

## JOINT USE OF LARGE-SCALE STOCHASTIC OPTIMIZATION TECHNIQUES AND HYDROLOGIC MODELING APPLIED TO THE COLUMBIA RIVER SYSTEM

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# About PSR

- ▶ Provider of analytical tools, R&D and consulting services (economics, environmental and finance) in electricity & gas since 1987
- ▶ PSR has 40 specialists in engineering, optimization, energy systems, statistics, finance, regulation, environment and IT
- ▶ Developer of computational tools for short-, mid- and long-term operation planning, G&T expansion planning and others
- ▶ Off-the-shelf and customized solutions for clients in more than 30 countries



# Some PSR tools

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- ▶ SDDP: hydrothermal mid-long term planning
- ▶ NCP: short-term scheduling
- ▶ OPTGEN: system expansion planning
- ▶ NETPLAN: transmission network planning
- ▶ CORAL: generation-transmission reliability model
- ▶ HERA: hydropower and environmental resource assessment

# What is SDDP?

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- ▶ Probabilistic hydrothermal dispatch model with a detailed representation of generation (hydro, fossil fuel plants and renewables) and transmission
  - ▶ Also natural gas production, storage and transportation network
- ▶ Study horizons from 1 to 25+ years
  - ▶ Weekly or monthly time steps with load blocks in each stage

# Hydro modeling

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- ▶ Detailed topology (hydro cascade) modeling
- ▶ Detailed hydro production
- ▶ Reservoir security constraints, flood control storage, min/max outflows
- ▶ Etc.

# Renewable modeling

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- ▶ Renewable production (wind, biomass, solar etc.) represented by scenarios, which can be correlated to the hydrological / climatic situation

# Thermal plant modeling

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- ▶ Efficiency curves
- ▶ Combined cycle thermal plants
- ▶ Multiple fuel plants optimization
- ▶ Fuel availability constraints
- ▶ GHG emission factors
- ▶ Unit commitment decisions

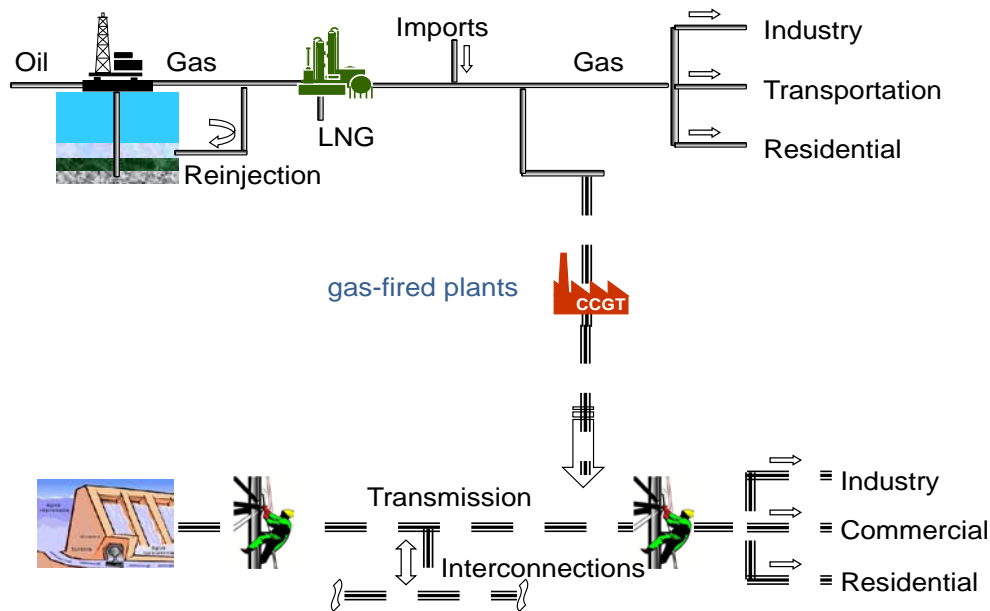
# Transmission network and loads

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- ▶ Linearized active power flow model with quadratic losses
  - AC and DC lines represented
- ▶ Security constraints: limits on flows, sum of flows (for a set of circuits), area export/import limits etc.
- ▶ Bus loads; demand response to prices



# Joint E&G modeling



- ▶ Gas nodes with production and demand (including thermal power use of natural gas and pipelines with transport limits).
- ▶ Gas-fired plants constrained by fuel and transport availability.

# Uncertainties

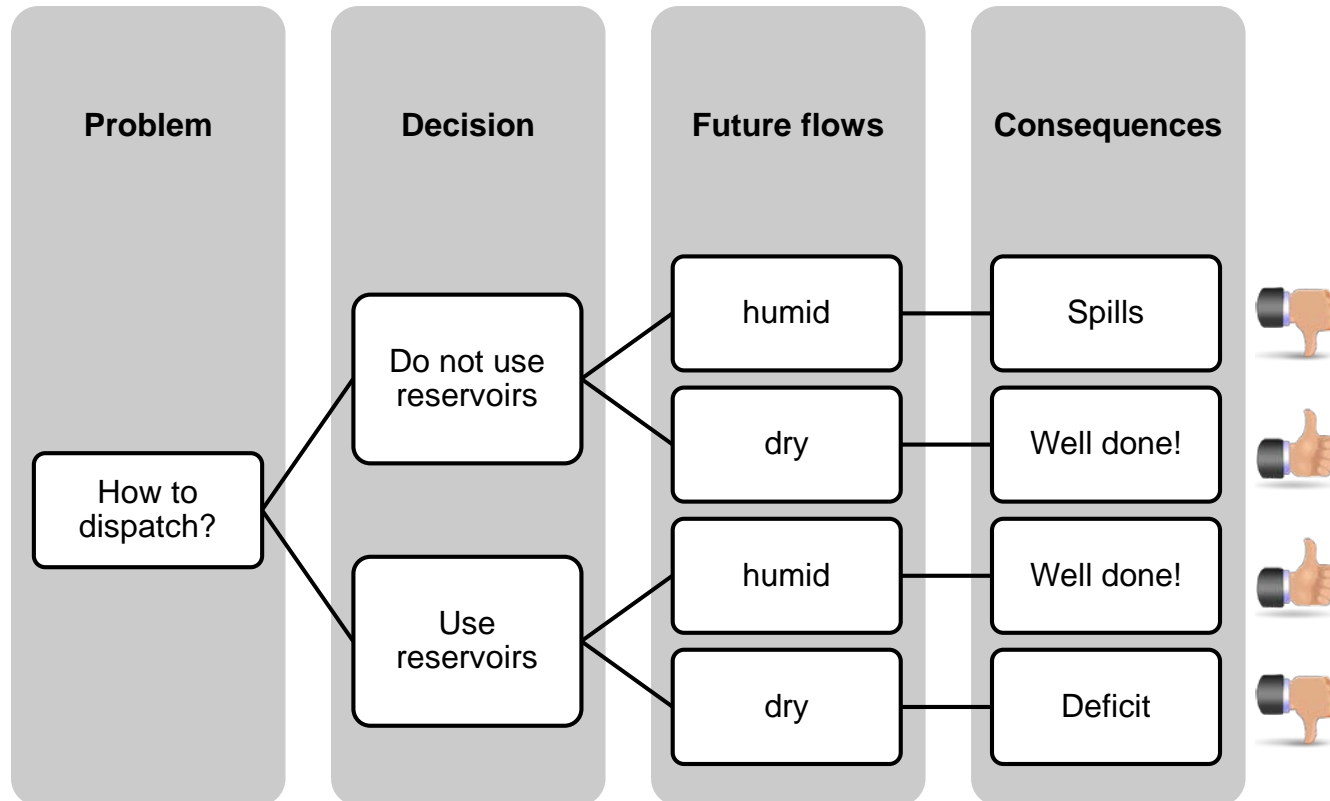
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- ▶ PAR-p multivariate stochastic streamflow model
  - Parameters adjusted with basis on historical records of streamflow scenarios produced for example by Reuters Point Carbon
  - Allows handling of macroclimatic events (El Niño), snowmelt and others
- ▶ Renewables
  - Scenarios + correlation with hydrological / climatic situation
  - External renewable models can be used to produce scenarios
- ▶ G&T equipment outages
  - ▶ Monte Carlo sampling
- ▶ Fuel cost uncertainty
  - Scenarios

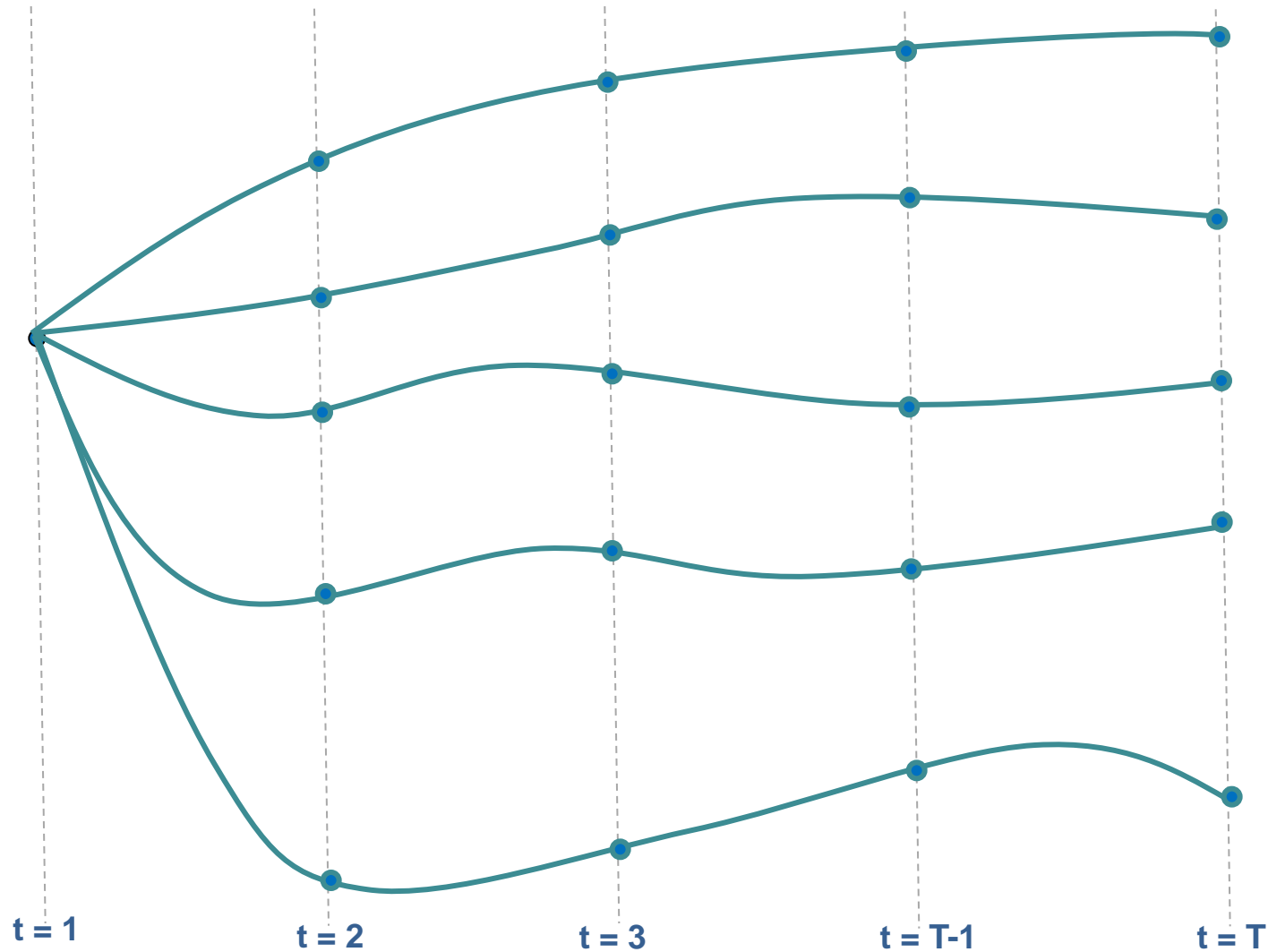
# Objective function

The scheduling problem is solved by multistage stochastic decomposition, stochastic dual DP, where the original problem is decomposed in one-stage sub-problems

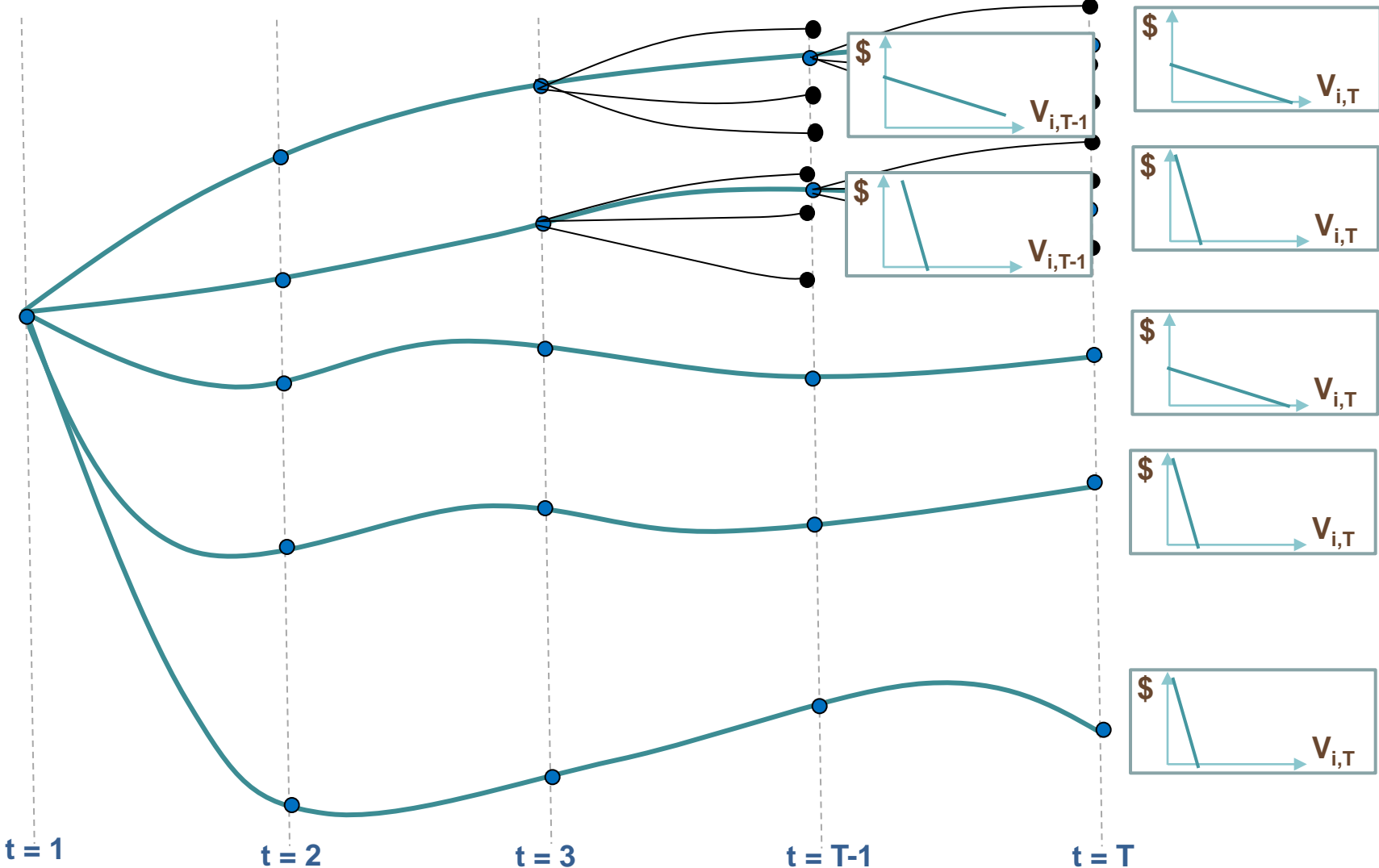
- ▶ Minimize present value of exp
- ▶ Fuel costs + penalties for violation of operational constraints



# SDDP solution algorithm: forward step



# SDDP: backward step

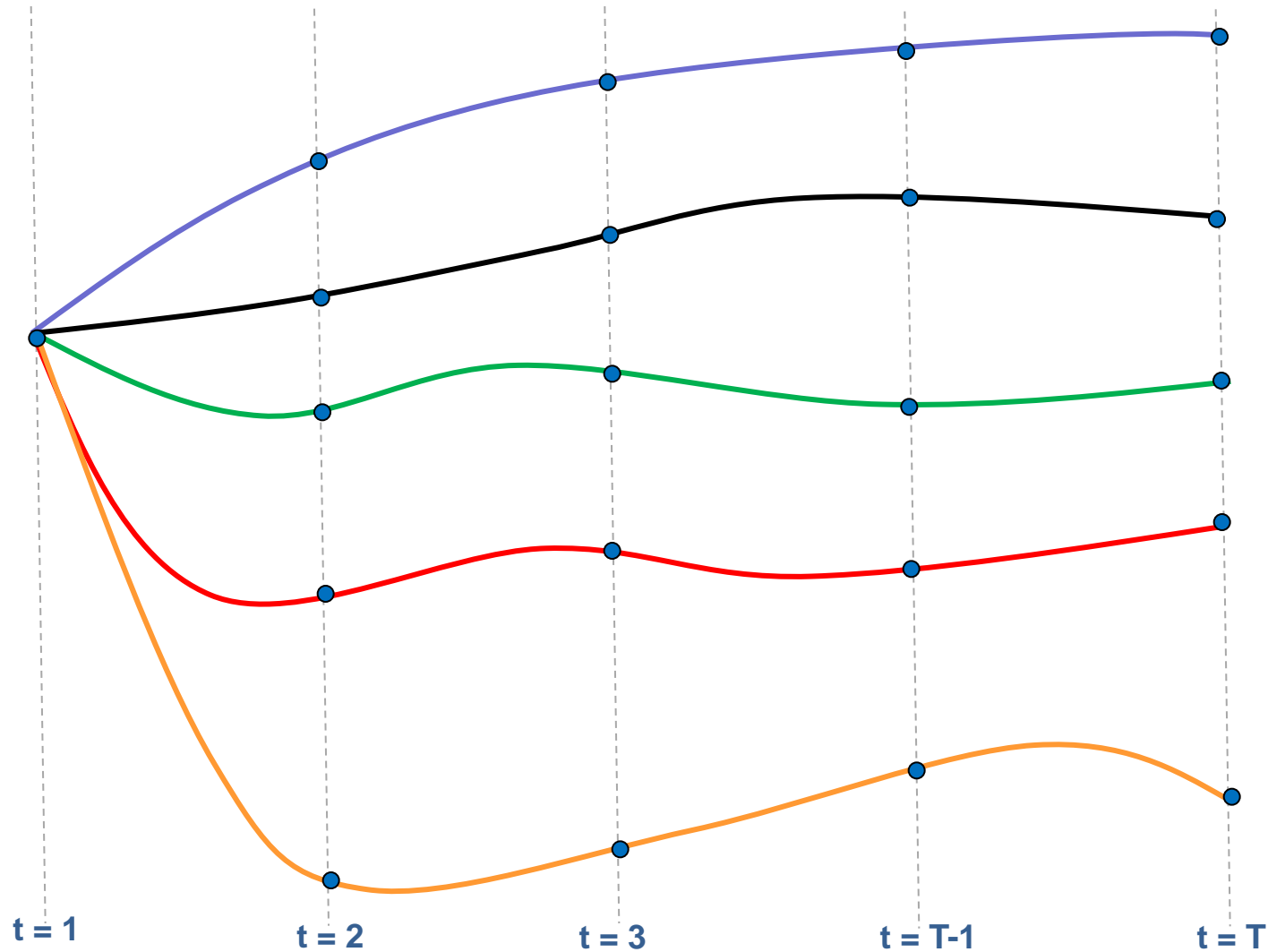


# Decomposition and distributed processing

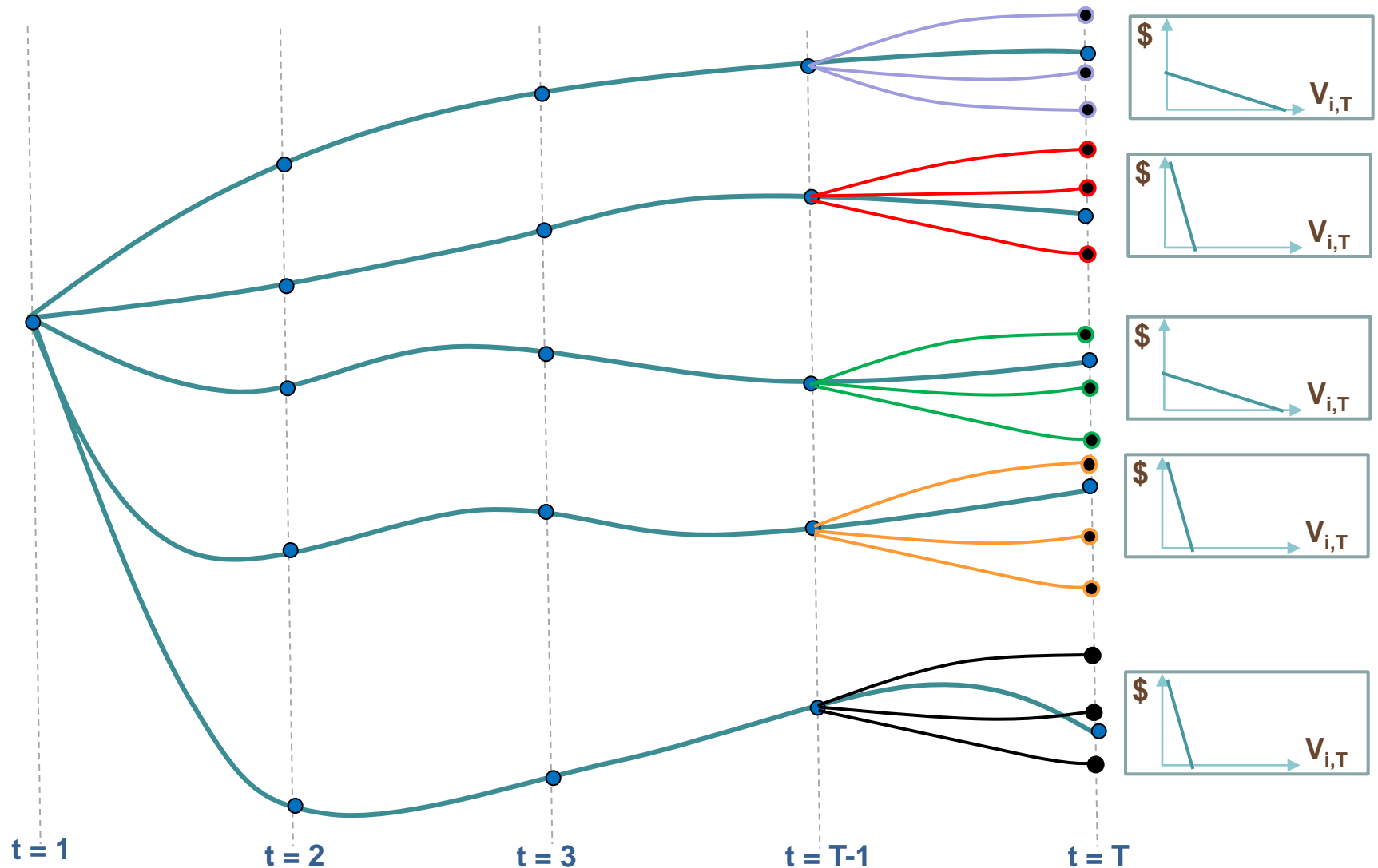
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- ▶ The one-stage sub-problems can be solved simultaneously, which allows the application of distributed processing
- ▶ SDDP has been running on computer networks since 2001
- ▶ In 2006, with the creation of Amazon Web Services (AWS), SDDP runs on our PSR Cloud
  - We currently have 500 virtual servers with 16 CPUs and 900 GPUs each

# SDDP: distributed processing of forward step

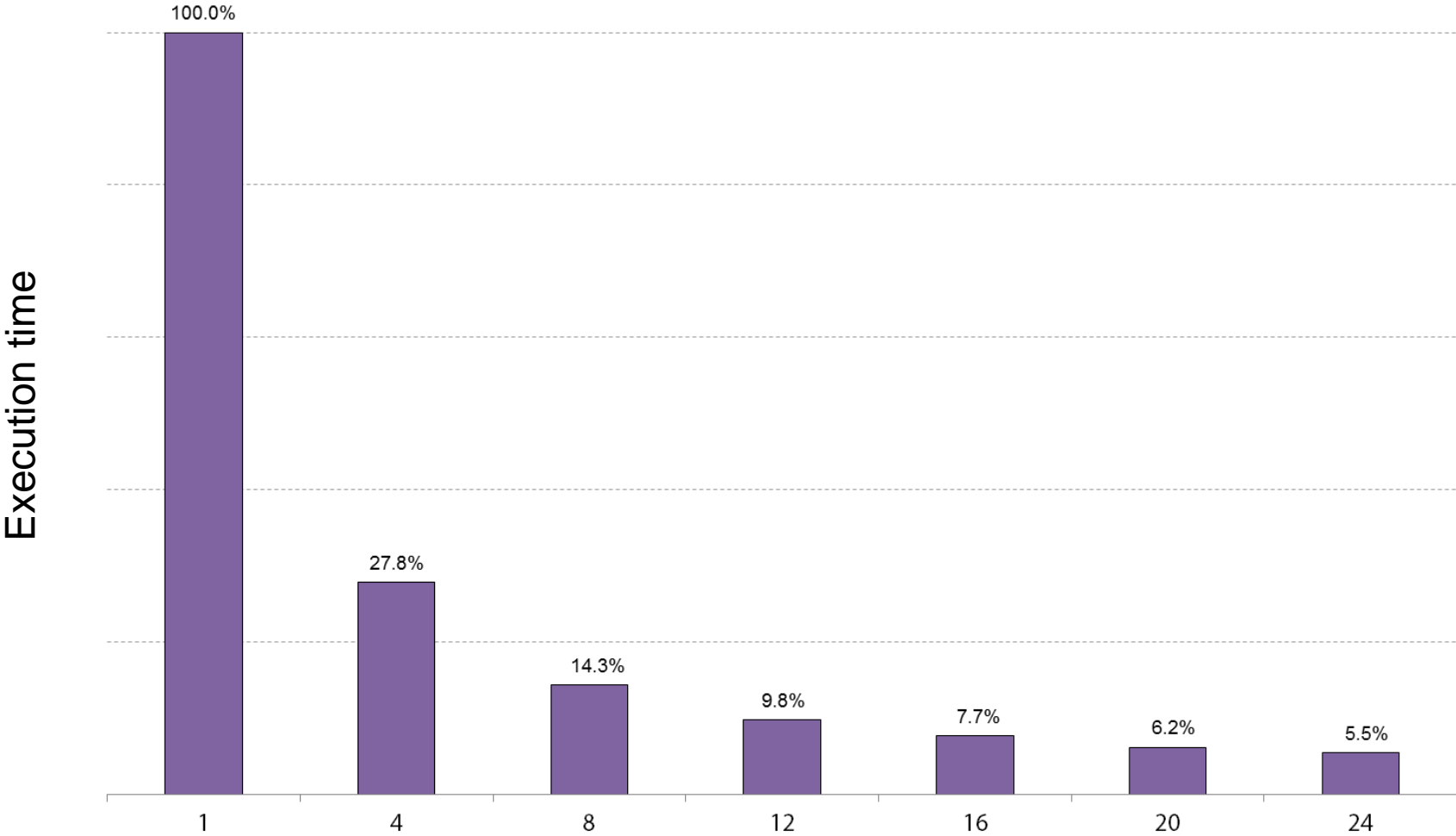


# SDDP: distributed processing of backward step

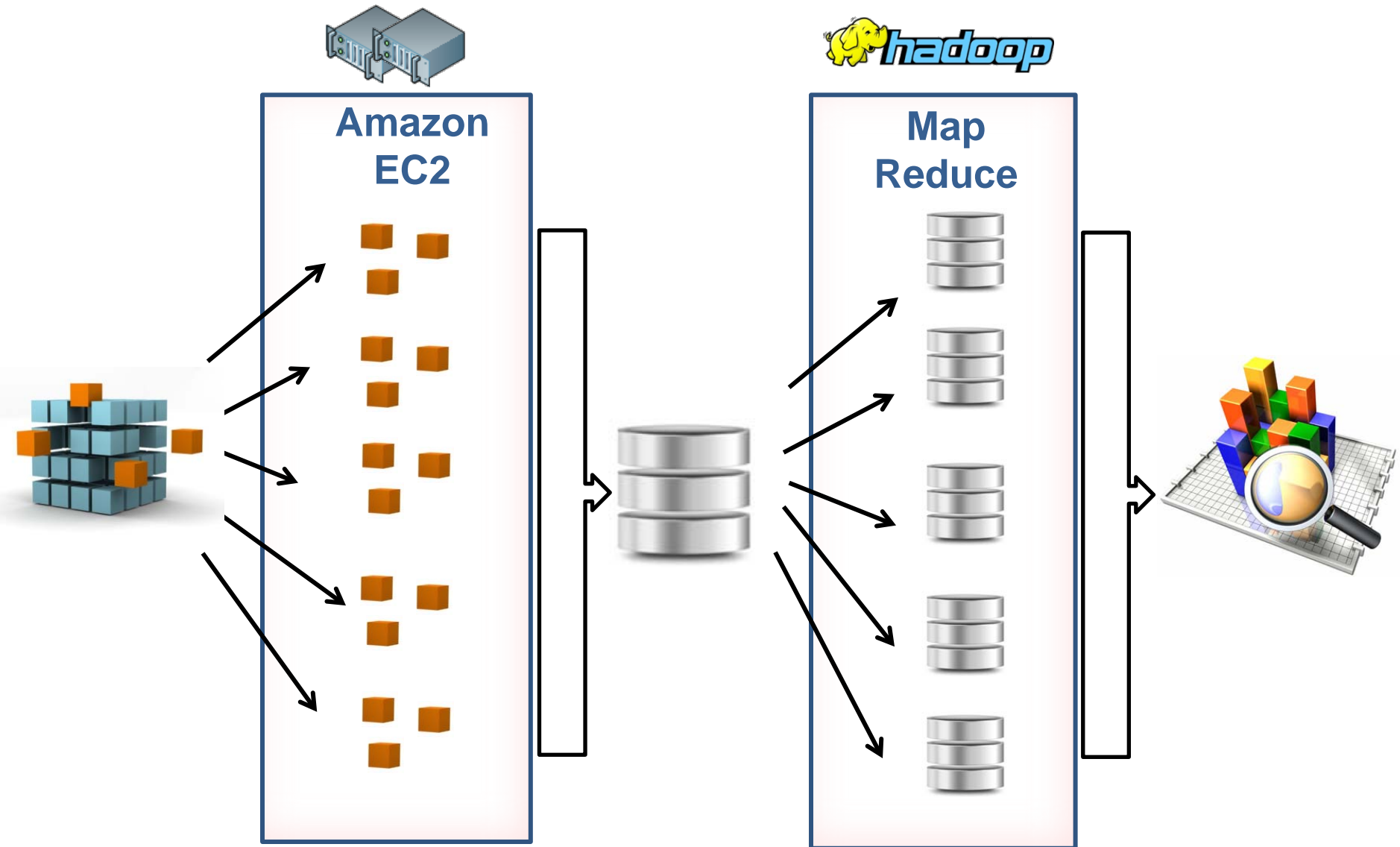




# Execution time vs. number of processes



# Analysis of results with Big Data techniques



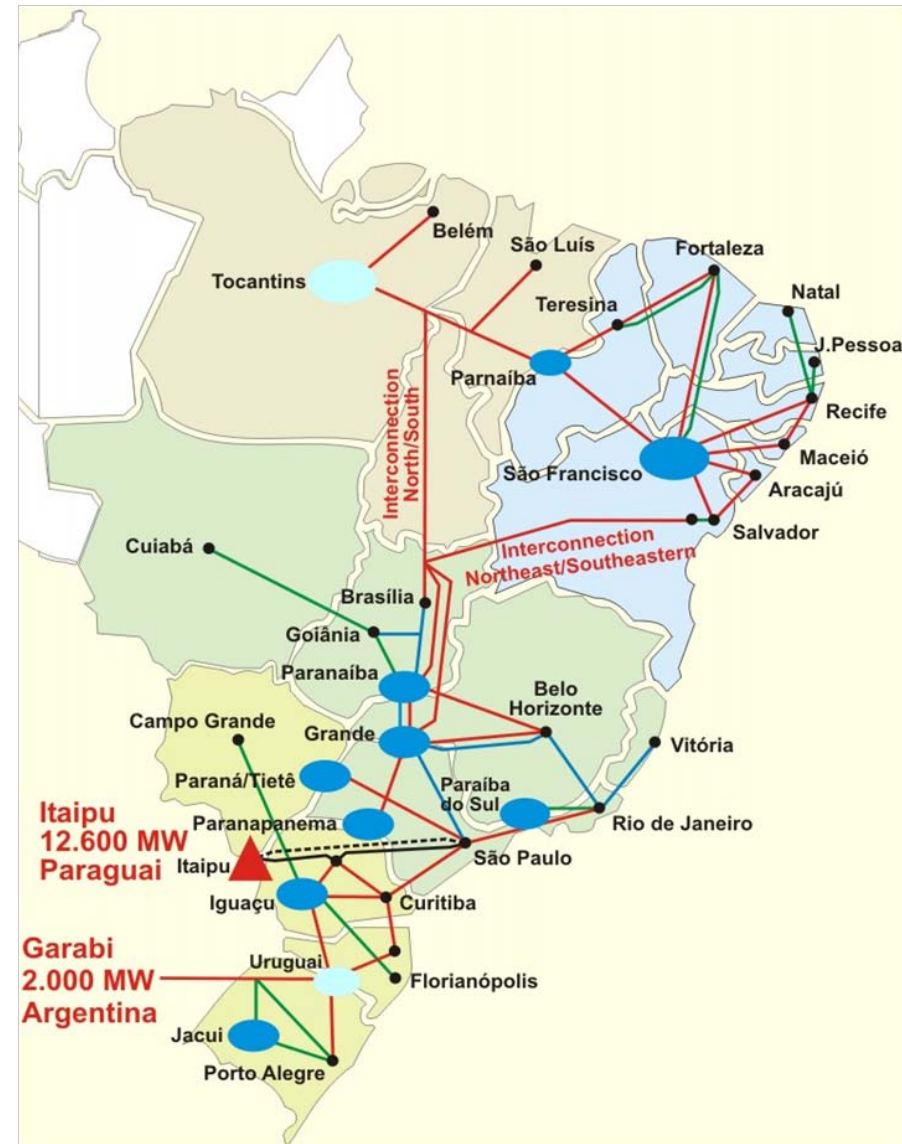
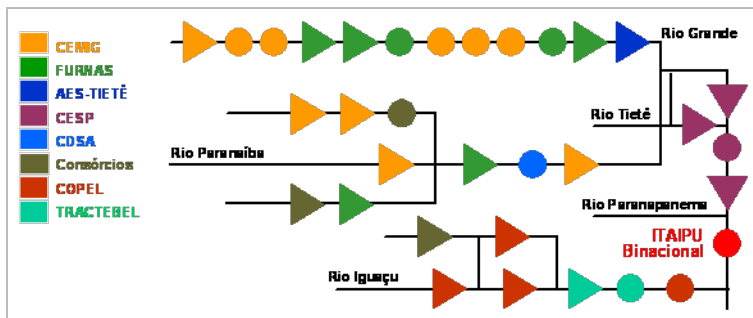
# SDDP applications

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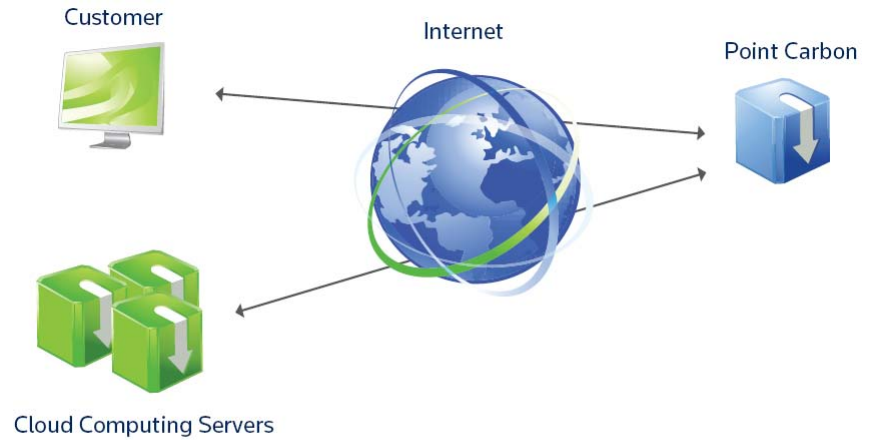
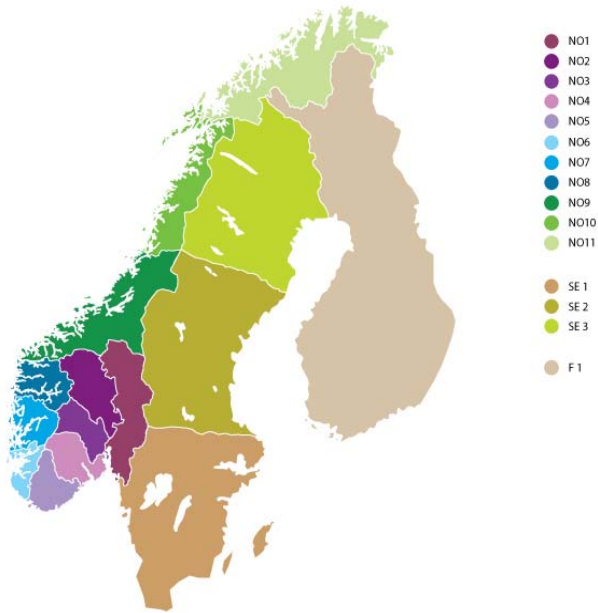
- ▶ SDDP has been used in planning and operation studies of 70 countries in the Americas, Europe, Asia Pacific and Africa
  - ▶ Production simulation (distribution of spot prices, fuel consumption, power flows, emission etc.)
  - ▶ Integrated resource planning (generation, transmission and gas networks) (with other models: Optgen and Optnet)
  - ▶ Calculation of grid tariffs
  - ▶ System dispatch (ISO)

# Example: Brazilian system

- ▶ Same area as continental US + ½ Alaska
- ▶ 120 GW installed capacity
- ▶ 85% hydro (remaining 15% include wind, gas, nuclear, coal and biomass)
- ▶ Main HV transmission network: 5,000 buses, 7,000 circuits



# Nordpool price forecasting



**PointCarbon**  
A Thomson Reuters Company



## What can we offer?

- Detailed SDDP model output from Point Carbon's weekly model run
- Including price and inflow series both for the whole Nord Pool area and for specific price areas
- Point Carbon analysts as discussion partners
- Defining alternative scenarios
- Discussing results
- The model output versus the market
- 24/7 access to the SDDP model via SDDP Interactive
- Data base access to your previous model runs, exclusively available for your company
- In house training of SDDP Interactive
- Tailor made solutions

## Power Market Trader Nordic power market outlook

ENERGY

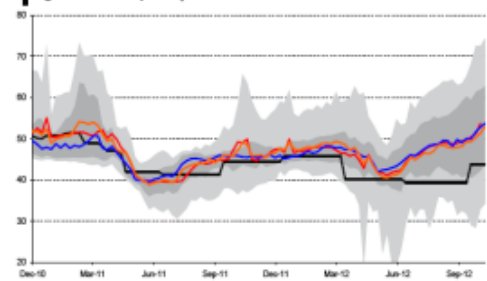
Week 45: November 9, 2010

### TO THE POINT

**This model run is based on hydrology/ weather forecasts as of Monday November 8.** Fuel prices and Continental power prices are closing prices from Friday November 5.

**Since the model run two weeks ago the hydro balance is slightly worsened (-2 TWh).** Over the course of the same period Continental power prices has moved slightly down (EEX Q1-11 -€0.5/MWh) and SRCM coal is unchanged. The very close front of the curve is slightly down whereas the February and March prices are up. The front year is unchanged.

Figure 1: SDDP system price forecast. 2010 - 2011. €/MWh



# NCP: short-term scheduling

- ▶ Horizon: up to 4 weeks ahead
  - Time steps: 15min, 30min or 1 hour
- ▶ Formulated as a MIP
- ▶ Used by ISOs and utilities in Europe, Asia and Latin America
- ▶ Integration with SDDP
  - End of week target storage of hydro plants, energy target or FCF (water values);
  - NCP “details” SDDP mid- or long-term studies: boundary conditions applied to all stages and hydrological scenarios
    - Suitable for Cloud computing
    - Results: 8,760h x years x scenarios

# NCP: modeling features

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- ▶ Comprises SDDP modeling features + additional short-term capabilities such as more detailed unit commitment constraints (minimum up and down times, ramp rates etc.) and the following hydro features:
- ▶ Water routing times and wave propagation
- ▶ Ramping constraints on forebay and tailwater elevations and outflows
- ▶ Downstream encroachment on upstream plants
- ▶ Minimum spillage as fraction of inflow (biological opinion constraints related to nitrogen concentration levels that impact fish life)
- ▶ Maximum spillage as function of forebay elevation (water pressure)

# NCP example: PNW peaking capability (PC)

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- ▶ Measures sustained production capacity for a given number of hours and reliability level
  - PC is constrained both by the available capacity and the hydro energy available for peak shaving the demand; requires a detailed representation of hydro production
  - Renewables (wind farms, small hydro and solar) and operational rules, including those related to environmental constraints, represented



# PC calculation for the PNW

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- ▶ Challenge: model all sources of uncertainty (equipment availability, hydrology and unconventional renewables)
- ▶ PNW database and modeling
  - Model of the PNW by Balancing Areas (by Mike McCoy)
    - Thermal power data (variable cost, maximum generation, ...)
    - Hydropower data (installed capacity, live storage, flow limits, ...)
    - Demand profile (hourly values)
    - Historical water years file
  - NCP and converters (for data formats and physical units)

# PC formulation

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*Max*  $\lambda$

Subject to:

$$\sum_i g(i,t) > \lambda D(t) \quad \text{for all } t = 1, 2, \dots, T$$

+ all mentioned hydro operational constraints

+ constraints on  $g(i,t)$  and  $\sum_t g(i,t)$  (boundary conditions)

Where

$D(t)$             hourly demand

$g(i,t)$             production of plant  $i$  in hour  $t$

$T$                     number of hours in a stage  $m$

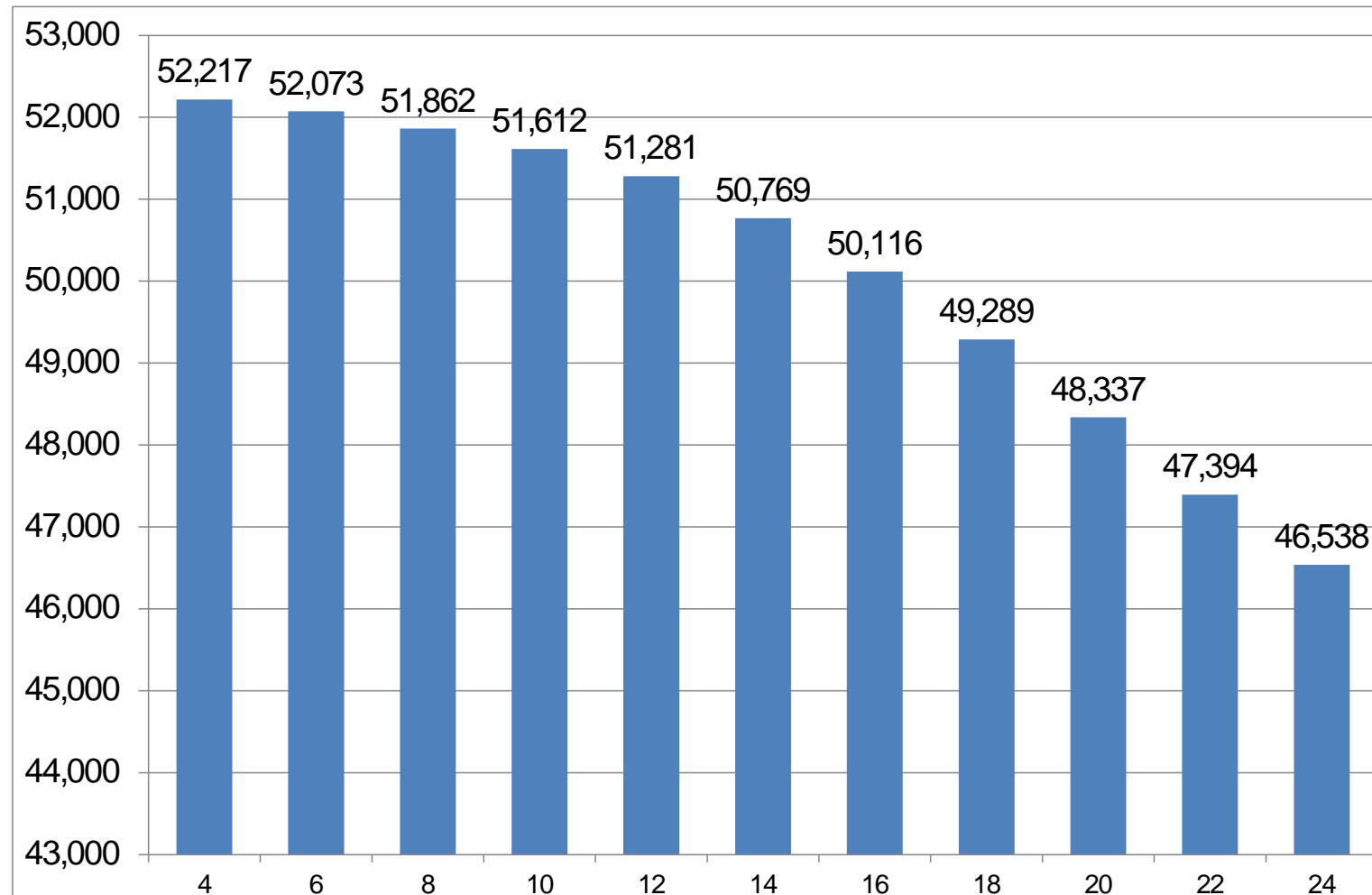
# PC calculation procedure

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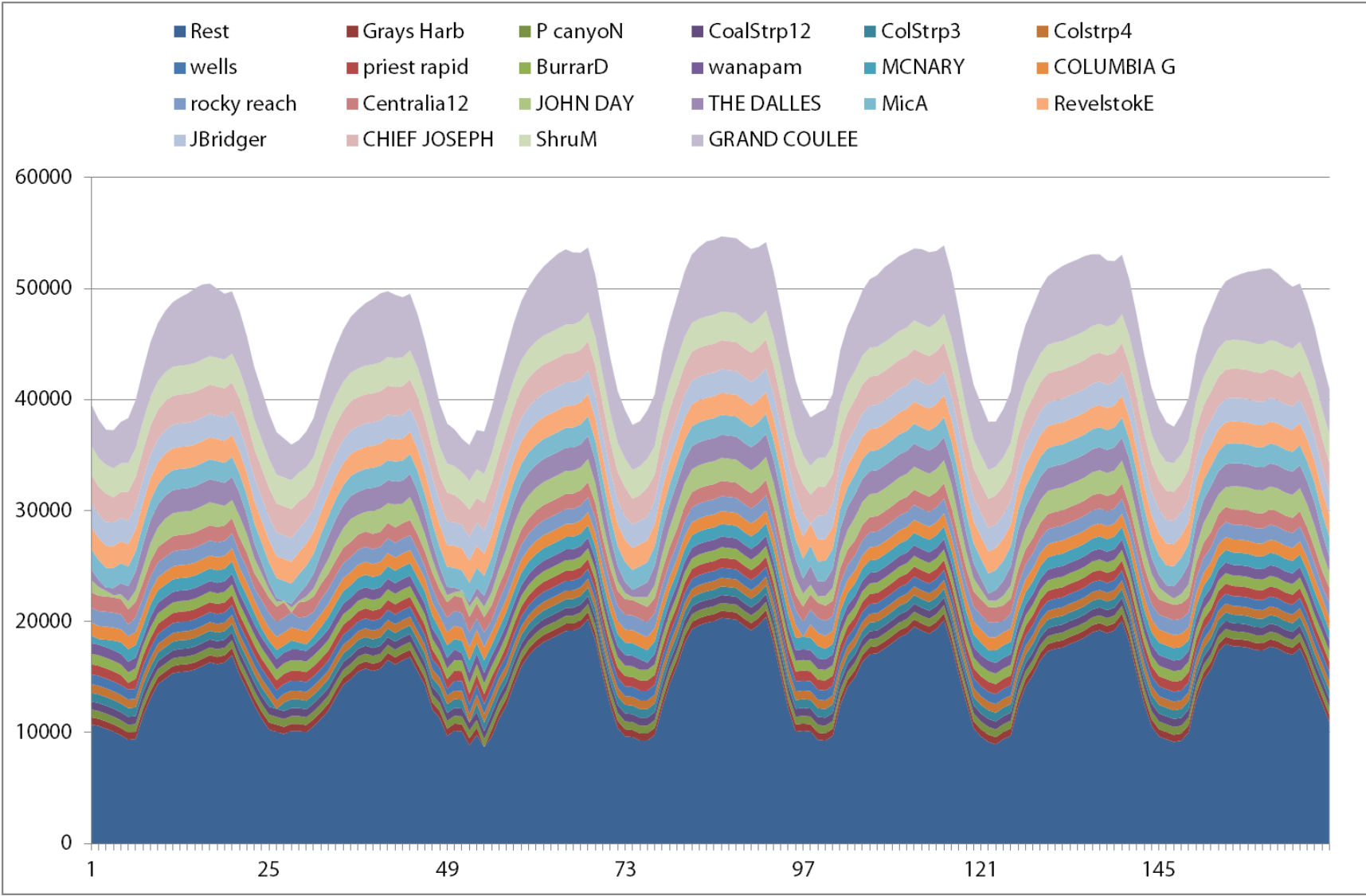
- ▶ For each hydrological year  $y$  and stage  $m$  we retrieve results from the SDDP mid-term planning (initial & final storage levels for each reservoirs or hydro plants' production for that stage)
  - NCP solves a problem with results from SDDP as boundary conditions and determine  $PC(y,m)$  (Peaking Capability)

# PC results for one sub problem $P(y,m)$

Peaking Capability for a given number of hours  $t'$  for this week and hydrological scenario (mean value of top hours of each day)



# PC example of results



# PSR development team

## Computational tools development

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EE : Electrical Engineering

CS: Computer Science

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