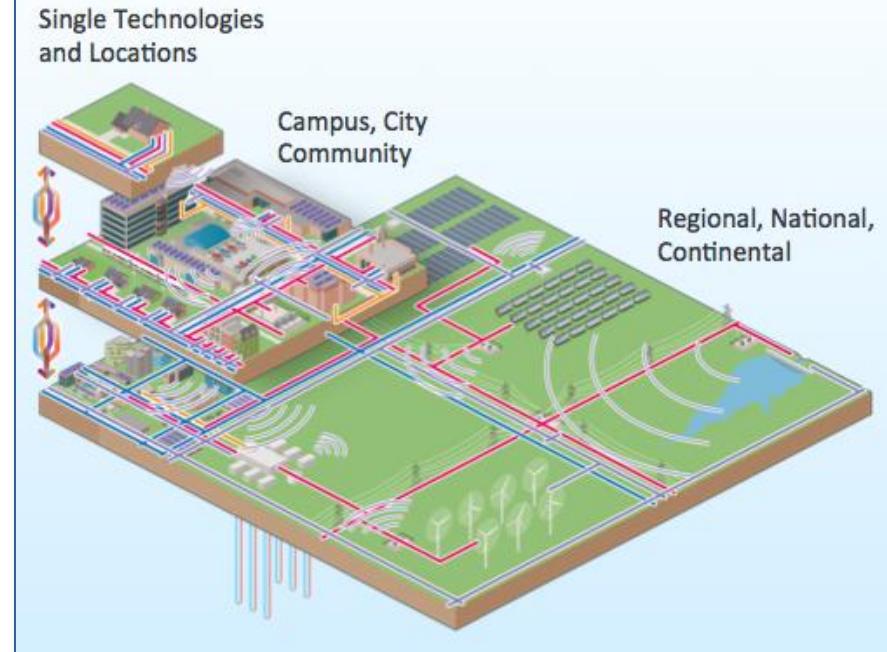


Integration of variable renewables into electricity grids

Mark O'Malley

mark.omalley@ucd.ie

ESI 101, 24th July 2014
NREL, CO, USA



Electricity



Data



Fuel



Thermal



International Institute™
for Energy Systems
Integration

Schedule

Mon 21/07/2014		
09:00 - 10:00	Introduction to ESI and Overview of ESI 101	Mark O'Malley
10:00 - 11:00	Benefits of ESI	Ben Kroposki
11:00 - 11:30	Coffee	
11:30 - 12:30	Forecasting of Load, Heat, Wind and Solar	Henrik Madsen
12:30-1:30	Lunch	
1:30-5:00	Project Work	
Tues 22/07/2014		
09:00 - 10:00	Energy Infrastructure Expansion Planning	Jim McCalley
10:00 - 11:00	Energy-Water Nexus	Pete Thomson
11:00 - 11:30	Coffee	
11:30 - 12:30	Gas – Electricity Nexus	Jim McCalley
12:30-1:30	Lunch	
1:30-2:30	Tour of ESIF	Ben Kroposki
2:30-5:00	Project Work	
Wed 23/07/2014		
09:00 - 11:00	Distributed Energy Systems, DER, CHP and Microgrids	Bob Lasseter
11:00 - 11:30	Coffee	
11:30 - 12:30	Energy – Transport Nexus	Jim McCalley
12:30-1:30	Lunch	
1:30 - 2:30	Regulatory Issues and Business Models In ESI	Jaqueline Cochran
2:30-5:00	Project Work	
5:00-10:00	Social Trip to Mount Evans	

Thurs 24/07/2014		
09:00 – 10:30	Greybox Modeling	Henrik Madsen
10:30 - 11:00	Introduction to Greybox Modeling Exercise	Niamh O'Connell
11:00 - 11:30	Coffee	
11:30 - 12:30	Introduction to Variable Renewables into Electricity Grids	Mark O'Malley
12:30-1:30	Lunch	
1:30-5:00	Grey Box Modeling Exercise	
Fri 25/07/2014		
09:00 – 10:00	Statistical Modeling for ESI	Chris Dent
10:00 - 11:00	Project Report Out	
11:00 - 11:30	Coffee	
10:00 - 11:00	Project Report Out	
12:30-1:30	Lunch	
1:30 - 2:30	Project Report Out	
2:30 – 2:45	Wrap Up	Mark O'Malley



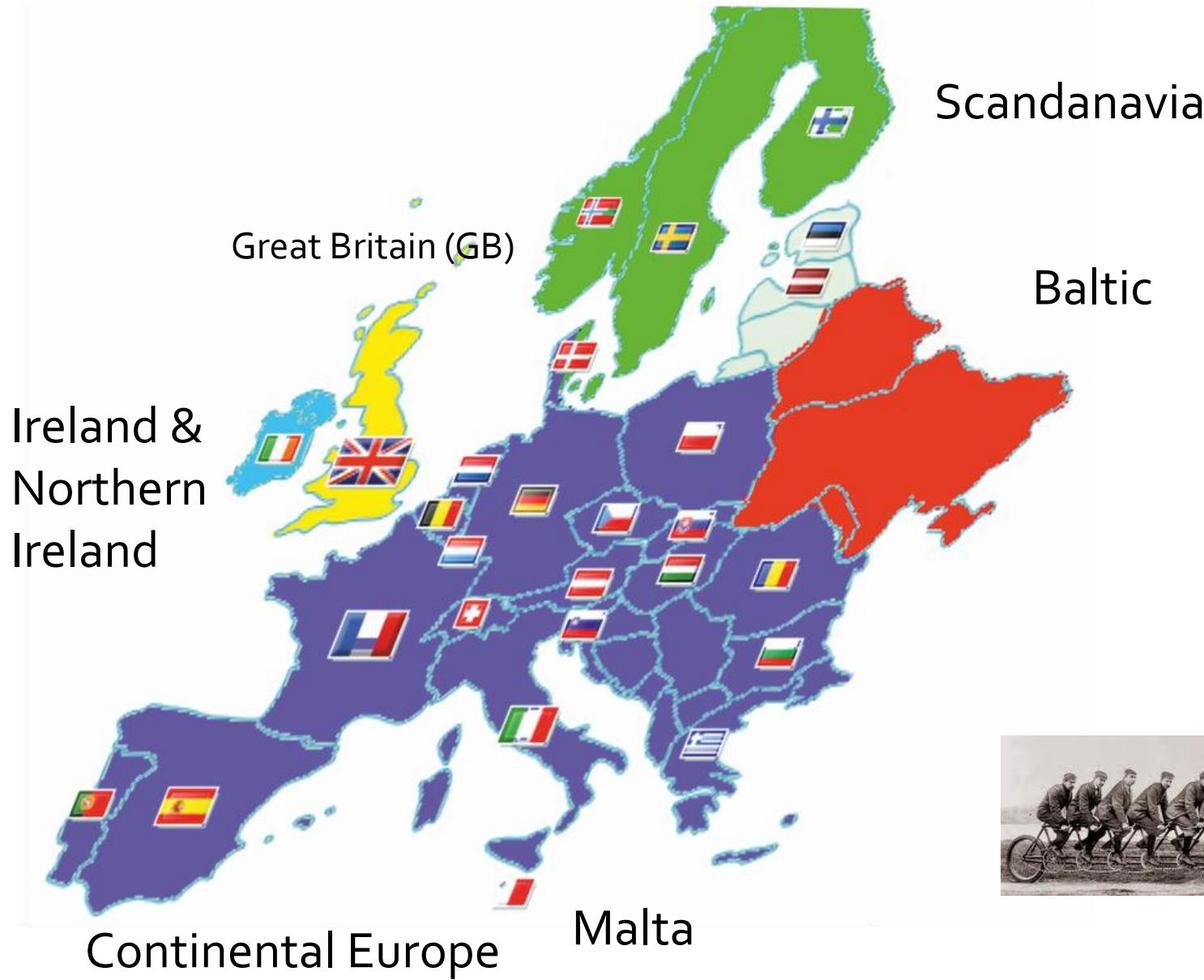
Agenda

- Ireland
- Supply demand balance & flexibility
- Variable renewable resource characteristics
- Transmission
- Thermal plant flexibility
- Renewable energy generators & stability
- Storage
- Demand response
- New technologies

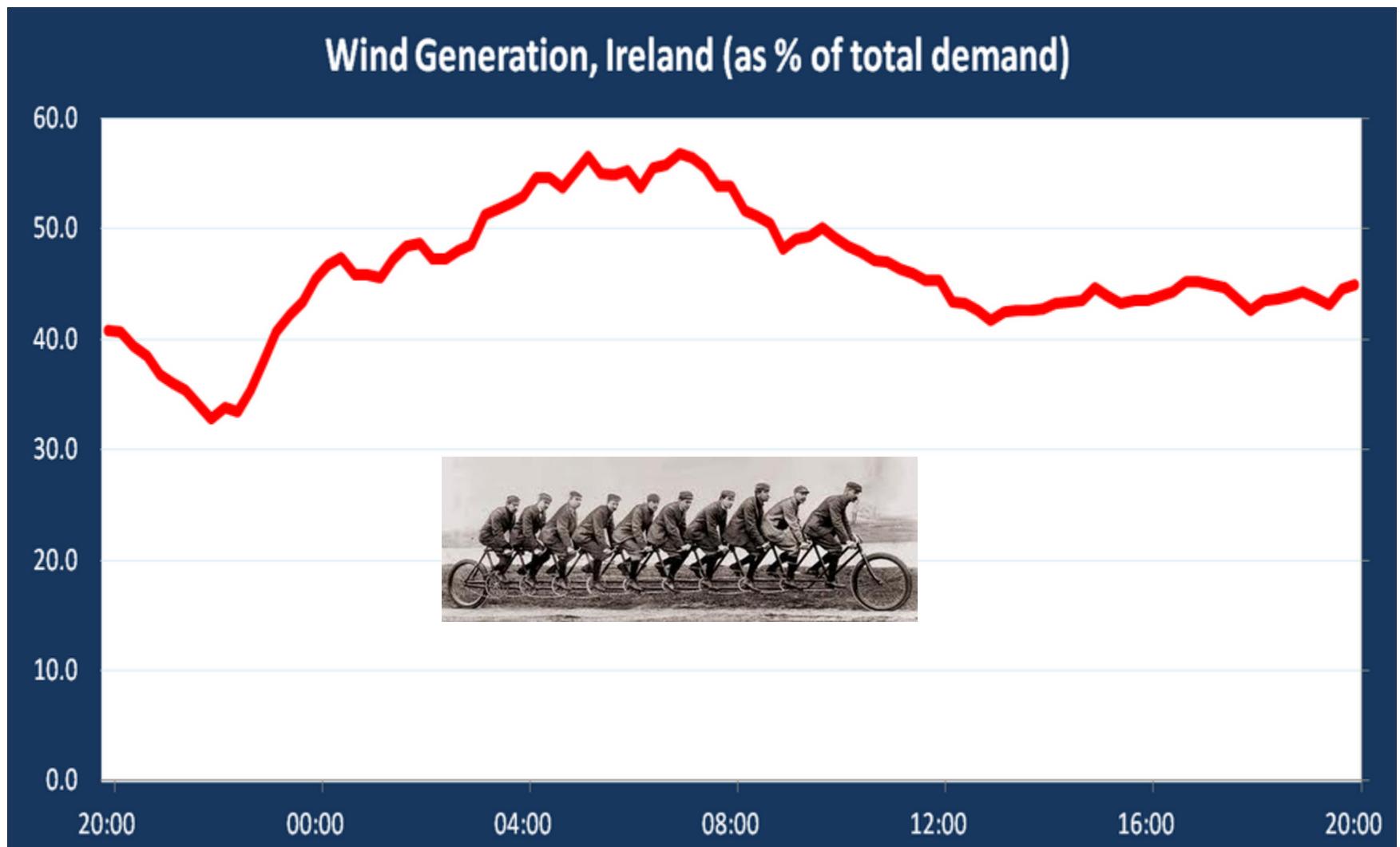


Ireland

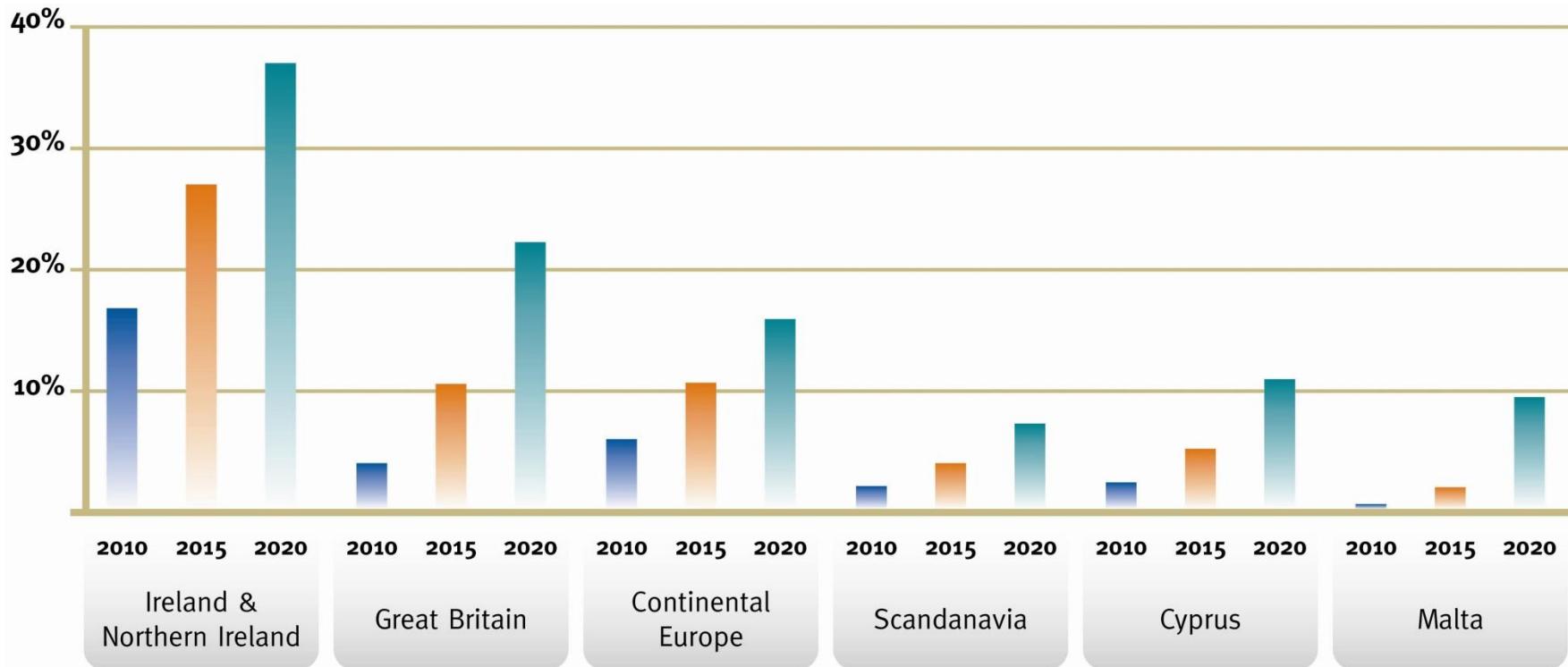
Les réseaux synchrones en Europe



13/14 Avril 2013 – Record du monde pour un réseau électrique synchrone?



Targets for non-synchronous sources in European Systems

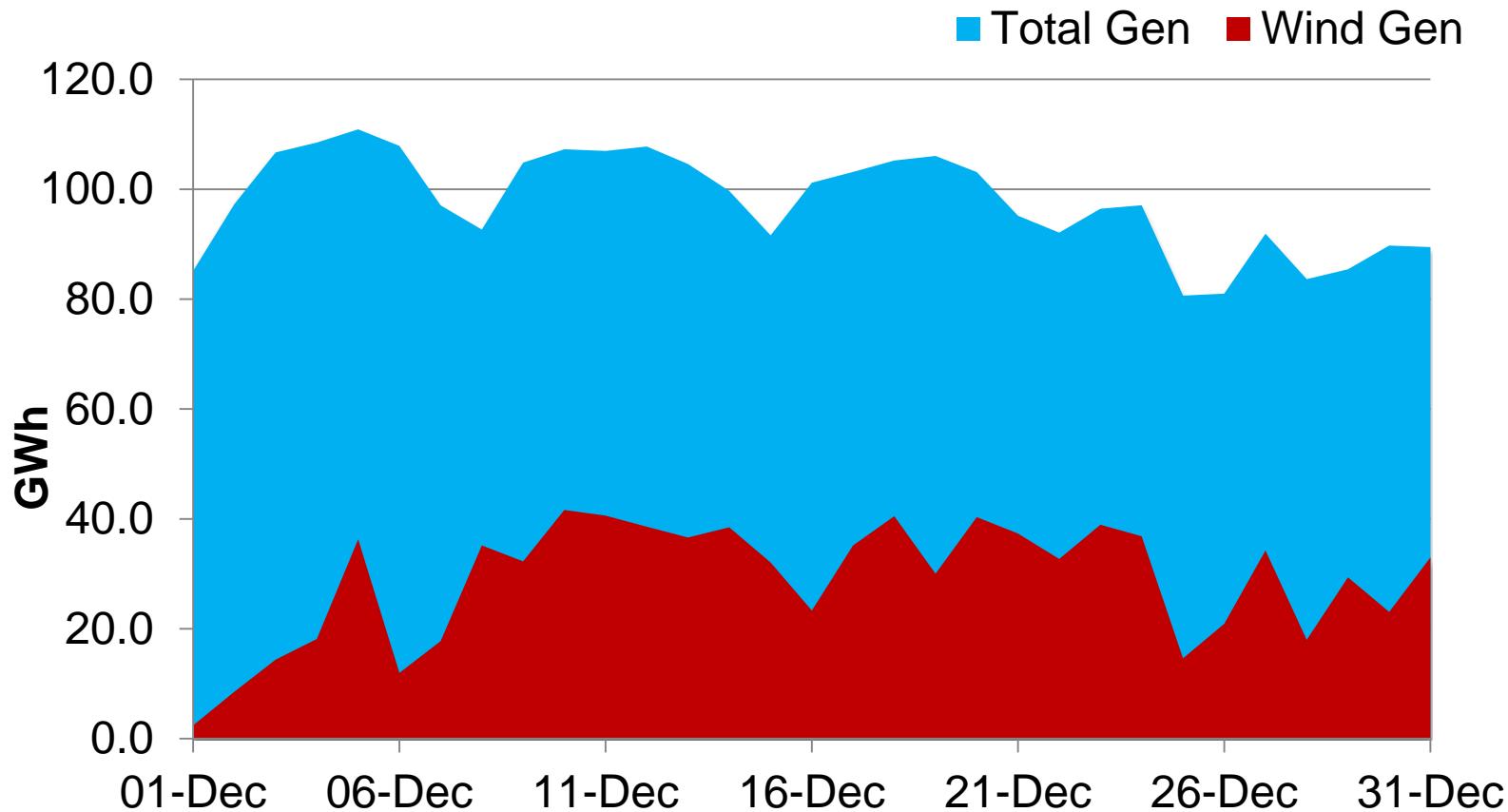


<http://www.eirgrid.com/operations/ds3/>

* Based on analysis of National Renewable Action Plans (NREAPs) as submitted by Member States

What is possible

December 2013: Wind and Total GWh per day

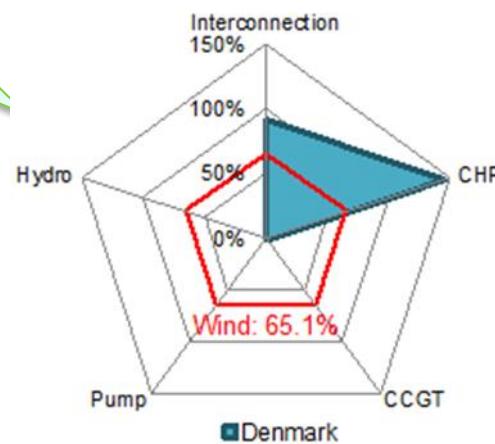


Top wind integration performance (2011)

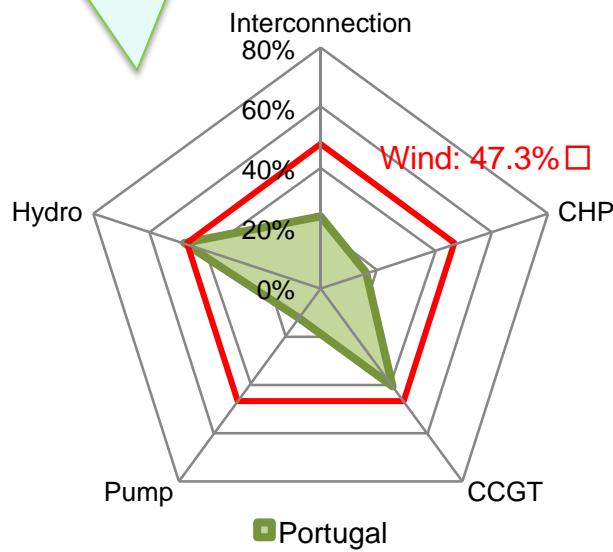
	% Electricity from wind (IEA, 2011)	% Wind Energy Curtailed	Balancing	Notes
	28.0	< 1 %		<i>Interconnection, flexible generation (including CHP) & good markets</i>
	18.0	Low	<i>Interconnection to Spain, gas, hydro & good market</i>	<i>Iberian peninsula: Spain & Portugal all well connected to one another but operate a single market MIEBEL</i>
	16.4	<i>< 1 % (but increasing due to excess hydro and low demand)</i>	<i>Gas, hydro & good market</i>	
	15.6	2.3 % in 2011	<i>Gas 50 %, good markets, etc.</i>	<i>Curtailment reduced in 2012 to 2.1 % and 2.0 % in 2013</i>
<i>EirGrid and SONI, 2012; "2011 Curtailment Report"</i>				

Flexibility chart

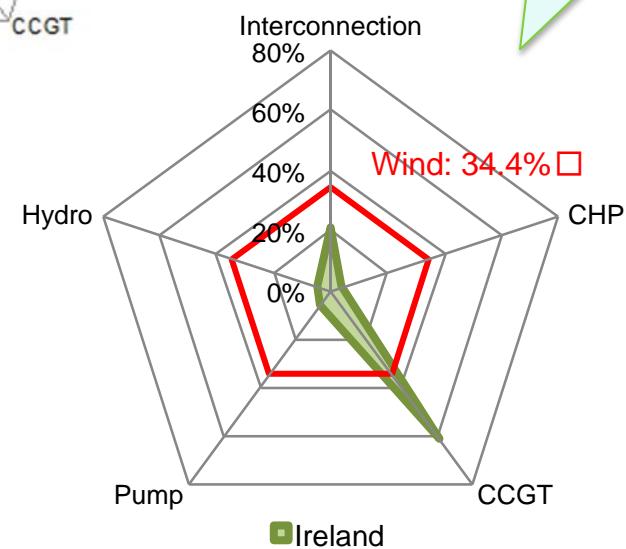
Denmark(Interconnection-oriented)



Portugal (Hydro-oriented)



Ireland (CCGT-oriented)



Examples of changing regulatory expectations: Integrating Variable Renewable Energy

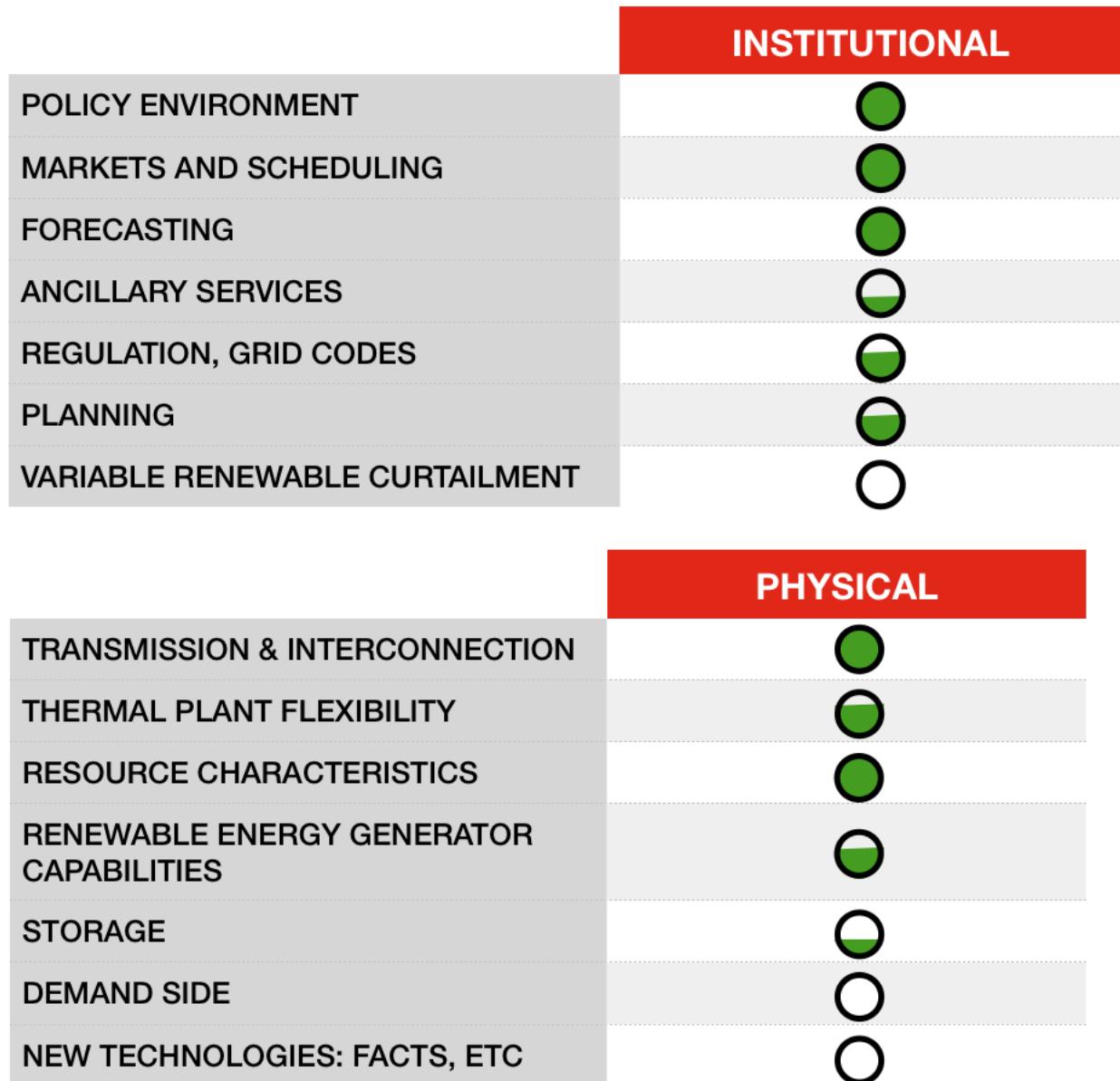
- Power system operation must carefully consider two sources of flexibility:
 - Physical power system: generators, transmission, storage, interconnection...
 - Institutional system: including dispatch decisions closer to real time, better use of forecasting, better collaboration with neighbors
- *Smart grids require smart frameworks and markets*



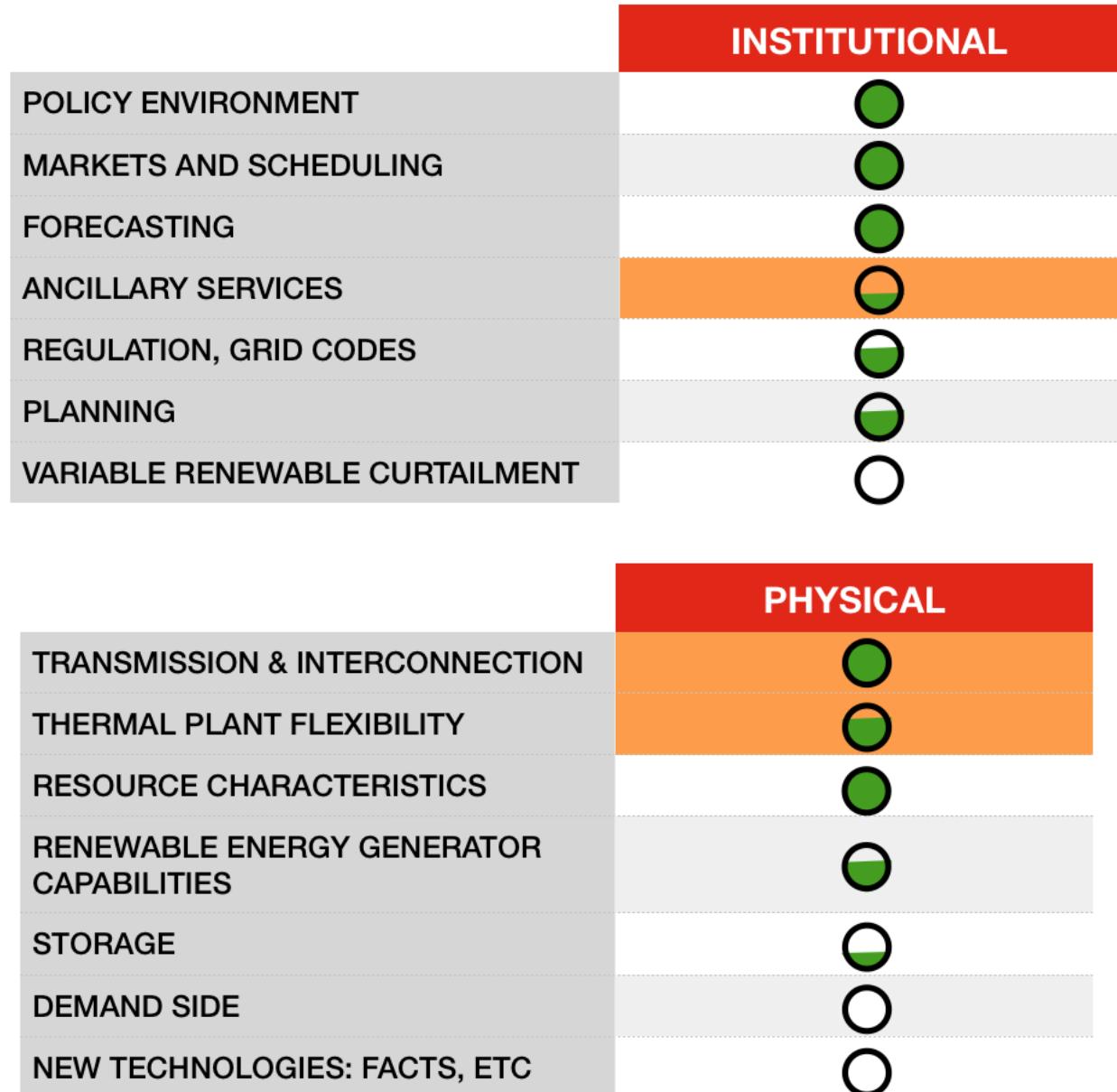
The ingredients of success – today 20 % wind



- Supportive
- Supportive but challenging
- Some
- Negligible



Work remaining for 40 %



Key Take Away

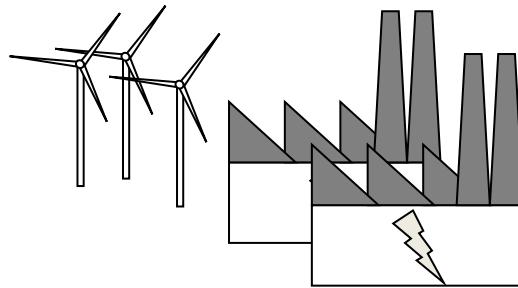
- High penetrations of variable renewables is happening now in many regions/countries
- They have got many of the key ingredients right
 - Strong coordinated institutional support
 - Good basic engineering on physical side
- Much of this can translate but every system has unique physical characteristics.



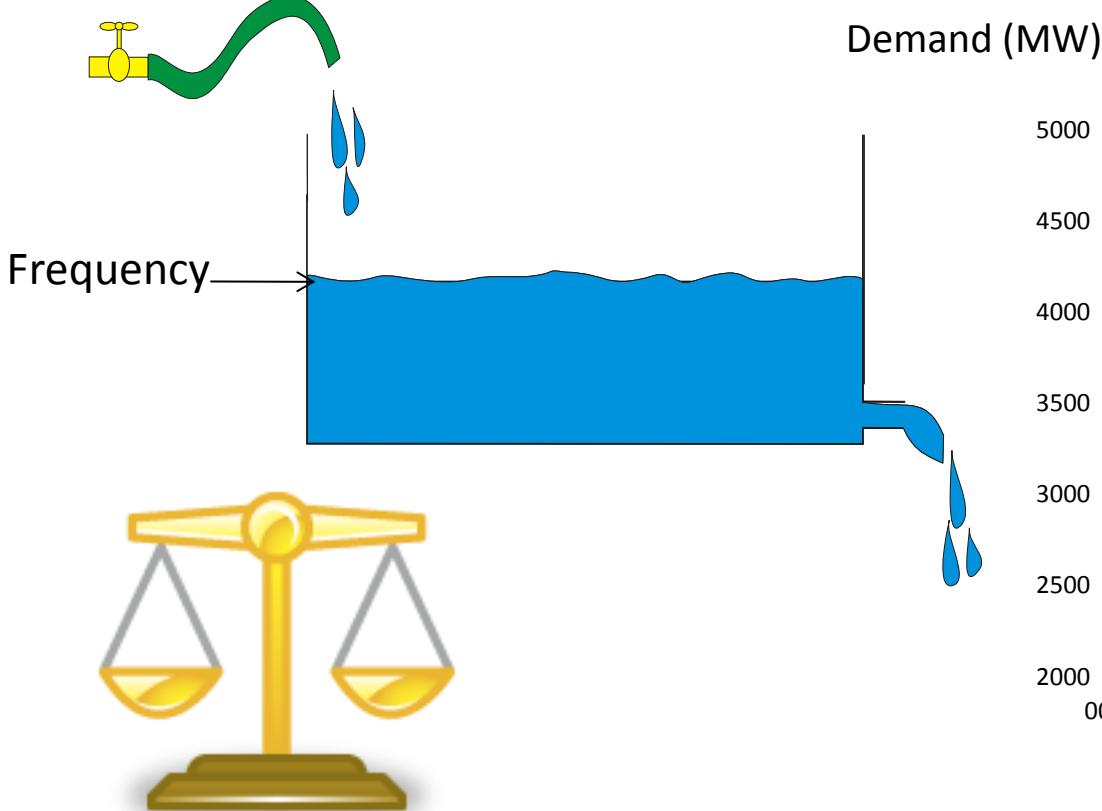


Supply demand balance & flexibility

Supply demand balance & frequency control

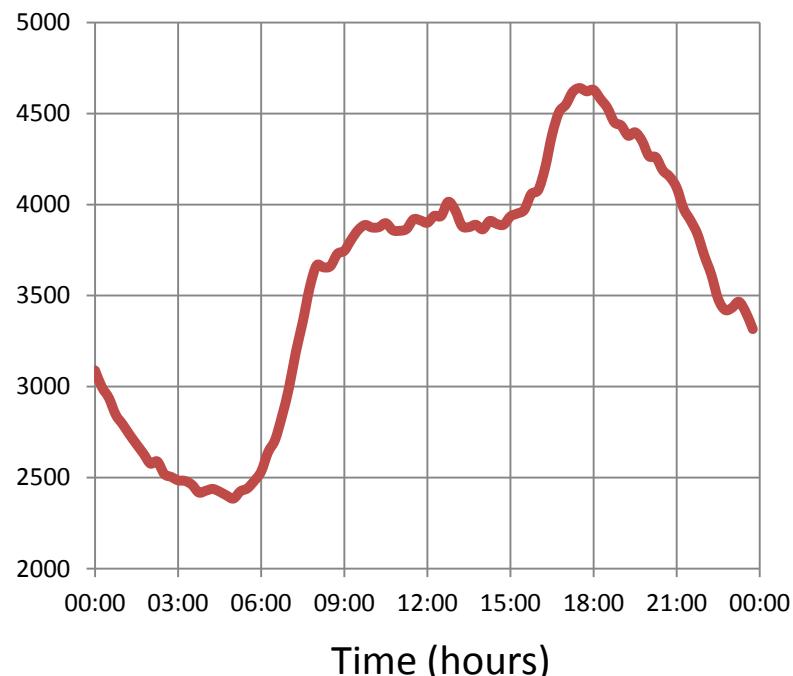


Supply

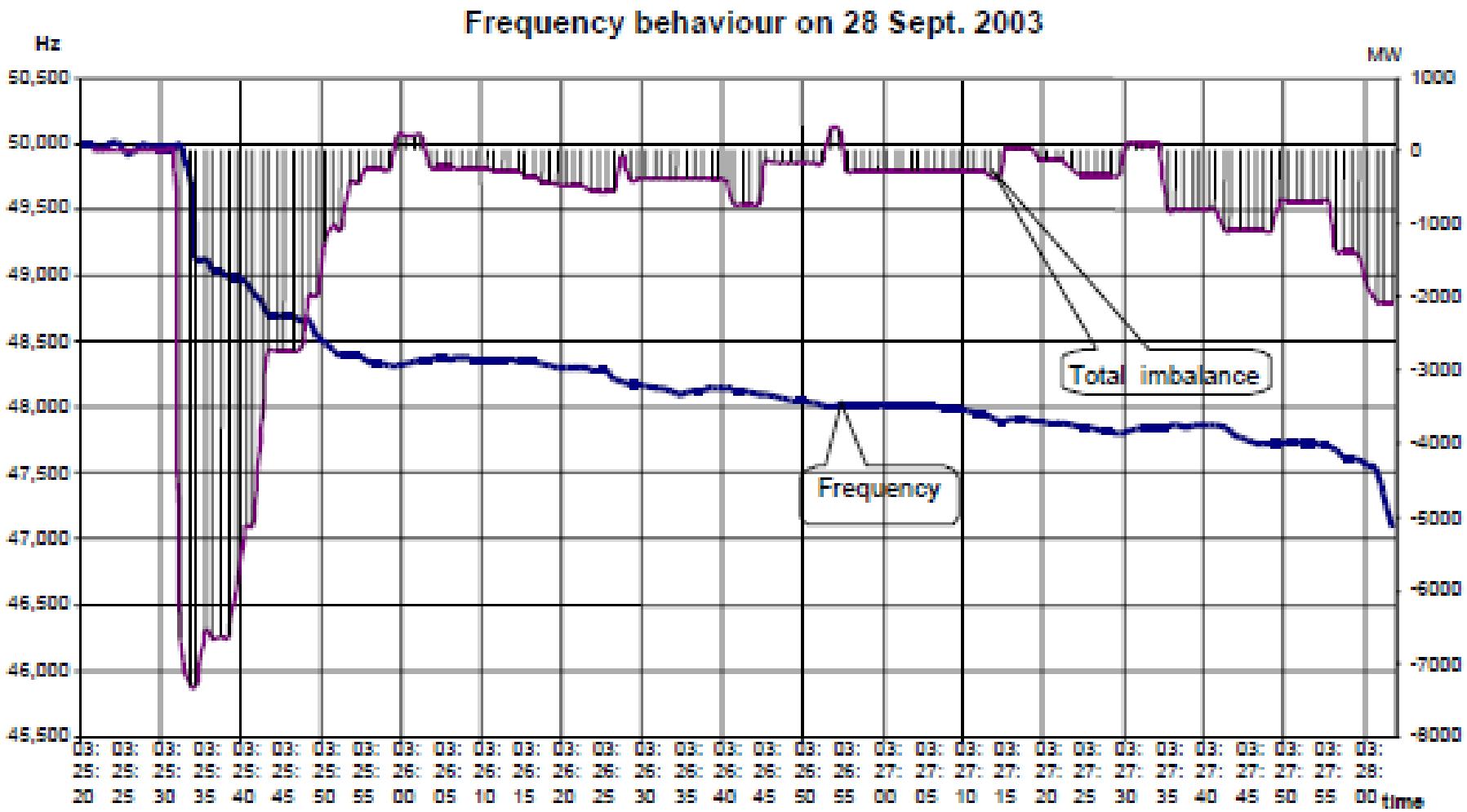


If generation and demand are matched water level (system frequency) will remain constant

Mismatches will result in a change in water level (system frequency)

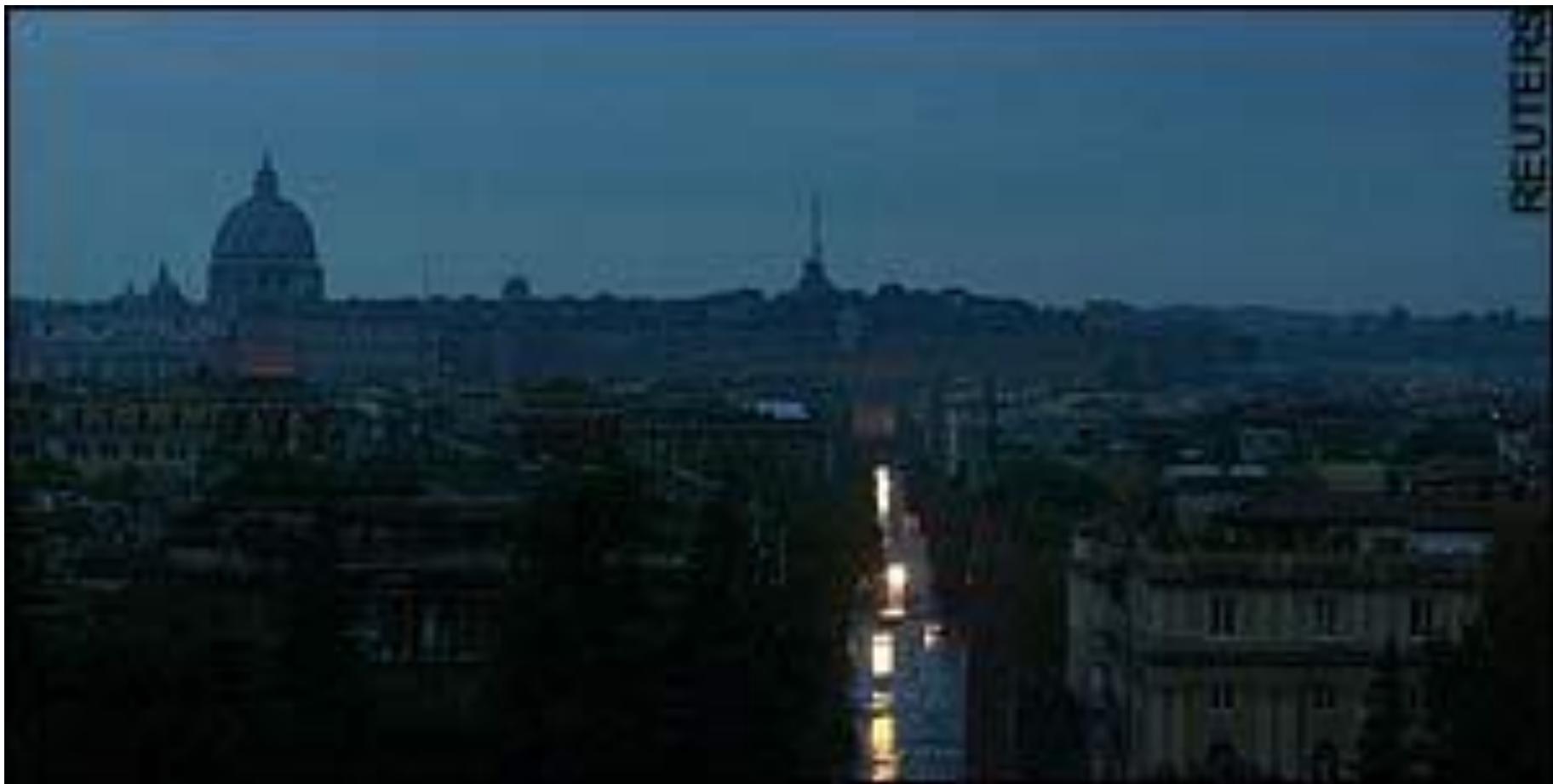


Italian blackout Sept 28th 2003

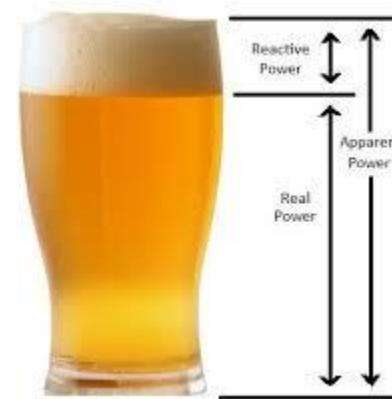
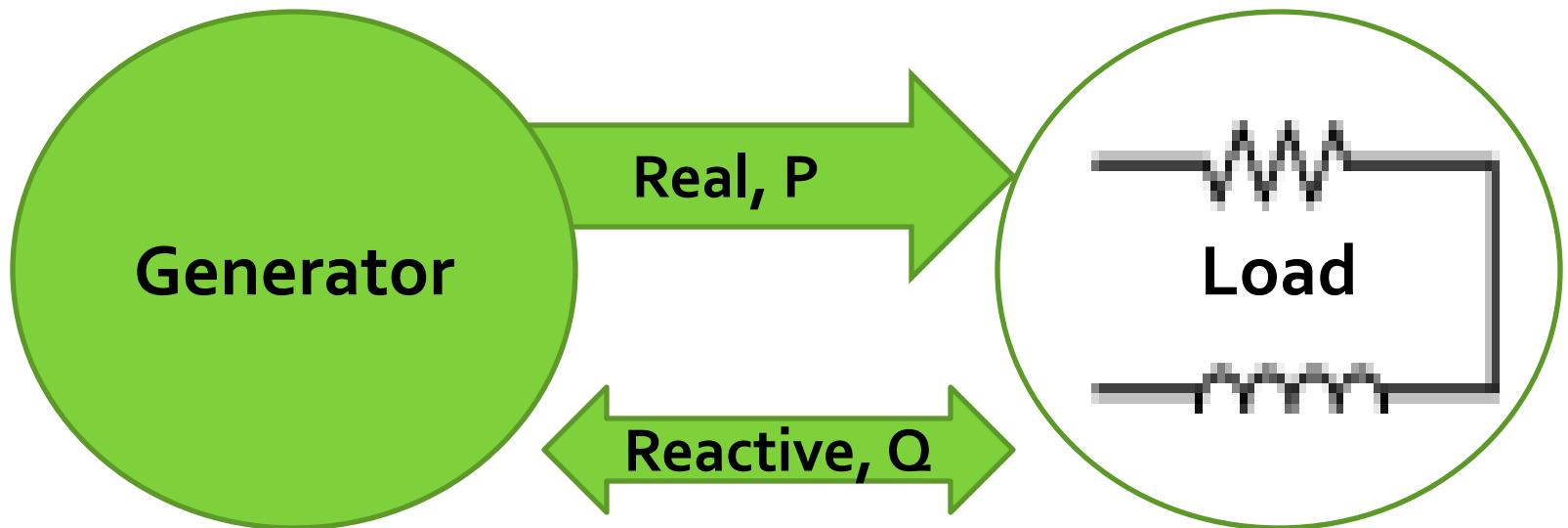


The Vatican Sept 28th 2003

19

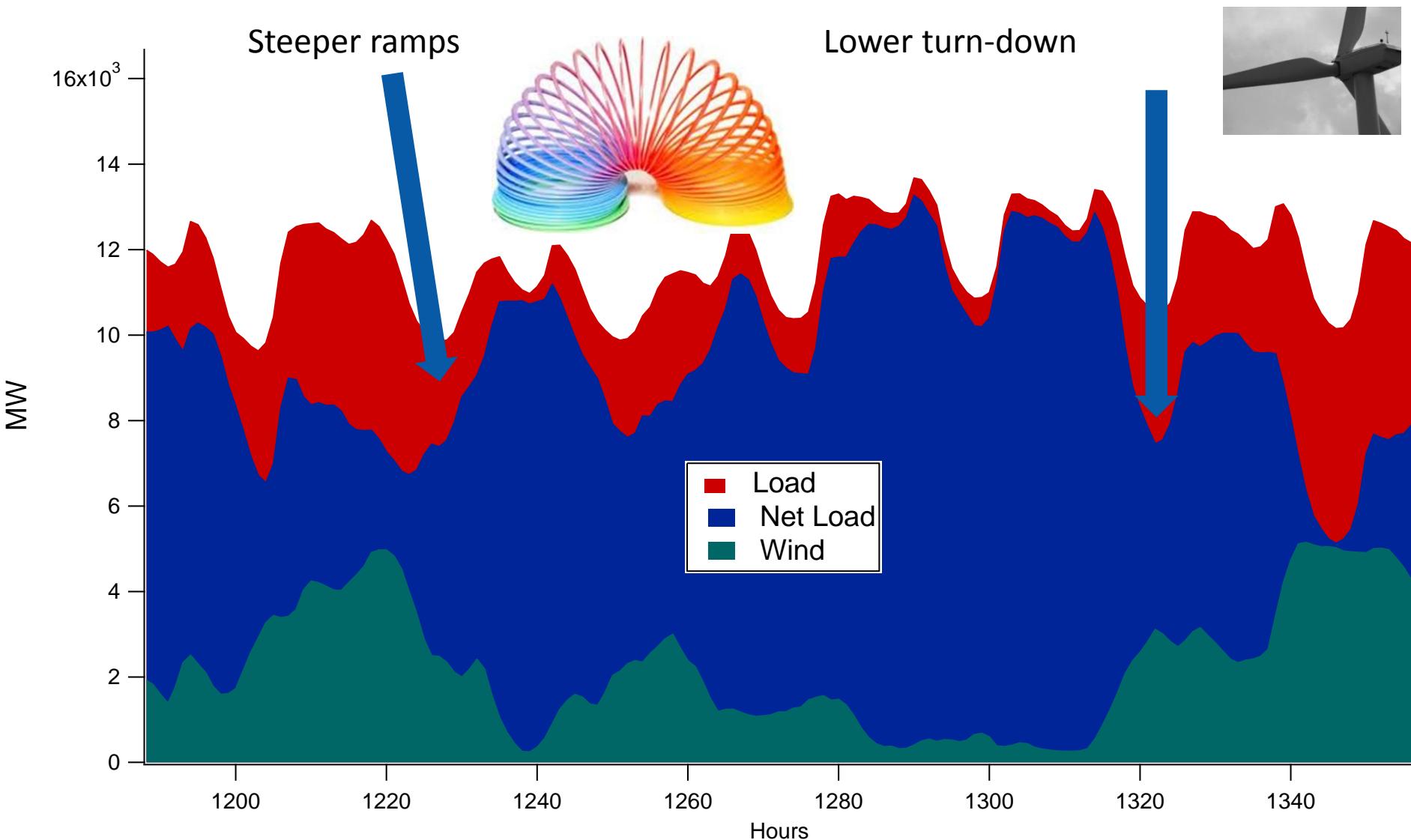


Supply demand balance & Voltage Control

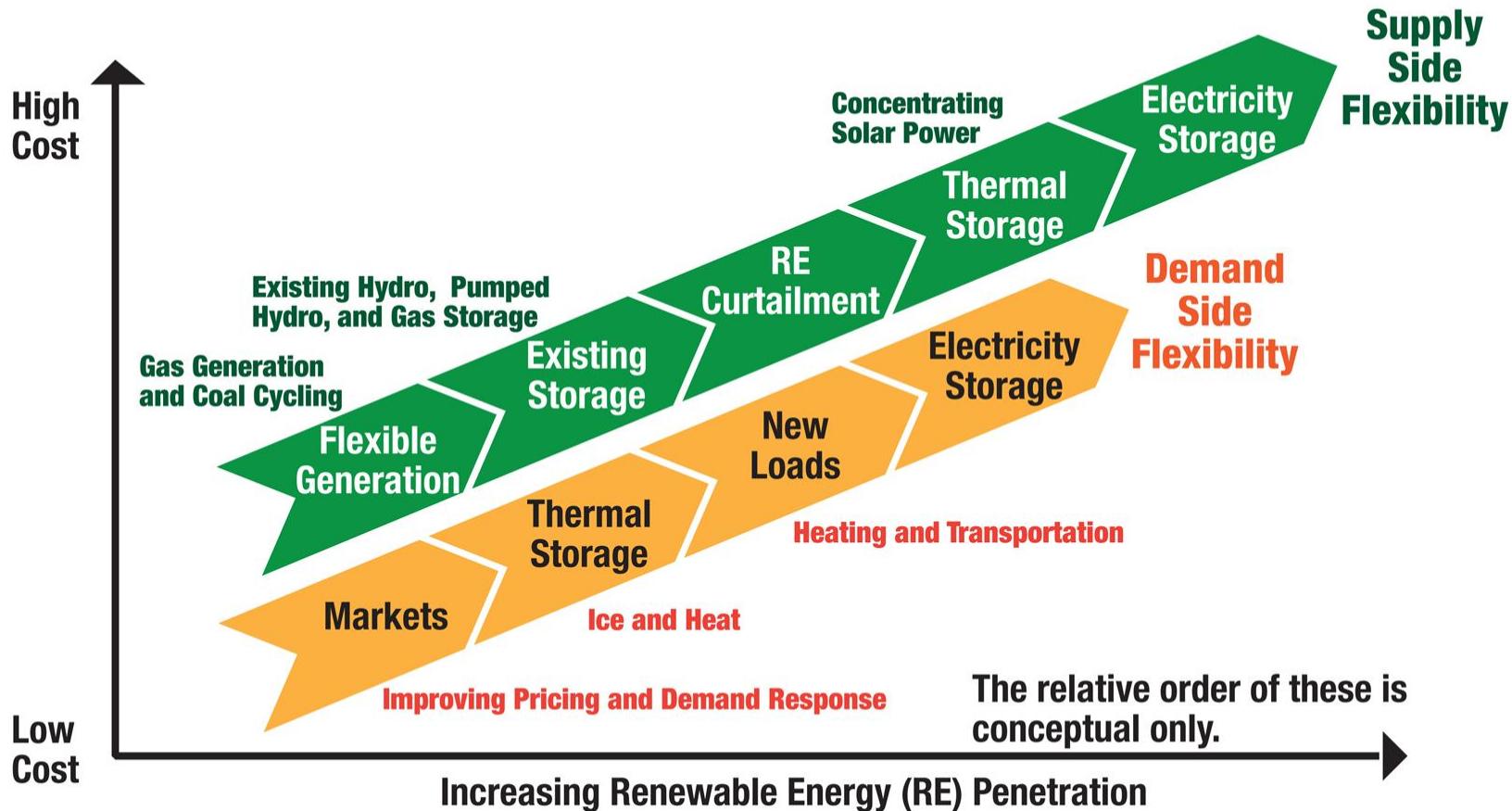


With Variable Renewables More Flexibility is Needed

21



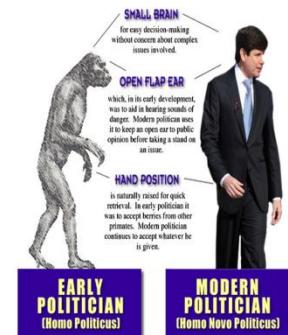
System Flexibility Supply Curve



How do we choose the optimum mix of flexibility resources?

Key Take Away

- It is about **reliability** and **cost**
- Reliability is supply demand balance of real (frequency control) and reactive (voltage control) power.
- Pick the cheapest cost solutions from the set of possible solutions, but cost is difficult to define.

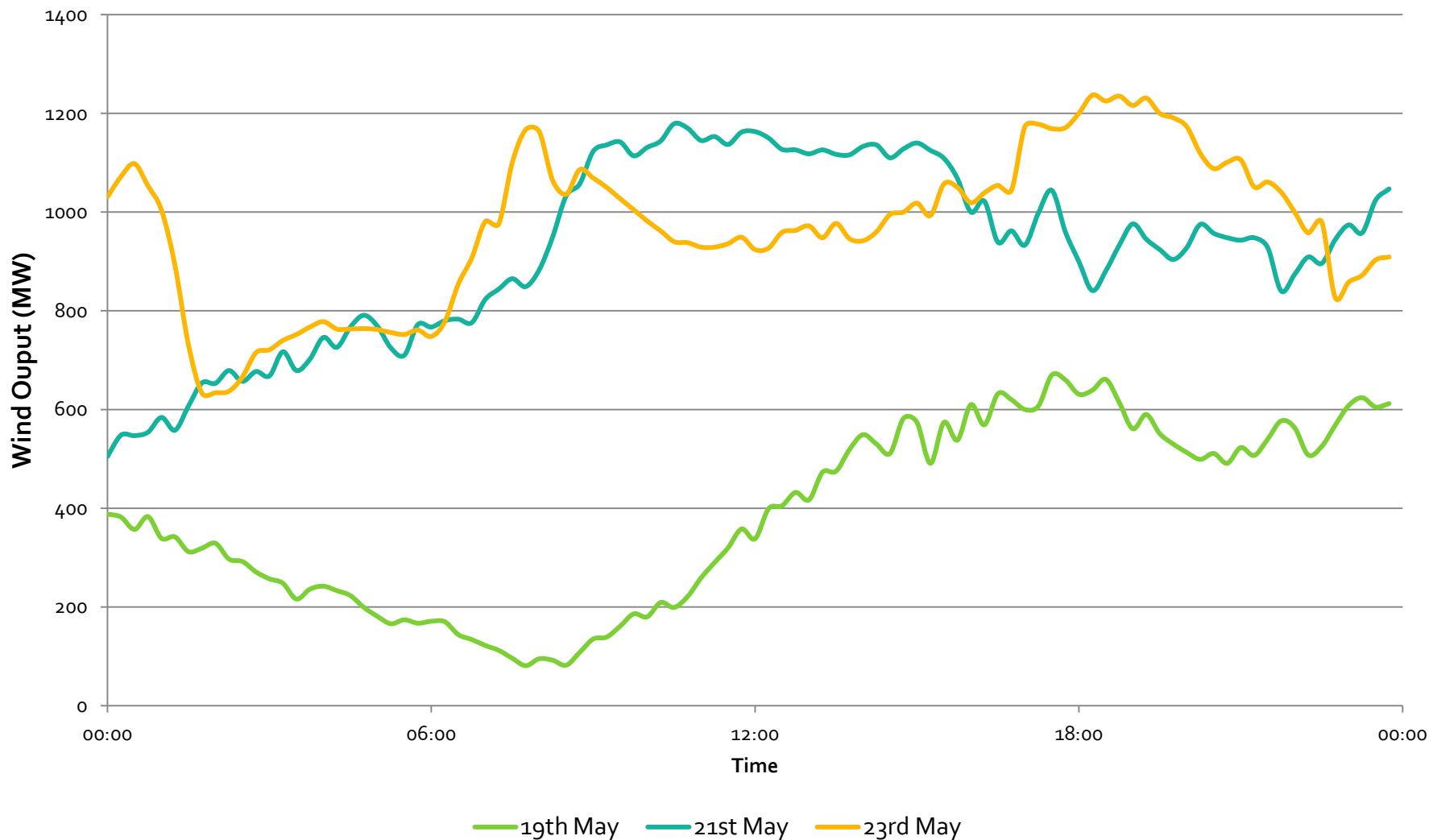




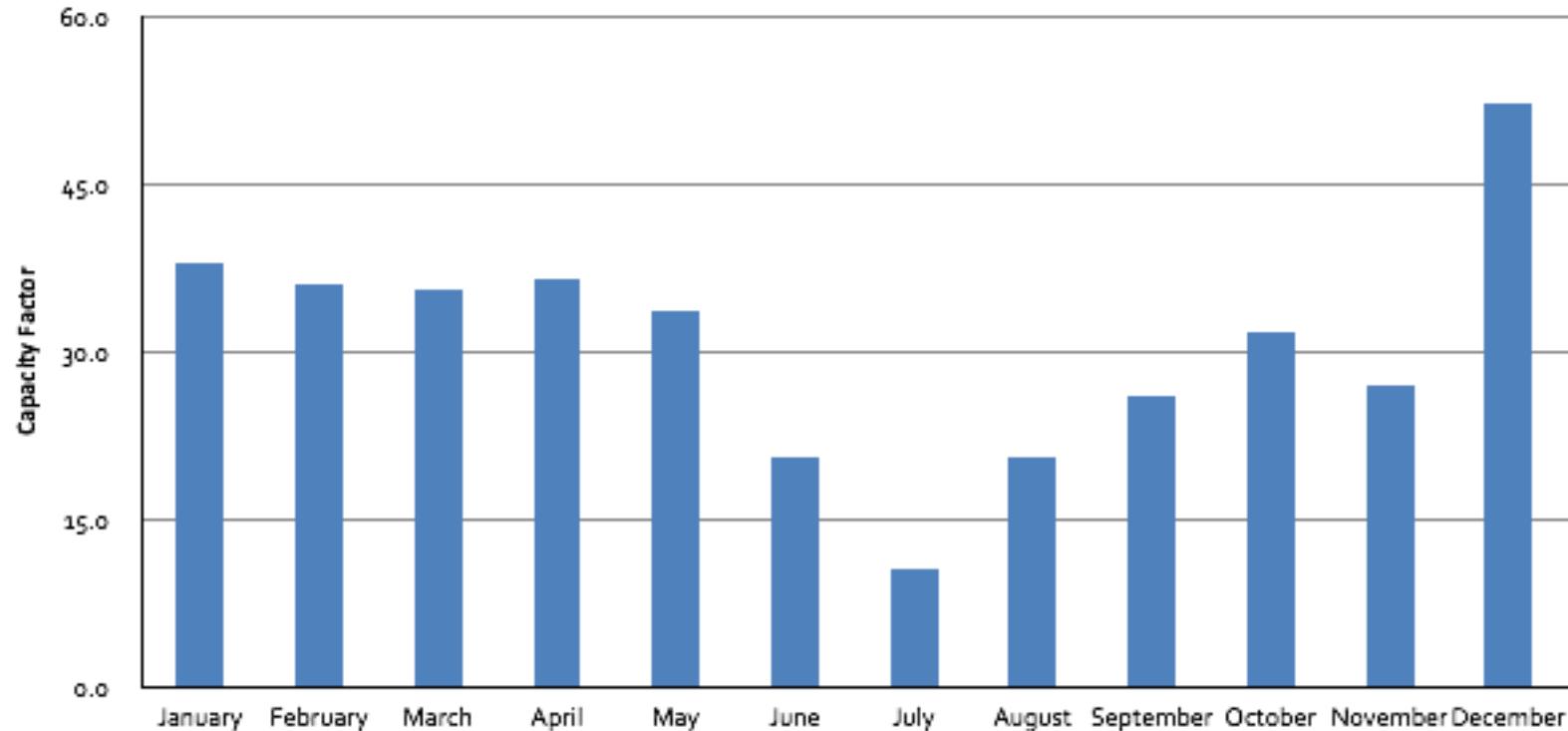
Variable renewable resource characteristics

Wind Generation Hourly Variability

May 2011 Wind Output



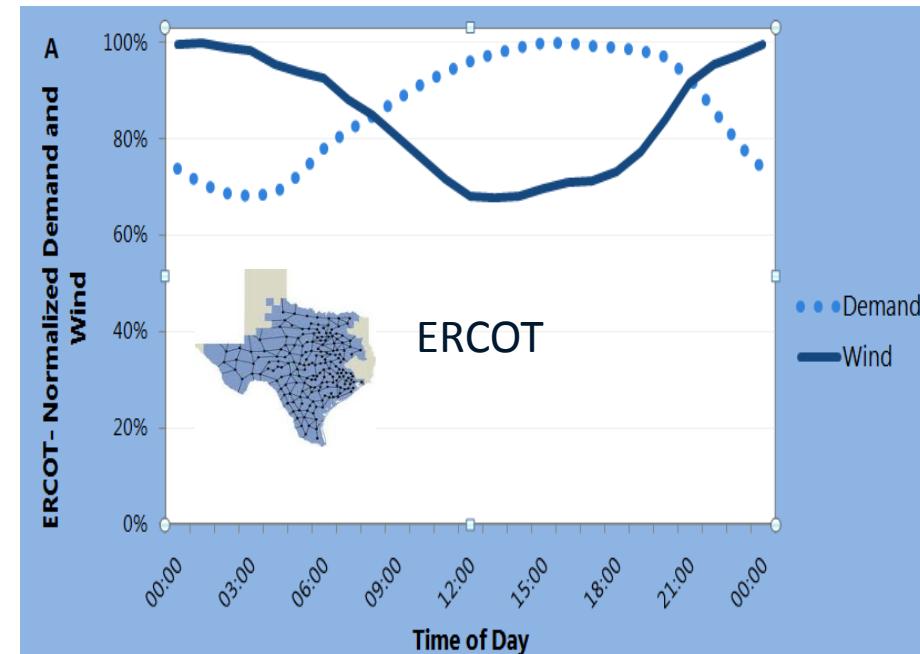
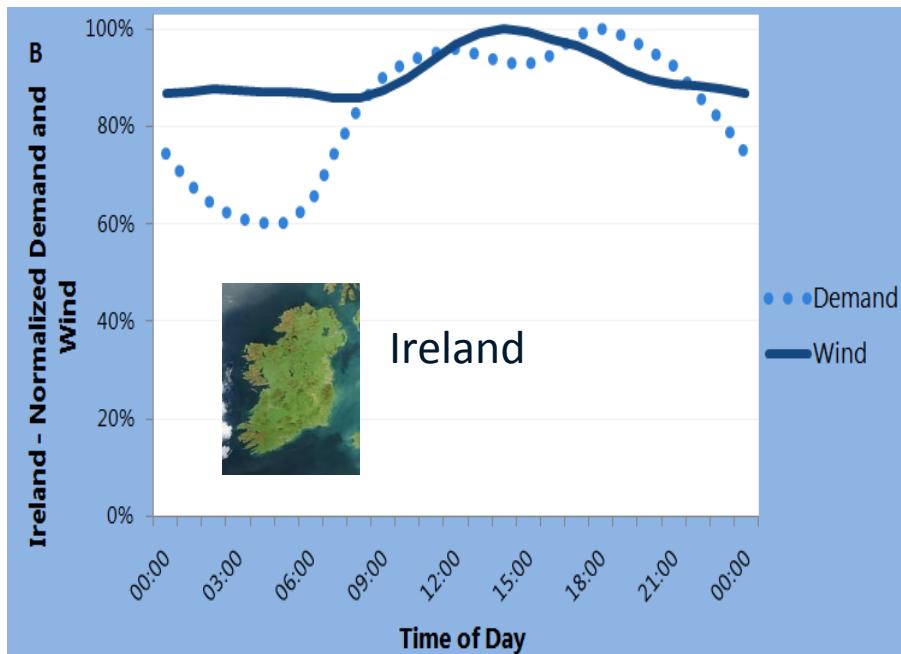
All Island Wind Capacity Factor 2013



Renewable energy and load (demand) characteristics



Dance partners



AEMO, Australian Energy Market Operator, "Wind Integration In Electricity Grids: International Practice And Experience" Work Package 1, 2011.

<http://www.aemo.com.au/~/media/Files/Other/planning/0400-0049%20pdf.pdf>

Key Take Away

- Variable at all time scales
- In general supply demand balance with variable renewables more problematic.
- The resource characteristics sometimes beneficial sometimes not.





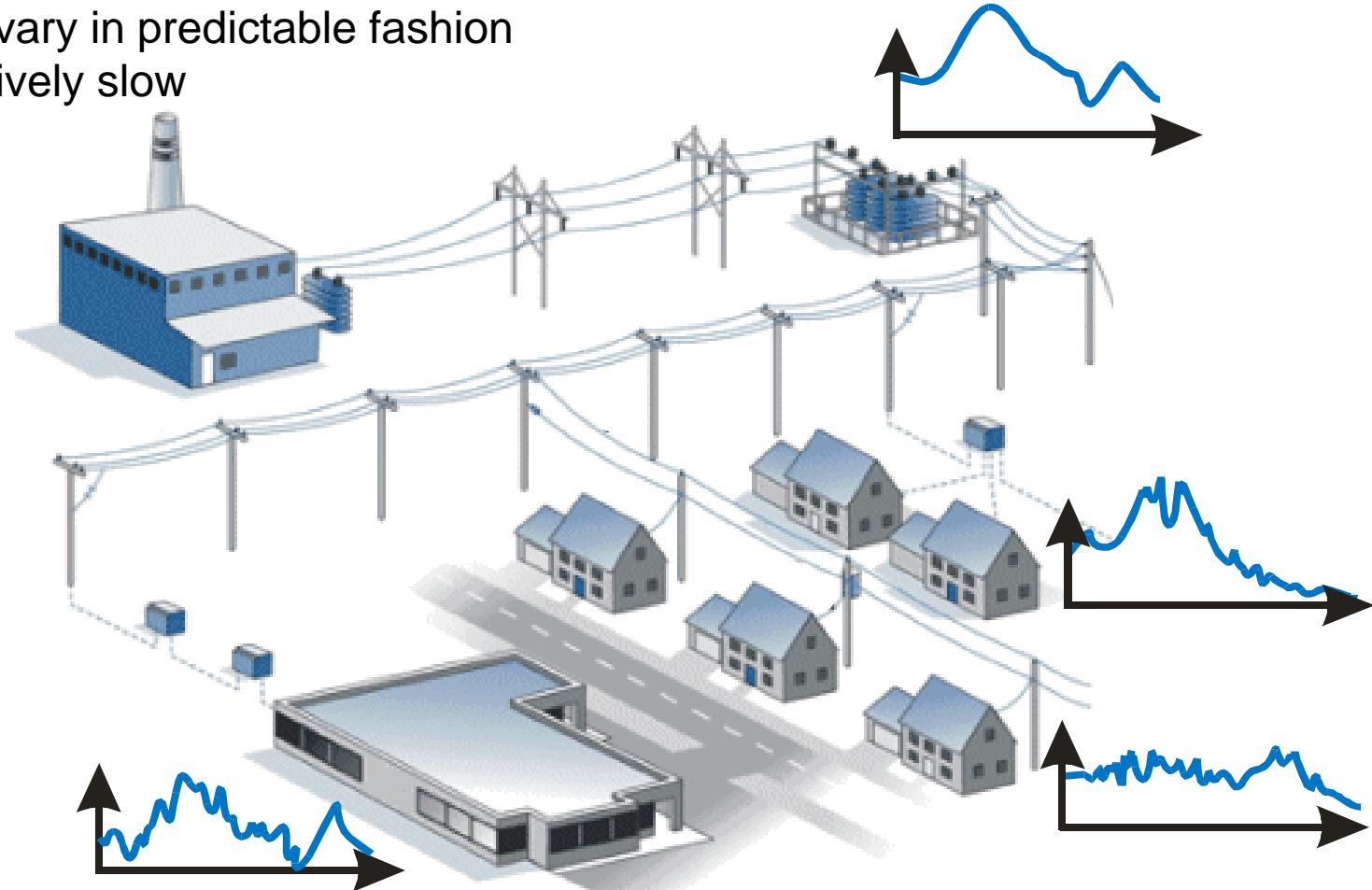
Transmission



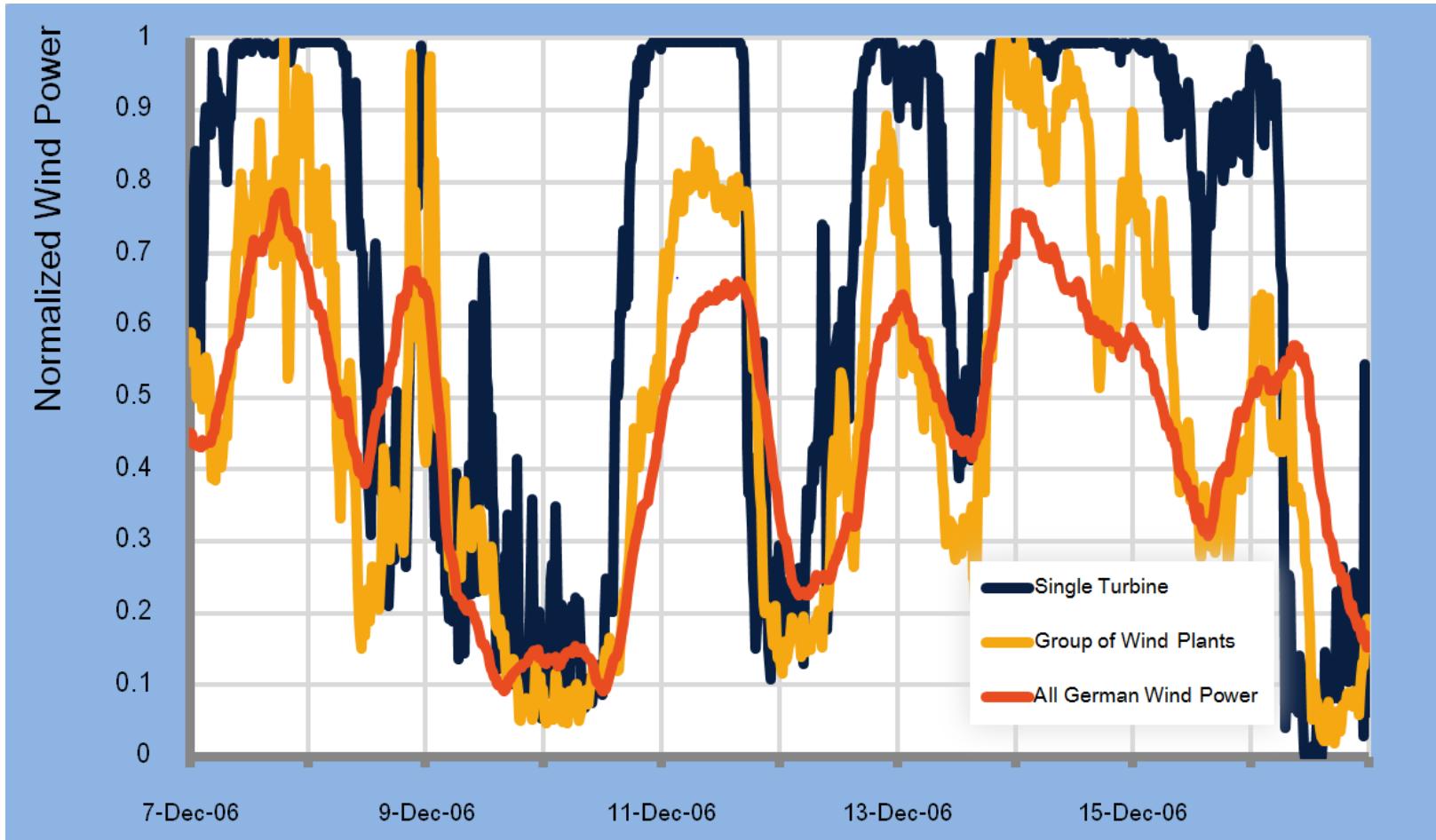
Page 5

Network helps aggregation

Individual loads may be random in nature
Pattern emerges at distribution transformer
Lumped loads vary in predictable fashion
Variations relatively slow



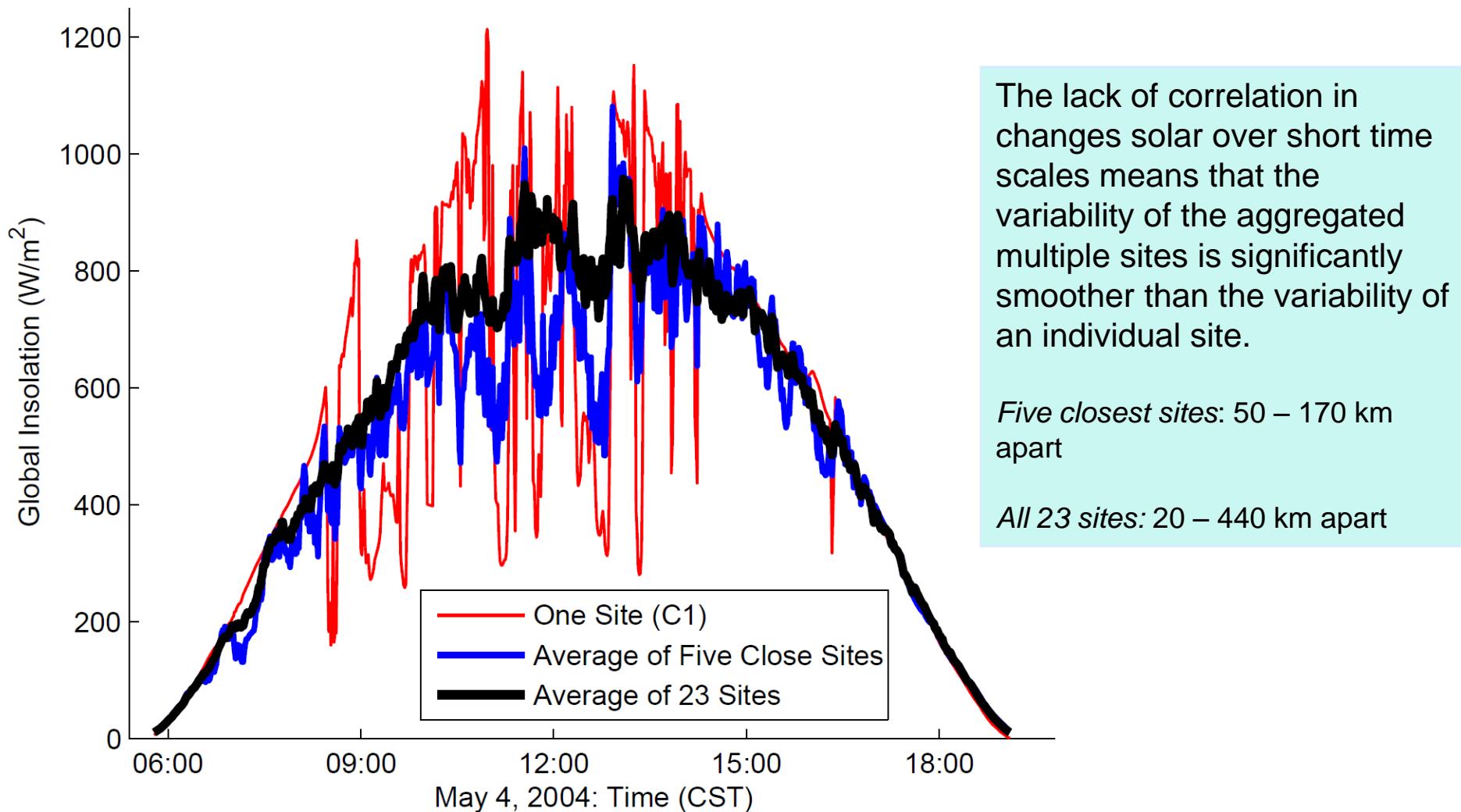
Aggregation wind



Impact of aggregation on wind variability. Time series of wind power output normalised for a single wind turbine, a group of wind power plants, and all wind power plants in Germany over a 10 day period in 2006.

Wiser, R., Z. Yang, M. Hand, O. Hohmeyer, D. Infield, P. Hjuler Jensen, V. Nikolaev, M. O'Malley, G. Sinden, A. Zervos, 2011: Wind Energy. In IPCC Special Report on Renewable Energy Sources and Climate Change Mitigation [O. Edenhofer, R. Pichs-Madruga, Y. Sokona, K. Seyboth, P. Matschoss, S. Kadner, T. Zwickel, P. Eickemeier, G. Hansen, S. Schlömer, C. v. Stechow (eds)], Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA.
http://srren.ipcc-wg3.de/report/IPCC_SRREN_Ch07

Aggregation of solar



Mills, A. D., and R. H. Wiser. 2011. Implications of geographic diversity for short-term variability and predictability of solar power. In 2011 IEEE Power and Energy Society General Meeting, 1-9. IEEE, July 24. doi:10.1109/PES.2011.6039888.

... and the Level of Wind Curtailment

Estimated Wind Curtailment (GWh and % of potential wind generation)

	2007	2008	2009	2010	2011	2012
Electric Reliability Council of Texas (ERCOT)	109.1 (1.2%)	1,416.6 (8.4%)	3,872.2 (17.1%)	2,066.5 (7.7%)	2,621.5 (8.5%)	1,038.0 (3.7%)
Southwestern Public Service Company (SPS)	N/A	0 (0.0%)	0 (0.0%)	0.9 (0.0%)	0.5 (0.0%)	N/A
Public Service Company of Colorado (PSCo)	N/A	2.5 (0.1%)	19.0 (0.6%)	81.5 (2.2%)	63.9 (1.4%)	N/A
Northern States Power Company (NSP)	N/A	25.4 (0.9%)	42.4 (1.7%)	44.3 (1.7%)	58.7 (1.6%)	120.5 (3.1%)
Midwest Independent System Operator (MISO), less NSP	N/A	N/A	249.6 (2.0%)	779.7 (4.2%)	782.6 (3.4%)	726.2 (2.5%)
Bonneville Power Administration (BPA)	N/A	N/A	N/A	4.6* (0.1%)	128.7* (1.4%)	70.8* (0.7%)
PJM	N/A	N/A	N/A	N/A	N/A	111.6# (1.8%)#
Total Across These Seven Areas:	109 (1.2%)	1,444 (5.7%)	4,183 (9.7%)	2,978 (4.9%)	3,656 (4.9%)	2,067 (2.7%)

- ERCOT numbers represent both forced (non-market) and voluntary (market) curtailment
- All other regions show only forced curtailment

*A portion of BPA's curtailment is estimated assuming that each curtailment event lasts for half of the maximum possible hour for each event.

#2012 curtailment numbers for PJM are for June through December only (data for January through May are not available).

Assuming a 33% capacity factor, the total amount of wind generation curtailed in 2012 within just the territories shown above equates to the annual output of roughly 715 MW of wind power capacity

Curtailment in Ireland 2011

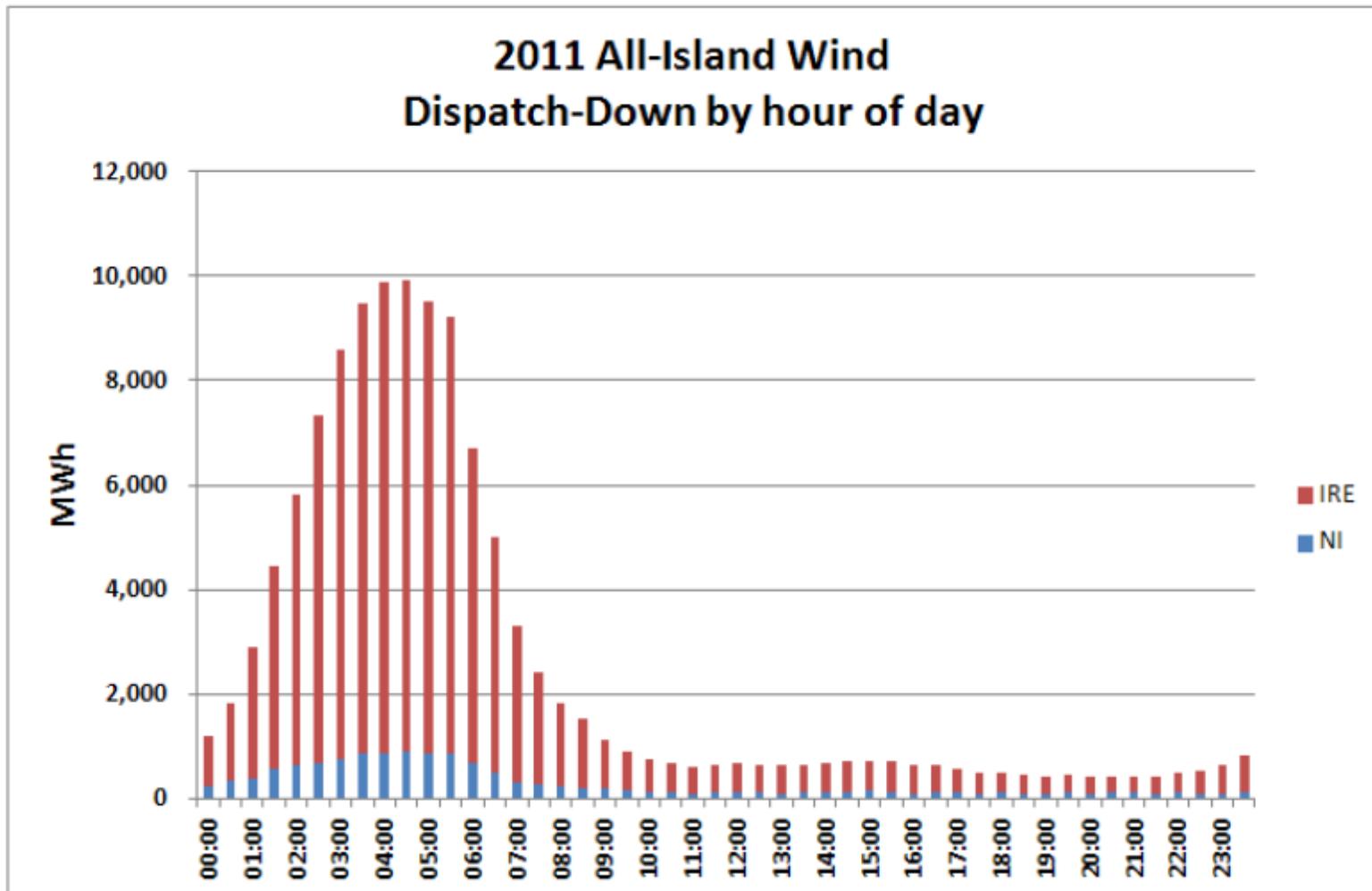


Figure 3 Ireland and Northern Ireland 24 hour clock of dispatch-down of wind 2011

- EirGrid and SONI, 2012; "2011 Curtailment Report"

Curtailment in Texas

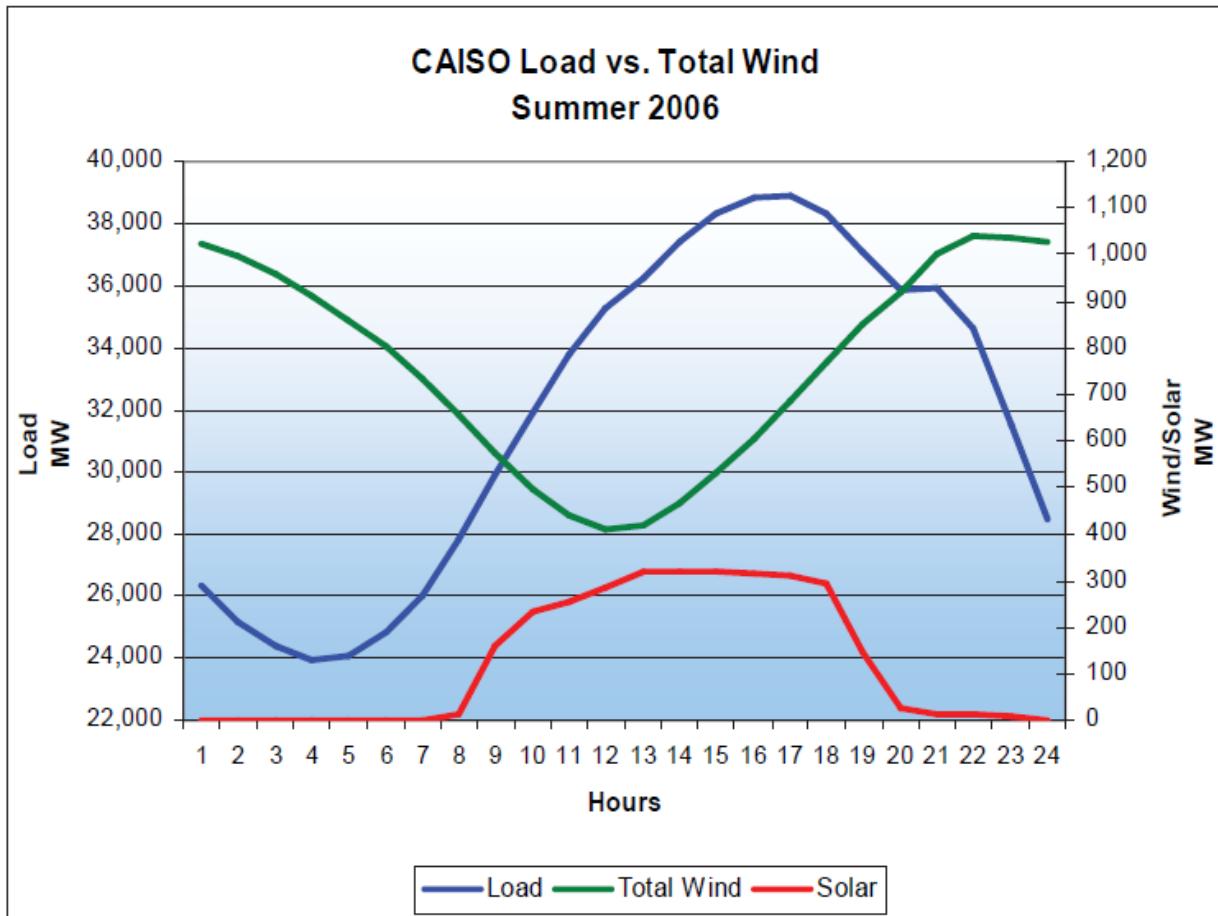
- Wind curtailment in Texas was 8 % in 2010 and 17 % in 2009 mainly due to lack of transmission (Wiser and Bollinger, 2011). It was this type of high levels of curtailment in the early part of the century that spurred Texas to initiate a proactive scheme to alleviate this problem.
- Competitive Renewable Energy Zone (CREZ) – curtailment in 2012 – 3.7 %



Wiser and Bollinger (2011), "Wind Technologies Market Report" US DOE Energy Efficiency and Renewable Energy

http://www1.eere.energy.gov/wind/pdfs/2011_wind_technologies_market_report.pdf

Aggregation of Sources Daily



Actual System Load, Wind Generation and Solar Generation for Summer 2006

California ISO, 2007 Integration of Renewable Resources, Transmission and operating issues and recommendations for integrating renewable resources on the California ISO-controlled Grid
<http://www.uwig.org/CAISOIntRenewablesNov2007.pdf>

Key Take Away

- Transmission is the key integration asset
- Enables aggregation
- Allows the sharing of “flexibility” etc.
- Fundamental to reducing curtailment





Thermal plant flexibility

Can Thermal Power Plant Skip ?



Table 3.2: The load following ability of dispatchable power plants in comparison

	Start-up time	Maximal change in 30 sec	Maximum ramp rate (%/min)
Open cycle gas turbine (OCGT)	10-20 min	20-30%	20%/min
Combined cycle gas turbine (CCGT)	30-60 min	10-20%	5-10%/min
Coal plant	1-10 hours	5-10%	1-5%/min
Nuclear power plant	2 hours - 2 days	up to 5%	1-5%/min

Source: EC JRC, 2010 and NEA, 2011a.

Flexible Gas Plant

The screenshot shows a website page for GE's Gas Turbines. At the top, there's a blue header bar with the text "GE'S FLEXIBILITY" on the left and "Contact" on the right. Below the header is the GE logo. A navigation bar includes links for Home, Products & Services, Gas Turbines, Products & Services (highlighted in blue), Power Generation Basics, and Media Center. The main content area features a large, close-up photograph of a gas turbine's metallic blades. To the left of the image, a blue callout box contains the text "GE was the first..." followed by "to achieve 99.4% yearly reliability with its F-class technology". Below this, a "Contact Us" section encourages users to ask questions about GE's FlexEfficiency* Portfolio. A "Sales Contact" button is also present. The central text "GAS TURBINES" is above the main headline "Efficient, flexible, and reliable technology". A detailed description of the technology follows, mentioning lower emissions, cleaner energy, and how it supports renewables like wind and solar.

GE'S FLEXIBILITY

Contact

Home / Products & Services / Gas Turbines **Products & Services** Power Generation Basics Media Center

GE was the first...
to achieve 99.4% yearly
reliability with its F-class
technology

Contact Us

We're here to answer your
questions about GE's
FlexEfficiency* Portfolio of
products. Please use the link
below to contact an expert
in our sales department.

→ Sales Contact

GAS TURBINES

Efficient, flexible, and reliable technology

GE's FlexEfficiency* Portfolio of gas turbine products offer lower emissions and provide cleaner, smarter, flexible and more efficient energy to the power grid. These innovative and proven solutions help maintain performance and lower operating costs while accelerating the widespread deployment of renewables, like wind and solar, to the grid.

<http://www.ge-flexibility.com/products-and-services/gas-turbines/index.html>

Flexible Coal plant ?



Power to Ontario.
On Demand.

Looking for Flexibility... More Flexibility in Coal than Gas?

Darren Finkbeiner
Manager Market Development
UVIG – Spring Technical Conference
April 24-26, 2012



Darren Finkbeiner, IESO, Canada, "Looking for Flexibility... More Flexibility in Coal than Gas?", UVIG – Spring Technical Conference, San Diego, April 24-26, 2012.

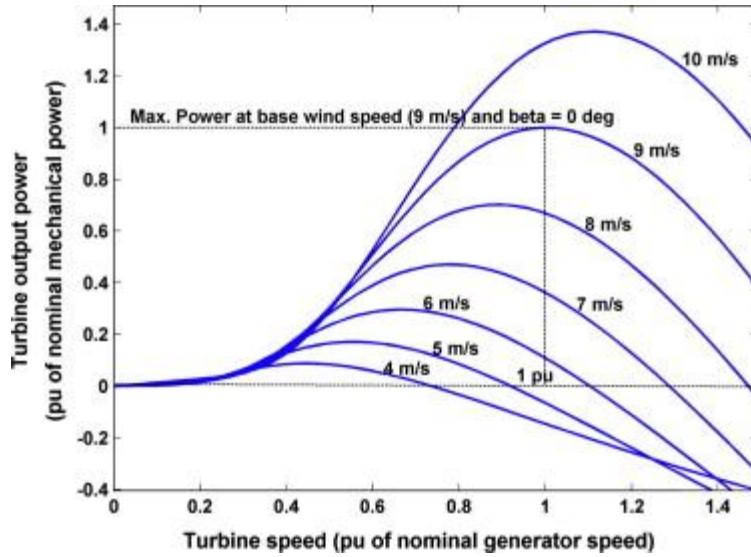
Hydro plant



Key Take Away

- Thermal power plant can be flexible at a cost
 - Gas tends to be more flexible
 - Coal and nuclear less so
 - Hydro also potentially flexible

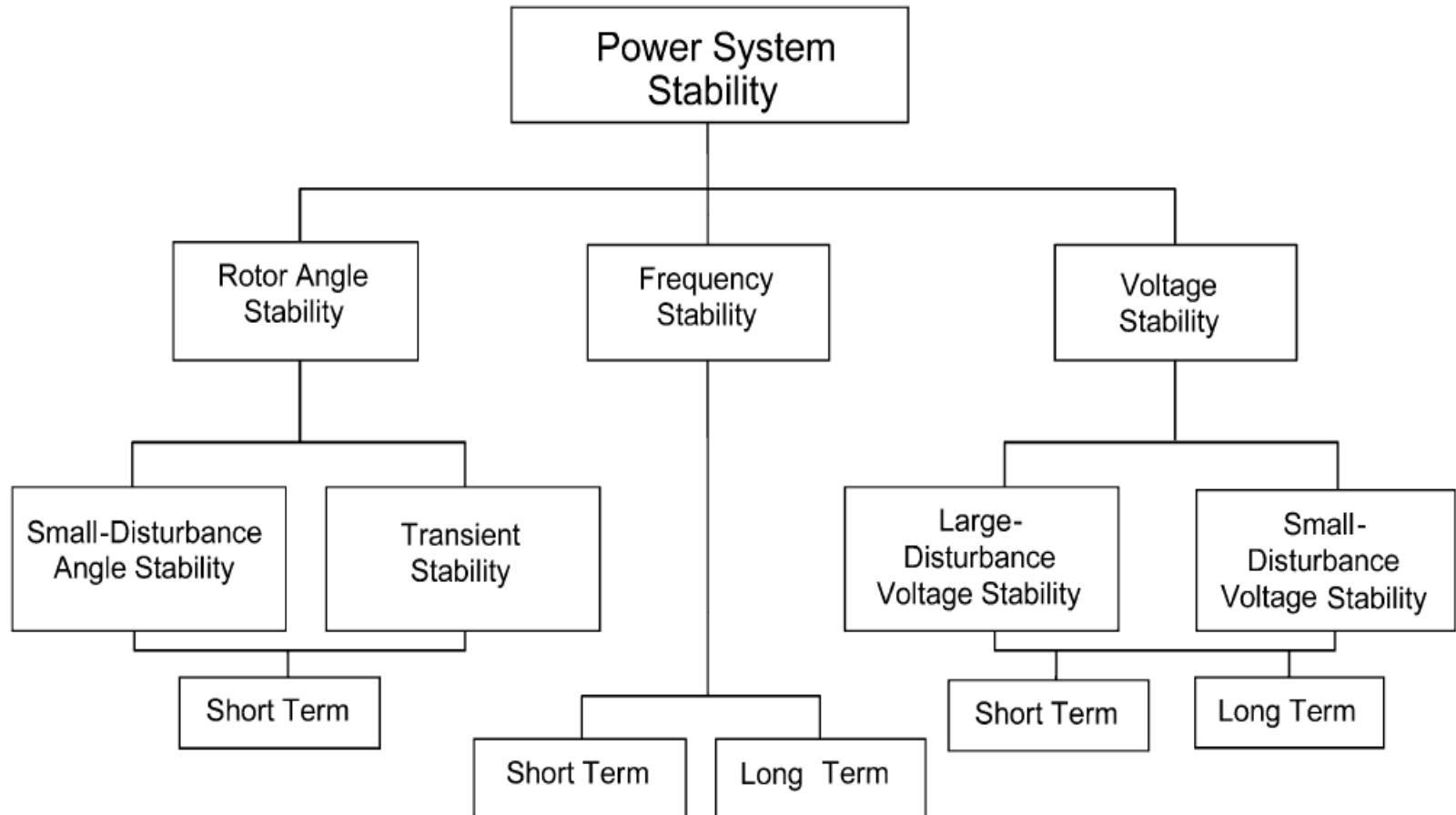




Renewable energy generator & stability

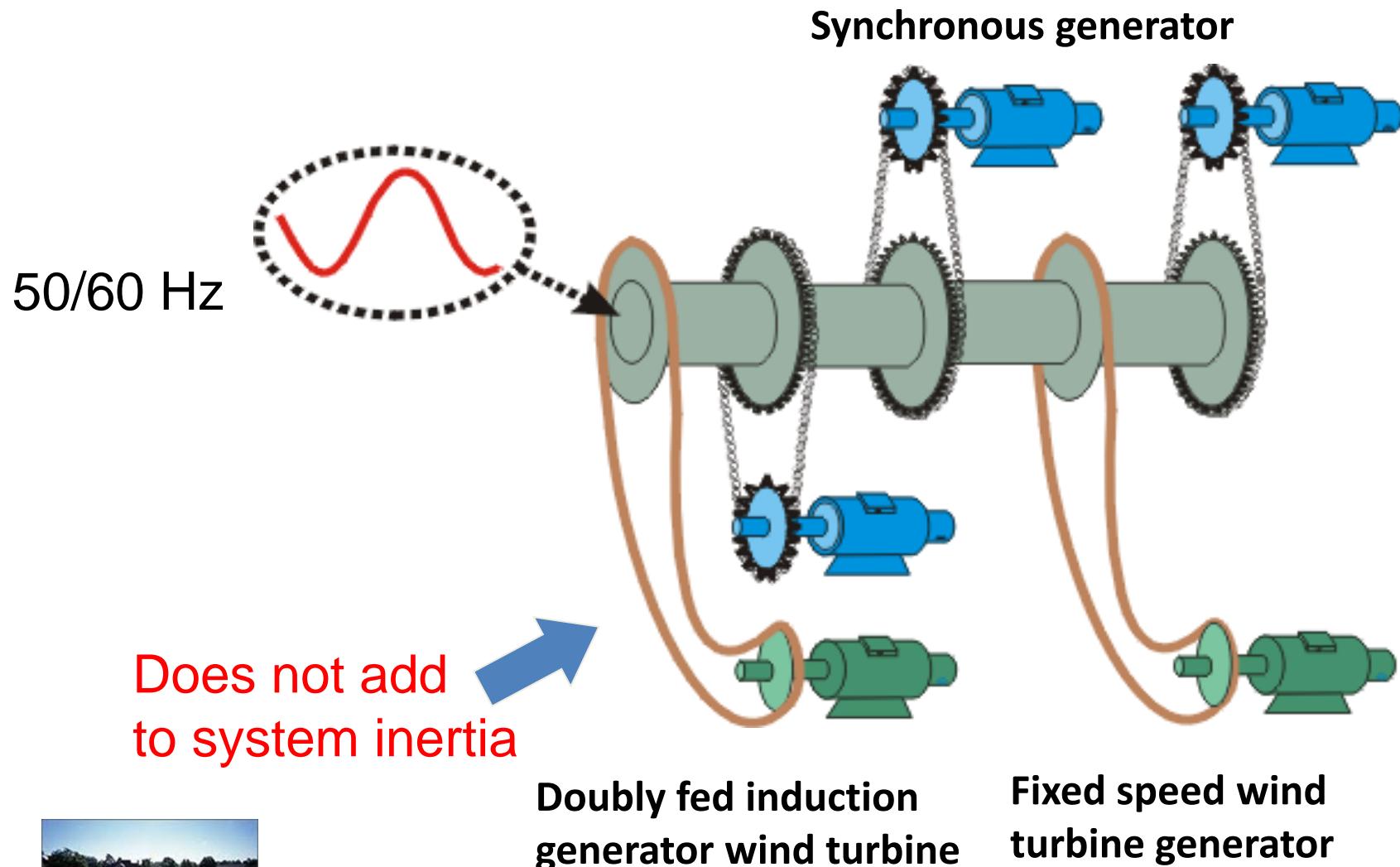
Classification of power system stability

“Power system stability is essentially a single problem”

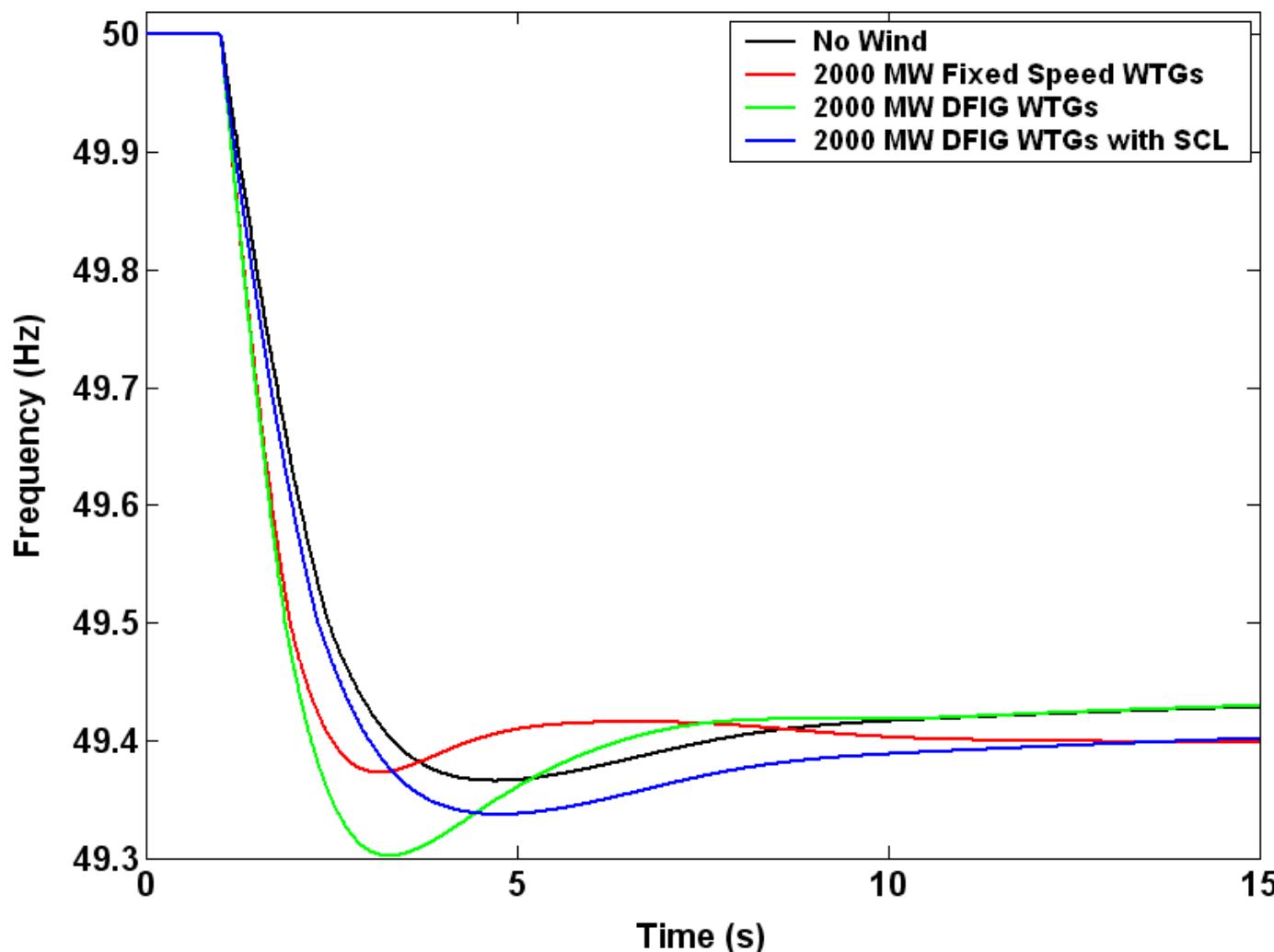


Prabha Kundur, John Paserba, Venkat Ajjarapu, Göran Andersson, Anjan Bose, Claudio Canizares, Nikos Hatziargyriou, David Hill, Alex Stankovic, Carson Taylor, Thierry Van Cutsem and Vijay Vittal. "Definition and Classification of Power System Stability" IEEE/CIGRE Joint Task Force on Stability Terms and Definitions, *IEEE transactions on Power Systems*, Vol. 19, pp. 1387 – 1401, 2004.

Adding non synchronous generation

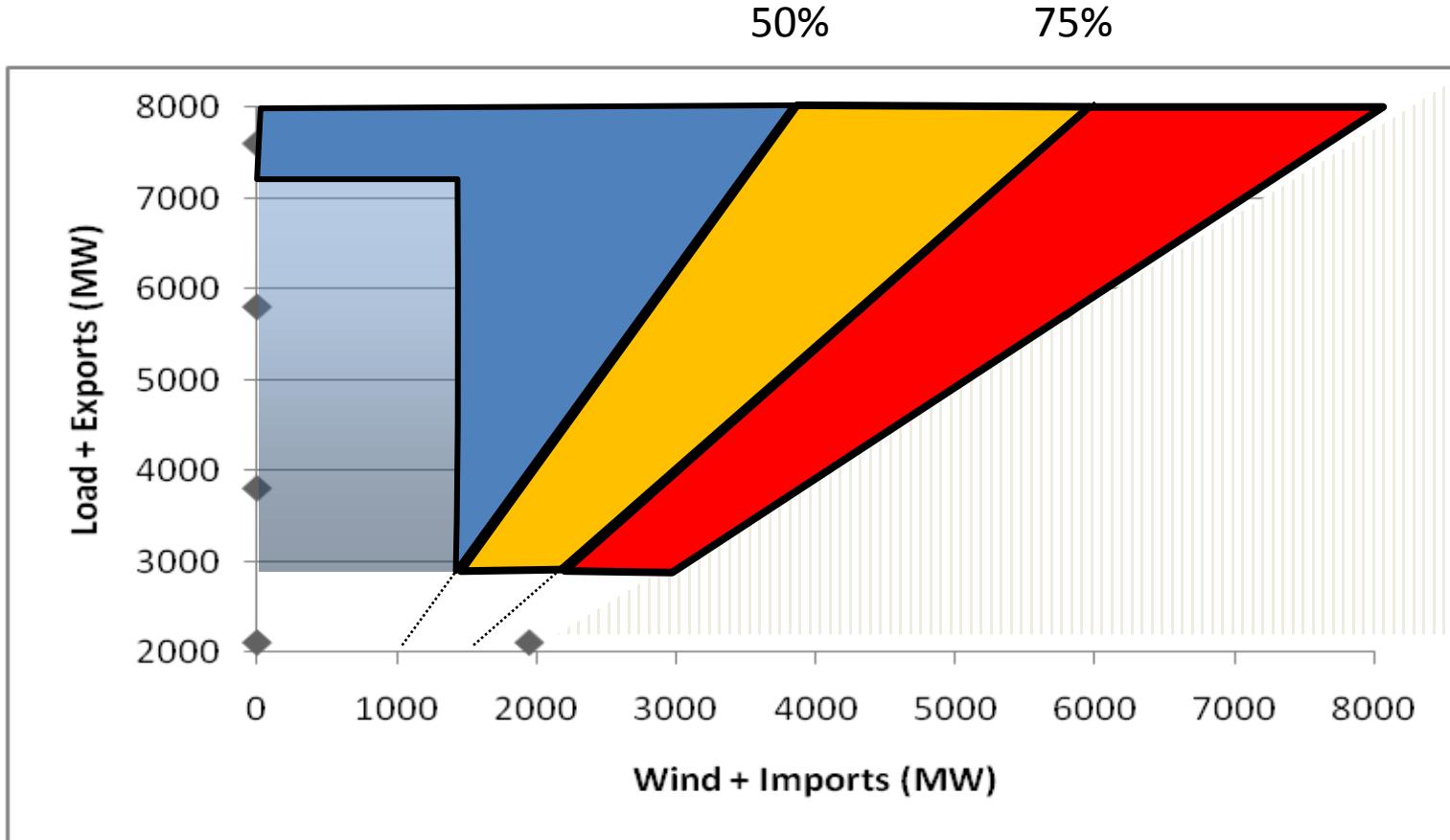


Frequency Response



Lalor, G., Mullane, A., and O'Malley, M.J., "Frequency Control and Wind Turbine Technologies", *IEEE Transactions on Power Systems*, Vol. 20, pp. 1903 – 1913, 2005.

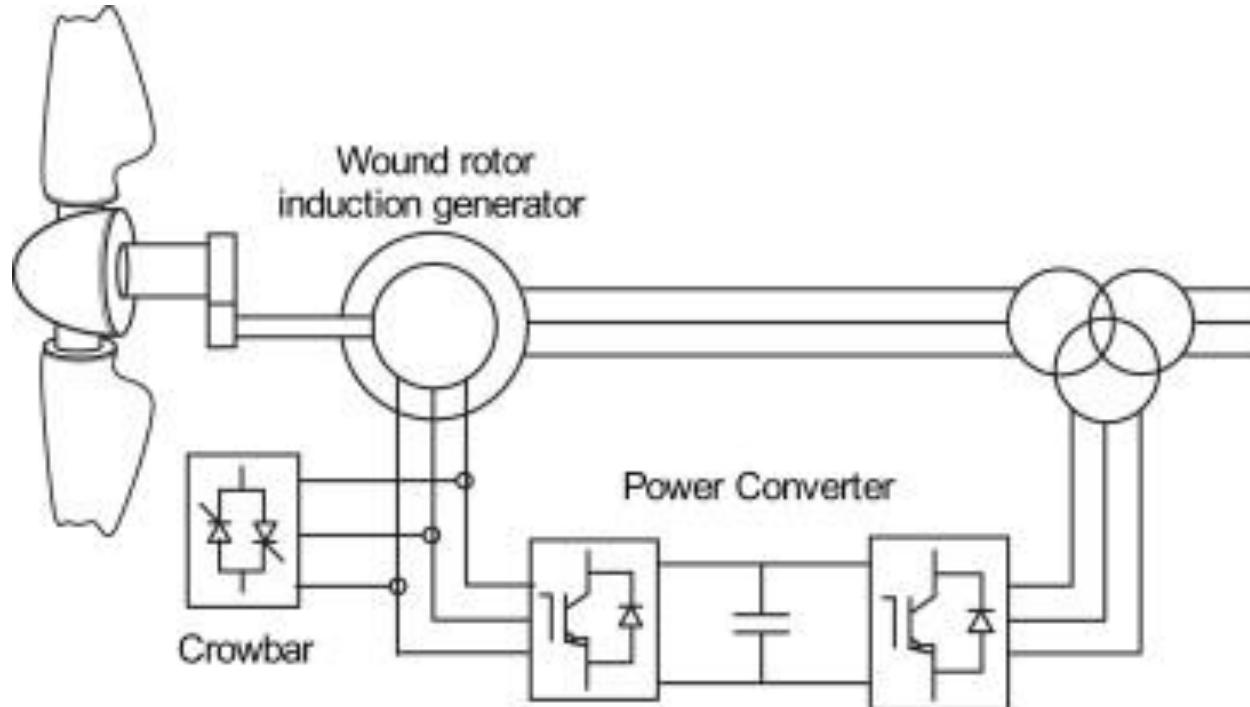
Real Time Operational Limits



Maximum Allowable Real Time Wind Level



Modern wind and solar PV generators are very controllable



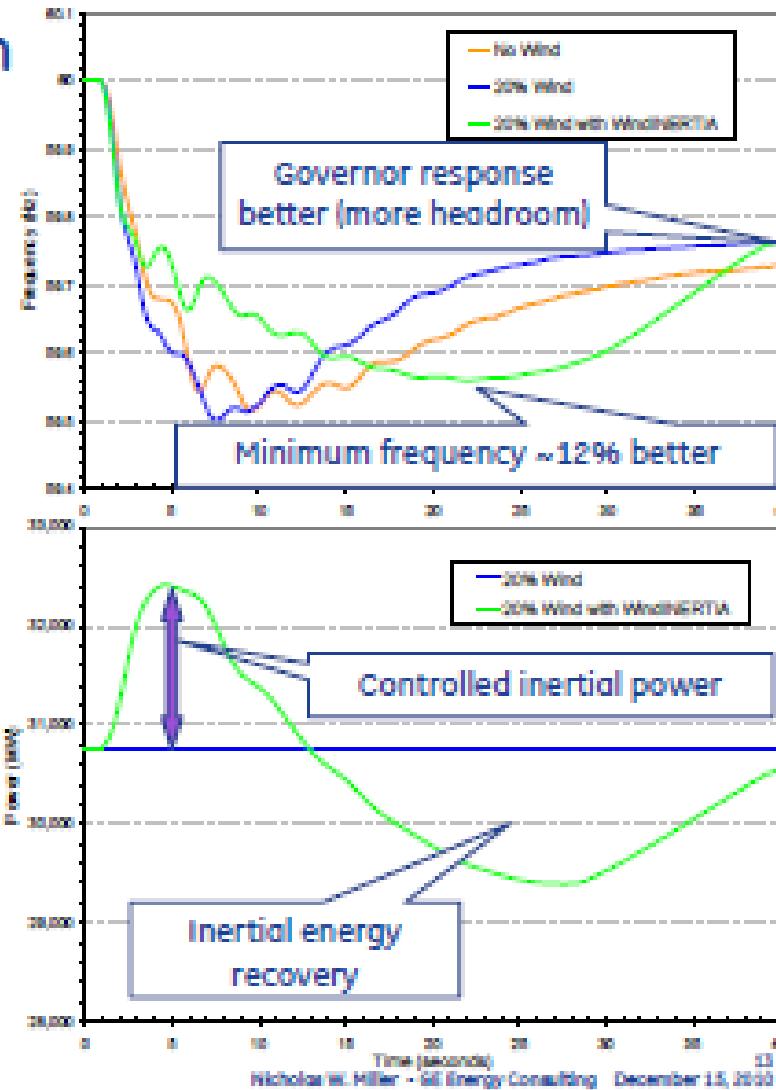
Emulated inertial response

Inertial Response from Wind Generation

Inertial response reduces and delays minimum frequency

Margin above UFLS increases by about 40mHz

Response in this case is overly aggressive:
Inertia is now another control variable that can be tuned.



Key Take Away

- Renewable energy generators can impact on stability both negatively and positively
- Modern power electronics has enhanced the controllability (frequency and voltage) of renewable energy generators





Storage

Storage Applications

Storage Technologies	Discharge Time / Duration	Storage Application by Response Timeframe									
		Hours					Minutes			Seconds	
		Energy Arbitrage	Generation Capacity Deferral	(T &D) Investment Deferral	Congestion Management	Voltage Support	Black Start	Spinning Reserve	Renewable Ramp Reduction	Regulation	Power Quality
Storage Technologies	Pumped Hydro	Hours	M	M	M	M	M	M	M	M	M
	CAES	Hours	C	C	C	C	C	C	C	C	
	Flywheel	Minutes					D	D	D	D	D
	Super Capacitor	Seconds									D
	Lead Acid Battery	Hours									C
	Advanced Lead Acid Battery	Hours					D	D	D	D	C
	NaS Battery	Hours					C	C	C	C	C
	NiCd Battery	Minutes							D	D	C
	Flow Battery	Hours					R	R	R	R	R
	Li-Ion Battery	Minutes							D	R	D

Technology Maturity Key :

M Mature

C Commercial

D Demonstration

R R & D

Elzinga, D., Dillon, J., O'Malley, M.J., Lampreia, J., "The role electricity storage in providing electricity system flexibility", in Electricity in a climate constrained world. International Energy Agency, Paris, 2012.

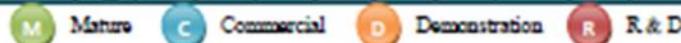
Storage Applications & Competitors



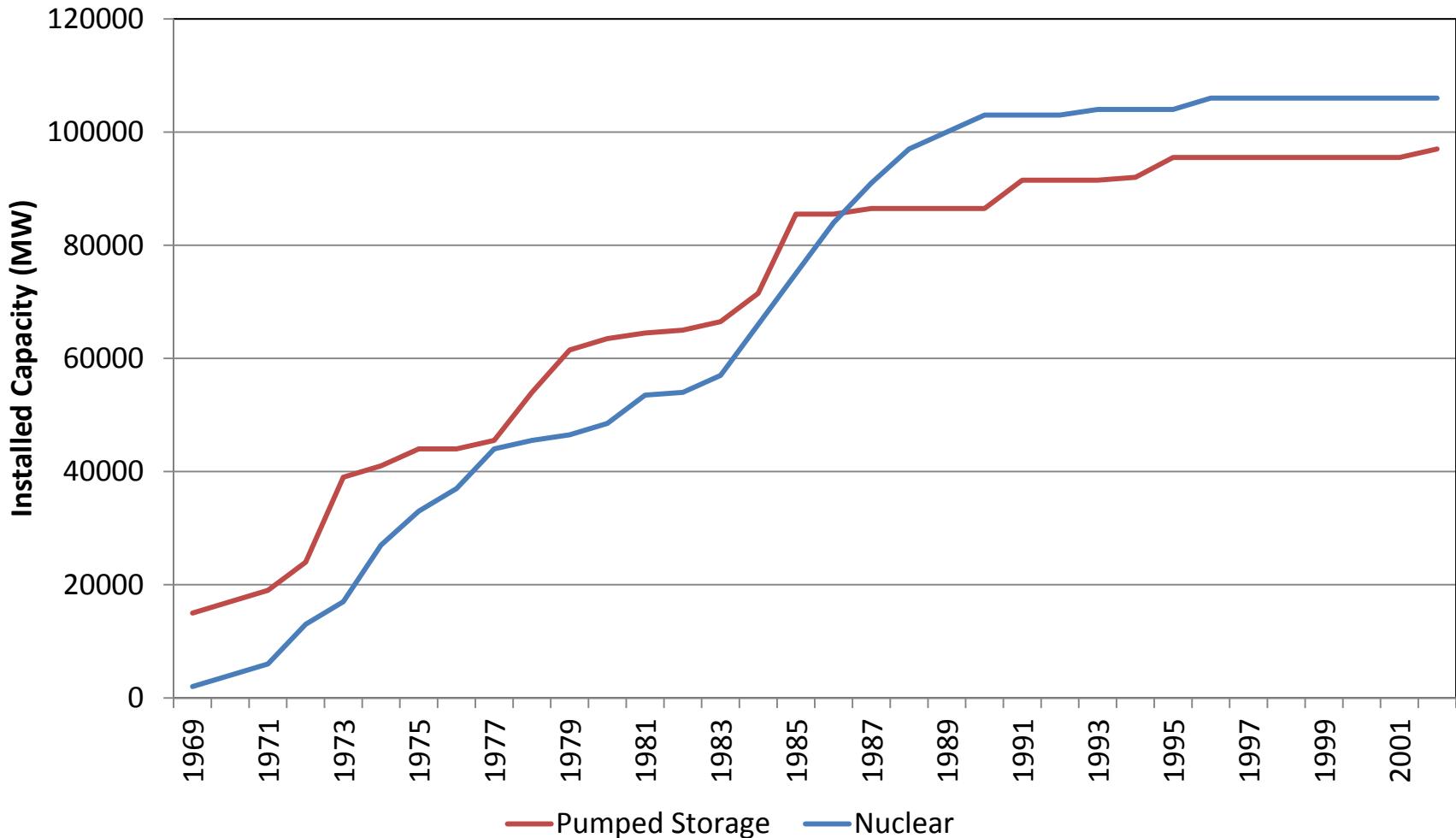
Elzinga, D., Dillon, J., O'Malley, M.J., Lampreia, J., "The role electricity storage in providing electricity system flexibility", in Electricity in a climate constrained world. International Energy Agency, Paris, 2012.

		Discharge Time / Duration	Storage Application by Response Timeframe							
			Hours		Minutes		Seconds			
			Energy Arbitrage	Generation Capacity Deferral	(T & D) Investment Deferral	Congestion Management	Voltage Support	Block Start	Spinning Reserve	Renewable Ramp Reduction
Storage Technologies	Pumped Hydro	Hours	M	M	M	M	M	M	M	M
	CAES	Hours	C	C	C	C	C	C	C	C
	Flywheel	Minutes					D	D	D	D
	Super Capacitor	Seconds								D
	Lead Acid Battery	Hours								C
	Advanced Lead Acid Battery	Hours					D	D	D	D
	NaS Battery	Hours					C		C	C
	NiCd Battery	Minutes								D
	Flow Battery	Hours				R	R	R	R	R
	Li-Ion Battery	Minutes				R	R	R	D	D
Competing Technologies	Conventional Generation	> Hours	M	M		M	M	M	M	M
		> Hours		M	M					
	Hydro Generation	> Hours		M	M	M	M	M	M	M
		Hours	M	M			M	M	M	
	Demand Response ¹	> Hours		M	M	M	M	M	M	M
		Hours	M	M			M	M	M	
	Interconnection	Hours	M	M	M	M	M	M	M	
Operational Measures	Transmission / Interconnection	> Hours	M	M	M	M	M	M	M	M
		> Hours	M	M	M	M	M	M	M	M
	Static Comp. Devices	> Hours	M	M	M	M	M	M	M	M
		> Hours	M	M	M	M	M	M	M	M
	Power Electronics Protection Measures	Seconds		M	M					M
	Dynamic Line Rating	Seconds		M	M					
	Forecasting	Hours	M		C	C				
		Hours								

Technology Maturity Key :



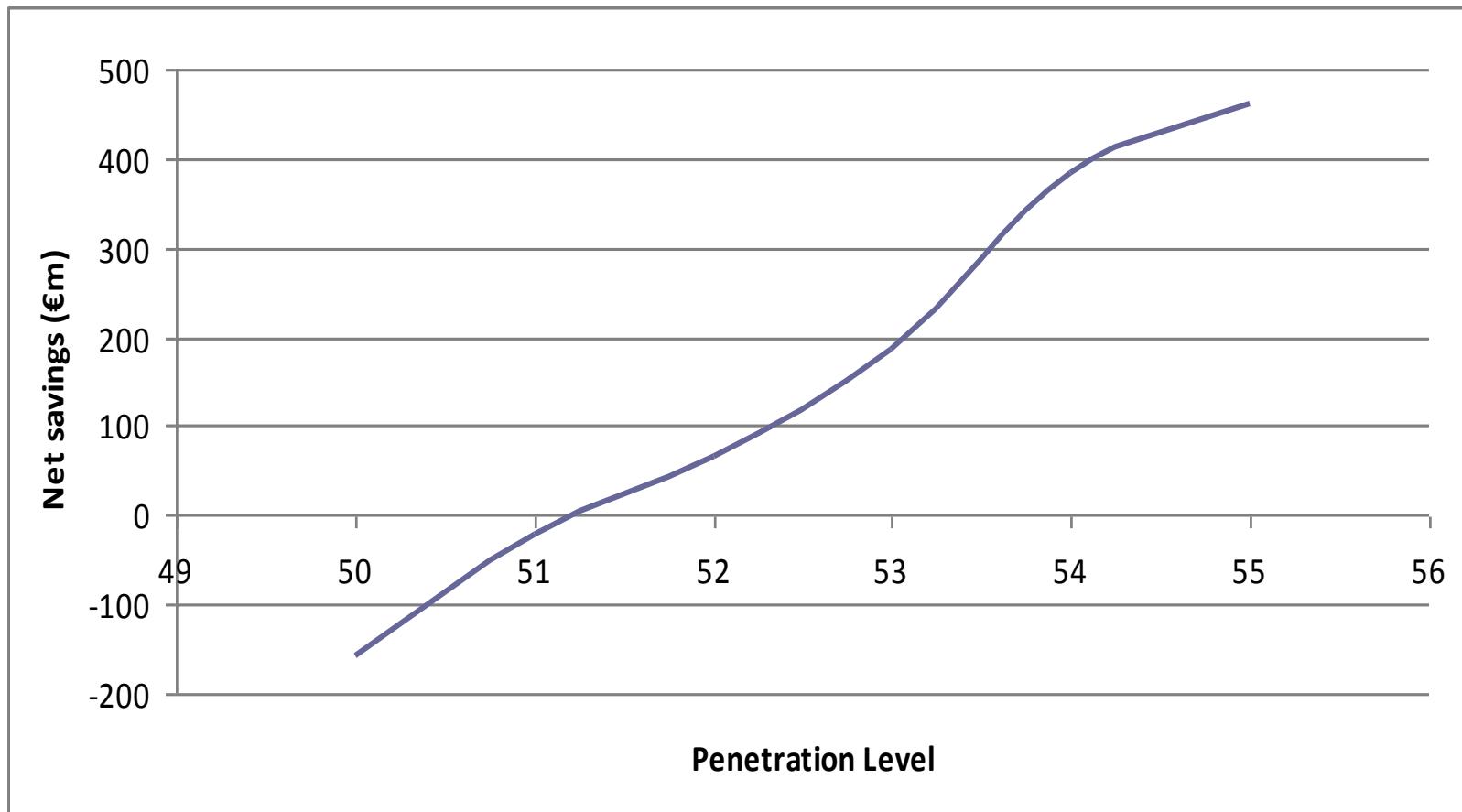
Historical Storage Drivers



Data From OECD Countries only

Business case for storage

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Tuohy, A. and O'Malley, M.J., "Pumped Storage in Systems with Very High Wind Penetration", *Energy Policy*, Vol. 39, pp. 1965-1974, 2011.

Key Take Away – Storage

- Storage can supply multiple services
 - Energy arbitrage
 - Ancillary services
- The opportunity for these services increases with variable renewable energy
- Storage has competitors for all these opportunities and is generally more costly





Demand (consumer) Response

Empowering consumers through energy management techniques such as demand response could save \$17 billion annually.

http://www.mckinsey.com/client_service/electric_power_and_natural_gas/latest_thinking/mckinsey_on_smart_grid

Demand Response with renewables

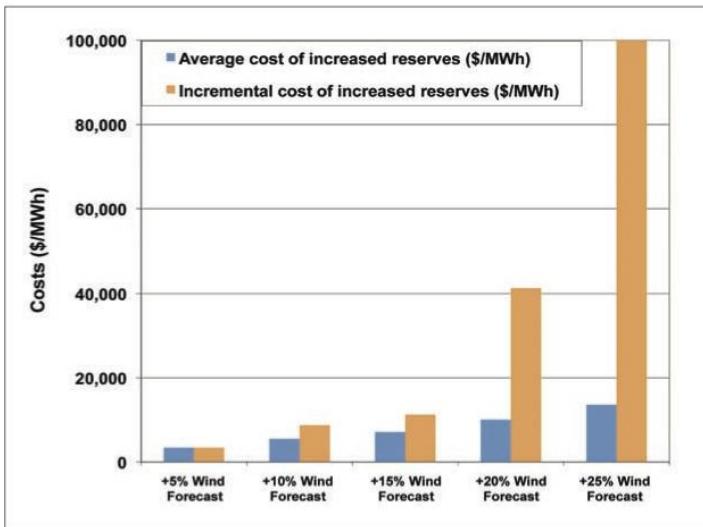


Figure 12 – The cost of increasing spinning reserves increases with higher percentages of spin. The incremental cost increases sharply at higher percentages of spin, indicating that the cost of reducing those final reserve shortfalls is prohibitively high. The five bars show the effect of increasing spinning reserve by 5, 10, 15, 20, and 25% of the day-ahead wind forecast.

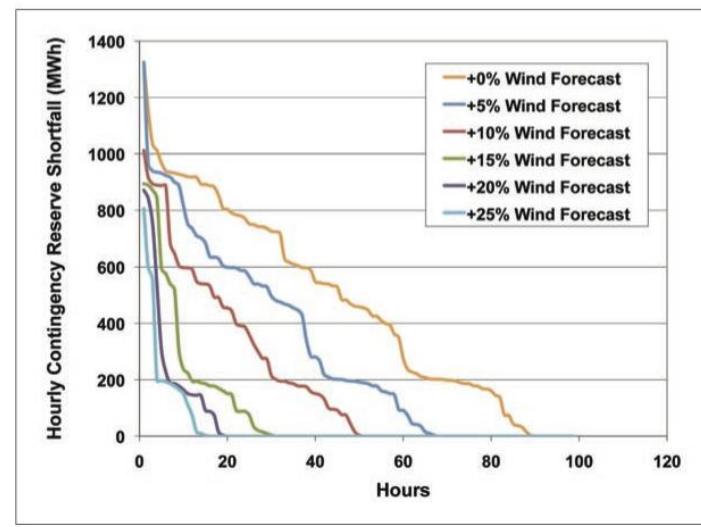


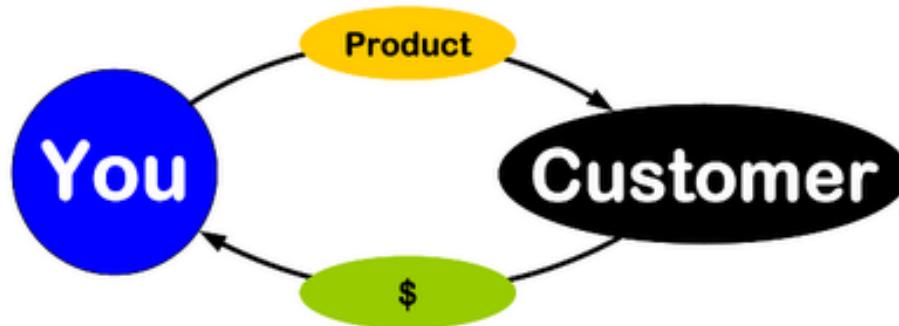
Figure 13 – A demand response program which requires load to participate in the 89 hours of the year that there are contingency reserve shortfalls is more cost-effective than increasing spin for each of the 8760 hours of the year. Hourly contingency reserve-shortfall duration curves for the In-Area 30% case with a SOA forecast with no additional spinning reserves, and then with spinning reserves increased by 5, 10, 15, 20, and 25% of the day-ahead wind forecast.

High wind and solar displace thermal units leading to a shortfall in contingency reserves; demand response may be more cost-effective than committing additional units for 89 hours of the year.

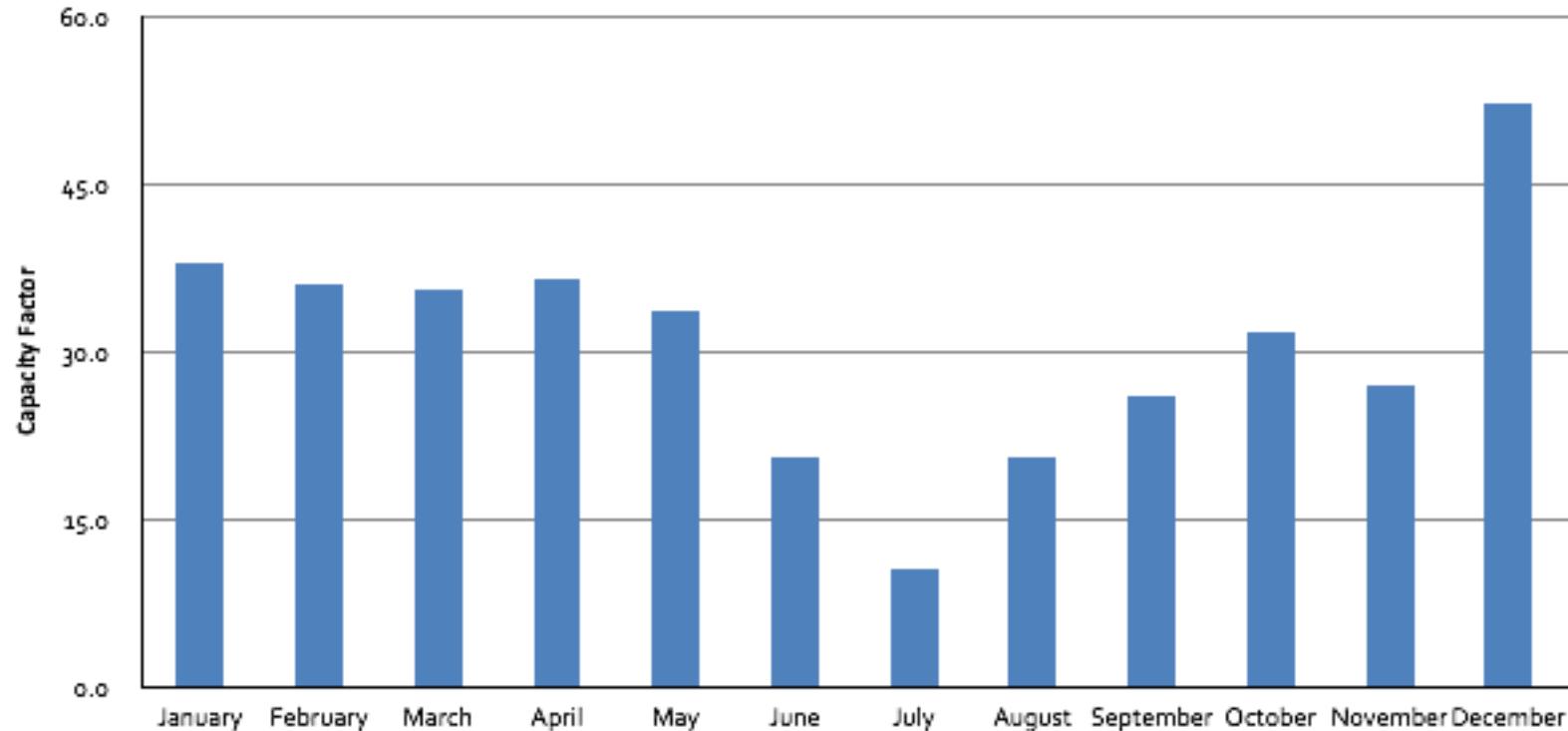


Western Wind and Solar Integration Study, NREL, GE (2010)
http://www.uwig.org/wwsis_executive_summary.pdf

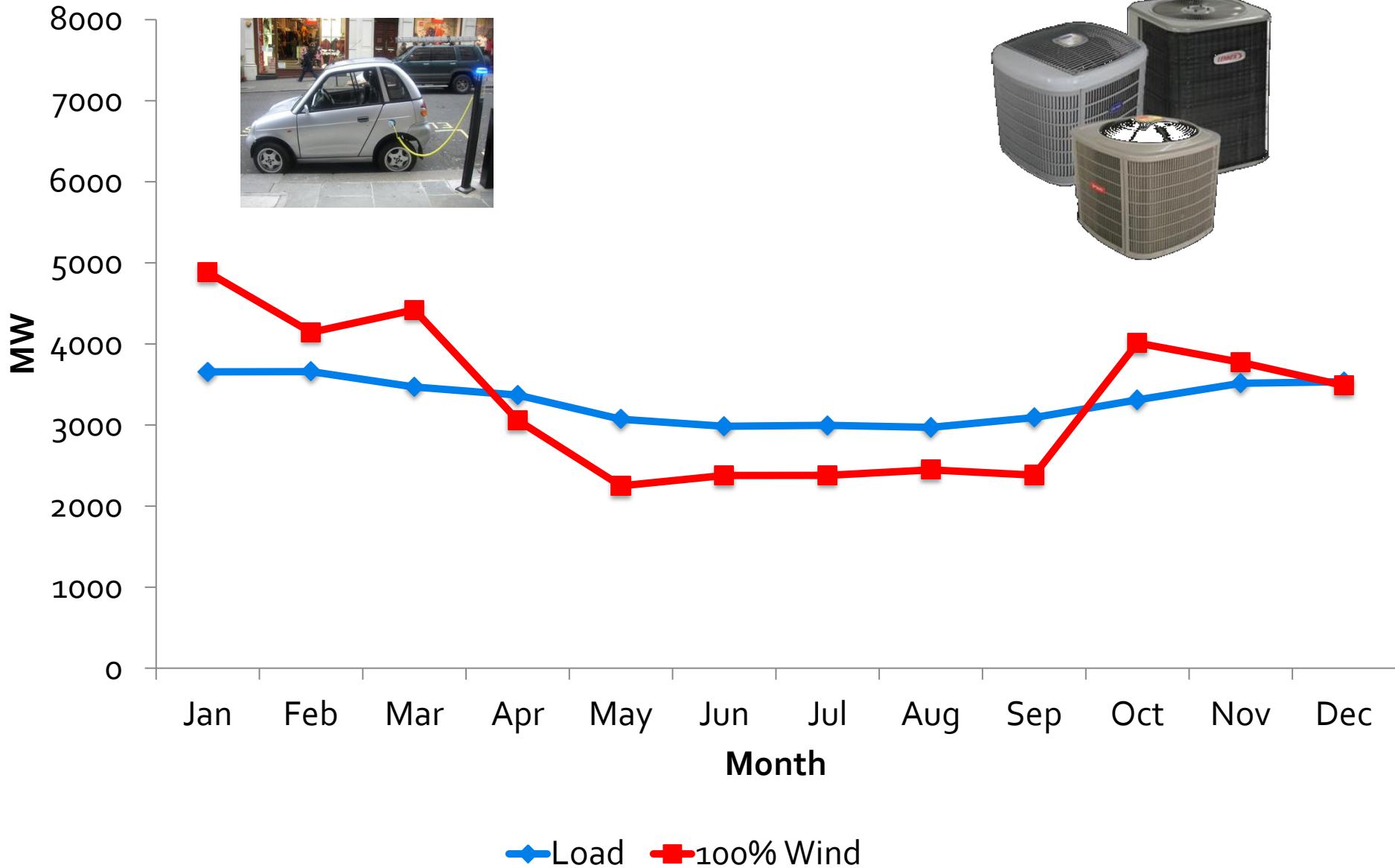
Business model



All Island Wind Capacity Factor 2013



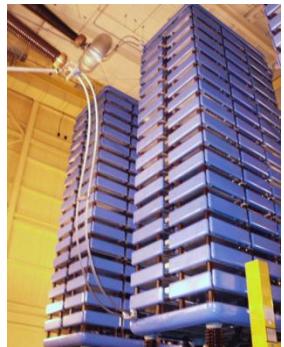
100 % Wind we will have to change how we live



Key Take Away

- Demand response is an important potential integration resource
- Demand response and storage unlikely to address variability at longer time scales

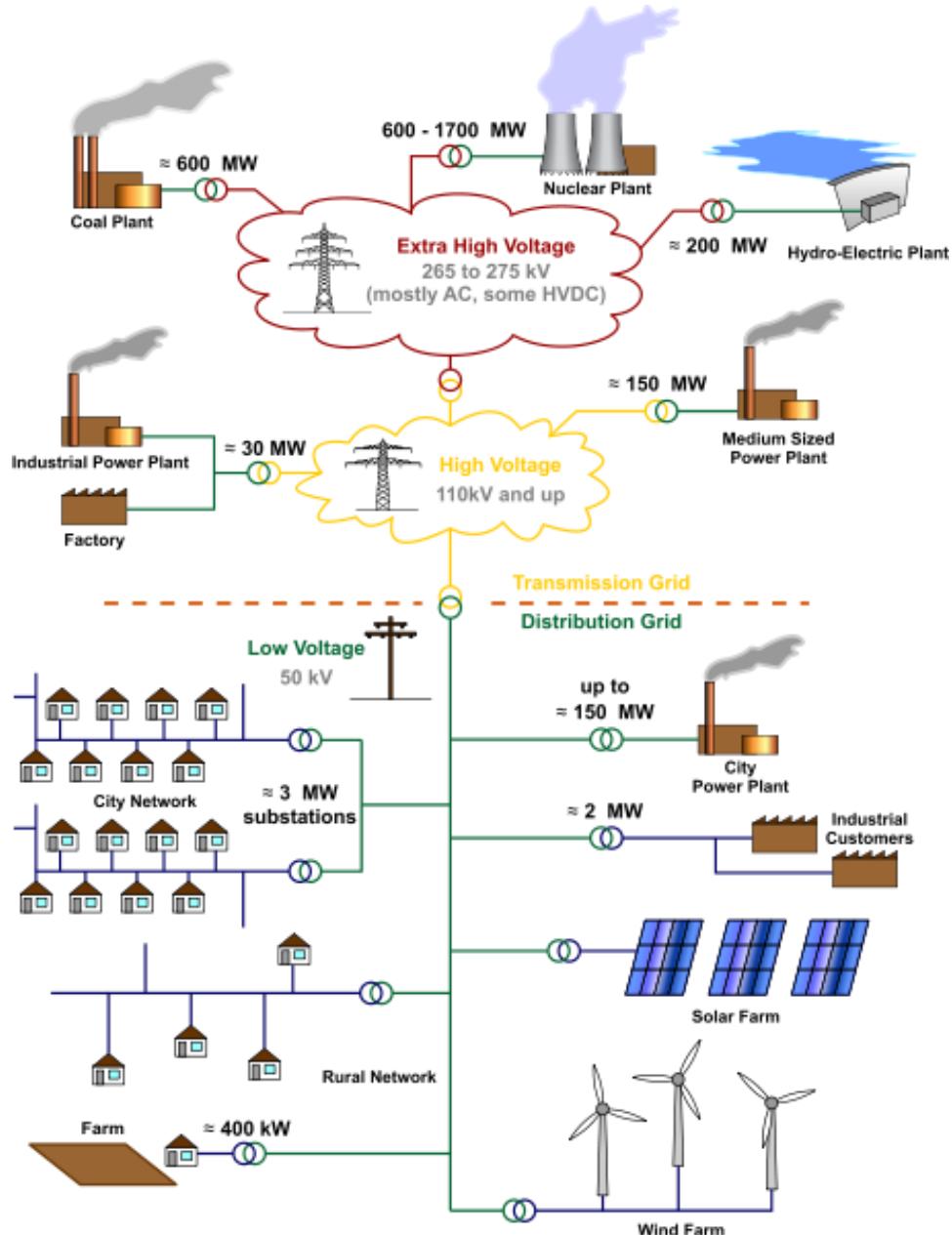




New technologies

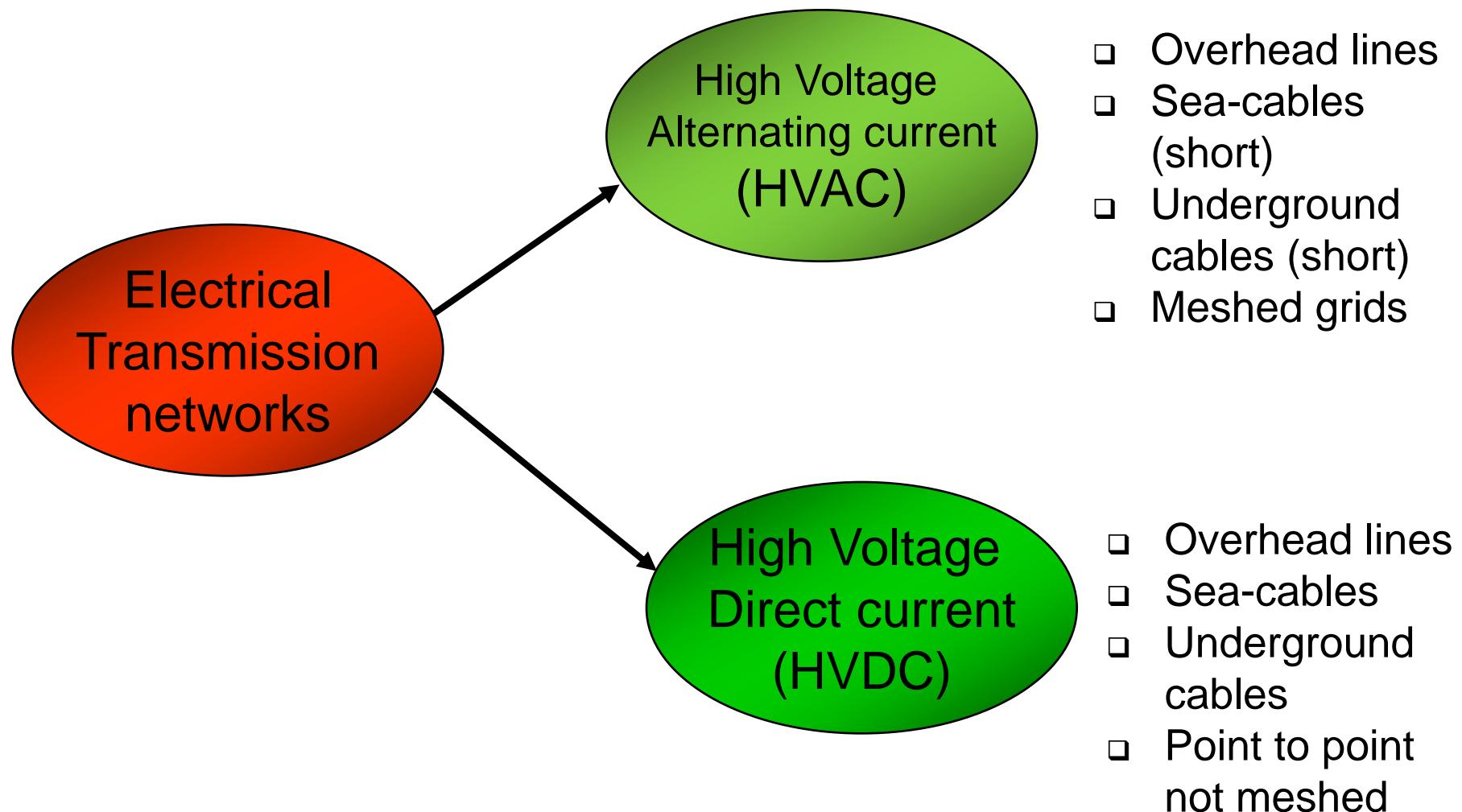
Power Electronics Applications

- Flexible AC Transmission Systems (FACTS)
- High Voltage DC (HVDC)
 - ❑ Classic
 - ❑ Light (VSC) – more controllable
- Connection of Distributed Generation
- Variable renewables
 - ❑ Photovoltaics
 - ❑ Wind Turbines
- Loads – AC-DC conversion for most electronic equipment.



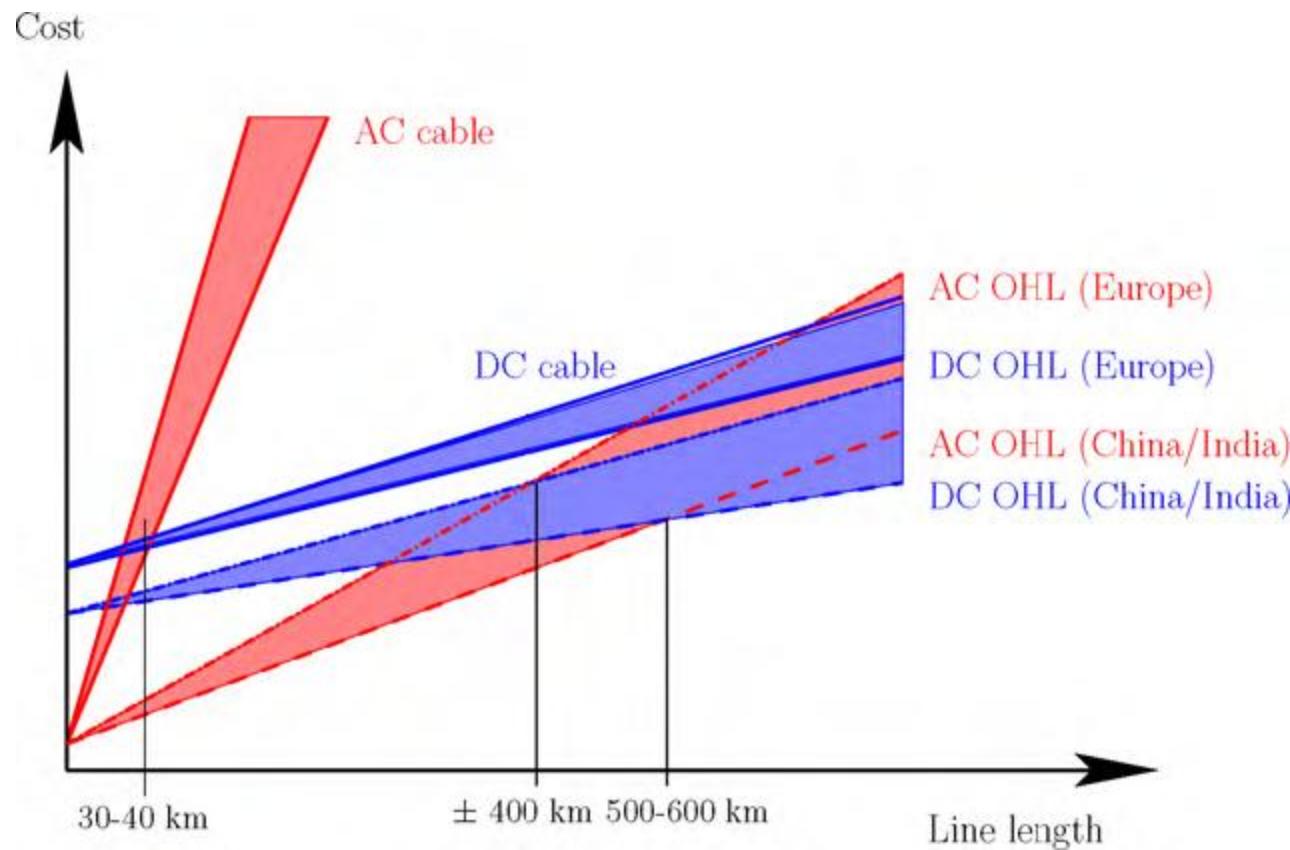
Source: Terence O'Donnell, UCD

Electrical Transmission Systems



AC vs. DC

- Cost comparison AC vs. DC



Technology (Smart Grids) Solutions

- Avoid construction of new lines
- Dynamic Line Rating (DLR)
 - Real time measurements (temperature, wind speed) are used to derive more accurate capacities of transmission lines
 - 25%-30% increases in line capacity 90% of the time
- Special Protection Schemes (SPS)
 - Automatic corrective actions rather than conservative preventive control
 - Increase in system risk associated with the complexity of the scheme



Source: Janusz Bialek

Key Take Away

- Power electronics and DC are growing in importance
- HVDC is typically for long distance point to point energy transfers and can be very controllable
- Other “smart grid” technologies can make the grid more flexible and increase its capacity



Reading Material



Krewitt, W., P. Mercado, R. Sims, G. Bhuyan, D. Flynn, H. Holttinen, G. Jannuzzi, S. Khennas, Y. Liu, L. J. Nilsson, J. Ogden, K. Ogimoto, M. O'Malley, H. Outhred, Ø. Ulleberg, F. van Hulle, 2011: Integration of Renewable Energy into Present and Future Energy Systems. In IPCC Special Report on Renewable Energy Sources and Climate Change Mitigation [O. Edenhofer, R. Pichs-Madruga, Y. Sokona, K. Seyboth, P. Matschoss, S. Kadner, T. Zwickel, P. Eickemeier, G. Hansen, S. Schlömer, C. v. Stechow (eds)], Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA.

http://srren.ipcc-wg3.de/report/IPCC_SRREN_Cho8

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Integration of Renewable Energy into Present and Future Energy Systems

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Reading Material # 1

- AEMO, Australian Energy Market Operator, "Wind Integration In Electricity Grids: International Practice And Experience" Work Package 1, 2011.
<http://www.aemo.com.au/~/media/Files/Other/planning/o400-0049%20pdf.pdf>
- AEMO, Australian Energy Market Operator, "Wind Integration: International Experience: Review of Grid Codes" Work Package 2, 2011.
<http://www.aemo.com.au/Electricity/Planning/Reports/National-Transmission-Network-Development-Plan/~/media/Files/Other/planning/o400-0050%20pdf.ashx>
- California ISO, 2007 Integration of Renewable Resources, Transmission and operating issues and recommendations for integrating renewable resources on the California ISO-controlled Grid <http://www.uwig.org/CAISOLntRenewablesNov2007.pdf>
- Borggrefe, F. and Neuhoff K. "Balancing and Intraday Market Design: Options for Wind Integration" Deutsches Institut für Wirtschaftsforschung October 2011
- Darren Finkbeiner, IESO, Canada, "Looking for Flexibility... More Flexibility in Coal than Gas?", UVIG – Spring Technical Conference, San Diego, April 24-26, 2012.
- Doherty, R., Mullane, A., Lalor, G., Burke, D., Bryson, A. and O'Malley, M.J. "An Assessment of the Impact of Wind Generation on System Frequency Control", IEEE Transactions on Power Systems, Vol. 25, pp. 452 – 460, 2010.
- EirGrid and SONI, 2012; "2011 Curtailment Report"
- EirGrid, "All Island TSO Facilitation of Renewable Studies", Final Report, 2010
<http://www.eirgrid.com/media/Renewable%20Studies%20V3.pdf>
- Energy Needs Ireland "Participating in Ireland's Smart Energy Future " Final Report, September 2013
http://eni.ucd.ie/2013/ENI_2013_White_Paper.pdf
- Elzinga, D., Dillon, J., O'Malley, M.J., Lampreia, J., "The role electricity storage in providing electricity system flexibility", in Electricity in a climate constrained world. International Energy Agency, Paris, 2012.

Reading Material #2

- Eurelectric 2011 "Flexible Generation: Backing up Renewables" Published as part of EURELECTRIC Renewables Action Plan (RESAP) NEA 2012 "Nuclear Energy and Renewables: System Effects in Low-carbon Electricity Systems" Nuclear Energy Agency ISBN 978-92-64-18851-8
- Frontier Economics "Study on flexibility in the Dutch and NW European power market in 2020" April 2010
http://www.energie-nederland.nl/wp-content/uploads/2011/01/344_Frontier-study-report.pdf
- GE Energy, 2010: *Western Wind and Solar Integration Study*. Golden, CO: National Renewable Energy Laboratory, New York, May, 536pp.
<http://www.nrel.gov/wind/systemsintegration/wwsis.html>
- Holttinen, H., O'Malley, M., Dillon, J., Flynn, D., Keane, A., Abildgaard, H. and Söder, L., "Steps for a Complete Wind Integration Study", *46th Hawaii International Conference on System Sciences*, Maui, Hawaii, January 2013.
- Holttinen, H, Antje Orths, Hans Abildgaard, Frans van Hulle, Juha Kiviluoma, Bernhard Lange, Mark O'Malley, Damian Flynn, Andrew Keane, Jody Dillon, Enrico Maria Carlini, John Olav Tande, Ana Estanqueiro, Emilio Gomez Lazaro, Lenart Söder, "IEA wind Recommended Practices, Wind Integration Studies", International Energy Agency, Sept 2013.
http://www.ieawind.org/Task_25/PDF/HomePagePDF%27s/RP%2016%20Wind%20Integration%20Studies_Approved%20091213.pdf
- Holttinen, H, Kiviluoma, J., Robitaille, A., Cutululis, N.A., Orths, A., van Hulle, F., Pineda, I., Lange, B., O'Malley, M., Dillon, J., Carlini, E.M., Vergine, C., Kondoh, J., Gibescu, M., Tande, J.O., Estanqueiro, A., Gomez, E., Söder, L., Smith, J.C., Milligan, M. and Lew, D., "Design and operation of power systems with large amounts of wind power. Final summary report, IEA WIND Task 25, Phase two 2009–2011, 2013.
<http://www.vtt.fi/inf/pdf/technology/2012/T75.pdf>
- Holttinen, H.. Meibom, P., Orths, A., van Hulle, F., Lange, B., O'Malley, M., Pierik, J., Ummels, B., Tande, J., Estanqueiro, A., Matos, M., Gomez, E., Soder, L., Strbac, G., Shakoor, A., Ricardo, J., Smith, C., Milligan, M., Ela, E. Design and operation of power systems with large amounts of wind power. IEA Task 25 Final report, Phase one 2006-08, 2009. <http://www.ieawind.org/AnnexXXV/PDF/Final%20Report%20Task%2025%202008/T2493.pdf>
- IEA 2008 "Empowering Variable Renewables – Options for Flexible Electricity Systems" .
http://www.iea.org/g8/2008/Empowering_Variable_Renewables.pdf

Reading Material # 3

- Kiviluoma, J., Meibom, P.; "Influence of wind power, plug-in electric vehicles, and heat storages on power system investments" Energy, Volume 35, Issue 3, March 2010, Pages 1244-1255.
- Krewitt, W., P. Mercado, R. Sims, G. Bhuyan, D. Flynn, H. Holttinien, G. Jannuzzi, S. Khennas, Y. Liu, L. J. Nilsson, J. Ogden, K. Ogimoto, M. O'Malley, H. Outhred, Ø. Ulleberg, F. van Hulle, 2011: Integration of Renewable Energy into Present and Future Energy Systems. In IPCC Special Report on Renewable Energy Sources and Climate Change Mitigation [O. Edenhofer, R. Pichs-Madruga, Y. Sokona, K. Seyboth, P. Matschoss, S. Kadner, T. Zwickel, P. Eickemeier, G. Hansen, S. Schlömer, C. v. Stechow (eds)], Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA. http://srren.ipcc-wg3.de/report/IPCC_SRREN_Ch08
- Krishnan, V.; Das, T.; Ibanez, E.; Lopez, C.A.; McCalley, J.D., "Modeling Operational Effects of Wind Generation Within National Long-Term Infrastructure Planning Software," *Power Systems, IEEE Transactions on* , vol.28, no.2, pp.1308,1317, May 2013 doi:10.1109/TPWRS.2012.2216293
- Lalor, G., Mullane, A., and O'Malley, M.J., "Frequency Control and Wind Turbine Technologies", *IEEE Transactions on Power Systems* , Vol. 20, pp. 1903 – 1913, 2005.
- Lannoye, E.; Flynn, D.; O'Malley, M.; , "Evaluation of Power System Flexibility," *Power Systems, IEEE Transactions on* , vol.27, no.2, pp.922-931, May 2012.
- Lannoye, Eamonn; Flynn, Damian; O'Malley, Mark; , "Power system flexibility assessment — State of the art," *Power and Energy Society General Meeting, 2012 IEEE* , vol., no., pp.1-6, 22-26 July 2012
<http://ieeexplore.ieee.org/stamp/stamp.jsp?tp=&arnumber=6345375&isnumber=6343905>
- Ma, J.; Silva, V.; Belhomme, R.; Kirschen, D. S.; Ochoa, L. F.; , "Evaluating and Planning Flexibility in Sustainable Power Systems," *Sustainable Energy, IEEE Transactions on* , vol.4, no.1, pp.200-209, Jan. 2013 doi: 10.1109/TSTE.2012.2212471
- Mackay, M., Bird, L., Cochran, J., Milligan, M., Bazilian, M., Neuhoff, K., Denny, E., Dillon, J., Bialek, J. and O'Malley, M.J., "RES-E-NEXT, Next Generation of RES-E Policy Instruments", IEA RETD, July 2013.
http://iea-retd.org/wp-content/uploads/2013/07/RES-E-NEXT_IEA-RETD_2013.pdf
- Matthias, C. et al. Security and Sustainability of Power Supply – Benefits of HVDC & FACTS for System Interconnection and Power Transmission Enhancement
http://www.ptd.siemens.de/Presentation_Security%20&%20Sustainability_PowerGrid_08-06_V%201.pdf

Reading Material #4

- Milligan, M., Donohoo, P., Lew, D., Ela, E., Kirby, B., Holttinen, H., Lannoye, E., Flynn, D., O'Malley, M., Miller, N., Eriksen., P.B., Gottig A., Rawn, B., Gibescu, M., Lázaro, E.G., Robitaille, A., Kamwa, I., NREL, "Operating Reserves and Wind Power Integration: An International Comparison Preprint", National Renewable Energy Laboratory, <http://www.osti.gov/bridge>, October, 2010.
- Mills, A. D, and R. H. Wiser. 2011. Implications of geographic diversity for short-term variability and predictability of solar power. In 2011 IEEE Power and Energy Society General Meeting, 1-9. IEEE, July 24. doi:10.1109/PES.2011.6039888
- NEA 2012 "Nuclear Energy and Renewables: System Effects in Low-carbon Electricity Systems" Nuclear Energy Agency ISBN 978-92-64-18851-8
- NERC (2010a). *Special Report: Flexibility Requirements and Potential Metrics for Variable Generation, Implications for System Planning Studies*. North American Electric Reliability Corporation, Princeton, NJ, USA.
http://www.nerc.com/docs/pc/ivgtf/IVGTF_Task_1_4_Final.pdf
- NERC, 2010B: Special Report: Potential Reliability Impacts of Emerging Flexible Resources. August 2010, 57pp.
http://www.nerc.com/files/IVGTF_Task_1_5_Final.pdf
- NERC, Special Report: Flexibility Requirements and Potential Metrics for Variable Generation: Implications for System Planning Studies, August, 2010. http://www.nerc.com/docs/pc/ivgtf/IVGTF_Task_1_4_Final.pdf
- NERC, "Special Report: Accommodating High Levels of Variable Generation", April 2009. http://www.nerc.com/files/ivgtf_report_041609.pdf
- NERC, "Special Report: Methods to Model and Calculate Capacity Contributions of Variable Generation for Resource Adequacy Planning", March 2011. <http://www.nerc.com/docs/pc/ivgtf/IVGTF1-2.pdf>
- Papaefthymiou, G.; Hasche, B.; Nabe, C., "Potential of Heat Pumps for Demand Side Management and Wind Power Integration in the German Electricity Market," *Sustainable Energy, IEEE Transactions on* , vol.3, no.4, pp.636,642, Oct. 2012 doi: 10.1109/TSTE.2012.2202132
- Prabha Kundur, John Paserba, Venkat Ajjarapu, Göran Andersson, Anjan Bose, Claudio Canizares, Nikos Hatziargyriou, David Hill, Alex Stankovic, Carson Taylor, Thierry Van Cutsem and Vijay Vittal. "Definition and Classification of Power System Stability" IEEE/CIGRE Joint Task Force on Stability Terms and Definitions, *IEEE transactions on Power Systems*, Vol. 19, pp. 1387 – 1401, 2004.
- Rutledge, L.; Miller, N. W.; O'Sullivan, J.; Flynn, D.; , "Frequency Response of Power Systems With Variable Speed Wind Turbines," *Sustainable Energy, IEEE Transactions on* , vol.3, no.4, pp.683-691, Oct. 2012.

Reading Material # 5

- Troy, N., Denny, E. and O'Malley, M.J. "Base load cycling on a system with significant wind penetration", *IEEE Trans. Power Syst.*, Vol. 25, pp. 1088 - 1097, 2010.
- Troy, N., Flynn, D. and O'Malley, M.J., "Multi-mode Operation of Combined-Cycle Gas Turbines with Increasing Wind Penetration", *IEEE Transactions on Power Systems*, Vol. 27, pp. 484 - 492, 2012.
- Troy, N., Flynn, D., Milligan, M. and O'Malley, M.J., "Unit commitment with Dynamic Cycling costs", *IEEE Transactions on Power Systems*, Vol. 27, pp. 2196-2205, 2012.
- Tuohy, A. and O'Malley, M.J., "Pumped Storage in Systems with Very High Wind Penetration", *Energy Policy*, Vol. 39, pp. 1965-1974, 2011.
- UCTE, Final Report of the Investigation Committee on the 28th September 2003 Blackout in Italy
- Van Hertem, D., Ghandhari, M., "Multi-terminal VSC HVDC for the European supergrid: Obstacles", *Renewable and Sustainable Energy Reviews* 14 (2010) 3156–3163
- Wiser, R., Z. Yang, M. Hand, O. Hohmeyer, D. Infield, P. Hjuler Jensen, V. Nikolaev, M. O'Malley, G. Sinden, A. Zervos, 2011: Wind Energy. In IPCC Special Report on Renewable Energy Sources and Climate Change Mitigation [O. Edenhofer, R. Pichs-Madruga, Y. Sokona, K. Seyboth, P. Matschoss, S. Kadner, T. Zwickel, P. Eickemeier, G. Hansen, S. Schlömer, C. v. Stechow (eds)], Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA.
http://srren.ipcc-wg3.de/report/IPCC_SRREN_Ch07
- Wiser and Bollinger (2013), "Wind Technologies Market Report, 2012" US DOE Energy Efficiency and Renewable Energy,
http://www1.eere.energy.gov/wind/pdfs/2012_wind_technologies_market_report.pdf
- Wiser and Bollinger (2011), "Wind Technologies Market Report" US DOE Energy Efficiency and Renewable Energy
http://www1.eere.energy.gov/wind/pdfs/2011_wind_technologies_market_report.pdf
- Xu, L. and Tretheway, D. Flexible Ramping Products, California ISO.
<http://www.caiso.com/Documents/DraftFinalProposal-FlexibleRampingProduct.pdf>
- Y. Yasuda et al.: "Flexibility Chart – Evaluation on Diversity of Flexibility in Various Areas", 13th Wind Integration Workshop, WIW13-1029, (2013, 10, London).