

The 4<sup>th</sup> ISM-ZIB-IMI MODAL Workshop on  
Mathematical Optimization and Data Analysis

# Unit Commitment Problem revisited in the course of Electricity Market Reform in Japan

**TOSHIBA**

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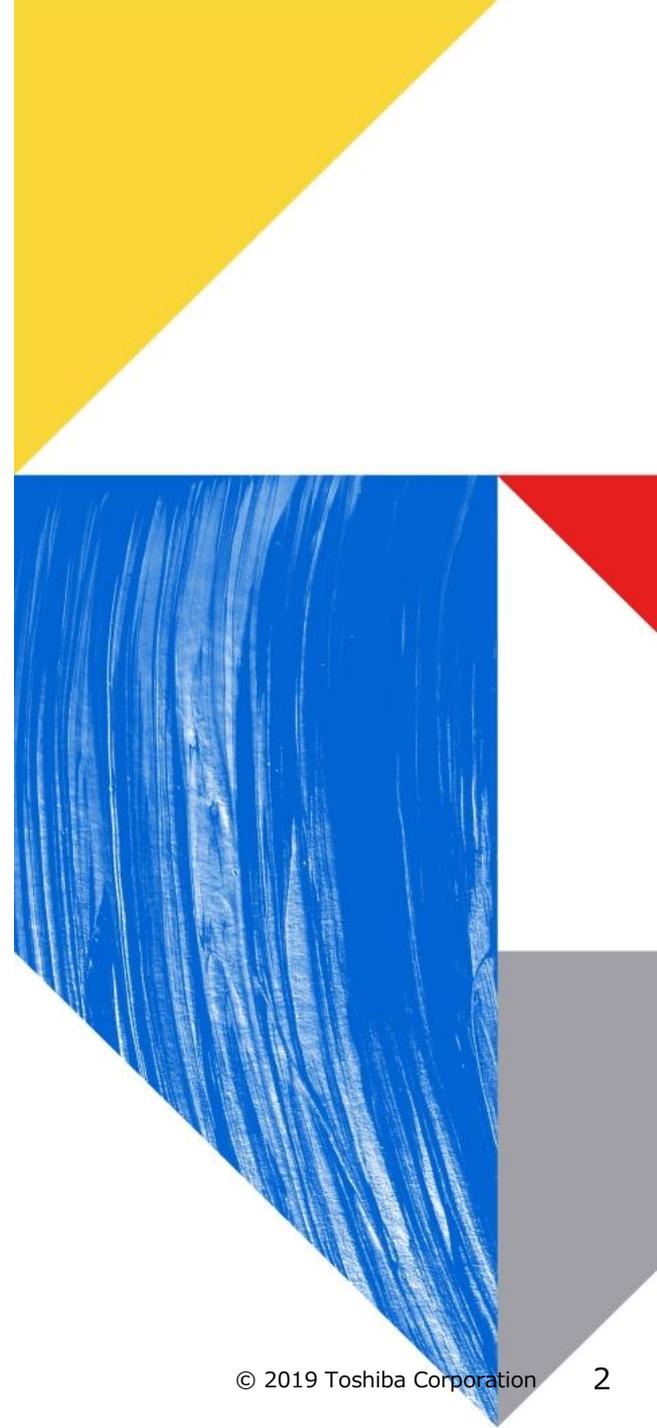
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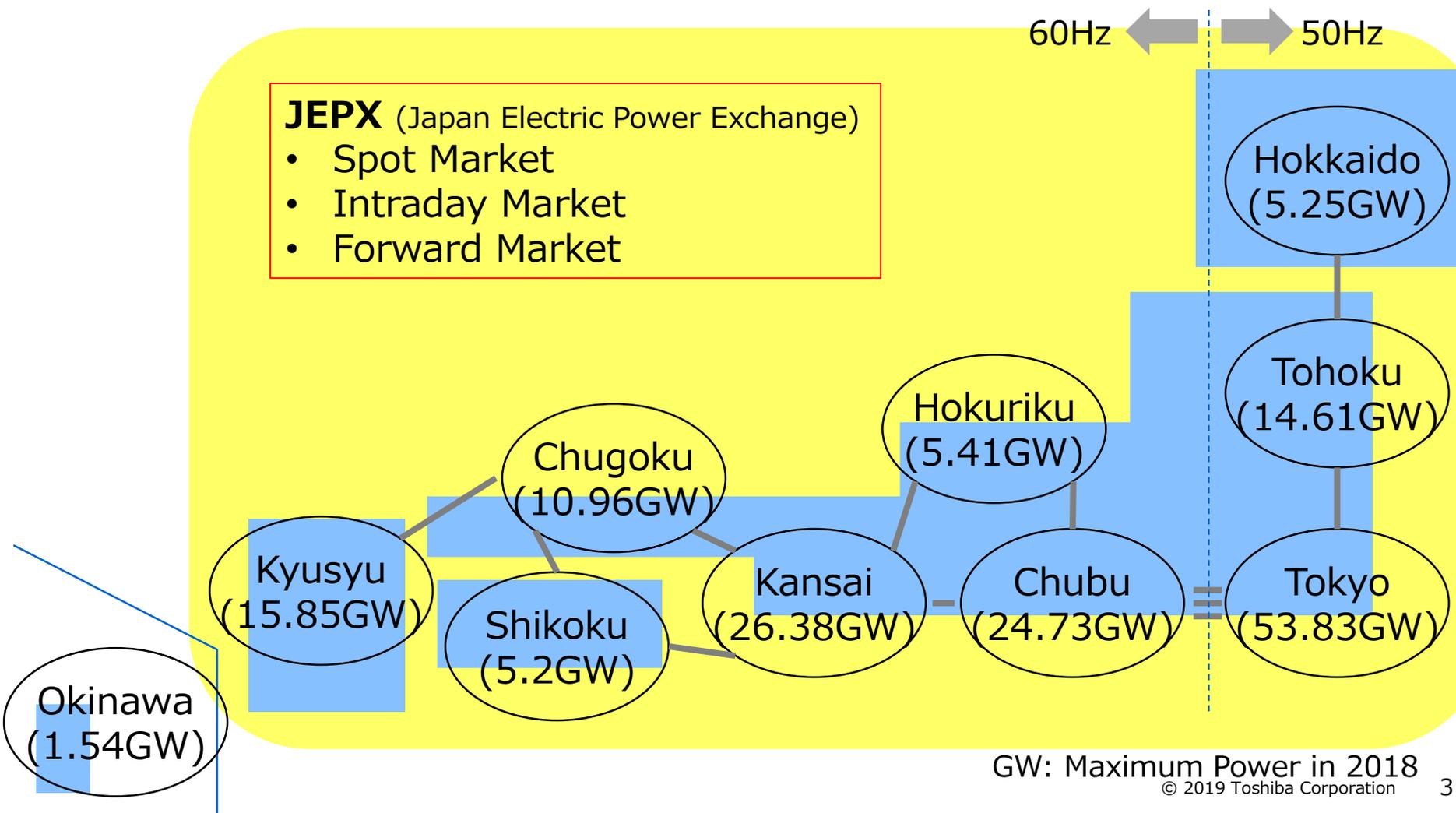
# 01

## Background



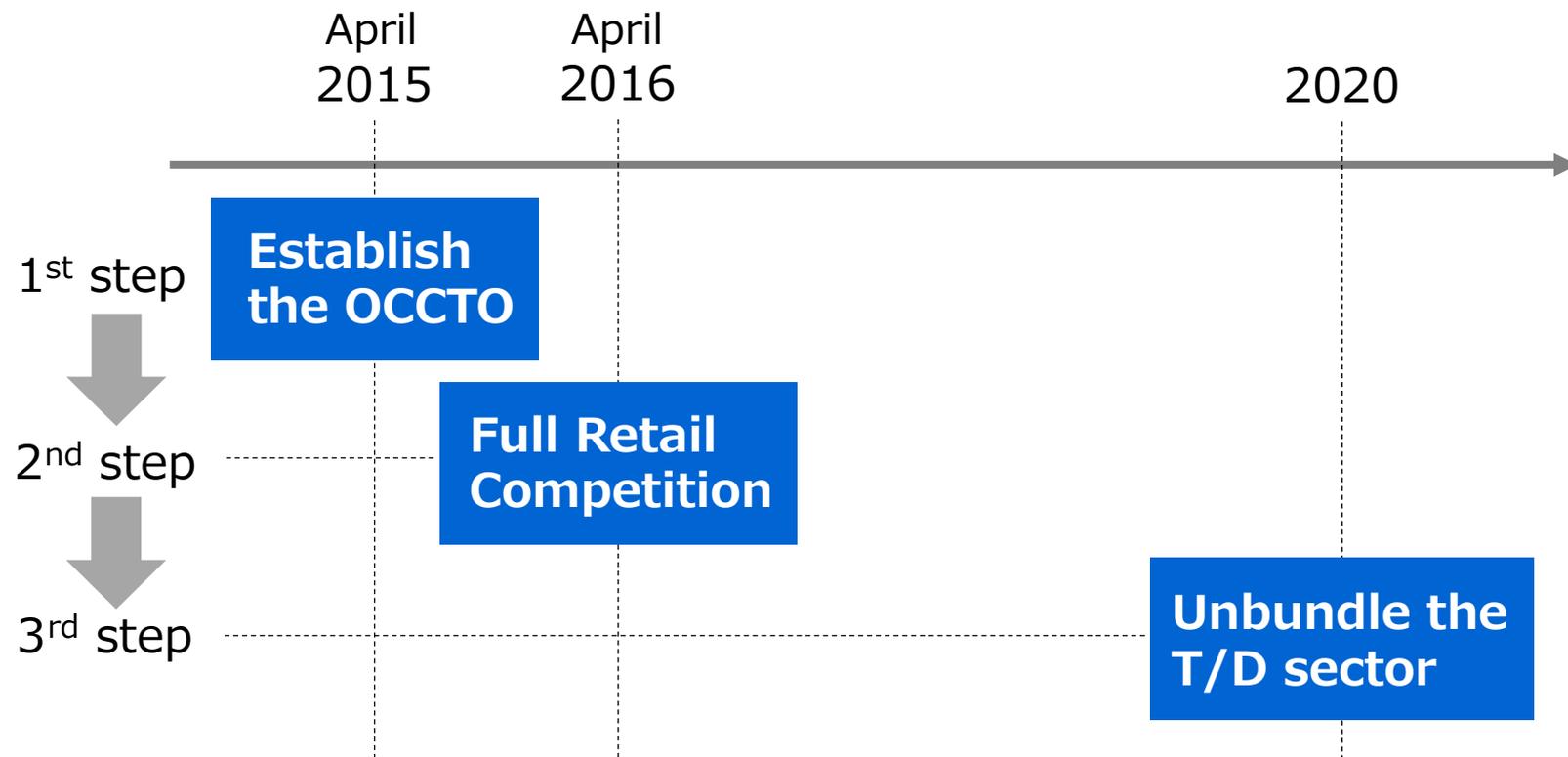
# Japan's Electricity Market Overview

- 10 Electricity Power Companies (EPCOs).
- 2 frequencies, 50Hz (East) and 60Hz (West).
- JEPX is a wholesale market in Japan established in 2003.



# Electricity Market Reform in Japan: Roadmap

Japan's Electricity Market Reform is being realized with a three-step approach since 2015.



OCCTO:  
Organization for Cross-regional  
Coordination of Transmission Operators

T/D:  
Transmission/Distribution

# Electricity Market: BRP Model

Balance Responsible Party (**BRP**)  
 =Retailers and power generation companies who balance  
 planned supply and demand by market transactions

T: T/D Sector  
 R: Retailer  
 P: Power Generation Company

Balancing **planned**  
 supply and demand

1 day ~

**Gate  
 Close**

Balancing **actual**  
 supply and demand

1 hour

**ACTUATE**

Payment for  
**imbalances**

2 months

JEPX

Spot Market

Intraday Market

Forward Market

OTC Contract

T

BRP

R

P



Manual  
 Control

Automated  
 Control

T

BRP

R

P



T

BRP

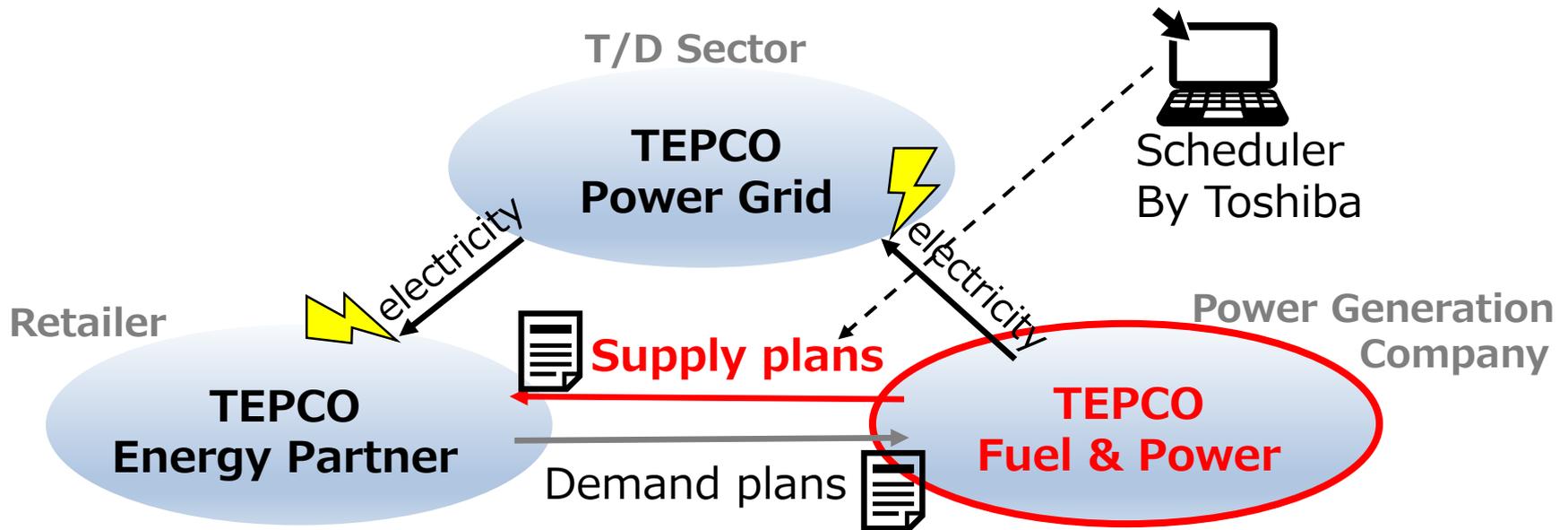
R

P



# TEPCO's Reorganization (April 2016)

- Tokyo Electric Power Company (TEPCO) adopted a holding company system in April 2016 to split into 3 companies.
- Toshiba developed a brand-new power generation scheduling system for TEPCO Fuel & Power.



# Brand-new Scheduler for Thermal Power Units

- **Viability**

- Avoid paying to settle the imbalance, viable schedules with less imbalances are needed.

- **Flexibility**

- We need to consider flexible operations, such as Daily-start-stop (DSS) and partial-loaded operations, because of increasing amount of renewable energies.

- **Efficiency**

- To improve profitability as an independent company after April 2016, TEPCO Fuel & Power generates electricity with minimum fuel cost.

# 02

## Model and Algorithm



# Unit Commitment Problem (UCP)

variables:  $x_{it} \in \mathbb{R}$ , MWh of unit #i in period #t (30min)  
 $y_{it} \in \{0,1\}$  on-off status of unit #i in period #t (30min)

objective:

$$\min_{x,y} \sum_{t=1}^T \sum_{i=1}^n (a_{it}x_{it}^2 + b_{it}x_{it} + c_{it}y_{it})$$

Minimize total operation cost which is convex quadratic function of x and y

constraints:

$$l_{it}y_{it} \leq x_{it} \leq u_{it}y_{it}$$

online units supply MWh between l and u (note  $l > 0$ )

$$\sum_{i=1}^n x_{it} = d_t$$

total power supply equals demand at every period

$$(x_{it}, y_{it}) \in \mathcal{F}$$

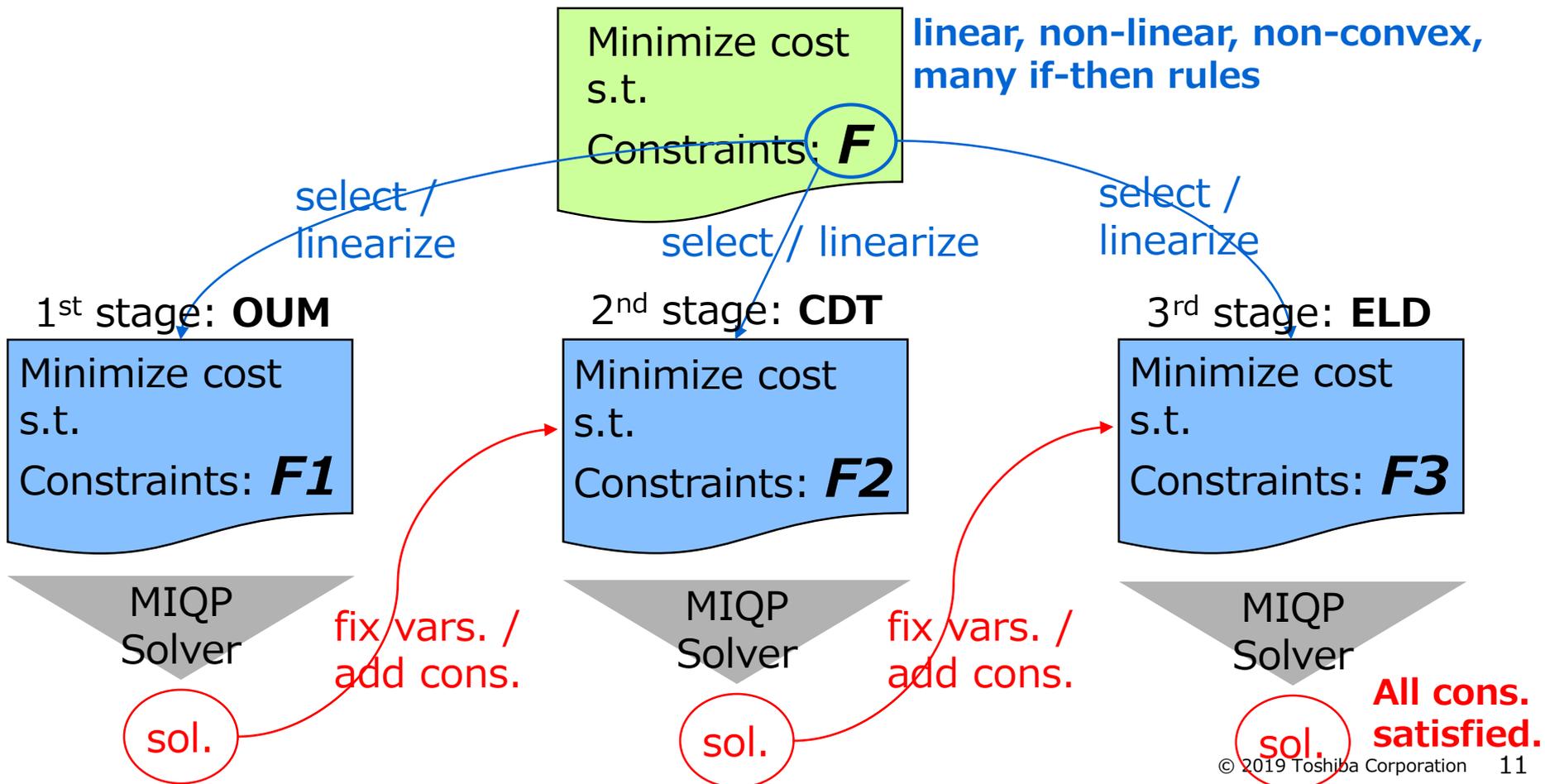
many other constraints requisite for operation: linear, non-linear(non-convex), if-then rules, etc.

# What makes UCP hard to solve

- Without constraints F, UCP would be Mixed Integer Programming Problem (**MIQP**) which is easy to solve even if UCP is large-scale (e.g., 100 units and 1000 periods).
- F includes constraints which make UCP hard to solve, e.g.,
  - Many if-then rules representing conditions on starting/stopping process in DSS operation.
  - Quadratic non-convex constraints representing available range on variation rate of MW during partial-loaded operation.
  - Inequalities including many variables representing long-term cumulative MWh amount that is consistent with LNG supply, considering LNG tank capacity and cargo-ship schedule.

# Algorithm: Multi-stage Optimization

- Represent UCP as an approximate three-stage MIQP, reducing  $F$  into  $F1 \rightarrow F2 \rightarrow F3$  by selecting and/or linearizing constraints.



# 1<sup>st</sup> stage: OUM (Online Unit Member)

- Output: Online Unit Member (OUM)

variables:  $x_i \in \mathbb{R}$ ,

$y_i \in \{0,1\}$  on-off status of unit #i in period #t

objective:

$$\min_{x,y} \sum_{i=1}^n (a_{it}x_i^2 + b_{it}x_i + c_{it}y_i)$$

constraints:

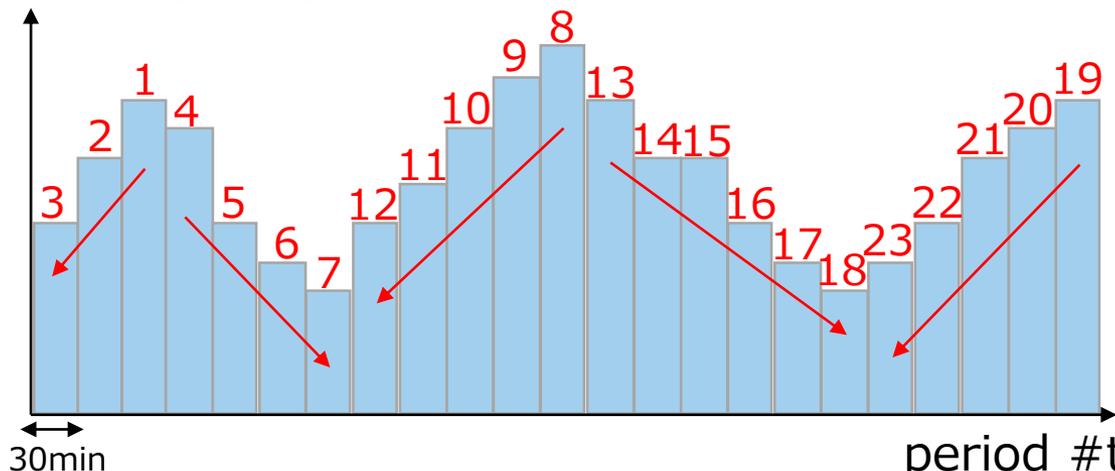
$$l_{it}y_i \leq x_i \leq u_{it}y_i$$

$$\sum_{i=1}^n x_i = d_t$$

$$(x_i, y_i) \in \mathcal{F}1_t$$

$$b.c. \sim \#(t \pm 1)$$

demand (MWh)



## 2<sup>nd</sup> stage: CDT (Commitment/Decommitment Timing)

- Input: online units in time bucket #k
- Output: Commitment/Decommitment Timing (CDT)

variables:  $x_{it} \in \mathbb{R}$ ,

$w_{im} \in \{0,1\}$

operation status of unit #i with different commitment/decommitment timing #m in time bucket #k

objective:

$$\min_{x,w} \sum_{t=T_{k-1}}^{T_k-1} \sum_{i \in ON} (a_{it}x_{it}^2 + b_{it}x_{it} + c_{it})$$

constraints:

$$l_{it} \leq x_{it} \leq u_{it}$$

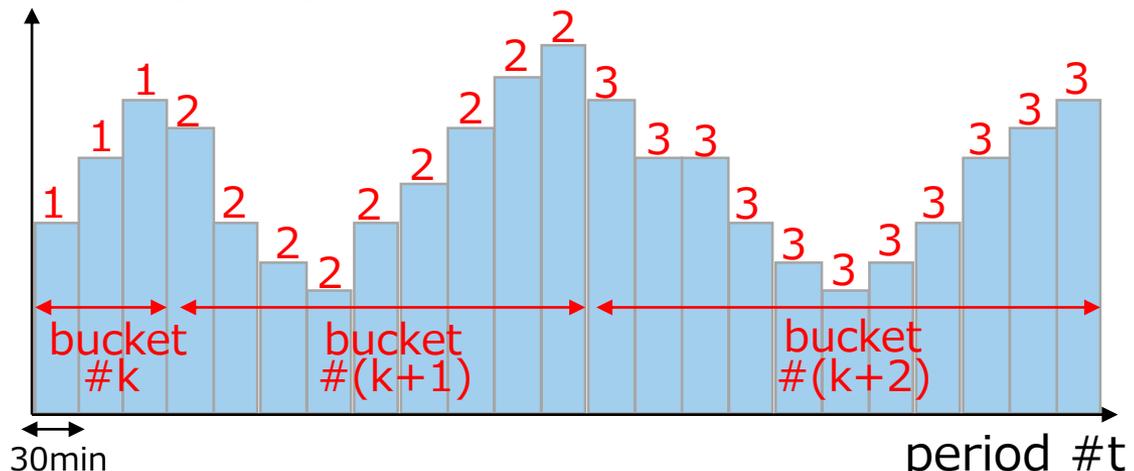
$$\sum_{i=1}^n x_{it} = d_t$$

$$(x_{it}, w_{im}) \in \mathcal{F}2_k$$

$$b.c. \sim \#(k-1)$$

Solve MIQP, bucket by bucket, chronological order

demand (MWh)



# 3<sup>rd</sup> stage: ELD (Economic Load Dispatch)

- Input: commitment/decommitment period #t
- Output: Economic Load Dispatch (ELD)

variables:  $x_i \in \mathbb{R}$ ,

$z_i \in \{0,1\}$  upward/downward direction of MW of unit #i in period #t

objective:

$$\min_{x,z} \sum_{i \in ON} (a_{it}x_i^2 + b_{it}x_i + c_{it})$$

constraints:

$$l_{it} \leq x_i \leq u_{it}$$

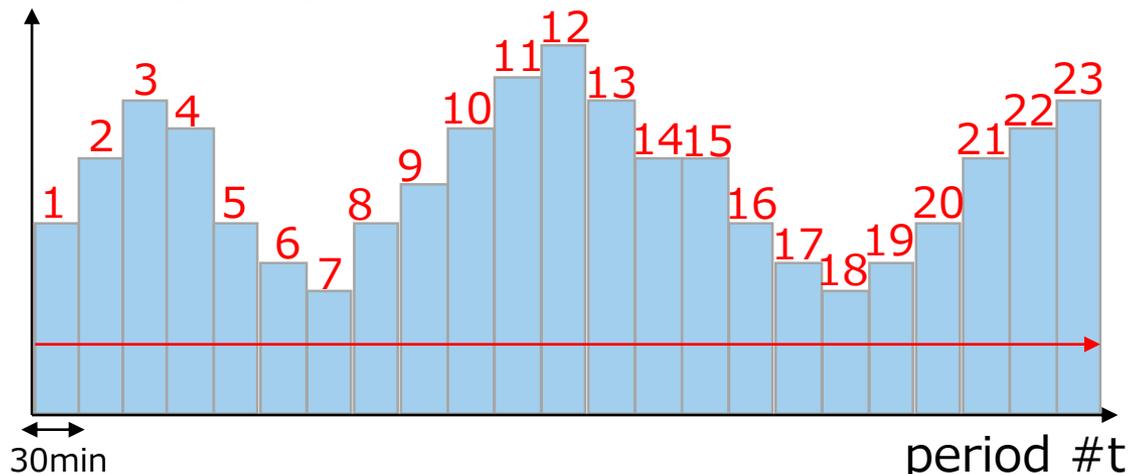
$$\sum_{i=1}^n x_i = d_t$$

$$(x_i, z_i) \in \mathcal{F}3_t$$

$$b.c. \sim \#(t-1)$$

Solve MIQP, period by period, chronological order

demand (MWh)

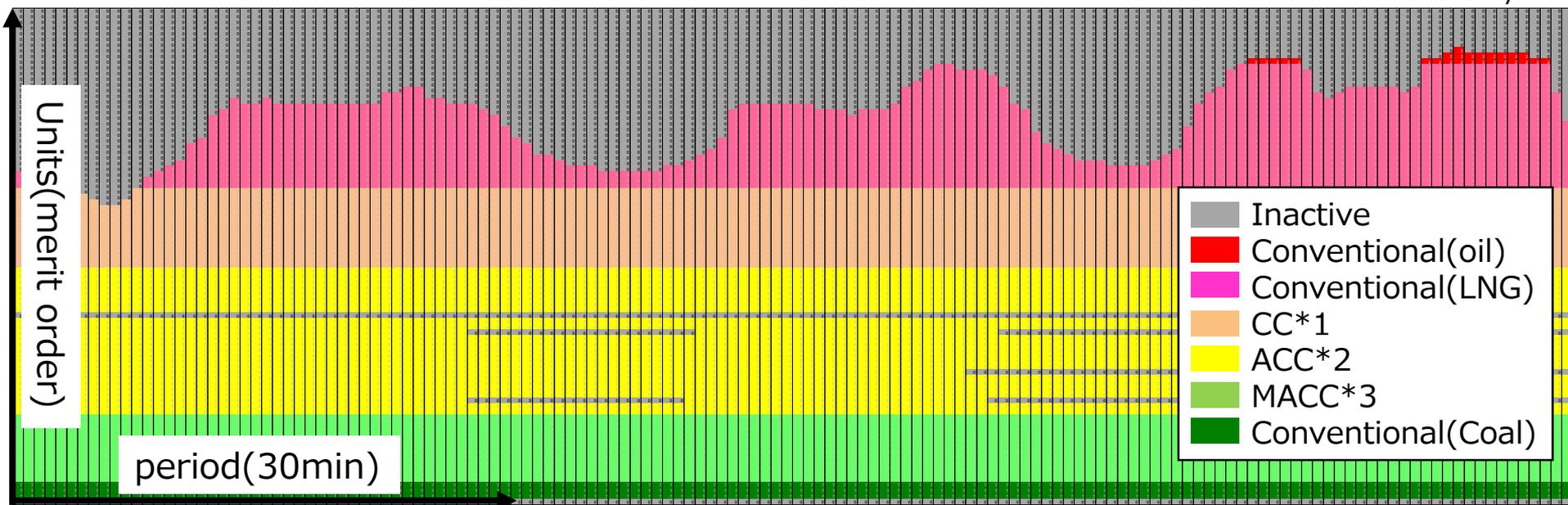


# 03

## Verification and Validation

# Verification: Quality of Solution

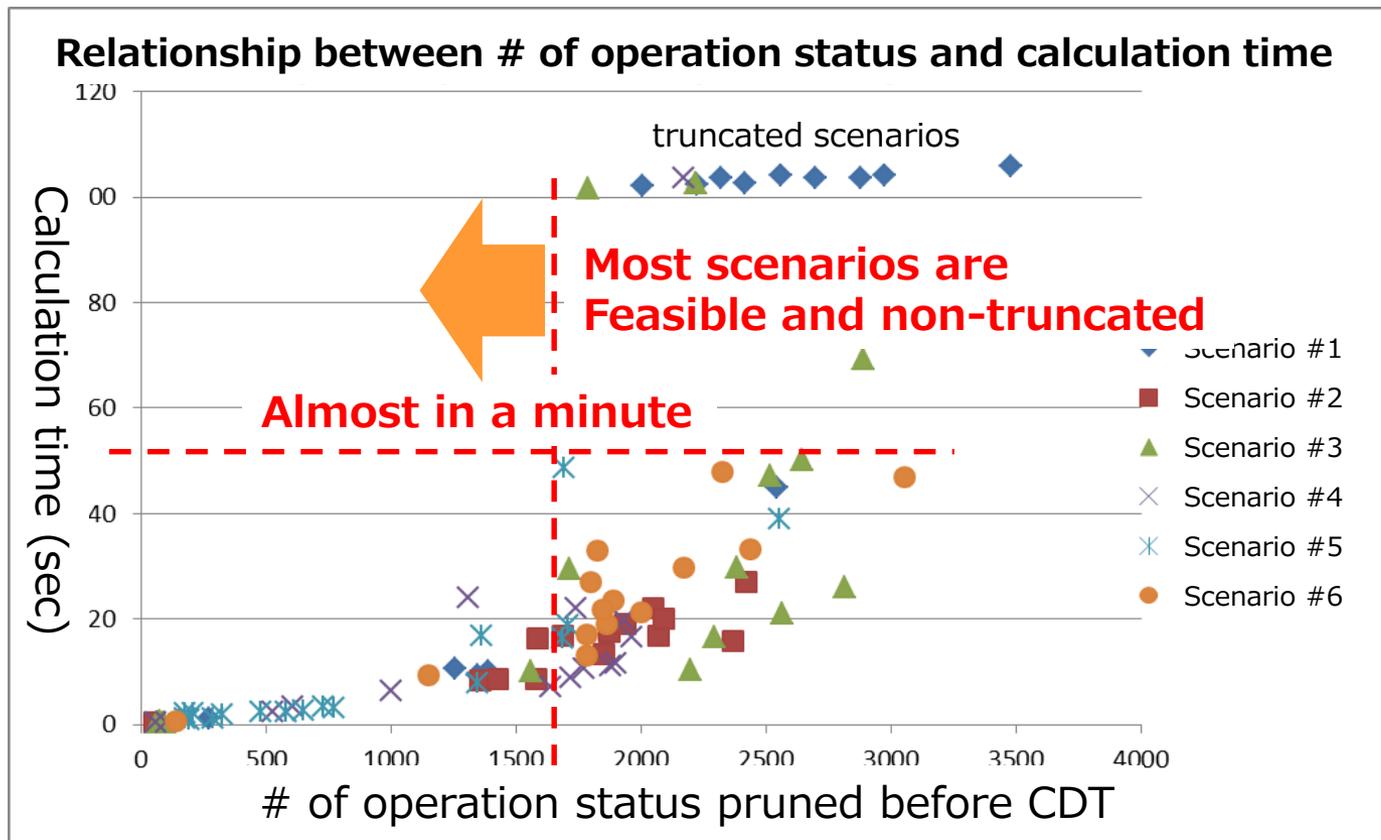
- \*1: Combined Cycle
- \*2: Advanced Combined Cycle
- \*3: More Advanced Combined Cycle



- More than **500** scenarios for verification conducted by TEPCO Fuel & Power and Toshiba.
  - Viability: All constraints satisfied? No unusual behaviors of unit?
  - Flexibility: DSS and/or partial-loaded operation fully adopted?
  - Efficiency: Operation cost lowest enough?

# Verification: Calculation Time

- Pruning technique is introduced to reduce calculation time.
- Fine tuning to balance calculation time and feasibility is requisite.



# Validation

- TEPCO Fuel & Power started “most economical operation” in April 2016:
  - **24-hour** constant monitoring and generation planning of over **90** thermal units.
  - using a brand-new scheduling system, based on the **multi-stage optimization** algorithm, developed by Toshiba.
- The system provides power generation plans:
  - with high-viability, and operators can fix the plans quickly and easily.
  - in a very short time, e.g., 1-day plan in **30sec ~ 3min**.
  - more economical than ever, resulting in a fuel cost saving of **0.48%** that amounted to **dozens of €M/year**.

# Conclusion

- Toshiba developed a brand-new scheduling system of thermal unit generation planning, based on the multi-stage optimization algorithm, in pursuit for viability, flexibility and efficiency.
- TEPCO Fuel & Power introduced the system and started “most economical operation” in April 2016, in the course of the market reform in Japan.
- Issues to be addressed in the future are:
  - Extension to the power generation system including thermal units and renewable energies.
  - Optimal strategy of operation considering market transactions.

# TOSHIBA

Thank you for your attention!!