MOBILIZING GRID FLEXIBILITY FOR RENEWABLES INTEGRATION THROUGH ENHANCED COMPUTATION

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33% RPS - Cumulative expected VERs build-out through 2020



Source: CAISO

Tehachapi Wind Generation in April – 2005





Hour

California IS

Negative Correlation with Load



The "Duck Curve"

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https://www.caiso.com/Documents/FlexibleResourcesHelpRenewables_FastFacts.pdf

Introduction

New Challenges

The ISO needs a flexible resource mix that can react quickly to adjust electricity production to meet the sharp changes in electricity net demand.

- Ramping requirements
- □Flexible resources
- □Over generation mitigation

Integration of Renewable Generation



Flexible Transmission Network Control

 Topology Control
 Switch on/off lines
 Flexible Line Rating
 Include choosing proper line ratings as decisions
 FACTS





Topology Control

Topology control has been studied to:

Relieve abnormal conditions^[1]

Reduce system loss^[2]

Reduce operating cost (Optimal Transmission Switching)^[3]

Utilize existing assets required by normal operating conditions. No additional cost other than the wear of breakers is incurred.

[1] A. G. Bakirtzis and A. P. Sakis Meliopoulos, "Incorporation of switching operations in power system corrective control computations," *IEEE Transactions on Power Systems*, vol. PWRS-2, no. 3, pp. 669–675, 1987.
[2] R. Bacher and H. Glavitsch, "Loss reduction by network switching," *IEEE Transactions on Power Systems*, vol. 3, no. 2, pp. 447–454, 1988.
[3] F. Fisher, R. O'Neill, and M. Ferris, "Optimal transmission switching," IEEE Transactions on Power Systems

[3] E. Fisher, R. O'Neill, and M. Ferris, "Optimal transmission switching," IEEE Transactions on Power Systems, pp. 1–10, 2008.

Operating Cost Reduction

Original Optimal Cost: \$20,000 (A=180MW,B=30MW, C=40MW) Open Line A-B, Optimal Cost: \$15,000 (A=200MW, B=50MW)



150MW 180MW 200MW

Topology Control in Practice

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Topology Control in Practical Power System Operations

PJM Manual 03: Transmission Operations

PJM uses the following techniques to control contingency or system violations:

- ..
- switching transmission facilities in/out of service
- •
- ISO New England Operating Procedure No . 19 Transmission Operations

In the operating procedure, transmission circuit switching is listed as one of EMERGENCY system actions.

Where it is clear that opening a transmission facility will alleviate a problem existing for a specific emergency situation, consideration will be given to opening such facility.

...





4) ² Green Electricity Network Integration (GENI)					
\$4,910,031	College	Robust Adaptive Topology Control (RATC)			
	Station, TX	Historically, the electric grid was designed to be passive,			
		causing electric power to flow along the path of least			
		resistance. The Texas Engineering Experiment Station team			
		will develop a new system that allows real-time, automated			
		control over the transmission lines that make up the electric			
		power grid. This new system would create a more robust,			
		potentially saving billions of dollars a year.			
ARIZONA STATE UNIVERSITY	TEXAS A&M EXPERIM	A ENGINEERING A ENGINEERING ENT STATION Sciences Applied Communicatio Sciences			
	rk Integration (G \$4,910,031	rk Integration (GENI) \$4,910,031 College Station, TX Station, TX			







UC Berkeley

Lawrence Livermore²⁰¹⁸⁻⁰⁴⁻⁰⁴ National Laboratory LLNL

Topology Control as Recourse

In deterministic unit commitment, topology control can reduce the generation cost^[4] and mitigate post contingency violations In stochastic unit commitment, topology control as a recourse action may leverage the grid controllability and mitigate the variability of renewable generation.

^[4] K. Hedman and M. Ferris, and et al. "Co-optimization of generation unit commitment and transmission switching with N-1 reliability," *IEEE Transactions on Power Systems* vol. 25, no. 2, pp. 1052–1063, 2010.

Two-stage Stochastic Unit Commitment

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Objective : minimize the expected operating cost
 Decision variables:



Formulation: Constraints

System-wide constraints

- Market clearing
- DC power flow
- Line capacity
- Number of lines that can be switched off
- Generator constraints
 - Generation capacity
 - Ramping up/down
 - Min up/down time
 - On/off transition

Topology Control Formulation

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 $\square B\theta$ Formulation $-M_{ii}(1-r_{ii,t,s}) \le F_{ii,t,s} - B_{ii}(\theta_{i,t,s} - \theta_{i,t,s}) \le M_{ii}(1-r_{ii,t,s}), \quad \forall i, j \in N_{z}, t \in T, s \in S$ $-r_{ii,t,s}F_{ii}^{\max} \leq F_{ii,t,s} \leq r_{ii,t,s}F_{ij}^{\max}, \forall i, j \in N_z, t \in T, s \in S$ PTDF Formulation(Ruiz, 2012) $\min_{\mathbf{p},\mathbf{v},\mathbf{z}} \mathbf{c}' \mathbf{p}$ subject to 1'(p-1) = 0 $\mathbf{p} \leq \mathbf{p} \leq \overline{\mathbf{p}}$ $\underline{\mathbf{f}}_{\tau}^{\mathcal{M}} \leq \Psi_{\tau}^{\mathcal{M}}(\mathbf{p}-1) + \Phi_{\tau}^{\mathcal{MS}} \mathbf{v}_{\tau} \leq \overline{\mathbf{f}}_{\tau}^{\mathcal{M}}, \quad \forall \tau$ $\underline{\mathbf{f}}_{\tau}^{S} \leq \Psi_{\tau}^{S}(\mathbf{p}-1) + \Psi_{\tau} \quad \forall \tau \geq \tau_{\tau}, \quad \forall \tau$ $\underline{\mathbf{\tilde{F}}}_{\tau}^{S} \mathbf{z} \leq \Psi_{\tau}^{S}(\mathbf{p}-1) + (\Phi_{\tau}^{SS}-I) \quad \mathbf{v}_{\tau} \leq \overline{\mathbf{F}}_{\tau}^{S} \mathbf{z}, \quad \forall \tau$ $\underbrace{\mathbf{f}}_{k}^{F}(\mathbf{p}-1) + (\Phi_{\tau}^{SS}-I) \quad \mathbf{v}_{\tau} \leq \mathbf{F}_{\tau}^{S} \mathbf{z}, \quad \forall \tau$ $-M(1-\mathbf{z}) \leq \mathbf{v}_{\tau} \leq M(1-\mathbf{z}), \quad \forall \tau$ $v_k \qquad m' \quad f_k + \phi_k^{m'n'} v_k \quad n' \qquad \dots$ $z_{\ell} \in \{0,1\}, \quad \forall \ell$

Test Case

□IEEE 118 system



Wind Modeling

Wind Generation Simulation

- In our test, wind speed and wind power data of three locations in Wyoming are obtained from NREL Western Wind Resources Dataset.
- 1000 wind generation scenarios are generated using the method described in [5].
- □ To reduce the computational complexity, we adopt the scenario reduction technique introduced in [6].

^[5] A. Papavasiliou and S. S. Oren, "Multiarea stochastic unit commitment for high wind penetration in a transmission constrained network," Operations Research, vol. 61, no. 3, pp. 578–592, 2013.
[6] N Growe-Kuska, H Heitsch and W Romisch, "Scenario Reduction and Scenario Tree Construction for Power Management Problems". IEEE Power Tech Conference, Bologna 2003.

Wind Speed Scenario Generation



Power Curve



- Solving the problem—Branch and Bound 48,336 binary variables, 80,352 continuous variables.
 - The problem is solved on a laptop: 2.6GHz CPU, 12G RAM.
 - When the MIP gap tolerance is 5%, using the default setting of CPLEX the program does not terminate after 8 hours.
 - The automatic tuning tool of CPLEX does not work for this problem. Appropriate parameters are not found after over 8 hours.

Warm Starts

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Solving the problem—Branch and Bound Using CPLEX MIP warm-start

Stochastic Unit Commitment without Topology Control

> Warm-Start Solution

Solver

Optimal Transmission Switching for 1 Hour with the Heaviest Net Load

Warm Start Heuristic

- Solving the problem—Branch and Bound Using CPLEX MIP
 - Unit Commitment Decisions
 - The warm-start values for unit commitment decisions are obtained from solving a stochastic unit commitment problem with no topology control recourse.
 - In practice, system operators can use the commitment decisions of previous days with similar loading conditions to construct warm-up values for commitment decisions.

Warm Start Heuristic

- Solving the problem—Branch and Bound Using CPLEX MIP
 - Topology Control Decisions
 - Topology control warm-up values are obtained from solving an optimal transmission switching problem for the highest load hour (no wind).
 - The warm-start values for switching decisions are the same for different hours and scenarios.

Start Switching Solutions

- □We conducted 9 numerical tests

lines that can be switched off. (J = x)

Case	Start switching solution		
TCSUC-1	132		
TCSUC-2	132,136		
TCSUC-3	132,136,153		
TCSUC-4	132,136,153,162		
TCSUC-5	132,136,151,153,163		
TCSUC-6	132,136,148,153,161,162		
TCSUC-7	63,132,136,148,153,161,162		
TCSUC-10	126, 132, 136, 146, 151, 153, 157, 165		
TCSUC-∞	1, 10, 14, 25, 28, 31, 57, 63, 66, 77, 79, 86, 96, 103, 110, 111, 132, 136, 146, 151, 153, 161, 165, 184		

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Improvement over SUC with no switching



Cost Reduction: percentage of saving Time limit: 30min Maximum value of optimality gap: 7.88%

Results Analysis

- Sources of cost savings
 Reduction of production cost
 Reduction of start-up cost
 Reduction of no-load cost
 - Reduction of load shedding

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Reduction of production cost



Reduction of start-up cost (STC6<STC8)</p>



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Reduction of no-load cost



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Reduction of load shedding



Solving the Problem

- The optimality gap for each sub-problem is set to be 4% and the time limit for each sub-problem is set to be 6 minutes.
- The algorithm converges after 7 iterations. The estimated time for solving the problem in parallel is 42 minutes.
- □The cost is reduced by 10.1% with topology control recourse.

Switching Results

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Switching solution for different scenario

Scenario	Switching solution of Hour 18 (Lines are off)
1	40, 94,109, 132, 136, 146, 151, 153, 157, 165
2	48, 88, 126, 132, 136, 146, 151, 153, 157, 165
3	116, 126, 132, 136, 153, 165
4	94, 96, 124, 132, 136, 146, 151, 153, 157, 165
5	39, 40, 63, 84, 122, 132, 136, 151, 153, 165
6	1, 83, 126, 132, 16. 146, 151, 153, 157, 165
7	45, 118, 126, 132, 136, 146, 151, 153, 157, 165
8	63, 96, 109, 124, 127, 132, 153, 163, 168
9	21, 42, 79, 132, 136, 146, 151, 153, 157, 162
10	37, 42, 59. 103, 132, 136, 146, 151, 153, 157

Evaluation

- Evaluate the robustness of the solution that was based on a reduced scenario set, under a richer uncertainty representation.
- The commitment of slow generators are fixed as the slow generators commitment solution of TCSUC-10.
- The line switching decisions are optimized for each of the simulation scenarios among the set of lines in the union of lines switched in TCSUC-10 for the 10 optimization scenarios.
- 1000 wind generation scenarios produced using Monte Carlo simulation are used in the evaluation.
- Both unit commitment and unit commitment with transmission switching are implemented to compare the cost.

Evaluation

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- In all 1000 tests, when there is transmission switching in the recourse, the total cost is less than when there is no transmission switching.
- The average total cost is reduced by 12.9% with transmission switching in the recourse.
- The simulation provides a lower bound of the cost reduction for the case where there is no restriction on the lines that can be switched.

Central European System Test Case

- Central European System
 - □7 Countries
 - □679 Buses
 - □ 1036 Lines
 - 667 Conventional Units :
 - 183 fast units and 484 slow units
 - □ 10 selected scenarios for renewable generation
 - Renewable Generation: 1439 units
 - Wind
 - Solar
 - Hydro

Central European Test System



Central European Test System

	AT	BE	СН	DE	FR	LX	NL
Buses	36	24	47	228	317	3	24
Lines	42	23	76	312	518	2	26
Fast Units	11	25	4	94	22	0	19
Slow Units	25	45	5	254	108	1	46
Peak Load (MW)	8044.9	1.3e4	7328	65018	69043	839	13959
Max. Gen. Cap. (MW)	7656.8	1.7e4	4335.1	1.1e5	9.0e4	375	24690

Central European Test System

Central European System

Renewable Generation Scenarios



- Stochastic unit commitment with topology control recourse
 - □ With 10 scenarios, there are over 1 million continuous decision variables and over 300,000 binary decision variables.
 - The problem cannot be solved within reasonable run time just using branching and cut even without topology control.
 - For single scenario deterministic unit commitment problem when the switching decision is relaxed as a continuous variable, the cost saving for the entire system is within 5%.
 - A good warm start solution is required for tuning Progressive Hedging.

Proposed Method

- Decompose the system into 5 control areas.
- Power exchanges between areas are obtained through solving a optimal dispatching problem for the whole system.
- □Each control area solve its own SUC/TCSUC.





Proposed Method



Proposed Method



□ Solve stochastic unit commitment for each control area.

Each control area submit commitment decisions to the second step.

- The solution to the first step can serve as warm starts for the third step.
- Total amount of power exchange with other control areas are penalized.

Proposed Method



Solve stochastic economic dispatch for the entire system to get the power exchange between control areas.

Commitment of generators are fixed.

 Power exchange between control areas are sent to each area in step 3.

Proposed Method



□ Solve SUC/TCSUC for each control area.

- The power exchange between control areas is given by the previous step.
- □ If we combine the solution of each control area, we get a feasible solution to SUC/TCSUC of the entire system.

TCSUC vs. SUC: Cost Savings

	SUC (MEUR)	TCSUC (MEUR)	Cost Saving (MEUR)
AT	7.0057	6.8244	0.1813
BE+LX	6.2083	6.2083	0.00
DE	14.2089	14.0540	0.1549
FR+CH	17.3961	16.0753	1.3478
NL	10.5475	10.3793	0.1682
Total	55.3665	53.5141	1.8521

**To solve TCSUC within reasonable time, switching decision for DE+LX and FR+CH are restricted on a preselected set.

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TCSUC vs. SUC: Result Analysis Zone FR+CH

Cost Comparison of Slow Units

1.001 0.995 0.963 0.935 0.926 0.926 Start-Up No-Load Expected Expected Expected Average Cost of Cost of Fuel Cost Generation Cost of Fuel Cost Slow Units Slow Units of Slow of Slow Slow Units of Slow Units Units Units

■ SUC ■ TCSUC

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TCSUC vs. SUC: Result Analysis Zone FR+CH

Cost Comparison of Fast Units

SUC TCSUC



Thermal Limits



Sag:





Line Rating Standards

IEEE Std 738 -2012CIGRE Technical Brochure 601, 2014



Heat Balance Equation(HBE)

$$q_c + q_r + mC_p \frac{dT}{dt} = q_s + I^2 R(T)$$

- Ambient conditions:
 - Temperature
 - Wind speed and direction
 - Solar radiation

Static Line Rating Adjustment

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Line Ratings in Practical Power System Operations

PJM Manual 03: Transmission Operations

Three sets of thermal limits:

normal limit

emergency limit

Ioad dump limit

Eight ambient temperatures are used with a set for the night period and a set for the day period; thus, 16 sets of three ratings are provided for each monitored facility.

All Transmission Owners' and the PJM RTO's security analysis programs must be able to handle all 16 sets and allow operating personnel to select the appropriate rating set to be used for system operation.

ISO New England Equipment Rating, Characteristic, and Operational Data Implementation Form Transmission Line (NX-9A)

Reference	555		Participant ID 123	345	
Participant	Test Company		ISO ID 123	345-3	
Form State	Submitted		Ckt 1		
Conductor Type	795 MCM 36/1 ACSR and	1113 ACSS 45/7 Blue Jay	ISO EM	SID 12345-3	
Terminal A	Station 1 115kV		Bu	us# 987654	EMS STATION1
Terminal B	Station2115kV		Bu	us# 654321	EMS STATION2
Cable Type	Overhead N	ominal System Voltage (kV)	15	Conductor Length	(mi.) 12.26
Default Summer 10	0 F Wind 3 ft/s				
MVA	Limiting Device / Descri	iption		Location	
Normal 208	Bus - Wire Bus			Station1	
LTE 244	Breaker-123CB			Station2	
STE 261	Conductor - 1113 ACSS			Line	
DAL 328	Conductor - 1113 ACSS			Line	
Default Winter 50	F Wind 3 ft/s				
MVA	Limiting Device / Descri	iption		Location	
Normal 200	Bus – Wire Bus			Station1	
LTE 200	Breaker - 123 CB			Station2	
STE 200	Conductor - 1113 ACSS			Line	
DAL 200	Conductor - 1113 ACSS			Line	
	Imped	dance Data (%) (100 MVA Ba	se)		
	R 0.8507	X 5.4413	B 0.758	1	
Revision Comments Reconductored section of the line with 1113 ACSS 45/7 Blue Jay from Structure X to Structure Y					
Equipment Notes	Open field available for Par	ticipant to supply pertinent infor	mation about the eq	quipment or the mann	er in which it is operated.
Data Revision Number	2 Date	Created 03/03/2014	PreparedBy F	Participant Usemame	•
Requested Effective Date	04/30/2014 Date R	Received 03/03/2014	Approved By		
Actual Effective Date	04/01/2014	ISO EMS Imple	mentation Date		

ssion

nple),

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Static Line Ratings

□Steady State HBE

$$q_c + q_r + \qquad \mathbf{0} \qquad = q_s + I^2 R(T)$$

CIGRE Technical Brochure 299 : Select Parameters

Sensitivity of the ampacity w.r.t. different

meteorological conditions*:



^{*} M. Bucher, On Operational Flexibility in Transmission Constrained Electric Power Systems, ETH ,2016

Dynamic Line Ratings

Dynamic line ratings adapts the **prevalent weather conditions**, **realtime conductor temperatures** and **actual loading** of transmission lines.

- Dynamic Line Rating in Practical Power System Operations
 - United States: Oncor, ERCOT's security constrained economic dispatch model.
 - Europe: Currently only used for information, alarms to dispatchers and others.

Dynamic Line Ratings

Dynamic Line Rating in Research

- Davis, 1977: First proposed dynamic line ratings(DLR)
- Foss, 1990: impacts of DLR on system security
- Michiorri, 2015; Fan, 2016: Probabilistic forecast of DLR
- Nick,2016: HBE in unit commitment; select representative scenarios of weather conditions
- Tschampion, 2016: DLR in N-1 secure dispatch optimization
- Cheung, 2016: DLR in security constrained economic dispatch

Motivation

Lack of measurement/forecast of meteorological conditions in day-ahead operations.

HBE:thermal inertia of

$$q_c + q_r + mC_p \frac{dT}{dt} = q_s + I^2 R(T)$$



Formulation



time

Line Status Variables:

- $s_{ij,t,sc}^{0}$: 1 if line *ij* is switched off in scenario *sc* at time *t*
- $s_{ij,t,sc}^{1}$: 1 if line *ij* adopts normal rating in scenario *sc* at time *t*
- $s_{ij,t,sc}^{2}$: 1 if line *ij* adopts high rating in scenario *sc* at time *t*

$$s_{ij,t,sc}^{0} + s_{ij,t,sc}^{1} + s_{ij,t,sc}^{2} = 1$$
, $\forall ij,t,sc$

Flexible Line Rating Formulation

1) line flow constraints:

$$-M(s_{ij,t,sc}^{1} + s_{ij,t,sc}^{2}) \le e_{ij,t,sc} - B_{ij}(\theta_{i,t,sc} - \theta_{j,t,sc}) \le M(s_{ij,t,sc}^{1} + s_{ij,t,sc}^{2})$$

2) line flow limit constraints:

$$-r_{ij}^{normal}s_{ij,t,sc}^{1} - r_{ij}^{high}s_{ij,t,sc}^{2} \le e_{ij,t,sc} \le r_{ij}^{normal}s_{ij,t,sc}^{1} + r_{ij}^{high}s_{ij,t,sc}^{2}$$

3) maximum time allowed to adopt high rating

$$\sum_{t=t_0}^{t_0+u_{ij}+1} s_{ij,t,sc}^2 \le u_{ij}$$

4) minimum time allowed to cool down:

$$\sum_{t=t_0}^{t_0+d_{ij}+1} (s^1_{ij,t,sc} + s^0_{ij,t,sc}) \ge d_{ij} (s^2_{ij,t_0,sc} - s^2_{ij,t_0-1,sc})$$

IEEE 118 System Test Results

60 With flexible line rating (including switching), the cost of stochastic unit Bus 89 - Bus 90 commitment can be reduced by 19%. 700 600 500 Bus 89 - Bus 91 400 MΝ 300 Static Line Rating -FLRSUC -FLRSUC 200 **System** 250 100 200 101112131415161718192021222324 150 MΜ 100 J Bus 91 - Bus 90 50 **Bus 92** 700 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 600 Bus 89 500 400 NV 300 Bus 92 - Bus 89 200 100 Static Line Rating 🛶 FLRSUC 🔫 SUC 250 12 13 14 15 16 17 18 19 20 21 22 23 24 230 210 190 Bus 92 - Bus 91 MΜ 170 Static Line Rating -FLRSUC -FLRSUC 150 **Bus 90** 250 130 **Bus 91** 110 200 90 150 1 2 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 MM 100 Large Load 5 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24

IEEE 118 System Test Results

Results Analysis

Cost Comparison of Slow Units

1.000 0.976 0.962 0.939 0.938 0.915 Start-Up Expected Expected No-Load Expected Average Generation Cost of Fuel Cost Cost of Cost of Fuel Cost Slow Units Slow Units of Slow of Slow Slow Units of Slow Units Units Units

SUC FLRSUC

IEEE 118 System Test Results

Results Analysis

Cost Comparison of Fast Units



SUC FLRSUC

Model Complexity

With 10 scenarios, there are around 1 million continuous decision variables and over 400,000 binary decision variables.

- For a single scenario sub-problem, there are over 70,000 binary decision variables
- In the zone of FR+CH, with 10 scenarios, there are around 170,000 binary decision variables and over 500,000 continuous variables. The solution time for this zone is within 8hr.

Model Complexity

□ FLR

With 10 scenarios, there are around 1 million continuous decision variables and over 900,000 binary decision variables.

- For a single scenario sub-problem, there are over 120,000 binary decision variables
- In the zone of FR+CH, with 10 scenarios, there are around 450,000 binary decision variables and over 500,000 continuous variables. The solution time for this zone is around 18 hr.

Computation Platform Information

- Platform description
 - Laptop: Intel i7 CPU (2.8GHz)+ 12 GB MemorySolver: CPLEX 12.5
 - Choosing Steepest-edge pricing as the algorithm for the pricing applied in the dual simplex algorithm for the linear relaxation problem at each node can significantly reduce the solution time caused by dual degeneracy.

FLRSUC vs. SUC: Cost Savings

	SUC (MEUR)	FLRSUC (MEUR)	Cost Saving (MEUR)
AT	7.0057	6.7980	0.2077
BE+LX	6.2083	6.1850	0.0233
DE	14.2089	13.9496	0.2593
FR+CH	17.3961	15.5977	1.7984
NL	10.5475	10.3642	0.1833
Total	55.3665	52.8945	2.472

FLRSUC vs. SUC: Result Analysis Zone FR+CH





FLRSUC vs. SUC: Result Analysis Zone FR+CH

Cost Comparison of Slow Units



SUC FLRSUC

FLRSUC vs. SUC: Result Analysis Zone FR+CH

Cost Comparison of Fast Units



SUC FLRSUC

Conclusion

Topology control and flexible line rating can both reduce the operating cost Flexible transmission network control can mitigate the variability of renewable generations so that cheaper slow generators can commit in the first stage.

Questions?

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FlexNet LIMAN A I III Autor 245V 1 phase 3 wire Kh 1 60Hz Kitchener-Wilmot Hydro Inc. KWH164707 @Sense KWH164707 @Sense Frags Trans Trans Trans Trans Trans Trans