

# Harvesting Renewable Energy The Grid Integration Challenge

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IEEE DLP, 19<sup>th</sup> May 2011

Zagreb



# Mark O'Malley

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- Professor of Electrical Engineering at University College Dublin (UCD)
- Founder and Director of the Electricity Research Centre (<http://ee.ucd.ie/erc> )
- Royal Irish Academy
- Fellow of the Institute of Electrical and Electronic Engineers (IEEE)
  - IEEE Ethics and Member Conduct Committee.
  - Chair of the IEEE Power and Energy Society Task Force on Capacity Value of Wind
  - Editorial Board of the IEEE Transactions on Power Systems
  - IEEE Power Engineering Society Wind Power Coordinating Committee
  - IEEE distinguished lecturer in the grid integration of renewable energy
- European Academy of Sciences Advisory Council Energy Panel and is the
- North American Electric Reliability Corporation Task Force on Integrating Variable Generation
- International Energy Agency Research Task 25: Design and Operation of Power Systems with Large Amounts of Wind Power
- International Panel on Climate Change Special Report on Renewable Energy Sources and Climate Change Mitigation.
- Wind Integration Studies: All Island Grid Study; Eastern Wind Integration and Transmission Study; Western Wind and Solar Integration Study.

# Electricity Research Centre (ERC), Industry Members

3



Other stakeholders on ERC board:



Department of Communications  
Energy & Natural Resources

Major Funding sources:



# Electricity Research Centre (ERC), 2011

4



Prof. Mark O'Malley



Dr. Ciara O'Connor



Ms. Magdalena  
Szczepanska



Ms. Rachael O' Hegarty

ERC has four research strands across two institutions, UCD and TCD:

- **Operations**

Dr. Damian Flynn



- **Networks**

Dr. Andrew Keane



- **Economics**

Dr. Eleanor Denny  
(TCD)



- **Systems**

Prof. Mark O'Malley



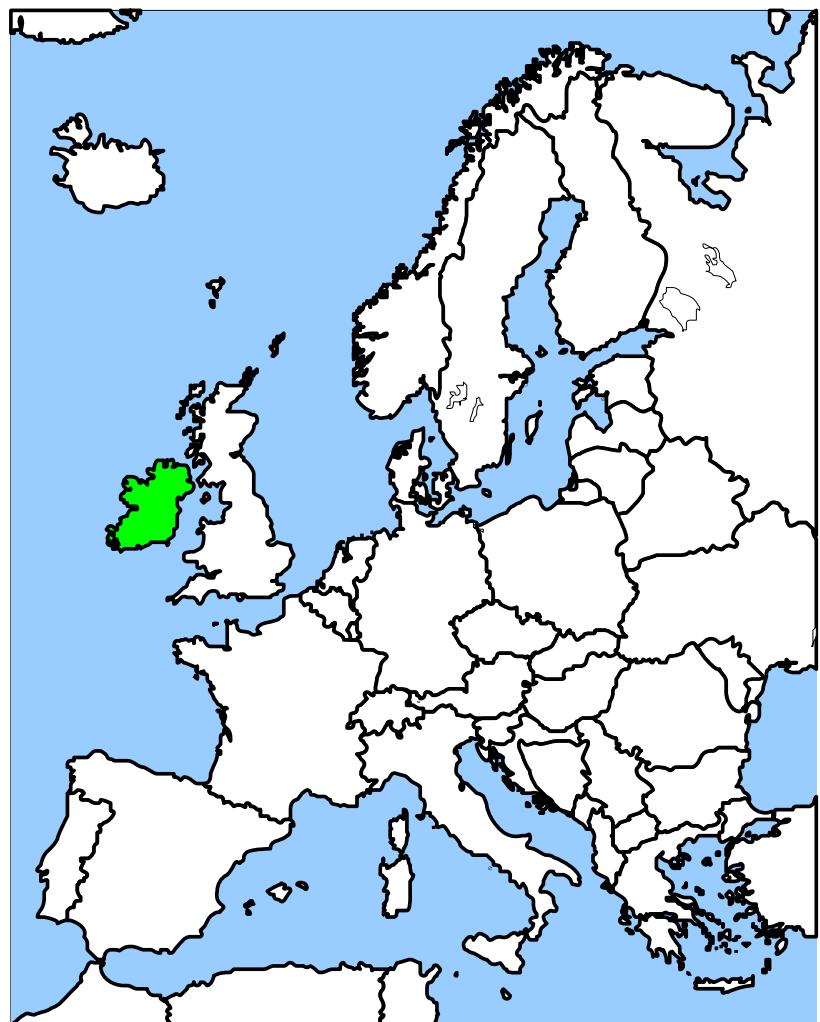


Ireland has a unique renewable  
resource & technical environment

# Ireland: All Island Grid

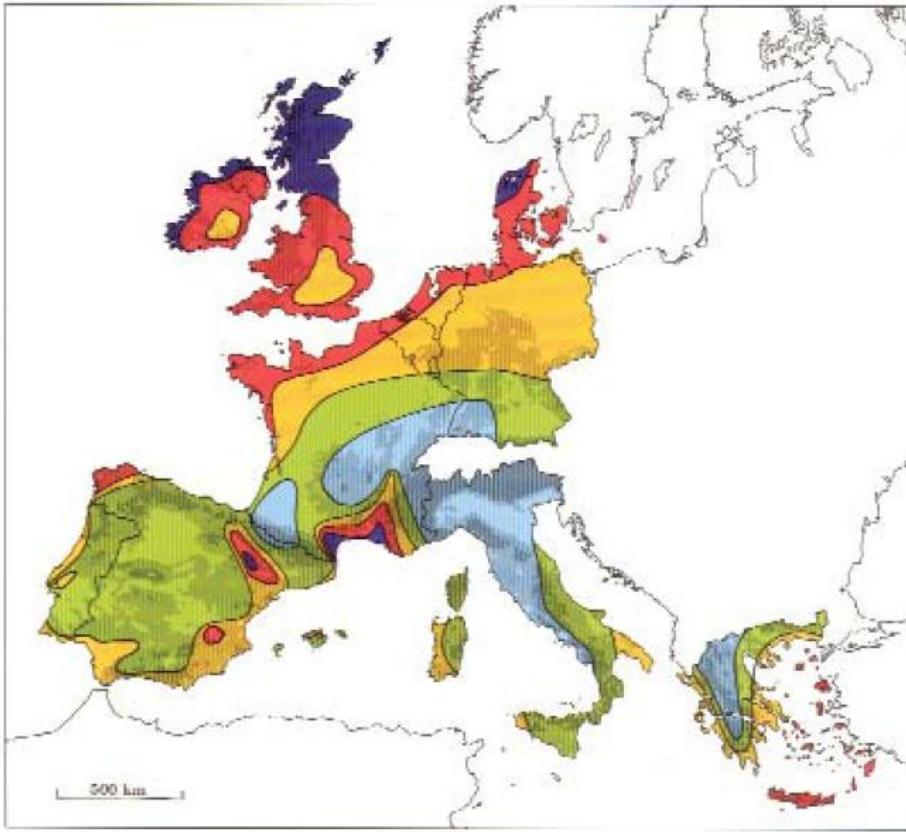
6

- Republic of Ireland (RoI) & Northern Ireland
- 9.7 GW Installed
- 1.8 GW Wind (**> 10 % energy**)
- 450 HVDC to GB
- Max load: 6.5 GW
- Min load: 2.4 GW



# European Wind Resources

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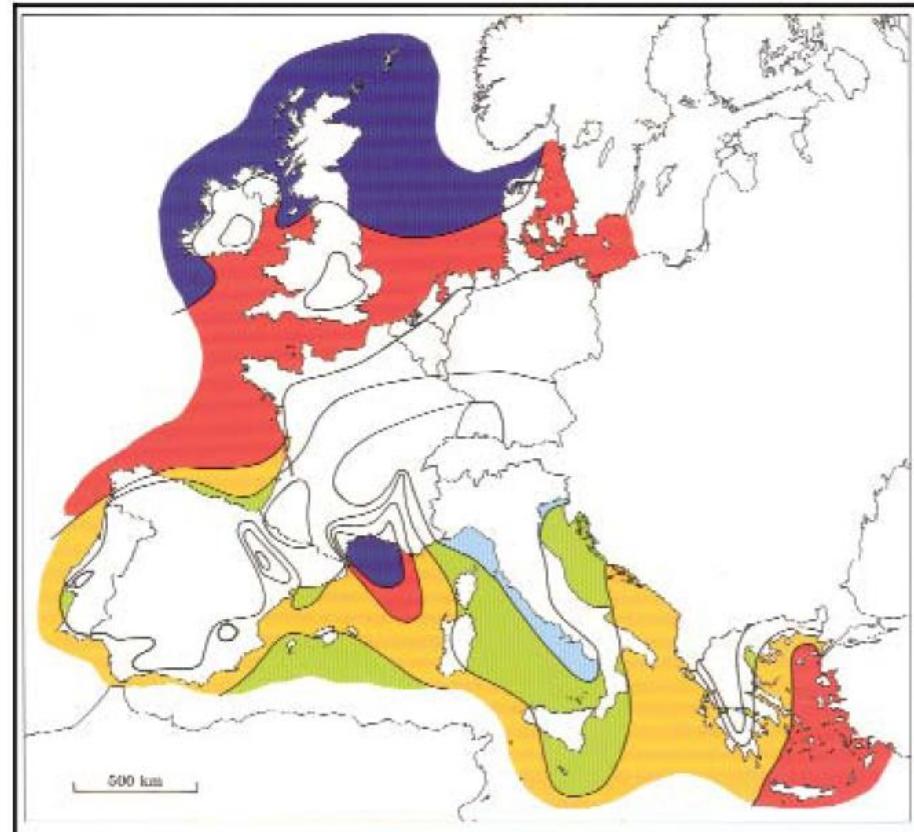


Wind resources<sup>1</sup> at 50 metres above ground level for five different topographic conditions

Sheltered terrain <sup>2</sup>		Open plain <sup>3</sup>		At minor coast <sup>4</sup>		Open sea <sup>5</sup>		Hills and ridges <sup>6</sup>	
ms <sup>-1</sup>	Wm <sup>-2</sup>	ms <sup>-1</sup>	Wm <sup>-2</sup>	ms <sup>-1</sup>	Wm <sup>-2</sup>	ms <sup>-1</sup>	Wm <sup>-2</sup>	ms <sup>-1</sup>	Wm <sup>-2</sup>
> 6.0	> 250	> 7.5	> 500	> 8.5	> 700	> 9.0	> 800	> 11.5	> 1800
5.0-6.0	150-250	6.5-7.5	800-500	7.0-8.5	400-700	8.0-9.0	600-800	10.0-11.5	1200-1800
4.5-5.0	100-150	5.5-6.5	200-300	6.0-7.0	250-400	7.0-8.0	400-600	8.5-10.0	700-1200
3.5-4.5	50-100	4.5-5.5	100-200	5.0-6.0	150-250	5.5-7.0	200-400	7.0-8.5	400-700
< 3.5	< 50	< 4.5	< 100	< 5.0	< 150	< 5.5	< 200	< 7.0	< 400

Onshore

Sustainable development commission, Wind Power in the UK, 2005



Wind resources over open sea (more than 10 km offshore) for five standard heights

10 m		25 m		50 m		100 m		200 m	
ms <sup>-1</sup>	Wm <sup>-2</sup>								
> 8.0	> 600	> 8.5	> 700	> 9.0	> 800	> 10.0	> 1100	> 11.0	> 1500
7.0-8.0	350-600	7.5-8.5	450-700	8.0-9.0	600-800	8.5-10.0	650-1100	9.5-11.0	900-1500
6.0-7.0	250-350	6.5-7.5	300-450	7.0-8.0	400-600	7.5-8.5	450-850	8.0-9.5	800-900
4.5-6.0	100-250	5.0-6.5	150-300	5.5-7.0	200-400	6.0-7.5	250-450	6.5-8.0	300-600
< 4.5	< 100	< 5.0	< 150	< 5.5	< 200	< 6.0	< 250	< 6.5	< 300

Offshore

# Wind Stats 2009

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	<b>Capacity (MW)<sup>#</sup></b>	<b>Energy (%)<sup>#</sup></b>	<b>Wind capacity factor (%)<sup>*</sup></b>	<b>System</b>
Denmark	3,480	19.3 %	22.8	Continental Europe & Nordel
Spain	19,149	14.4 %	24.8	Continental Europe
Portugal	3,616	15%	22.7	Continental Europe
Republic of Ireland	1,264	10.5 %	29.3	Island of Ireland
Germany	25,777	6.5 %	17.5	Continental Europe
United Kingdom	4,051	1.7%	26.1	England, Scotland, Wales & Island of Ireland
USA	35,086	1.9%		
China	26,010 <sup>^^</sup>	1% <sup>^^</sup>		

<sup>#</sup> IEA, Wind Energy, Annual Report, 2009

<sup>\*</sup> Boccard, Nicolas, Capacity Factor of Wind Power: Realized Values vs. Estimates (October 25, 2008). Available at SSRN: <http://ssrn.com/abstract=1285435>

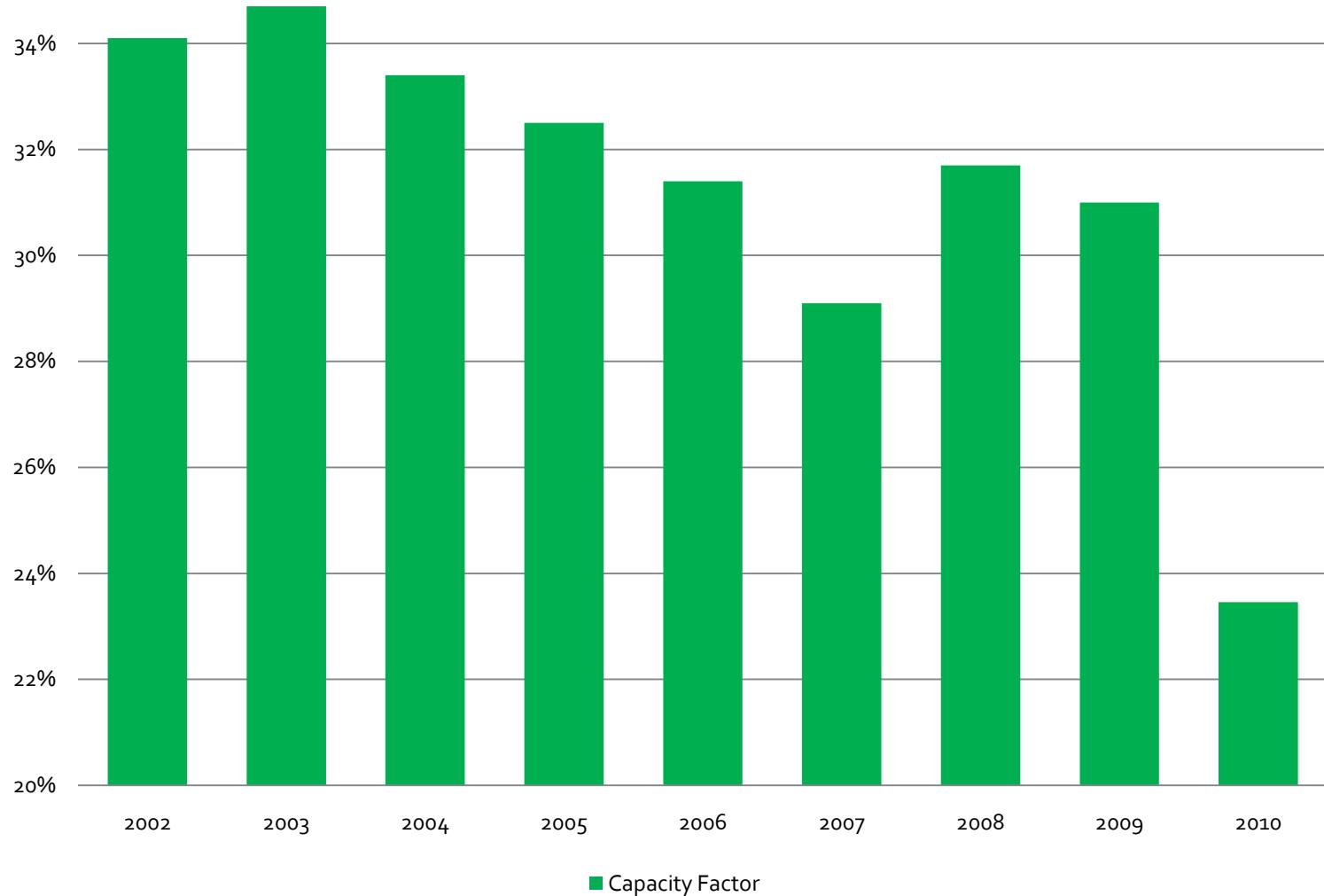
<sup>^^</sup> World Wind Energy Report 2009, WWEA

<sup>^^</sup> <http://energy-statistics.blogspot.com/2010/10/china-wind-energy-statistics.html>

# Capacity factor (Republic of Ireland)

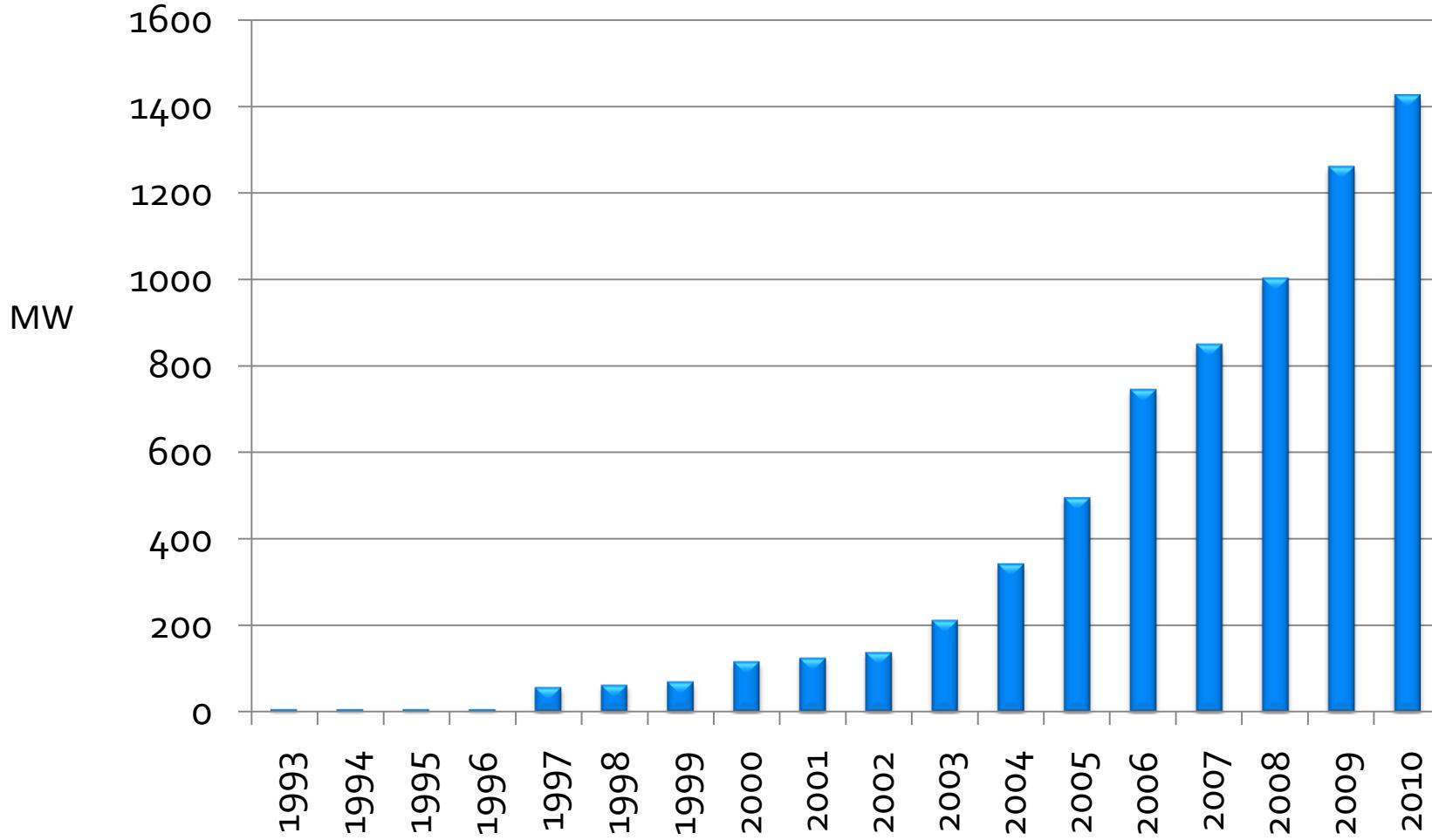
9

Wind Capacity Factor



# Wind Installed in Republic of Ireland

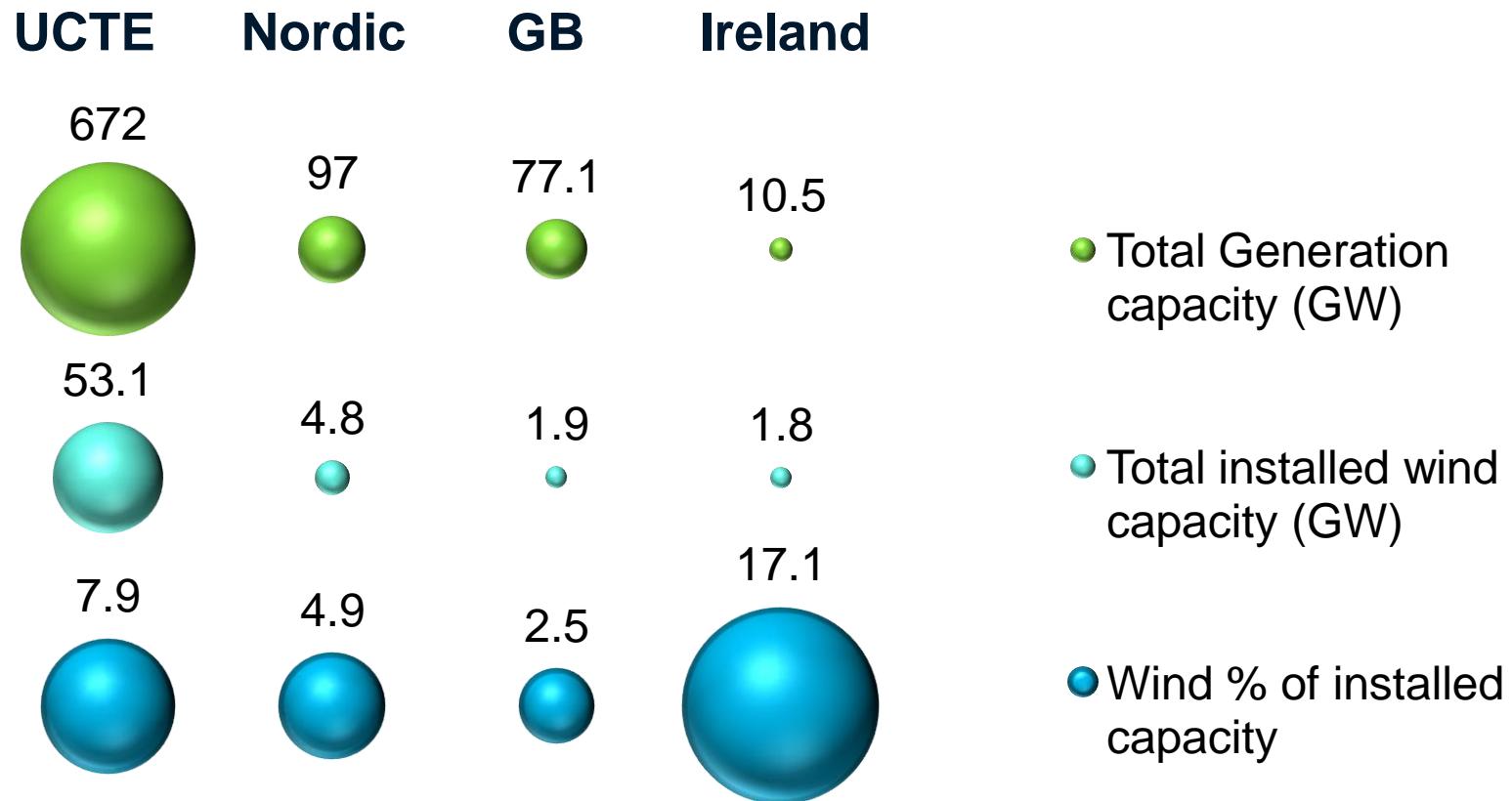
10



Source: EirGrid

# Ireland: Very High Wind Penetration

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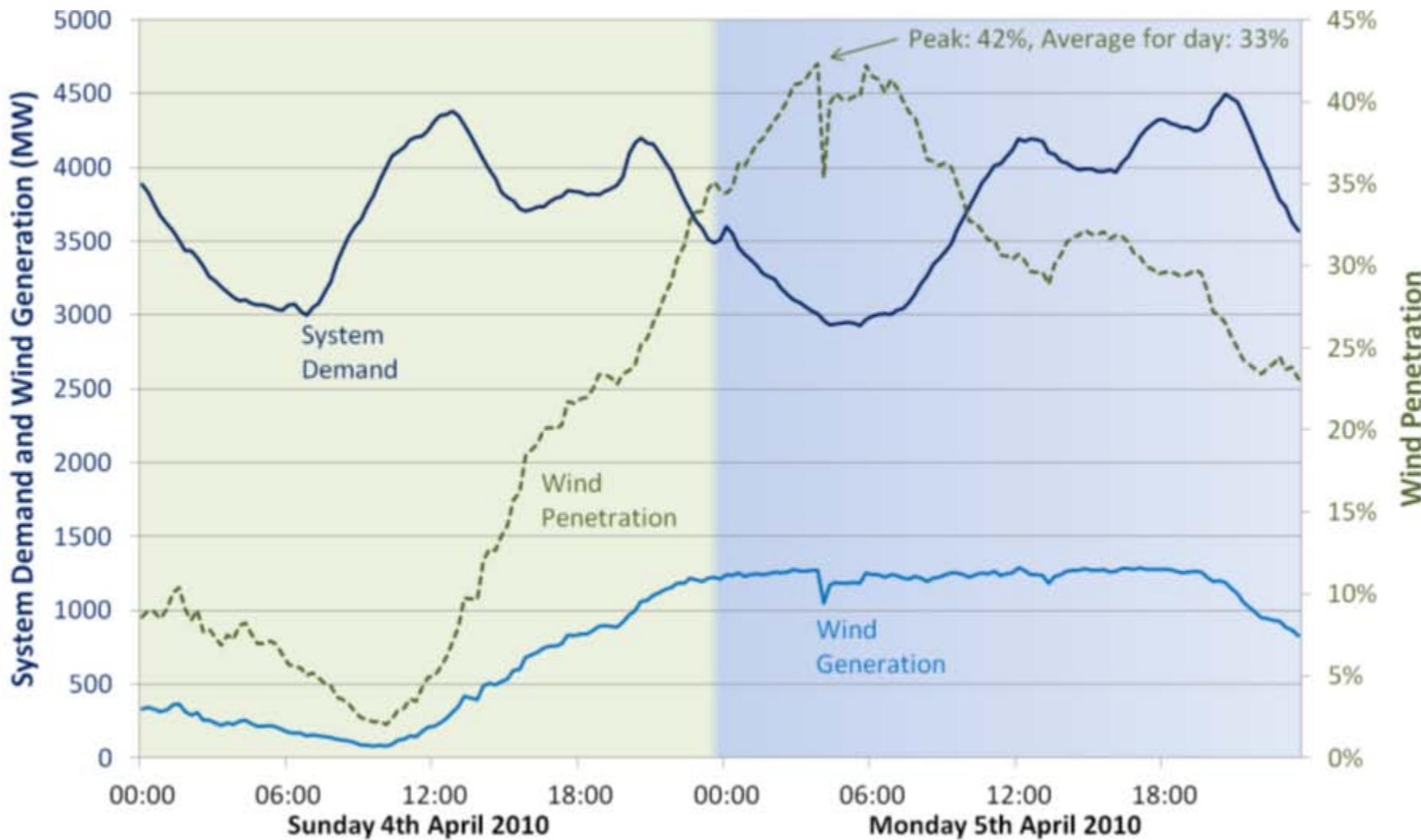


Figures for end 2008

Source: Global wind energy outlook 2008, EirGrid, UK National Grid, NORDEL, Eurelectric

# Wind in Republic of Ireland, April 2010

12

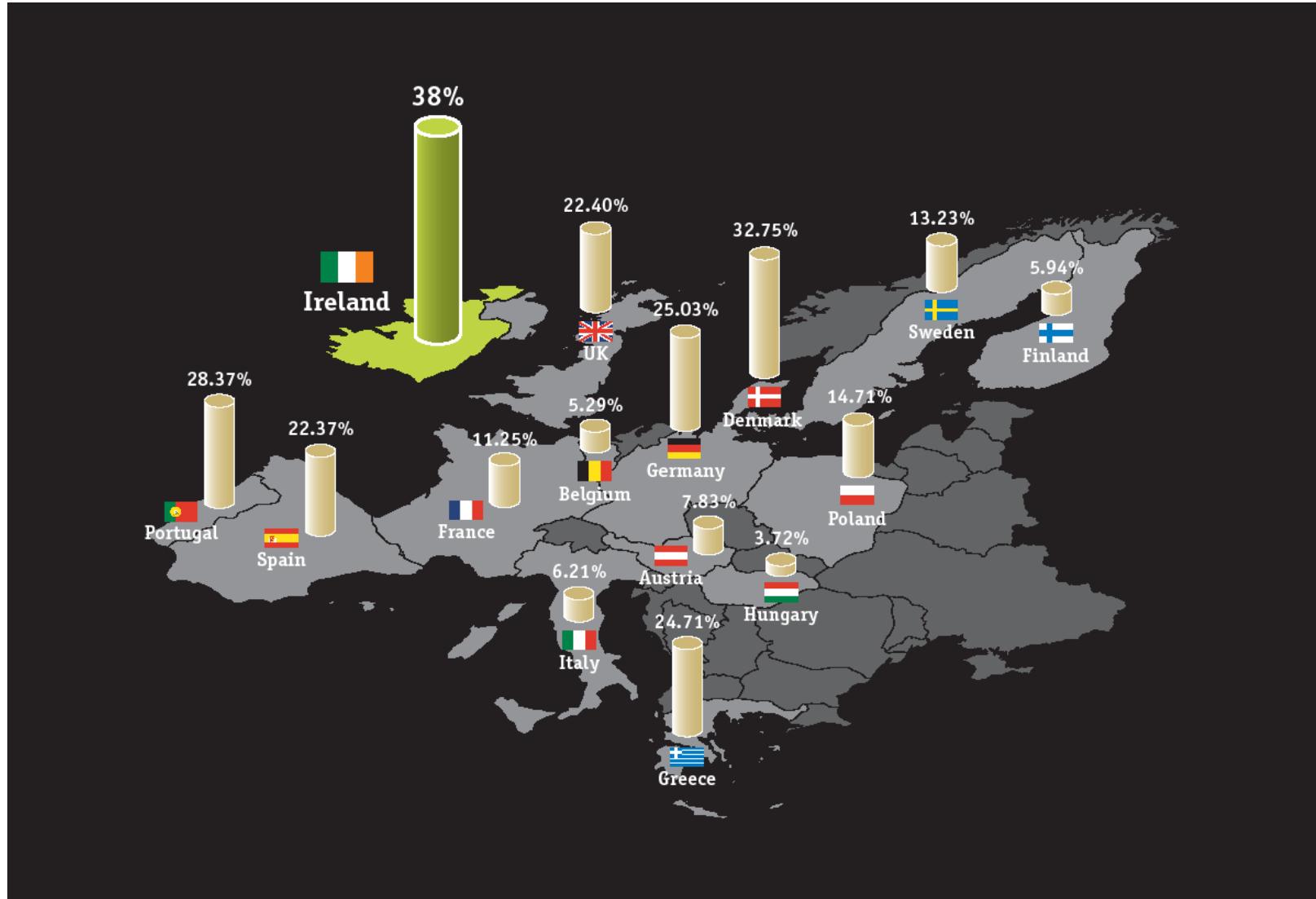


~1 .2 GW wind power change in 18 hours  
(2 % to 42 % penetration)

All island data from EirGrid & SONI

# EU Targets 2020 - Wind energy as % of electricity

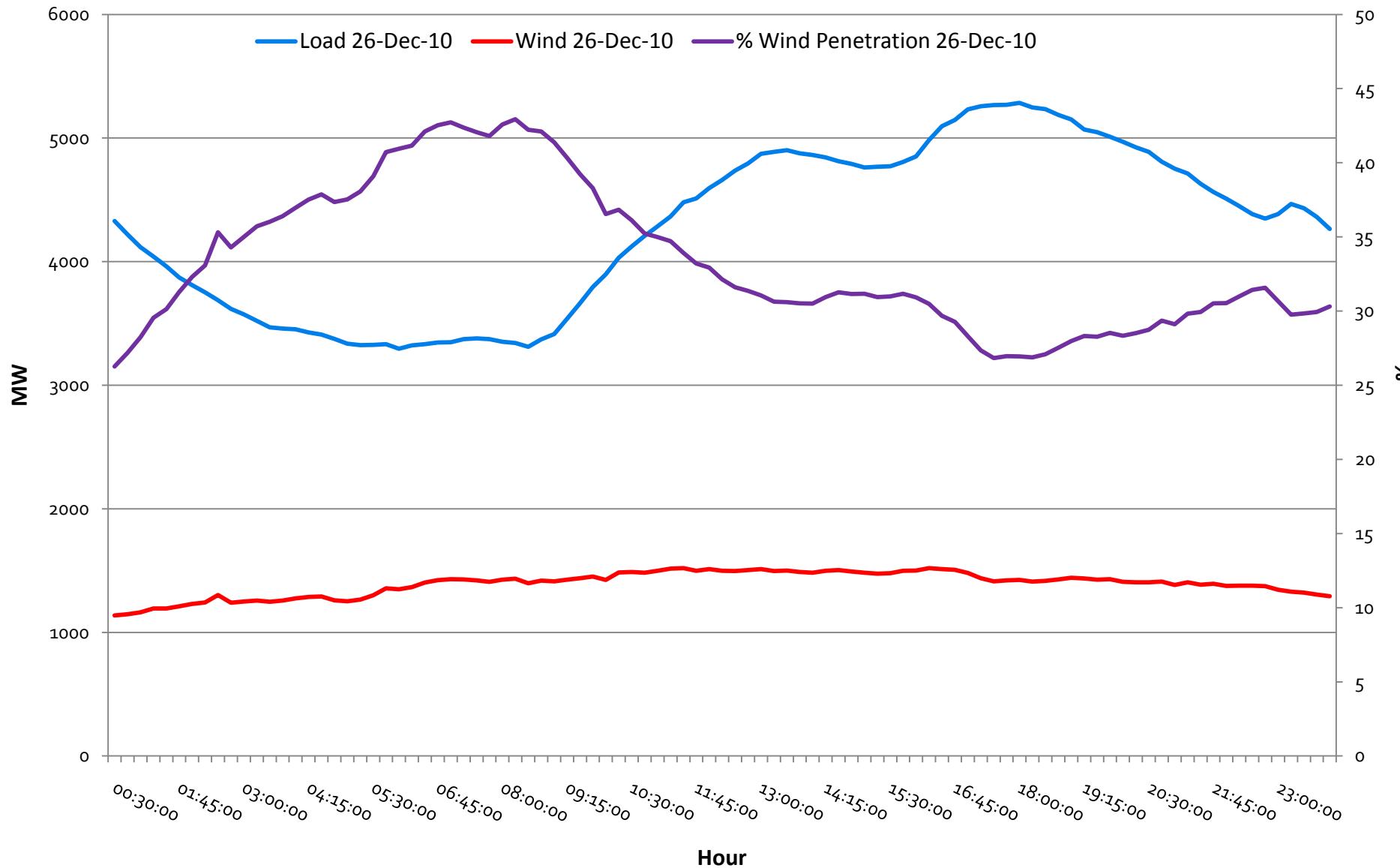
13



# Wind characteristics in Ireland

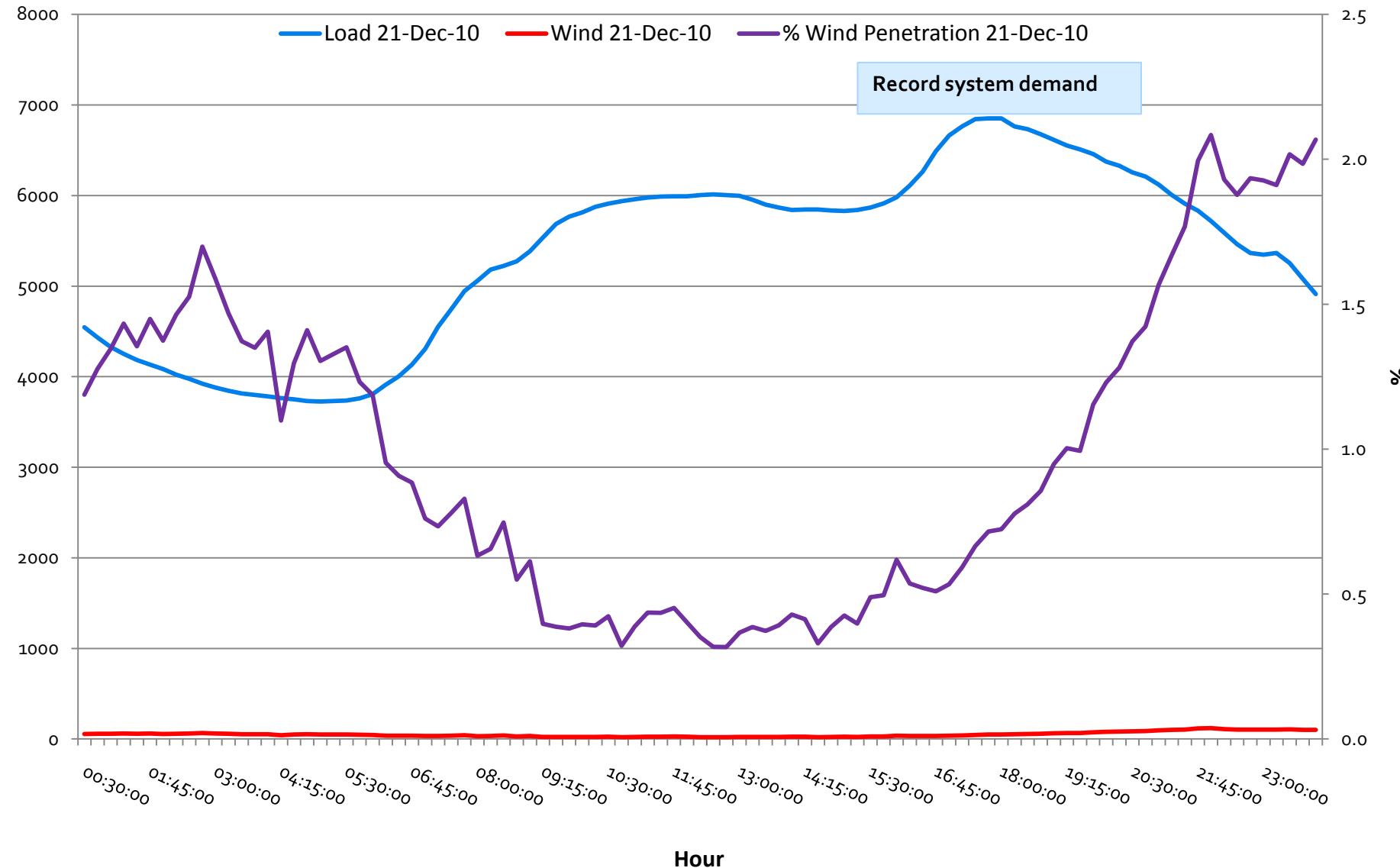
# Ireland – Demand, Wind and Penetration -26 Dec 2010

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# Ireland Wind & Load (21 Dec 2010)

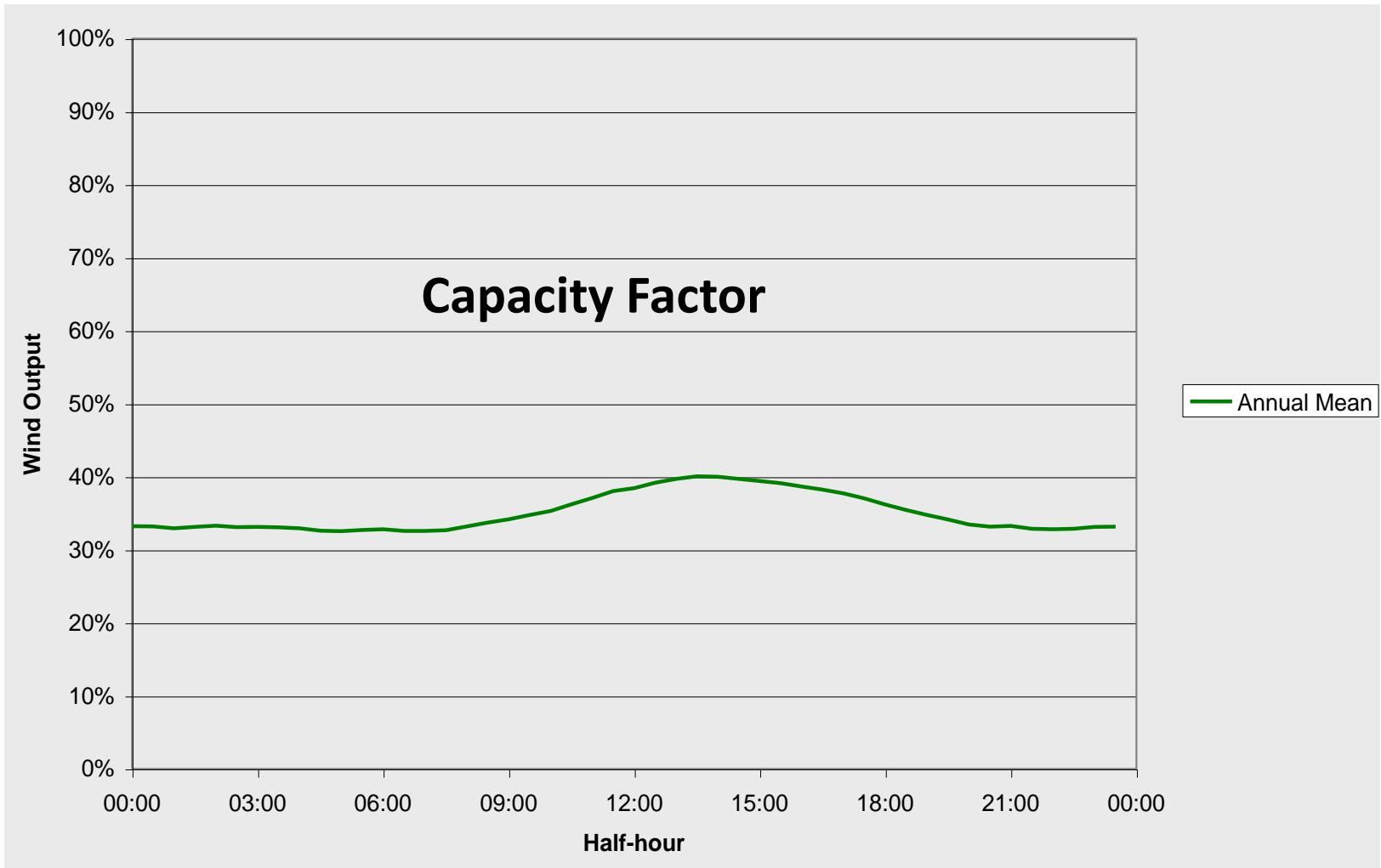
16



# Wind Generation in Ireland

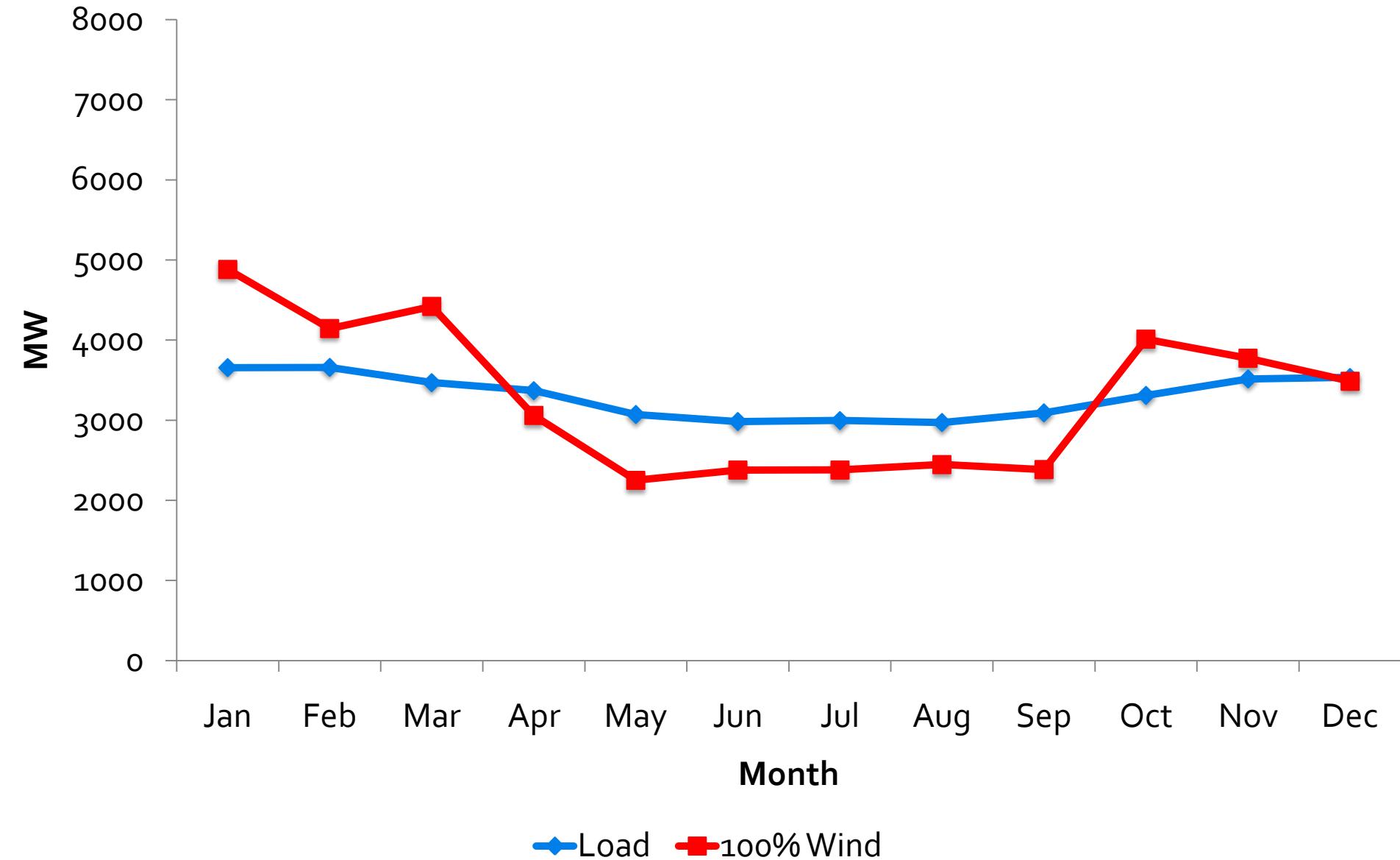
17

## *Annual Mean Wind Output*



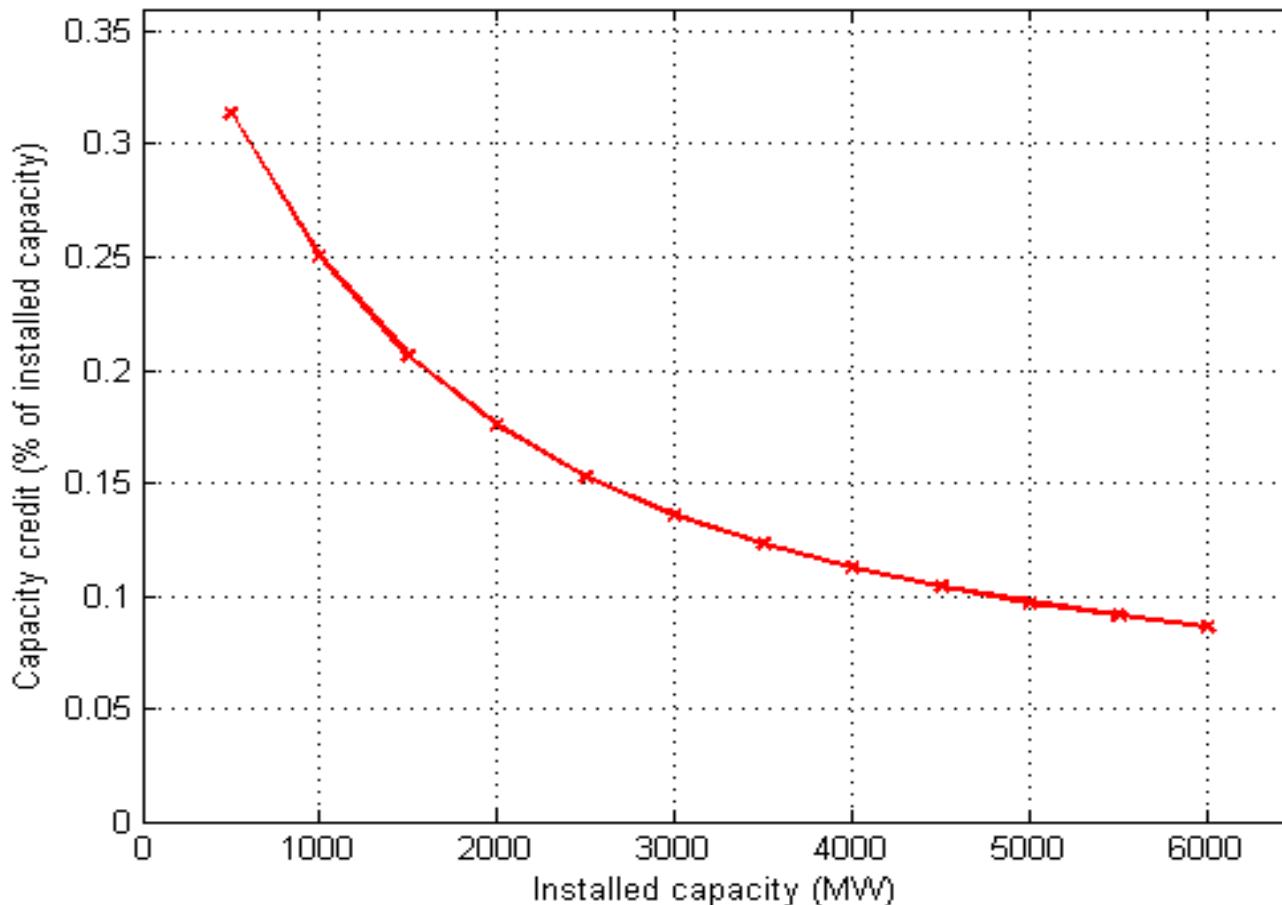
# Yearly load & 100 % Wind

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# Capacity Credit Ireland

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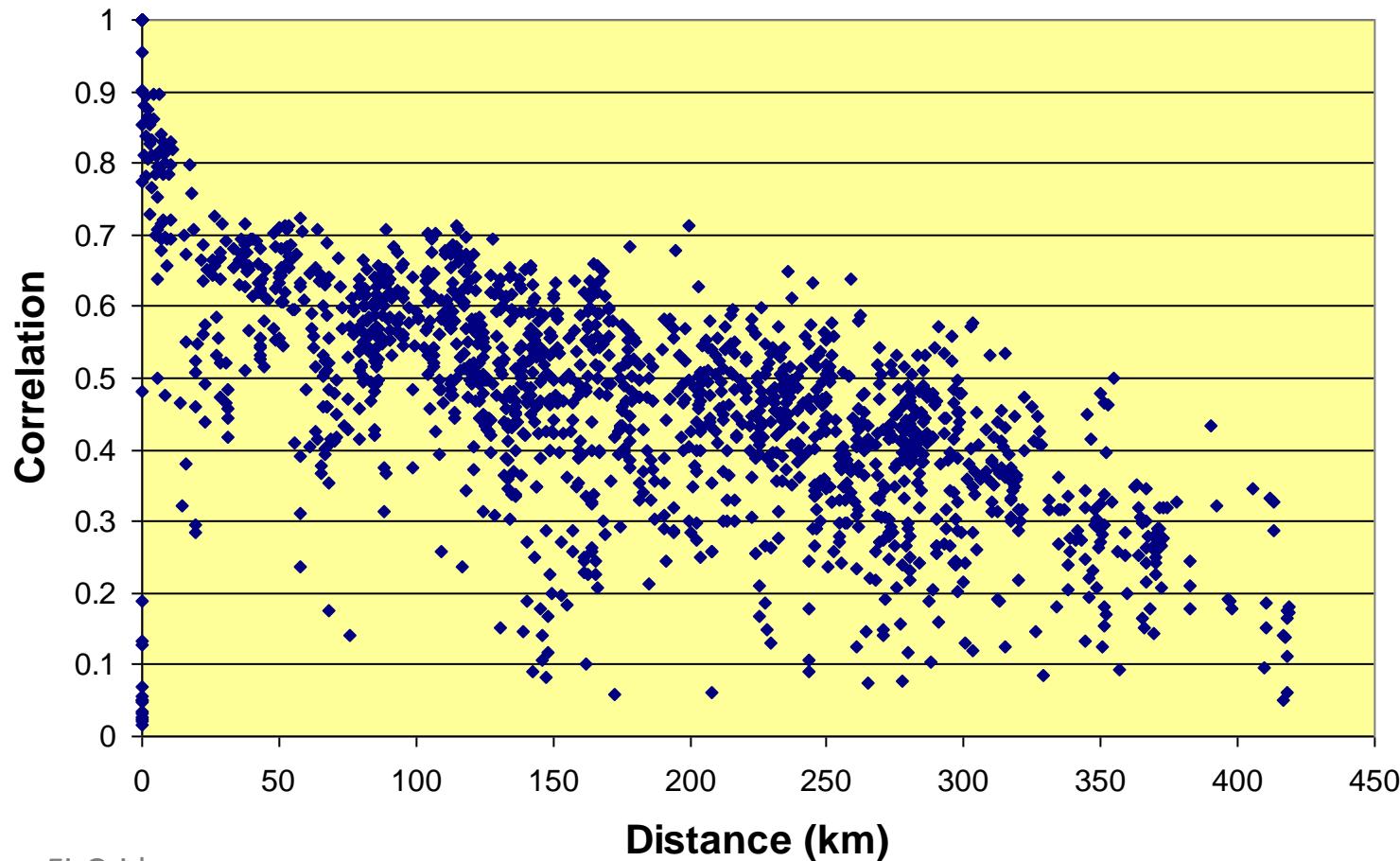


Keane, A., Milligan, M., D'Annuzio, C., Dent, C., Dragoon, K., Hasche, B., Holttinen, Samaan, N., Soder, L. and O'Malley, M.J., "Capacity Value of Wind Power, *IEEE Transactions on Power Systems*, Vol. 26, pp. 564 - 572, 2011.

# Correlation Between Wind Farms

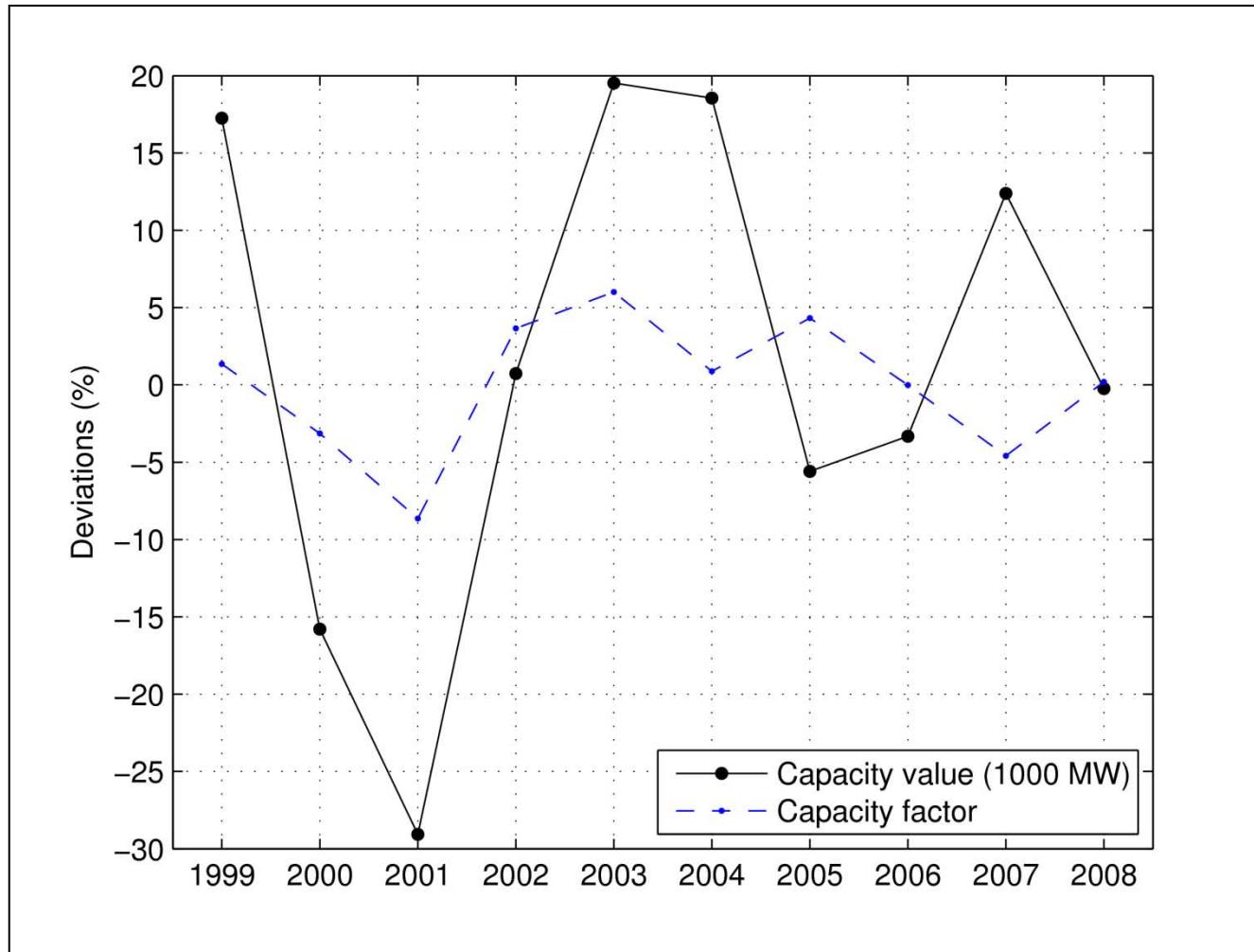
20

Correlation Between Farm Output vs. Distance  
between them (km)



Source: EirGrid

# Yearly variations



Hasche, B., Keane, A. and O'Malley, M.J. "Capacity credit of wind power: calculation and data requirements", *IEEE Trans. Power Syst.*, Vol. 26, pp. 420 - 430, 2011.

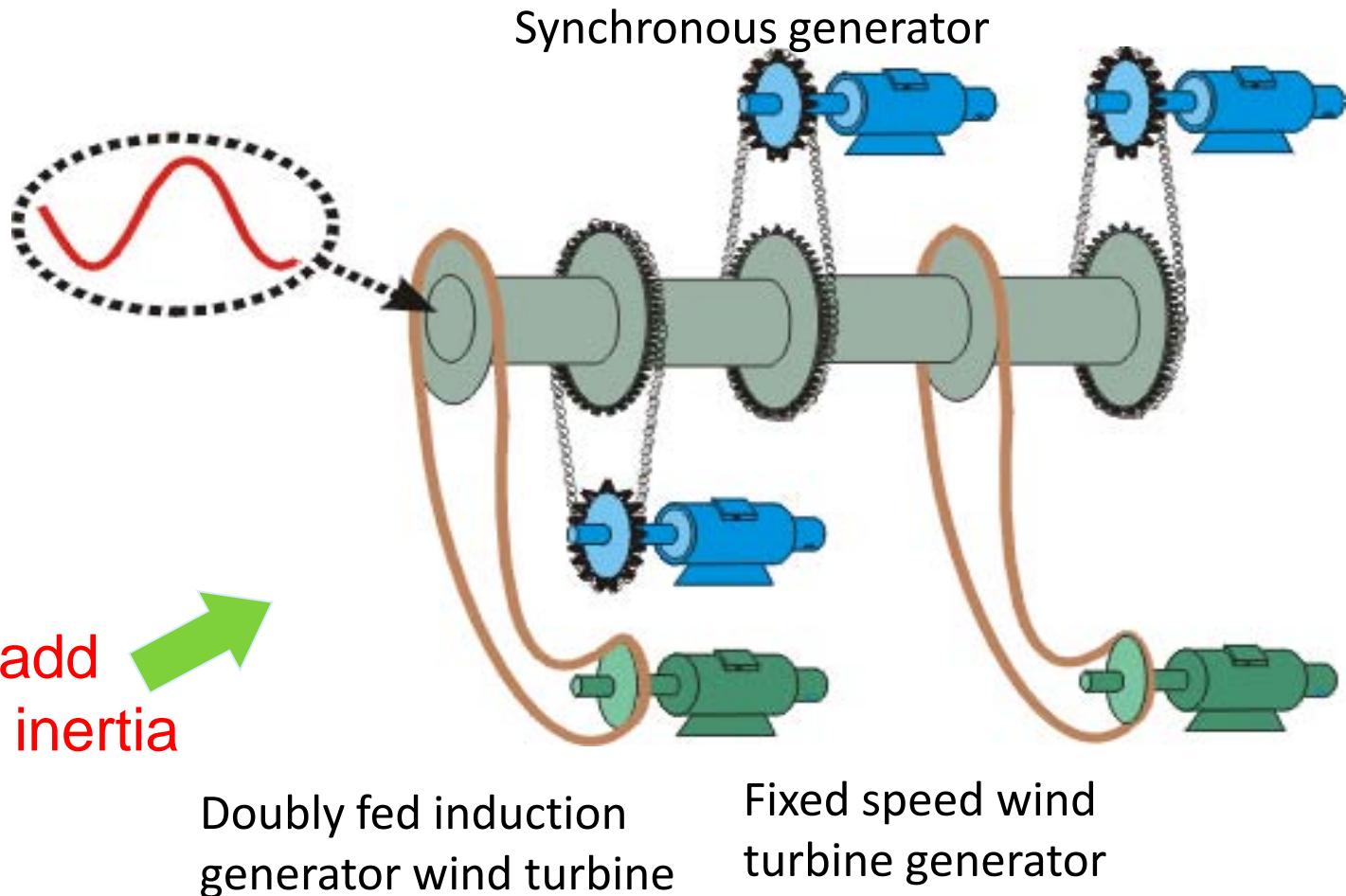
# Frequency control & inertia

# Frequency control

23

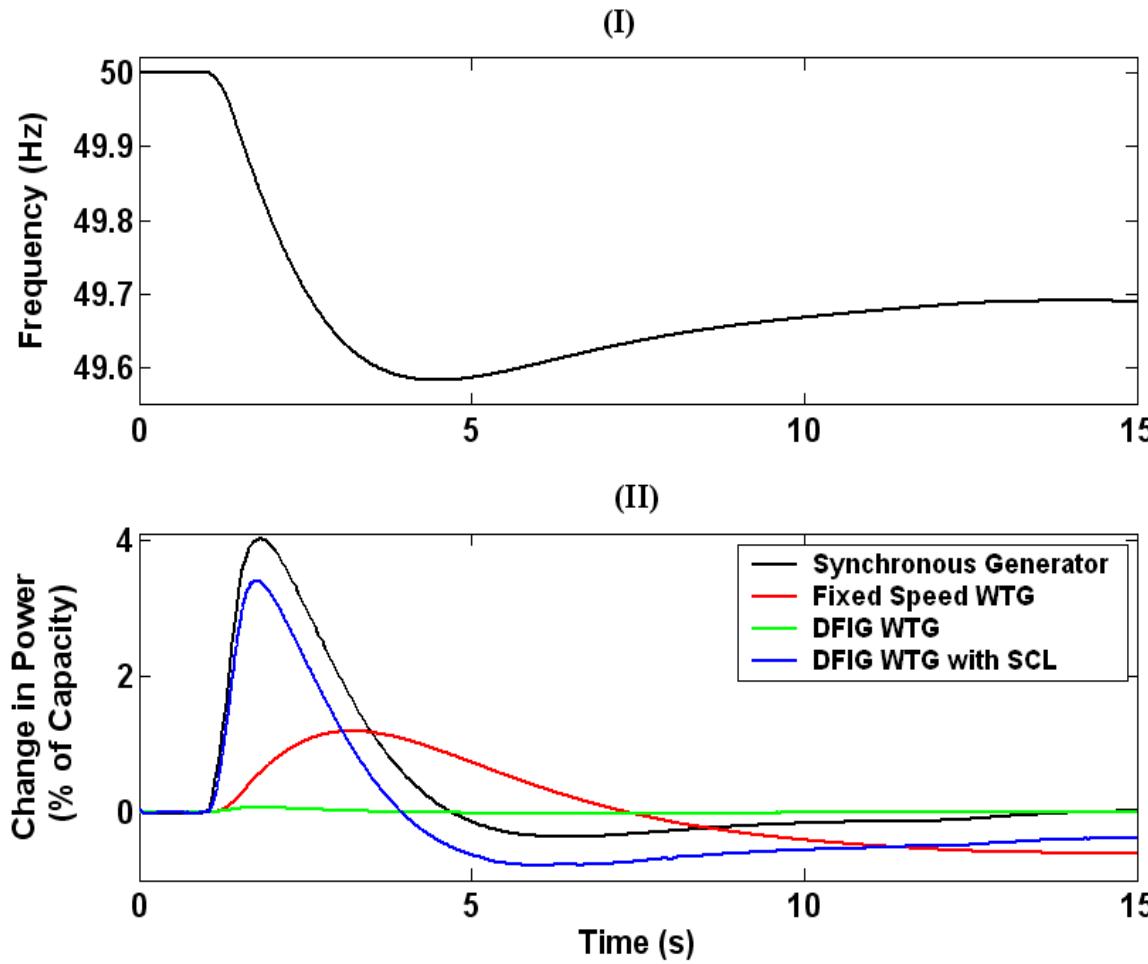
50/60 Hz

Does not add  
to system inertia



# Wind Turbine Inertial Response

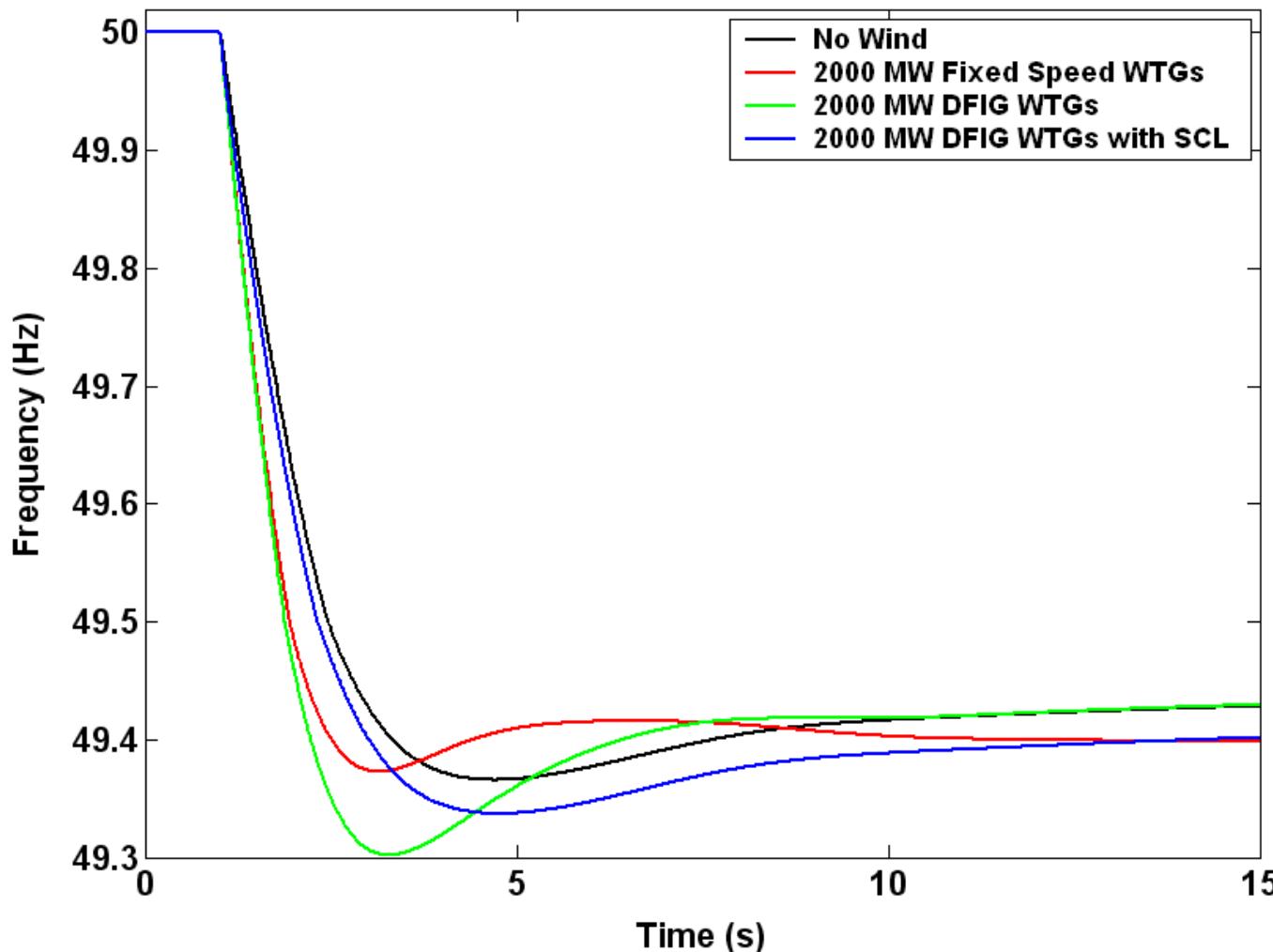
24



Mullane, A. and O'Malley, M.J., "The inertial-response of induction-machine based wind-turbines", *IEEE Transactions on Power Systems*, Vol. 20, pp. 1496 – 1503, 2005 .

# Frequency Response

25

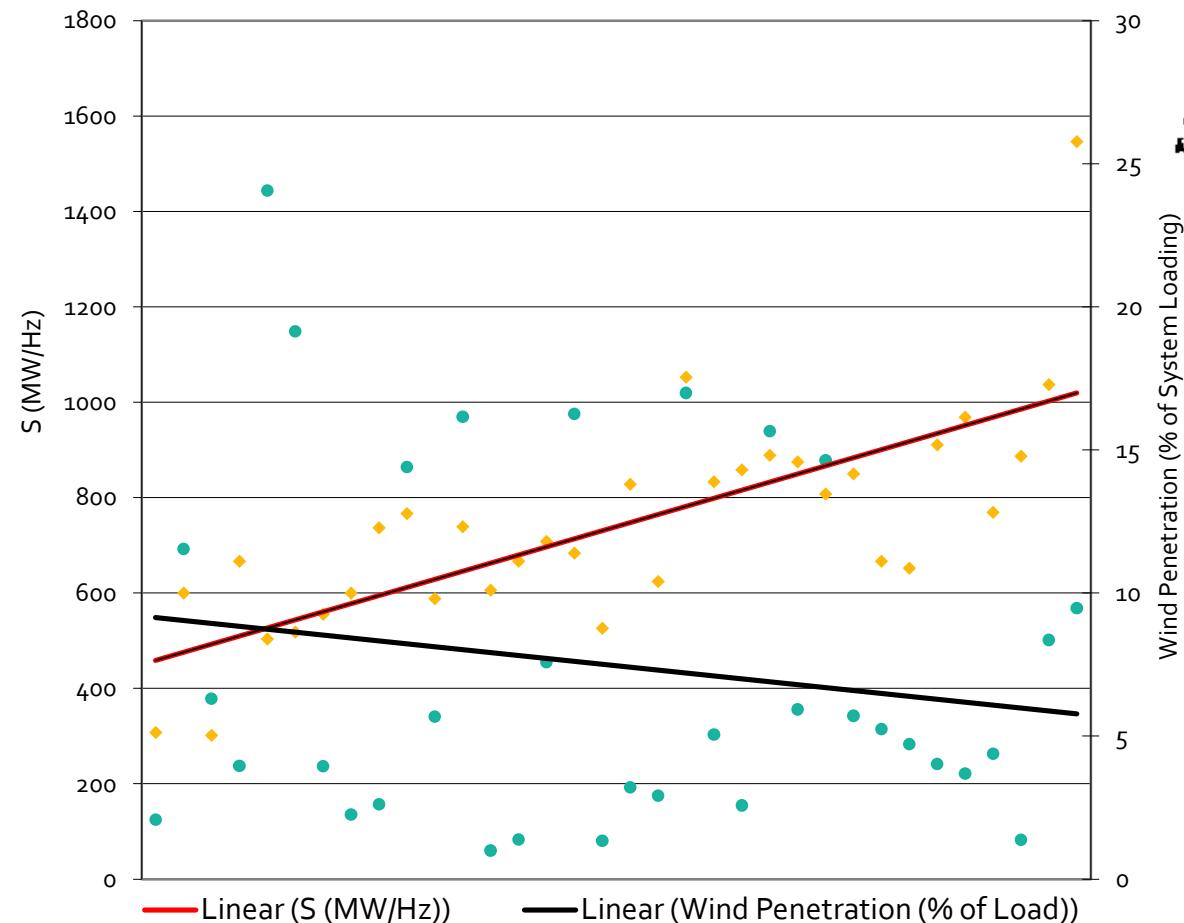


Lalor, G., Mullane, A., and O'Malley, M.J., "Frequency Control and Wind Turbine Technologies", *IEEE Transactions on Power Systems*, Vol. 20, pp. 1903 – 1913, 2005.

# Historical data Ireland

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S vs. Wind Penetration 22:00-8:00 (Night Loading)



## □ Frequency response

$$S = \left( \frac{MW_{Lost}}{f_{pre-event} - f_{nadir} + f_{post-event}} \right)$$

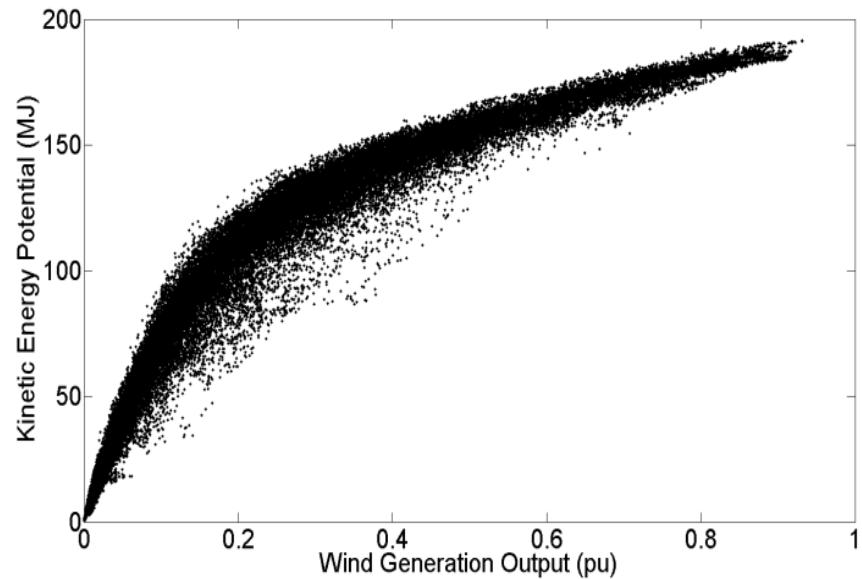
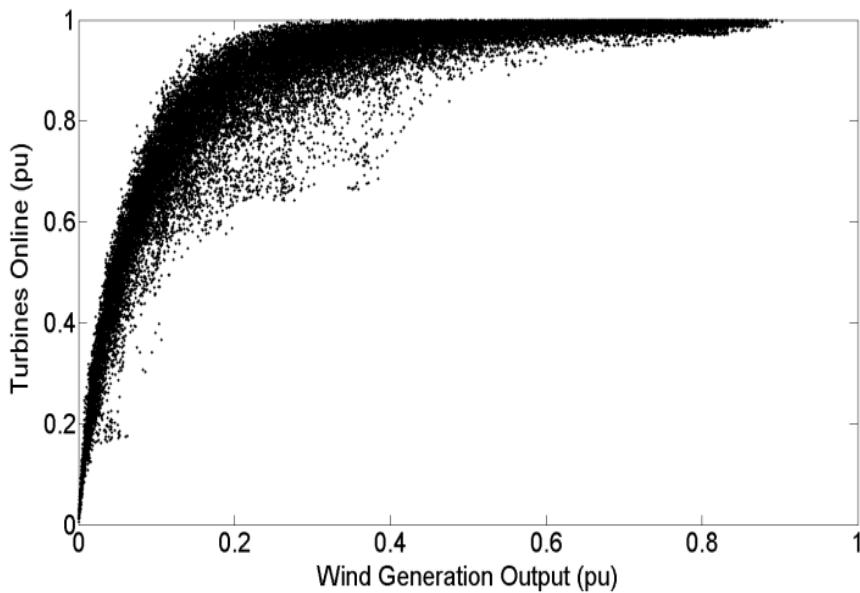
- Wind penetration increases
- Stiffness decreases
- Indicates increased vulnerability to a loss of generation event

## □ Should there be a market in frequency response ?

Dudurich, I.M.; , "Statistical analysis of frequency response of island power system under increasing wind penetration," *Power and Energy Society General Meeting, 2010 IEEE* , vol., no., pp.1-6, 25-29 July 2010

# Experimental data: Inertia

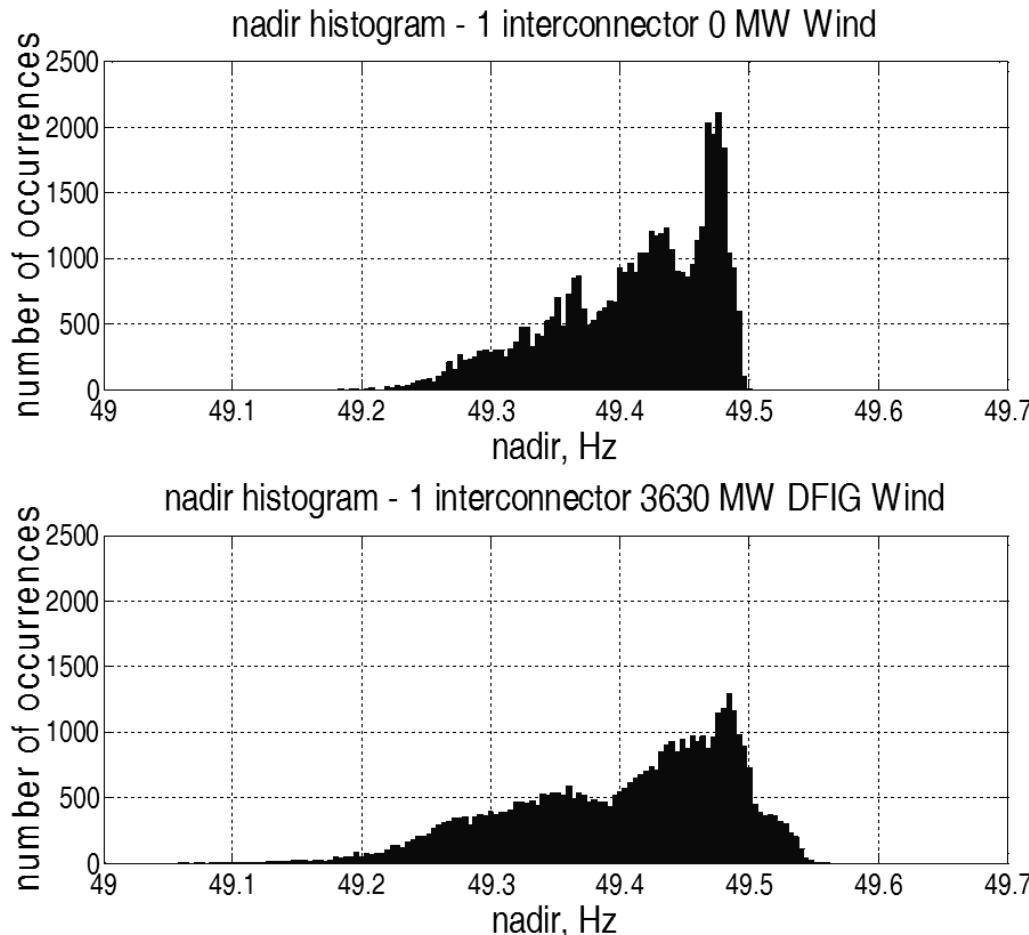
27



Ruttledge and Flynn, "System-wide inertial response from fixed Speed and variable speed wind turbines", *IEEE PES General Meeting*, Detroit, USA, July, 2011.

# Results: Frequency Nadir

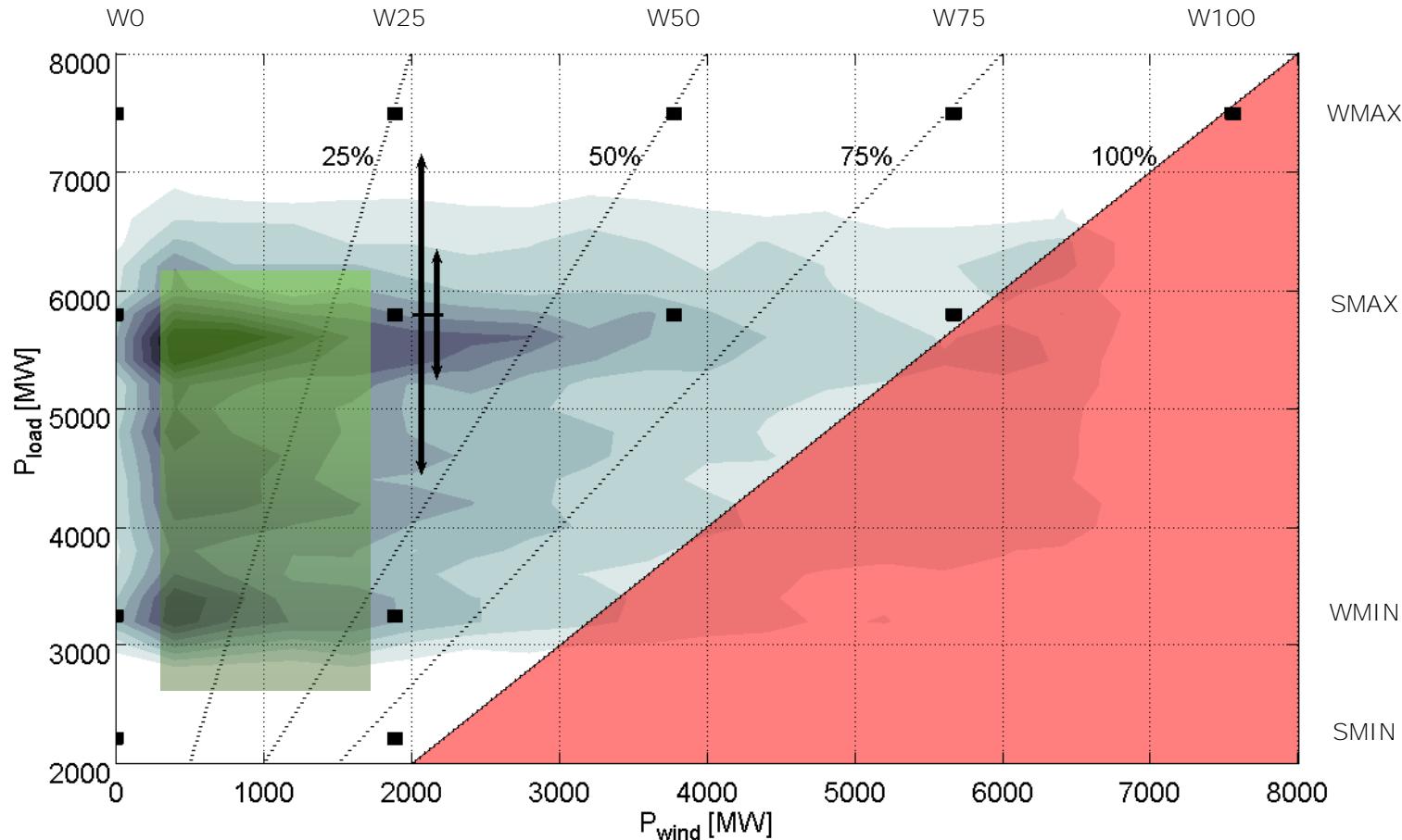
28



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", *IEEE Transactions on Power Systems*, Vol. 25, pp. 452 – 460, 2010.

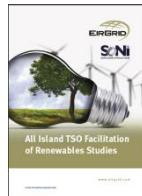
# Operational Boundaries

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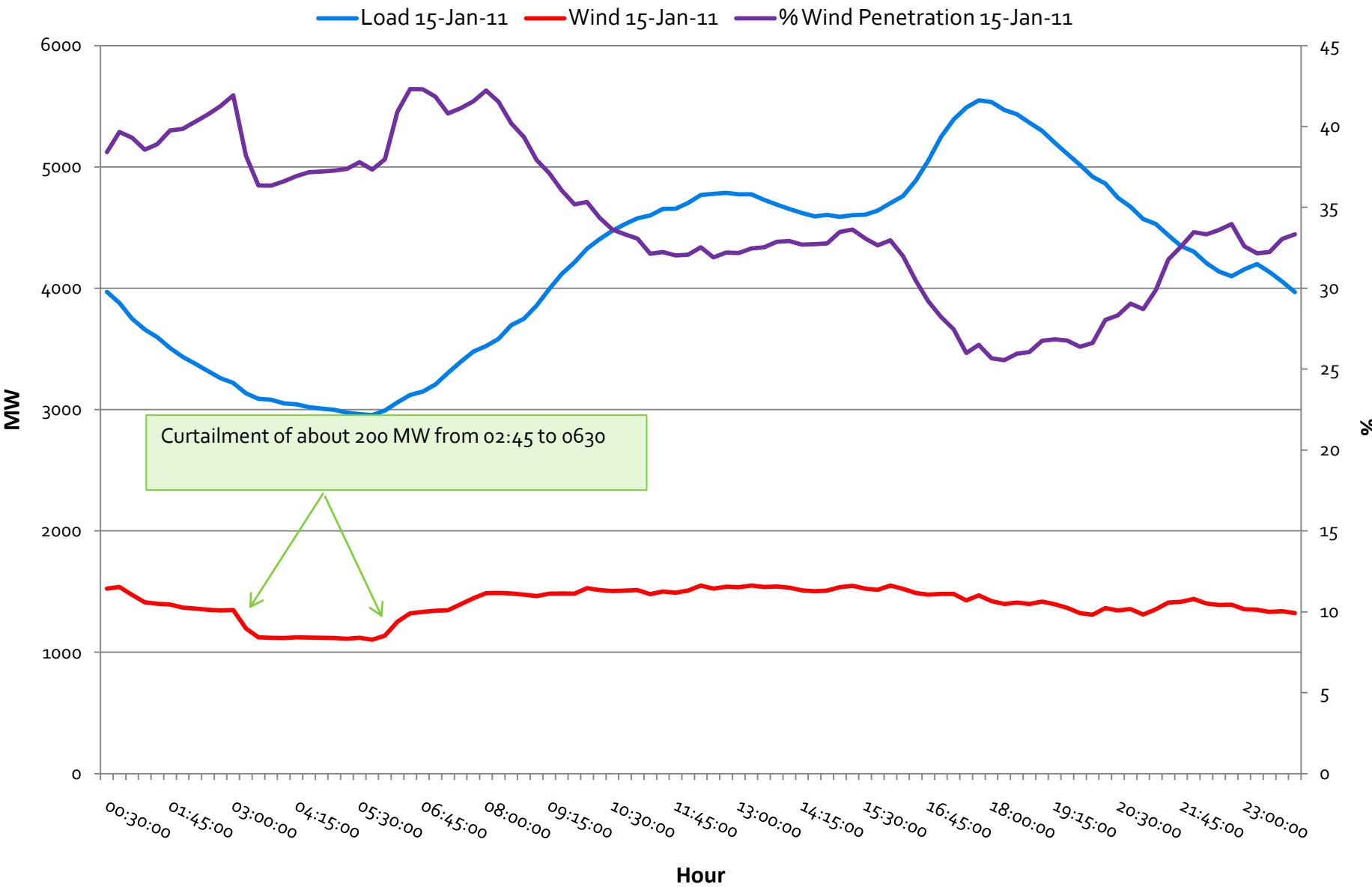
EirGrid, "All Island TSO Facilitation of Renewable Studies", Final Report, 2010 .

<http://www.eirgrid.com/media/Renewable%20Studies%20V3.pdf>



# Ireland, Wind & Load – 15 Jan 2011

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# Frequency response USA

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ERNEST ORLANDO LAWRENCE  
BERKELEY NATIONAL LABORATORY

LBNL-4142E

## Use of Frequency Response Metrics to Assess the Planning and Operating Requirements for Reliable Integration of Variable Renewable Generation

Joseph H. Eto, Principal Investigator  
*Lawrence Berkeley National Laboratory*

John Undrill  
*John Undrill, LLC*

Peter Mackin, Ron Daschmans, Ben Williams,  
Brian Haney, Randall Hunt, Jeff Ellis  
*Utility Systems Efficiencies, Inc.*

Howard Illian  
*EnergyMark, Inc.*

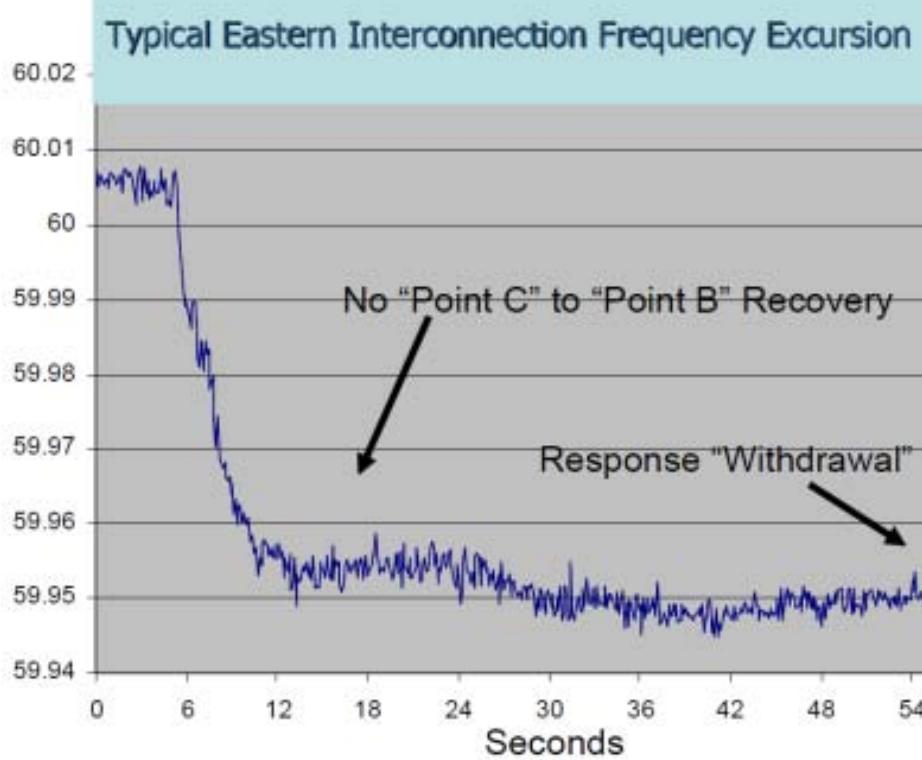
Carlos Martinez  
*Electric Power Group, LLC*

Mark O'Malley  
*University College Dublin*

Katie Coughlin, Kristina Hamachi LaCommare  
*Lawrence Berkley National Laboratory*

December 2010

The work described in this report was funded by the Federal Energy Regulatory Commission, Office of Electric Reliability. The Lawrence Berkeley National Laboratory is operated by the University of California for the U.S. Department of Energy under Contract No. DE-AC02-05CH11231.



Eto, J., J. Undrill, P. Mackin, R. Daschmans, B. Williams, B. Haney, R. Hunt, J. Ellis, H. Illian, C. Martinez, M. O'Malley, K. Coughlin, and K.H. LaCommare, "Use of Frequency Response Metrics to Assess the Planning and Operating Requirements for Reliable Integration of Variable Renewable Generation", Lawrence Berkley National Laboratory, Berkeley, 2010.  
<http://www.ferc.gov/industries/electric/indus-act/reliability/frequencyresponsemetrics-report.pdf>

# Grid Studies

# Wind energy integration studies

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GE Energy

Final Report:

## New England Wind Integration Study

Prepared for:  
ISO New England

Prepared by:  
GE Energy Applications and Systems Engineering  
EnerNex Corporation  
AWS Truepower

Project Leaders:  
**GE Energy**  
Gene Hinkle  
Richard Pwiwo

**ISO-NE**  
John Jordan  
Bill Hendon

Principal Contributors:  
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Amanvir Chahal  
Nick Miller  
Shakeri Mezran

**EnerNex**  
Robert Zavadil  
Jack King  
Tom Mousseau

**AWS Truepower**  
John Munoburco

December 8, 2010



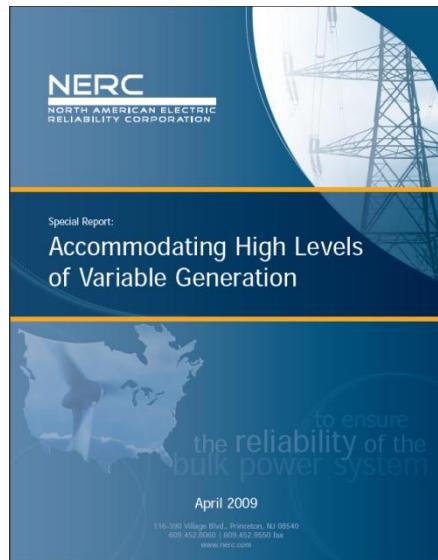
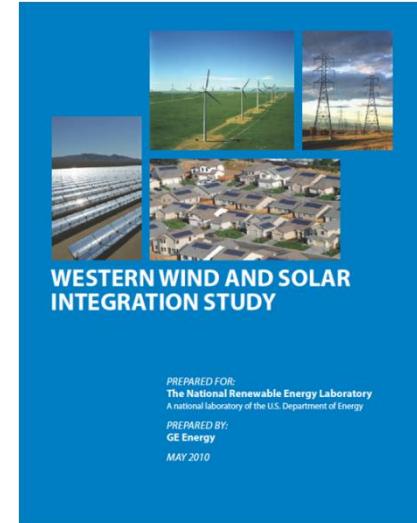
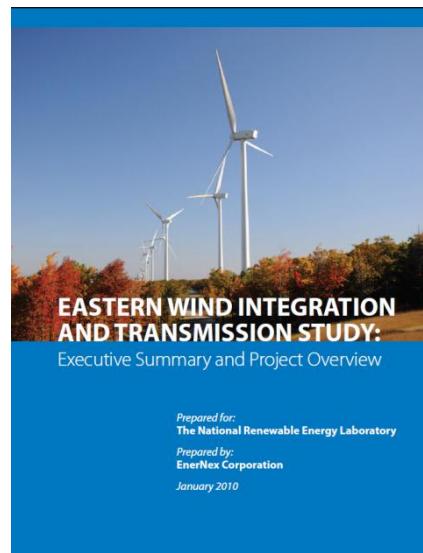
**NERC**  
NORTH AMERICAN ELECTRIC RELIABILITY CORPORATION

Special Report:  
Accommodating High Levels of Variable Generation

to ensure  
the reliability of the  
bulk power system

April 2009

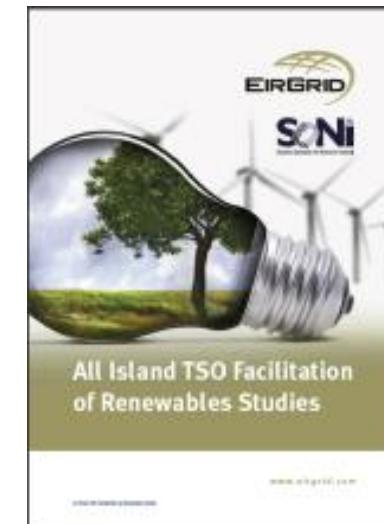
115-300 Village Blvd., Princeton, NJ 08540  
609.452.8060 | 609.452.8550 fax  
www.nerc.com



dena Grid Study II – Integration of Renewable Energy Sources in the German Power Supply System from 2015 – 2020 with an Outlook to 2025

Summary of the main results by the project steering group

Ampion GmbH, BARD Engineering GmbH, Federal Ministry for the Environment, Nature Conservation and Nuclear Safety (BMU), Federal Ministry of Economics and Technology (BMWi), Bundesverband der Energie- und Wasserversorgung e.V. (BDEW), EnBW Transportnetze AG, E.ON Netz GmbH, EWE Netz GmbH, Siemens AG, Stiftung Offshore-Windanlagen, TÜV Nord SE, TÜV Rheinland Group, Vattenfall Europe Power GmbH, Vattenfall/Nordex in VDE (FNN), Bundesverband WindEnergie e.V. (BWE), Verband Deutscher Maschinen- und Anlagenbau e.V. Fachverband Power Systems (VDMA Power System), VGB PowerTech e.V., Zentralverband Elektrotechnik- und Elektronikindustrie e.V. (ZVEI), 50Hertz Transmission GmbH



Risø DTU

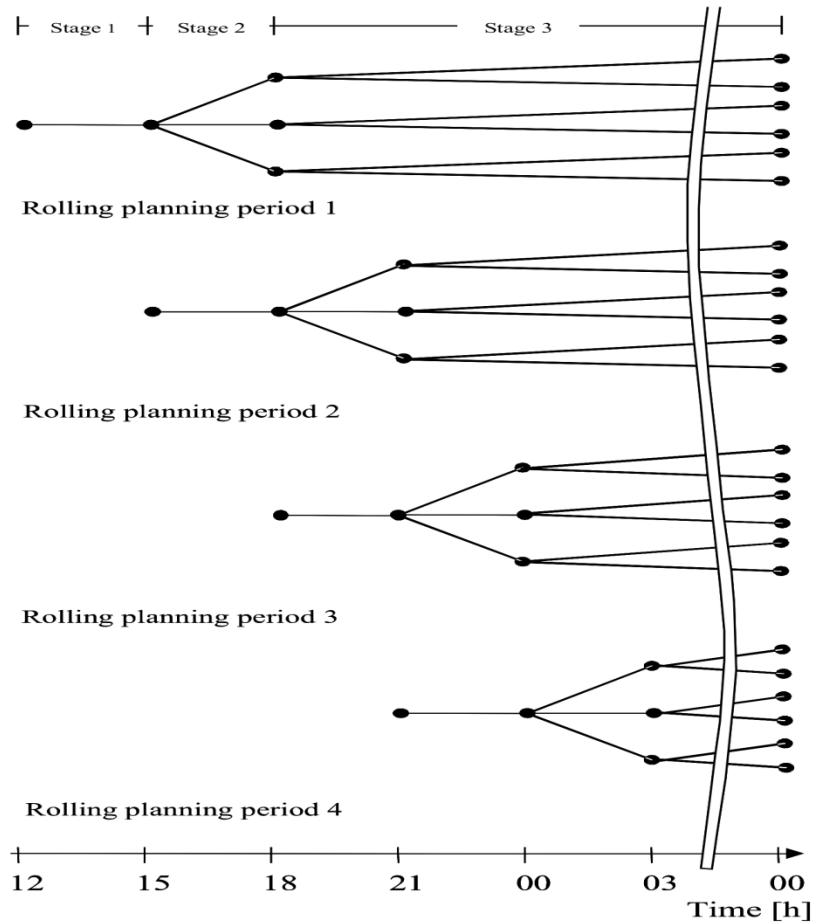
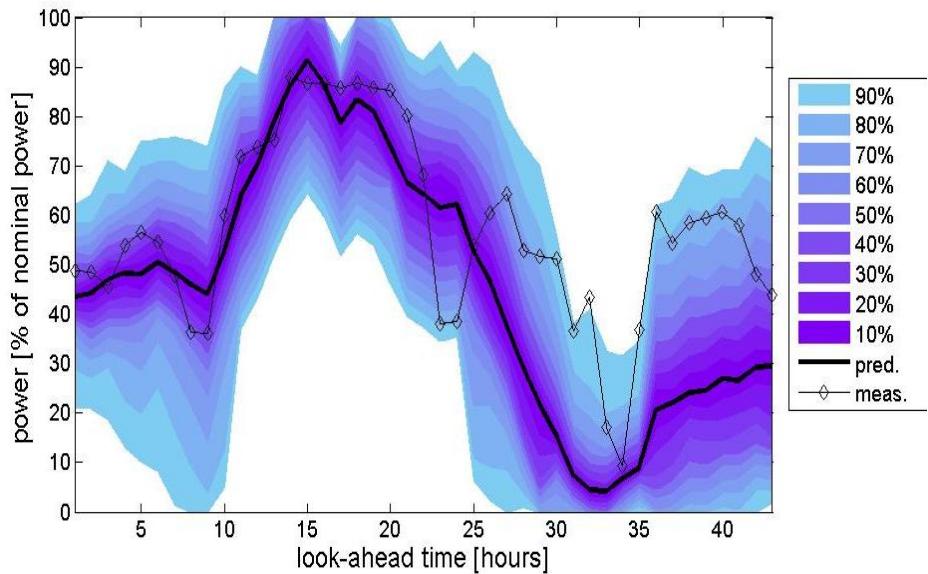


Stochastic Unit Commitment



# Wilmar: Stochastic Unit Commitment

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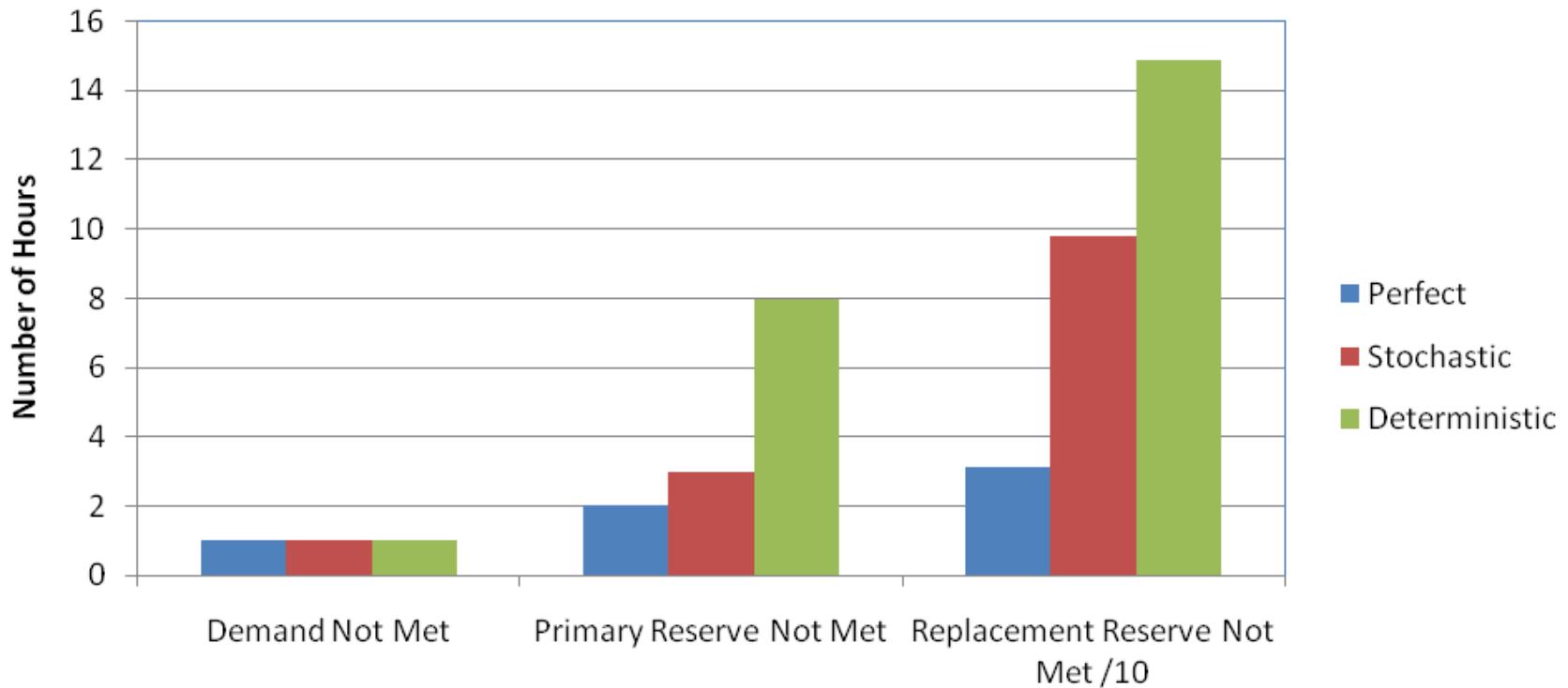


Meibom, P., Barth, R., Hasche, B., Brand, H., Weber, C. and O'Malley, M.J., "Stochastic optimisation model to study the operational impacts of high wind penetrations in Ireland", *IEEE Transactions Power Systems*, in press, 2011.

# Performance of Schedules

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- One hour frequency of rolling commitment

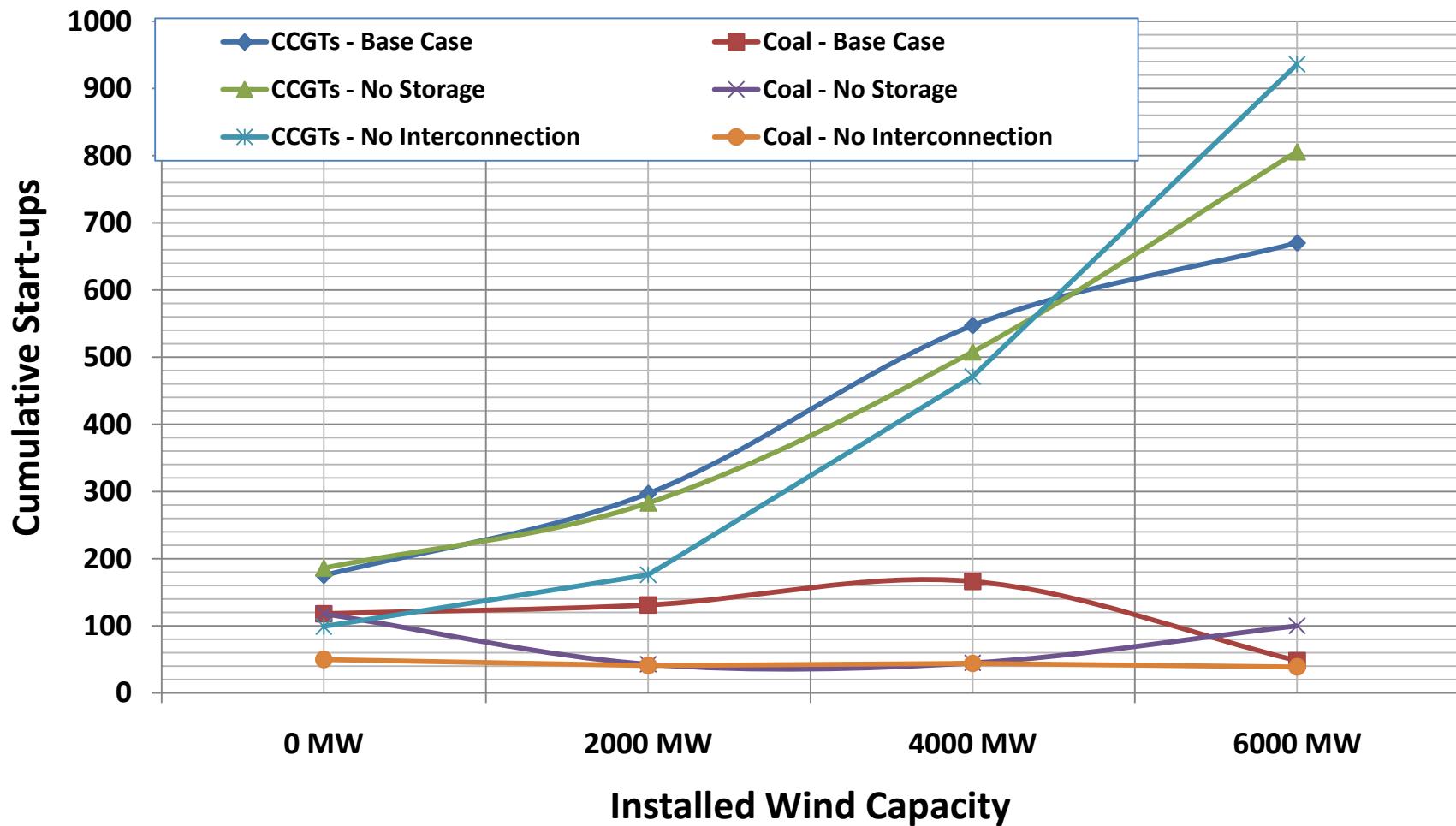


Tuohy, A., Meibom, P., Denny, E., & O'Malley, M., "Unit commitment for Systems with Significant Installed Wind Penetration", *IEEE Transactions on Power Systems*, Vol. 24, pp. 592 – 601, 2009.

# Frequency Control & Cycling

# Impact of Wind on Base-load Start-ups

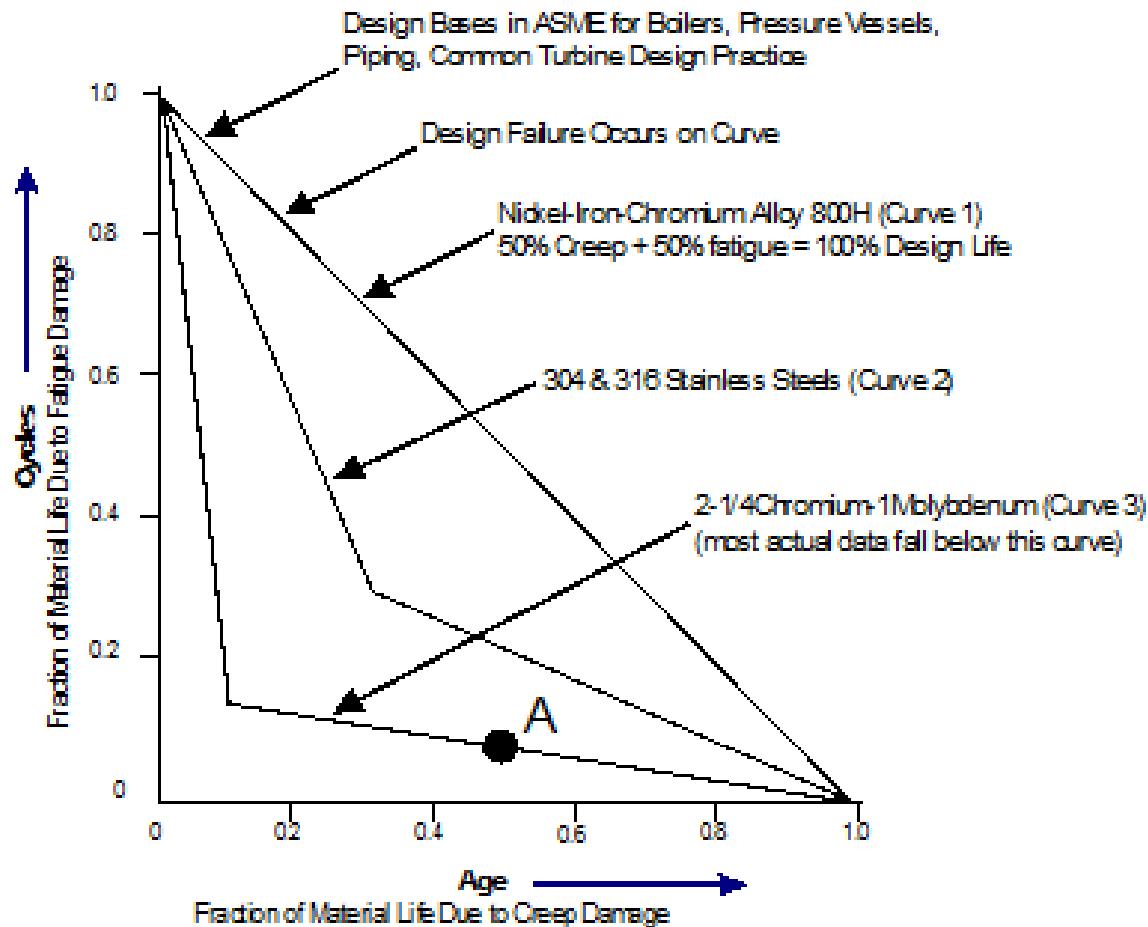
39

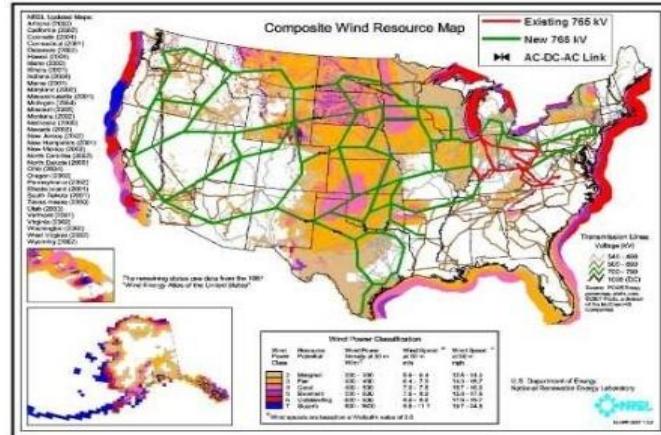


Troy, N., Denny, E. and O'Malley, M.J. "Base load cycling on a system with significant wind penetration", *IEEE Trans. Power Syst.*, Vol. 25, pp. 1088 - 1097, 2010.

# Creep fatigue interaction

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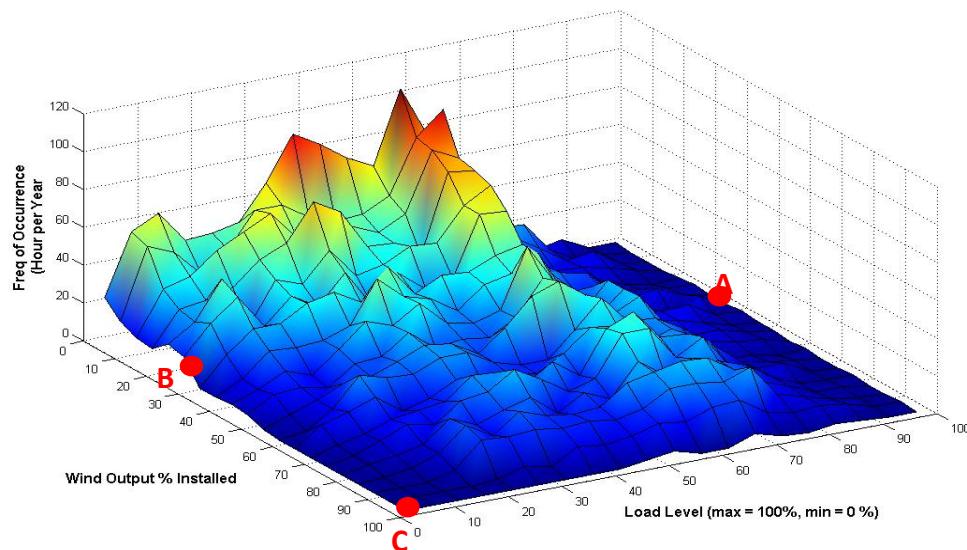
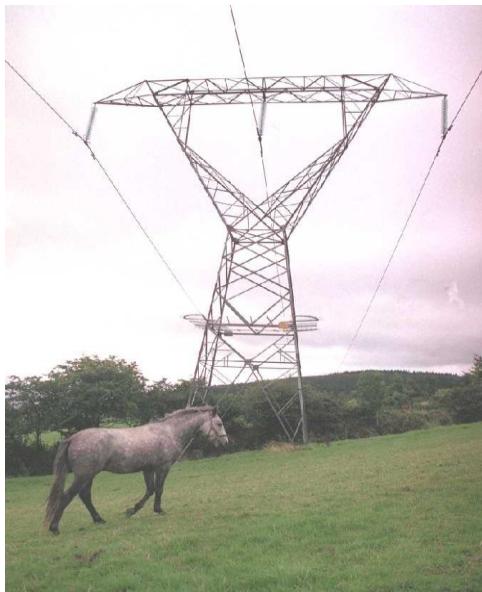
# Transmission



Page 5

# Transmission

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Burke, D.J., and O'Malley M.J. "A Study of Optimal Non-Firm Wind Capacity Connection to Congested Transmission Systems", *IEEE Transactions on Sustainable Energy*, in press, 2011.

Burke, D., and O'Malley, M.J., "Maximum firm wind power connection to security constrained transmission networks", *IEEE Transactions on Power Systems*, Vol. 25, pp. 749 – 759, 2010.

Burke, D J, and O'Malley M.J. "Factors Influencing Wind Energy Curtailment", *IEEE Transactions on Sustainable Energy*, in press, 2011.

# Firm Access

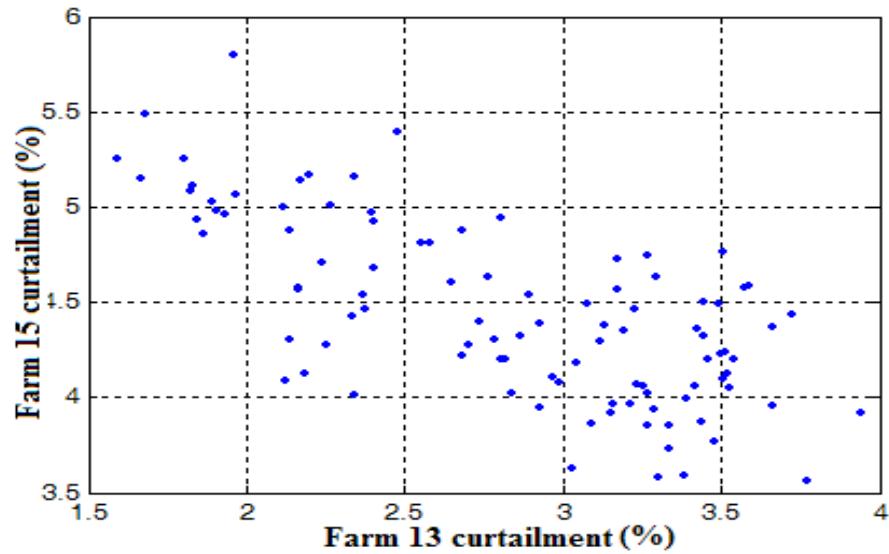
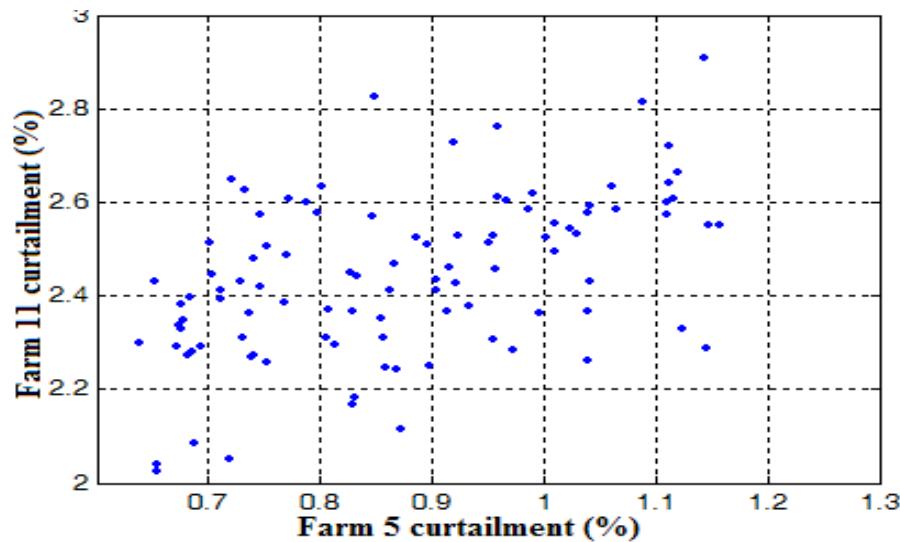
44

Energy % Penetration	Wind Farm Bus Number						
	12	14	15	25	27	29	30
5	0	0	<b>93.1</b>	0	81.4	0	0
6	0	0	<b>101.3</b>	0	90.2	0	0
7	0	0	<b>88.1</b>	9.5	147.0	0	0
8	33.4	38.9	<b>45.0</b>	35.5	138.9	0	0
9	73.6	51.6	<b>44.6</b>	30.9	128.3	0	0
9.5	68.7	54.6	<b>51.5</b>	40.2	132.7	0	0
10	<i>infeasible</i>						

Burke, D. and O'Malley, M.J., "Maximising firm wind power connection to security constrained transmission networks" *IEEE Transactions on Power Systems*, Vol. 25, pp. 749 – 759, 2010.

# Curtailment and risk diversification

45



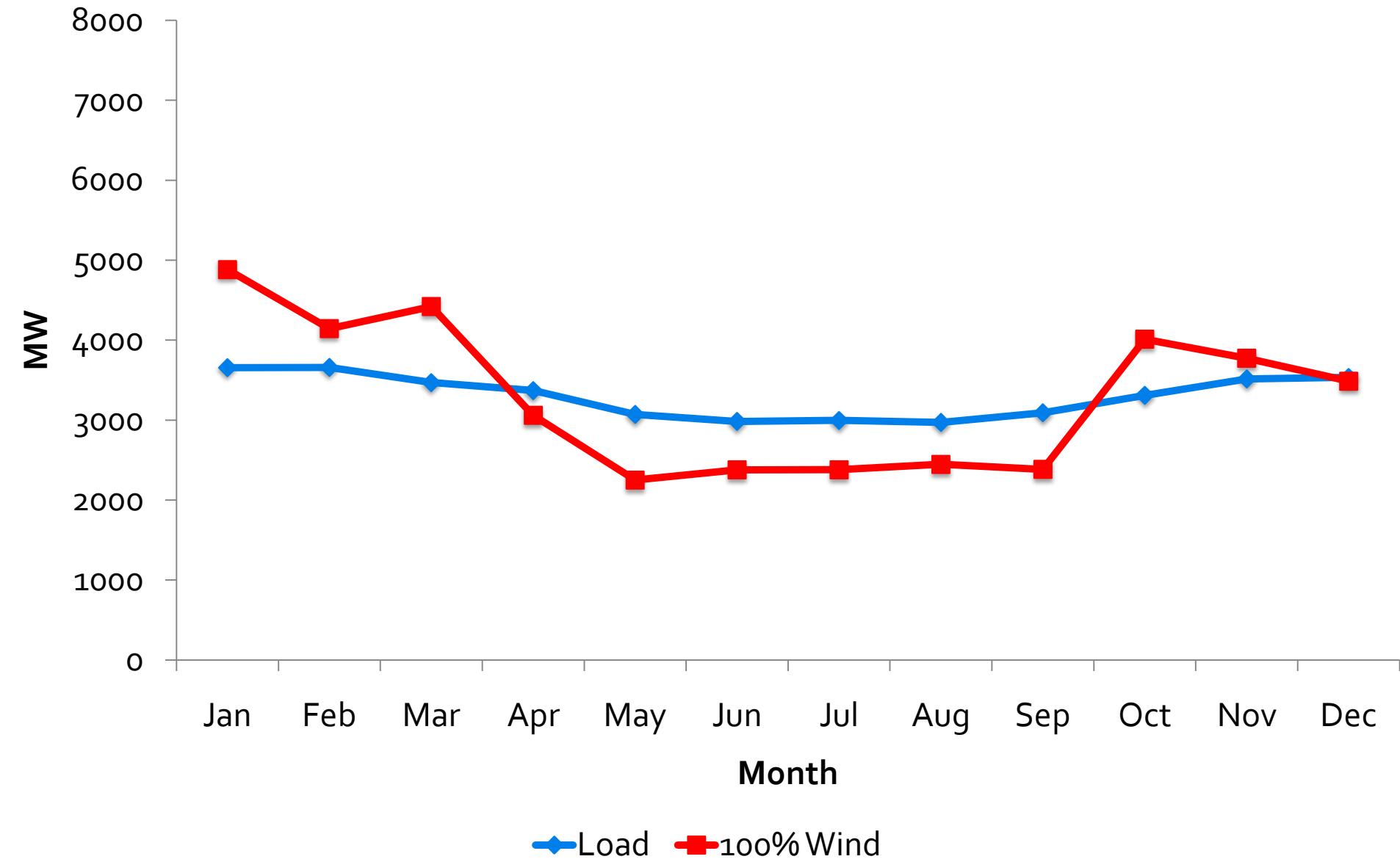
Burke, D J, and O'Malley M.J. "Factors Influencing Wind Energy Curtailment", *IEEE Transactions on Sustainable Energy*, in press, 2011.



# Conclusions & societal issues

# Yearly load & 100 % Wind

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# Demand side management

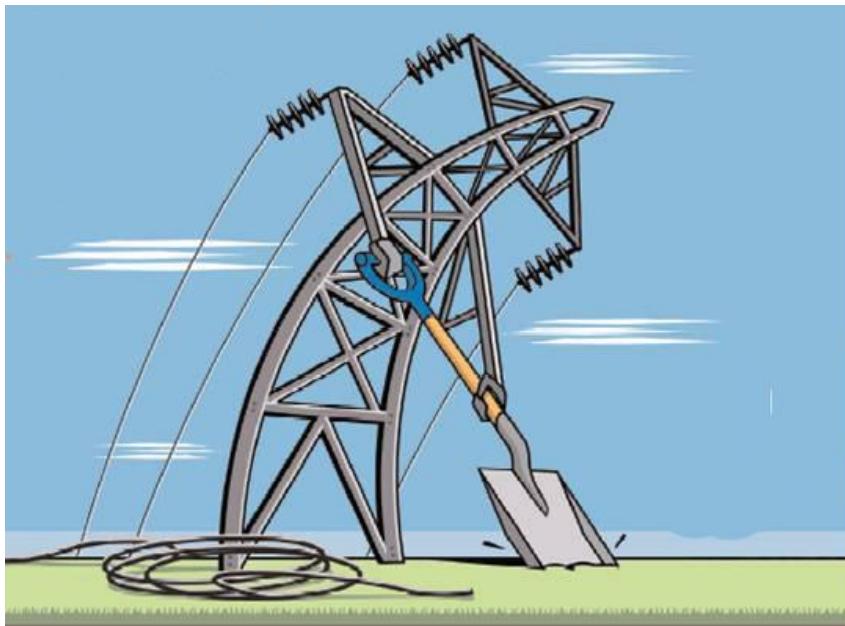
# Disruptive ?

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# Public acceptance of transmission

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# Recent Journal Publications

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- Burke, D.J., and O'Malley M.J. "A Study of Multivariate Component Analysis Applied to Statistical Distributed Wind Power", *IEEE Transactions on Power Systems*, in press, 2011.
- Meibom, P., Barth, R., Hasche, B., Brand, H., Weber, C. and O'Malley, M.J., "Stochastic optimisation model to study the operational impacts of high wind penetrations in Ireland", *IEEE Transactions on Power Systems*, in press, 2011.
- Keane, A, Tuohy, A., Meibom, P., Denny, E., Flynn, D., Mullane, A. and O'Malley, M.J., "Demand side resource operation on the Irish power system with high wind power penetration", *Energy Policy*, 39, 2925 - 2934, 2011.
- Keane, A., Milligan, M., D'Annuzio, C., Dent, C., Dragoon, K., Hasche, B., Holttinen, Samaan, N., Soder, L. and O'Malley, M.J., "Capacity Value of Wind Power", *IEEE Transactions on Power Systems*, Vol. 26, pp. 564 - 572, 2011.
- Tuohy, A. and O'Malley, M.J., "Pumped Storage in Systems with Very High Wind Penetration", *Energy Policy*, Vol. 39, pp. 1965-1974, 2011.
- Burke, D.J., and O'Malley M.J. "Factors influencing wind energy curtailment", *IEEE Transactions on Sustainable Energy*, Vol. 2, pp. 185-193, 2011.
- Burke, D.J., and O'Malley M.J. "A Study of Optimal Non-Firm Wind Capacity Connection to Congested Transmission Systems", *IEEE Transactions on Sustainable Energy*, Vol. 2, pp. 167 - 176, 2011.
- Holttinen, H, Meibom, P., Orths, A., Lange, B., O'Malley, M.J., Tande, J, Estanqueiro, A., Gomez, E., Söder, L., Strbac, G., Smith, J.C. and van Hulle, F., "Impacts of large amounts of wind power on design and operation of power systems, results of IEA collaboration", *Wind Energy*, Vol. 14, pp. 179-192, 2011.
- Hasche, B., Keane, A. and O'Malley, M.J. "Capacity credit of wind power: calculation and data requirements", *IEEE Transactions on Power Systems*, Vol. 26, pp. 420 - 430, 2011.
- Fitzmaurice, R., Keane, A., and O'Malley, M.J., "Effect of Short Term Risk Aversive Dispatch on a Complex System Model for Power Systems", *IEEE Transactions on Power Systems*, Vol. 26, pp. 460 - 469, 2011.
- Denny, E., Tuohy, A., Meibom, P., Keane, A., Flynn, D. Mullane, A. and O'Malley, M.J., "The Impact of Interconnection on Electricity Systems with Large Penetrations of Wind Generation", *Energy Policy*, Vol. 38, pp. 6946-6954, 2010.
- Nyamdash, B., Denny, E., and O'Malley, M.J. "The viability of balancing wind power with large scale energy storage", *Energy Policy*, Vol. 38, pp. 7200-7208, 2010.
- Troy, N., Denny, E. and O'Malley, M.J. "Base load cycling on a system with significant wind penetration", *IEEE Transactions on Power Systems*, Vol. 25, pp. 1088 - 1097, 2010.
- Burke, D., and O'Malley, M.J., "Maximizing firm wind connection to security constrained transmission networks", *IEEE Transactions on Power Systems*, Vol. 25, pp. 749 – 759, 2010.
- Vittal, E., O'Malley, M.J. and Keane, A., "A steady state voltage stability analysis of power systems with high penetrations of wind", *IEEE Transactions on Power Systems*, Vol. 25, pp. 433 – 442, 2010. Also presented at IEEE PES Meeting Minneapolis, July 2010.
- 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", *IEEE Transactions on Power Systems*, Vol. 25, pp. 452 – 460, 2010.

# Recent relevant reports

52

- Eto, J., J. Undrill, P. Mackin, R. Daschmans, B. Williams, B. Haney, R. Hunt, J. Ellis, H. Illian, C. Martinez, M. O'Malley, K. Coughlin, and K.H. LaCommare, ""Use of Frequency Response Metrics to Assess the Planning and Operating Requirements for Reliable Integration of Variable Renewable Generation", Lawrence Berkley National Laboratory, Berkeley, 2010. <http://www.ferc.gov/industries/electric/indus-act/reliability/frequencyresponsemetrics-report.pdf>
- 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.
- NERC, "Accommodating High Levels of Variable Generation", North American Electric Reliability Corporation, [http://www.nerc.com/files/IVGTF\\_Report\\_041609.pdf](http://www.nerc.com/files/IVGTF_Report_041609.pdf), April, 2009.
- 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>
- EirGrid and SONI, "All Island TSO facilitation of Renewables Studies", June 2010. <http://www.eirgrid.com/media/Renewable%20Studies%20V3.pdf>
- International Panel on Climate Change (IPCC) Special Report on Renewable Energy Sources and Climate Change Mitigation, Final draft report to be approved at IPCC Plenary Session, Abu Dhabi, UAEE 5-8 May 2011. <http://www.ipcc-wg3.de/publications/special-reports/srren>

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- Current research Team: Dr. Damian Flynn, Dr. Eleanor Denny, Dr. Andrew Keane, Dr. Ciara O'Connor, Dr. Andrej Gubina, Mr. Paul Smith, Mr. Michael Power, Mr. Ronan Doherty, Mr. Daniel Burke, Mr. Ronan Fitzmaurice, Mr. Batsaikhan Nyamdash, Mr. Eknath Vittal, Mr. Peter Richardson, Ms. Niamh Troy, Mr. Aonghus Short, Ms. Amy O'Mahoney, Ms. Paul Cuffe, Mr. Eamonn Lannoye, Mr. David Kavanagh, Mr. Colm Lowery, Mr. Stefano Verde, Ms. Lisa Ruttledge, Ms. Muireann Lynch, Mr. Eamon Keane, Mr. David Fletcher, Mr. Lasantha Meegahapola, Mr. Erik Ela, Mr. Benish Paily, Mr. Mario Džamarija, Mr. Gaspar Artac, Ms. Rachael O' Hegarty, Ms. Magda Szczepanska
- Graduated PhDs: Dr. Daniel Burke, Dr. Aidan Tuohy, Dr. Garth Bryans, Dr. Eleanor Denny, Dr. Ronan Doherty, Dr. Meadbh Flynn, Dr. Andrew Keane, Dr. Gill Lalor, Dr. Jonathan O'Sullivan, Dr. Michael Walsh
- Graduated Masters: Ms. Sonya Twohig, Mr. Jody Dillon, Mr. Shane Rourke, Mr. Paul Sheridan, Mr. Fintan Slye
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# Harvesting Renewable Energy The Grid Integration Challenge

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