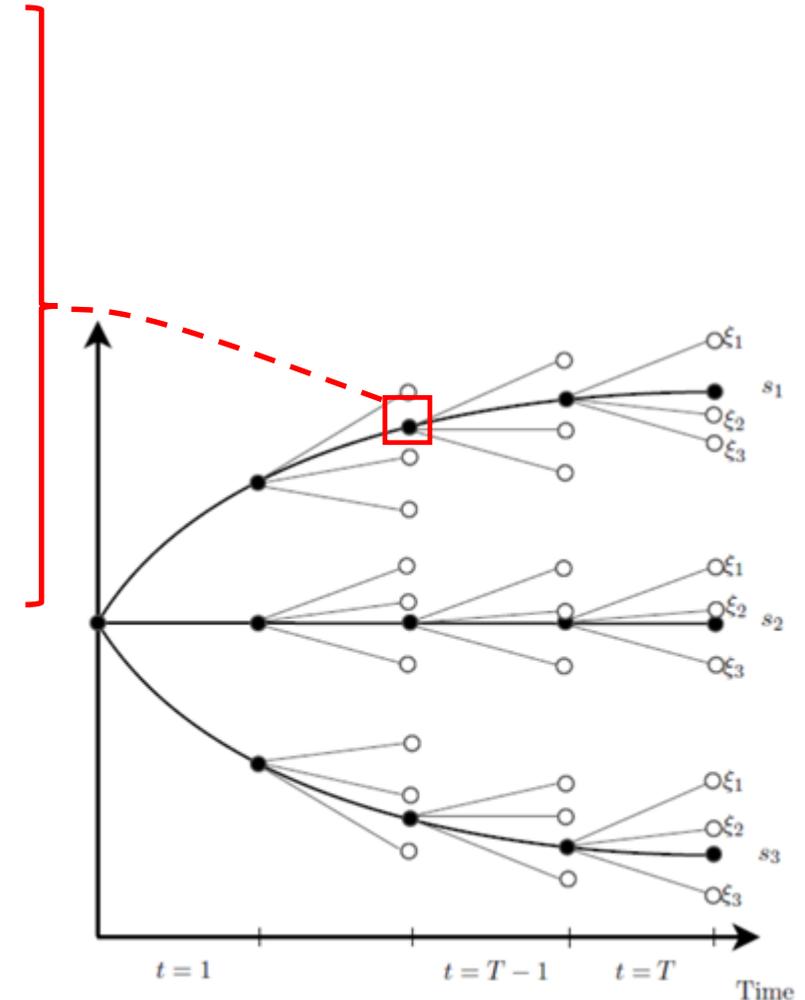
# The Decomposed Weekly Decision Problem

Given {energy price, inflow}

Maximize profit from sales of energy + expected future profit

Constraints:

- Reservoir balance
- Energy balance
- Cuts



# The Decomposed Weekly Decision Problem

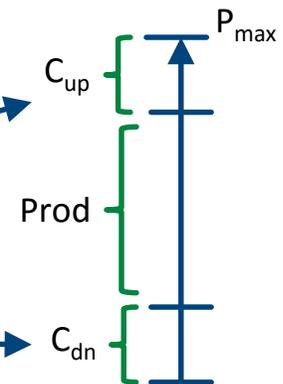
## Simultaneous Sales of Energy and Reserve Capacity

Given {energy price, reserve capacity price, inflow}

Maximize profit from sales of energy & reserve capacity + expected future profit

Constraints:

- Reservoir balance
- Energy balance
- Cuts
- Capacity balance
- Distribute capacity to power stations that
  - Do not run at maximum output
  - Generate electricity ("spinning")



# The Decomposed Weekly Decision Problem

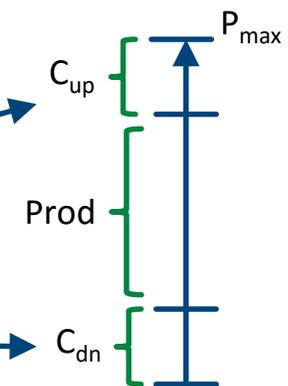
## Sequential Sales of Energy and Reserve Capacity

Given {energy price, reserve capacity price (t+1), inflow}

Maximize profit from sales of energy & reserve capacity (t+1) + expected future profit

Constraints:

- Reservoir balance
- Energy balance
- Cuts
- Capacity balance
- Distribute capacity to power stations that
  - Do not run at maximum output
  - Generate electricity ("spinning")



# The Decomposed Weekly Decision Problem

## Sequential Sales of Energy and Reserve Capacity

Given {energy price, reserve capacity price (t+1), inflow}

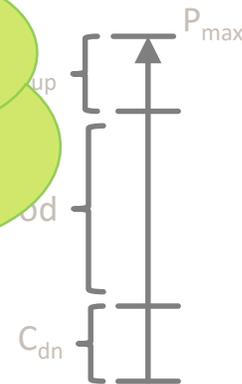
Maximize profit from sales of energy & reserve capacity (t+1) + expected future profit

Constraints:

- Reservoir balance
- Energy balance
- Cuts
- Capacity balance
- Distribute capacity to
  - Do not run at max
  - Generate electricity (if possible)

Sold capacity in (t-1)

Marginal cost of reserve capacity as a by-product

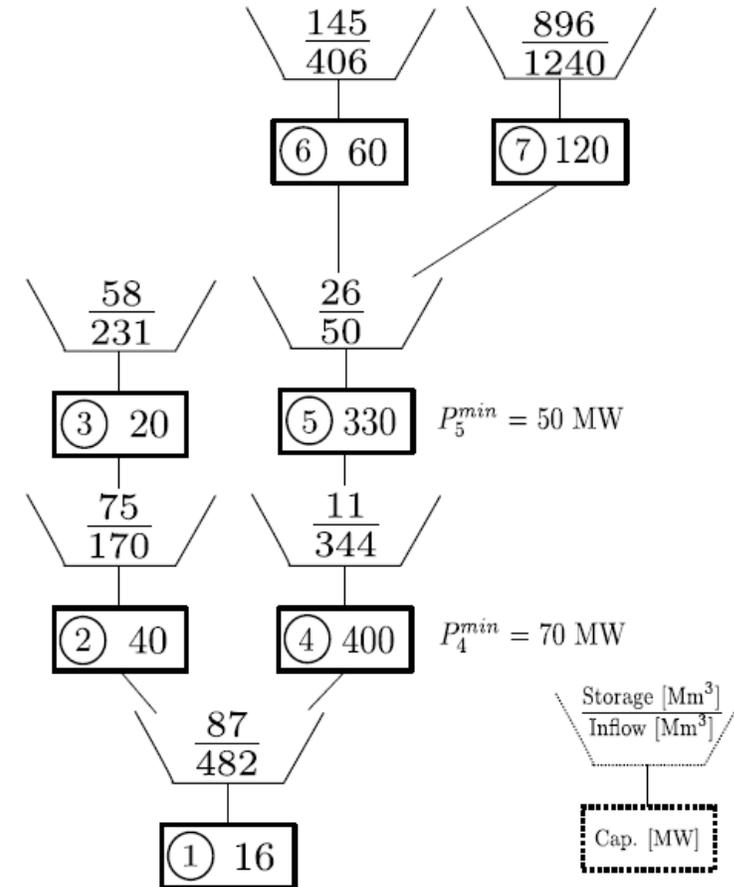


# Conducted Experiments & Conclusions

- Stochastic and deterministic reserve capacity prices
- Reserve capacity volume constraint (maximum droop)
- Additional constraints and penalties to enforce minimum production requirement
- Require water "behind" sold reserve capacity
- Simulate with all details (MIP)

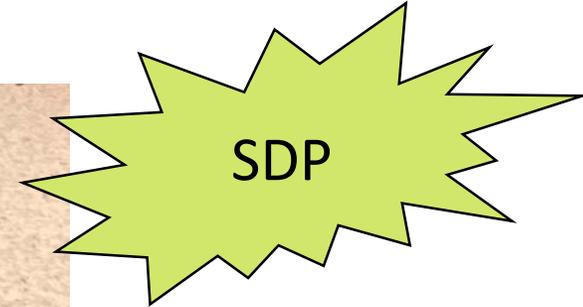
## Findings:

- ✓ Water values (cut coefficients) changes as previously explained
- ✓ Additional profit low in today's market
- ✓ Linear models significantly overestimate revenue potential



# Methodology Toolbox

Complexity



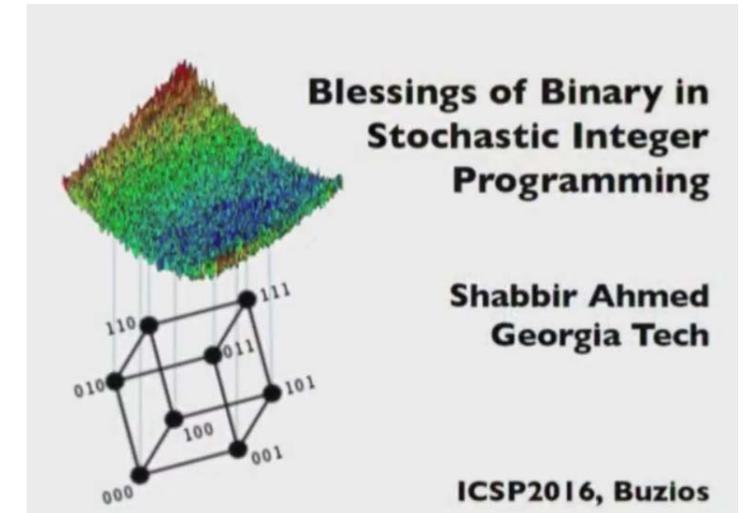
PhD

# Stochastic Dual Dynamic Integer Programming

- Developed by researchers at Georgia Tech University
- Applied to the hydropower scheduling problem by IBM project's PhD-student

## Algorithm in brief:

- Allow solving the weekly decision problem as a MIP and still create valid cuts
- Requires all state variables to be binary
- Several types of cuts are combined to improve performance
- Allows cut sharing



<https://www.youtube.com/watch?v=Ewr2Boj0Jgs>

# Stochastic Dual Dynamic Integer Programming

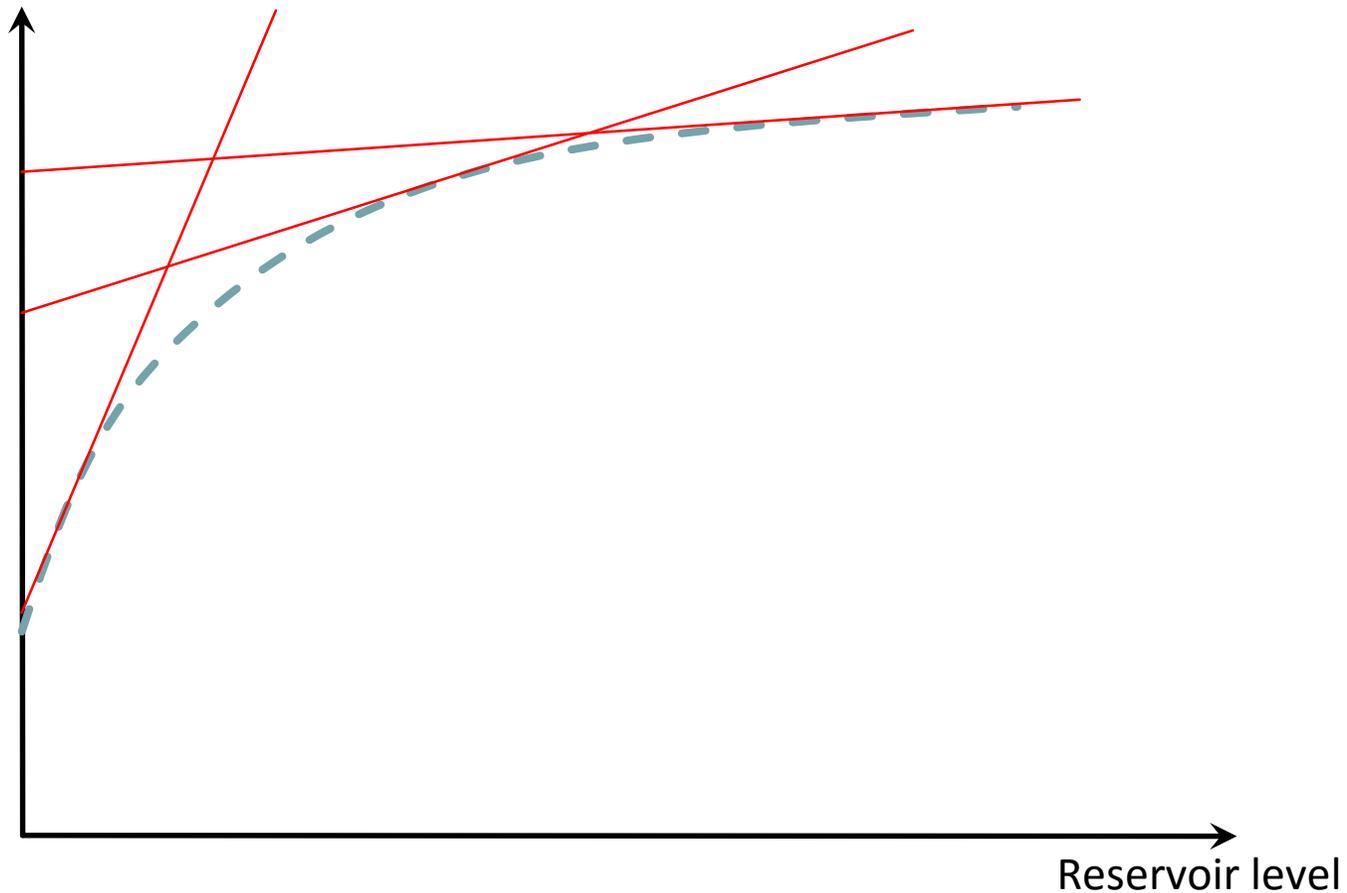
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## Our experiences so far:

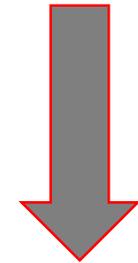
- Extremely computationally demanding!
- Has the potential to quantify approximation errors in linear models, e.g. related to:
  - ✓ Unit commitment
  - ✓ Head dependent production functions
  - ✓ State-dependent constraints
- New types of cuts can improve current scheduling models, e.g. strengthened Benders cuts

# The Expected Future Profit Function

Expected Future Profit



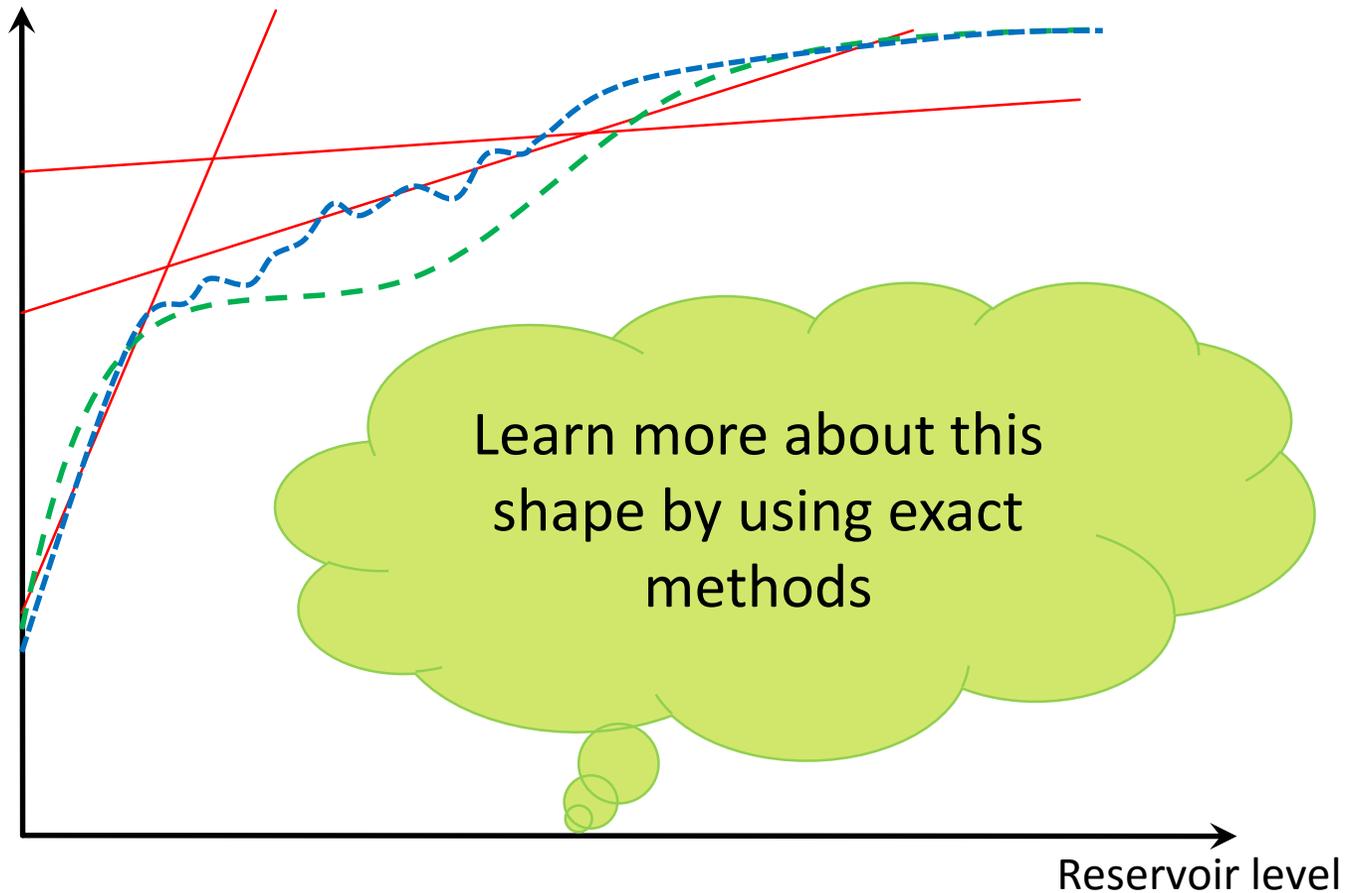
**ProdRisk**



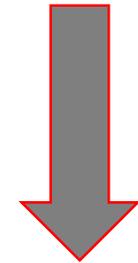
**SHOP**

# The Expected Future Profit Function

Expected Future Profit



**ProdRisk**



**SHOP**

# SINTEF Projects on Multi-Market Topics

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## IBM

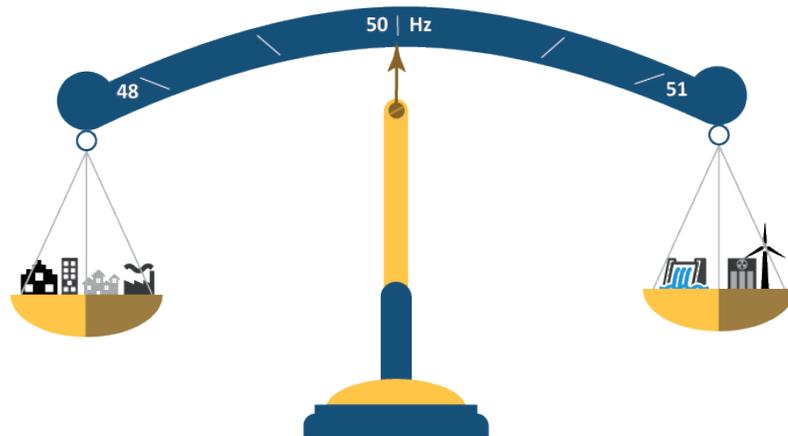
- Integrating Balancing Markets in Hydropower Scheduling Methods
- Producer's perspective

## PRIBAS

- Pricing Balancing Services in the Future Nordic Power Market
- Fundamental market modelling

# Pricing Balancing Services in the Future Nordic Power Market (PRIBAS)

- Knowledge building project (KPN) 2017-2020
- 17 MNOK, research council supports 67 %
- One PhD at NTNU



## Our partners



**Statnett**



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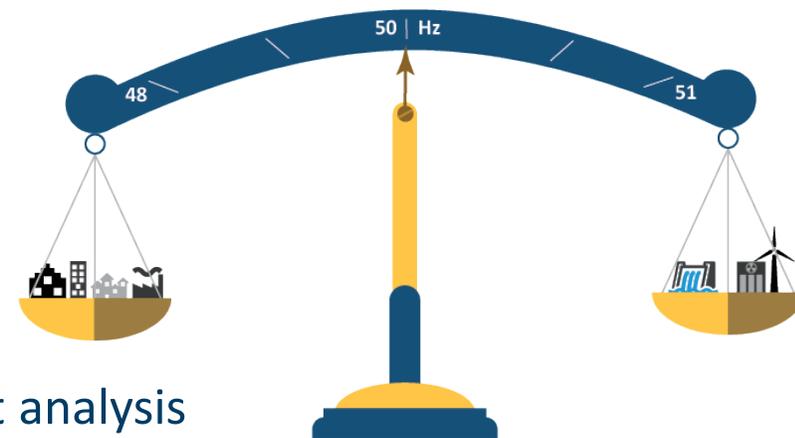


**ECO**

# Project Goal

Develop a fundamental multi-market **model concept** for the Nordic power system

- ✓ Compute marginal prices for all electricity products
- ✓ Including reserve capacity and balancing energy
- ✓ Including flexible consumption and local storages

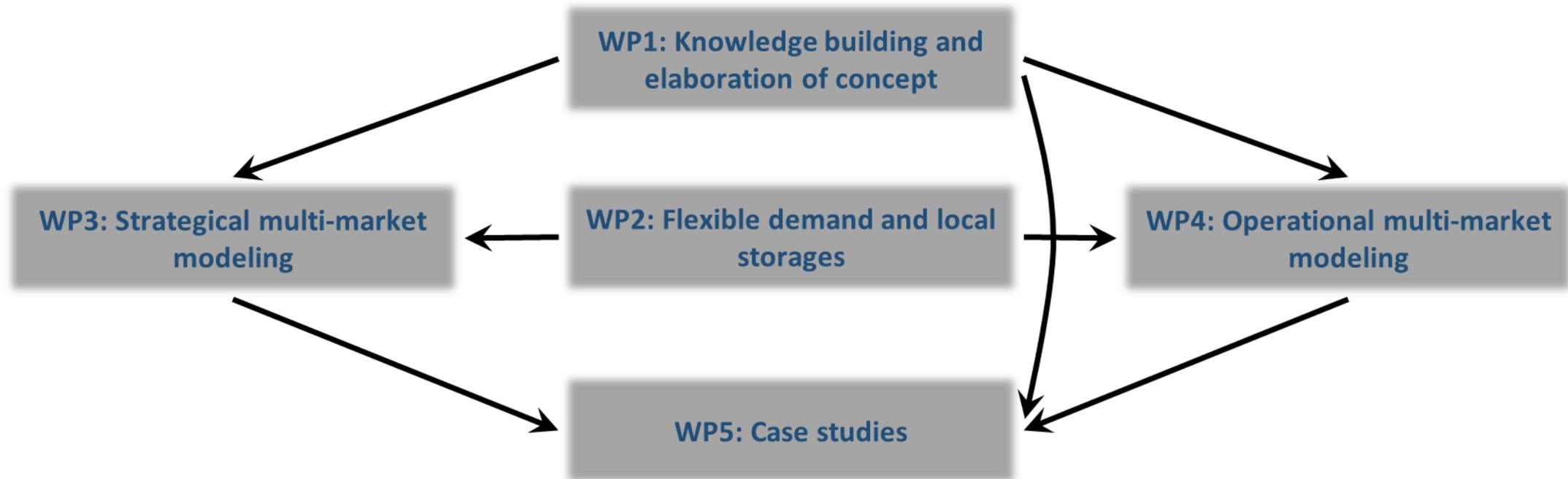


## Expected use

- Compute simultaneous market price time series, e.g. for investment analysis
- Estimate the value of flexibility in different market designs, e.g.
  - Spot market clearing closer to real time
  - Common reserve markets in the Nordics

# Work Packages

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balancing concept costs decision demand  
design developed different electricity energy european  
flexible forecasts fundamental future  
generation hydropower including increased integrated  
international knowledge local market  
methods model multi-market nordic ntnu  
operational partners power price products  
project prototype provide relevant representing  
research reserve results scheduling services sintef-  
er storages strategical system workshops wp