

Transmission Planning Under Uncertainty: A Two-Stage Stochastic Modelling Approach

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Outline

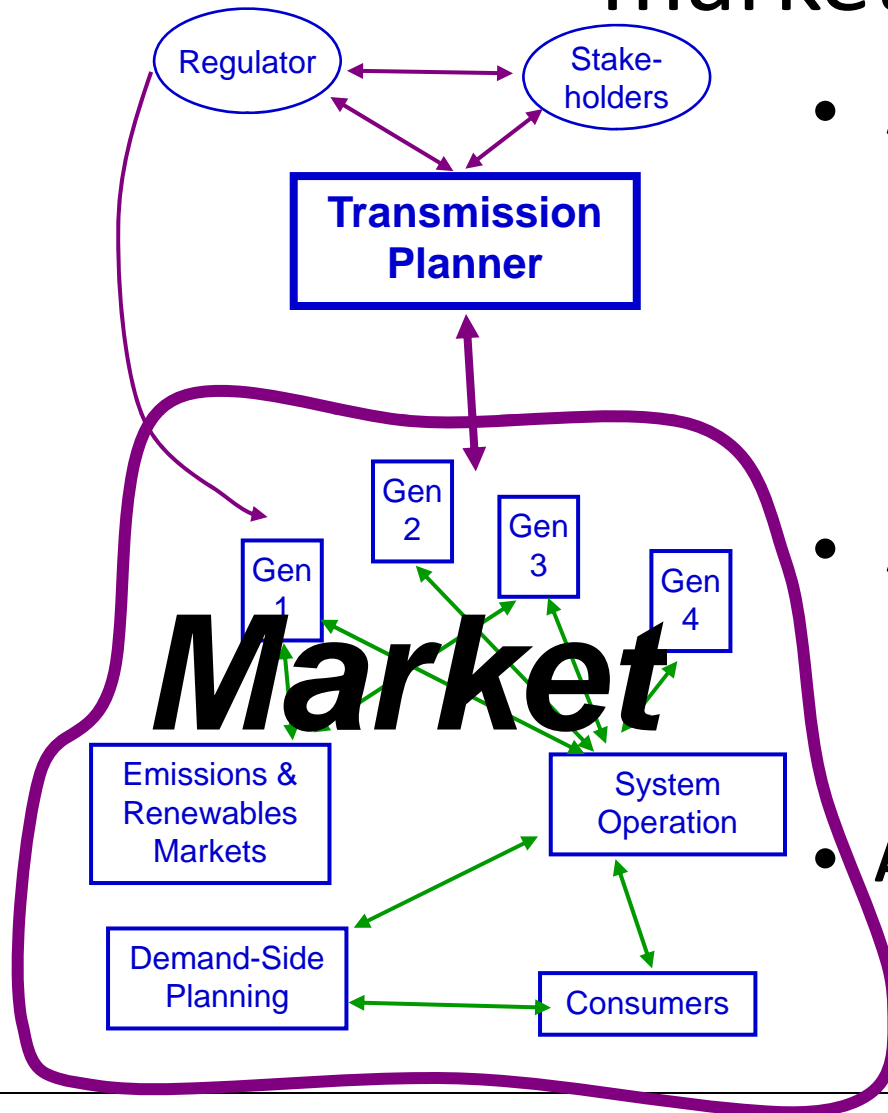


- Basic questions
- Modeling framework
- Assumptions
- Results
 - Robust plans
 - Value of information
 - Cost of naiveté
 - Option value

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Plan transmission, but consider market response!



- A “multilevel” (Stackelberg) game:
 - **Upper level:** planners (& regulator, stakeholders), who anticipate reactions of ...
 - **Lower level:** market response of consumers, generators
- Account for responses:
 - Price effects on gen type and siting decisions
 - Influence of policy on above
- Account for uncertainties:
 - Want robust plans that do well under a range of possible futures

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Basic questions



- **Optimal strategy under multiple scenarios?**
 - **Solve stochastic two-stage model: “OPT”**
- **Value of perfect information (EVPI)?**
 - **Optimize separately for each scenario s : “PI_s”**
 - **Compare cost of PI_s vs OPT, averaged over scenarios**
- **Cost of ignoring uncertainty (ECIU)?**
 - **Solve naïve model (no uncertainty): “NAÏVE”**
 - **Compare cost of NAÏVE vs OPT averaged over scenarios**
- **Option value?**
 - **Solve model assuming no options later: “OPENLOOP”**
 - **Compare cost of OPENLOOP vs OPT**

Deterministic planning can't answer these!

Modelling framework



- Two-stage Stackelberg game:

1. TSOs decide on transmission investment

2. Generators decide on generation investment

3. Decisions are implemented; Market operation

4. Repeat 1-3

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Modelling framework



- If objectives are aligned:

1. Decisions on transmission+generation investment

2. Decisions are implemented; Market operation

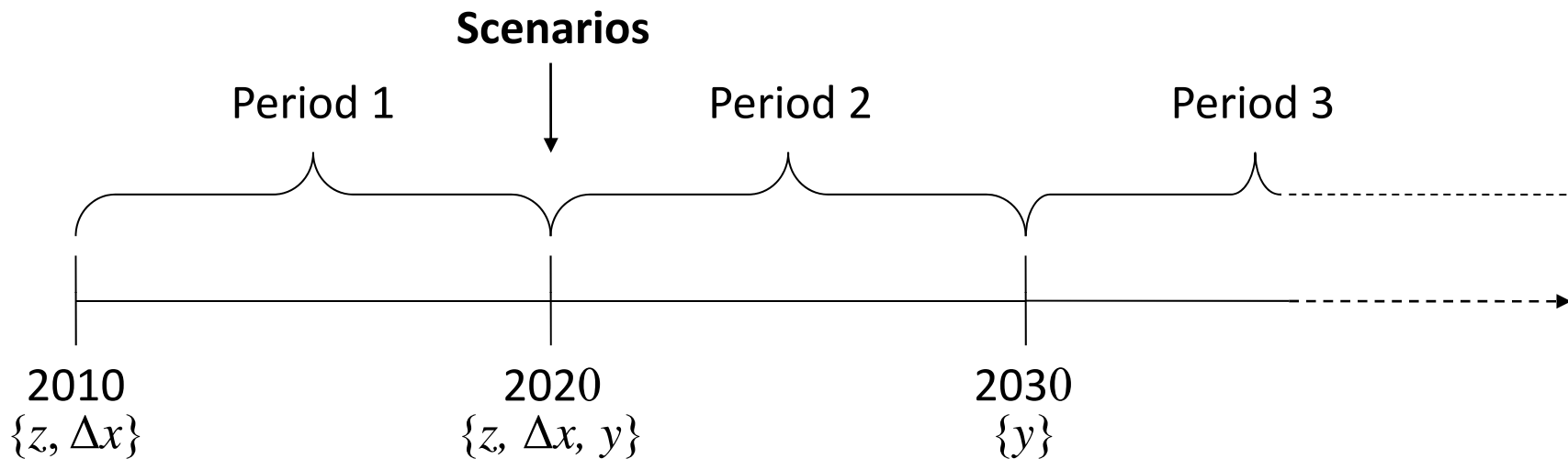
3. Repeat 1-2

- Our approach:
 - two stage stochastic programming
 - Mixed integer program (0-1 transmission variables)

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Modelling framework



z transmission investment decisions

Δx decisions to build new generation capacity

y generation dispatch

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Modelling framework: Two stage optimization



- Objective: $MIN InvestCost_{2010} + \sum_s P_s (InvestCost_{2020,s} + O\&MCost_{2020+2030,s})$
- Subject to constraints:
 - Build limits for 2010 and each s in 2020:
 - Transmission
 - Regional gen capacity
 - Operating constraints for each s in 2020 & 2030:
 - Capacity constraints upon gen & flows
 - Kirchhoff's laws for power flow
 - Renewable target
- $\sim 0.5M$ variables, constraints
 - Coefficients, constraints can vary by s

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Assumptions I - Structural



- Alignment of transmission & gen objectives
- Generation:
 - linear cost functions
 - no start-up costs, min run levels, ‘lumpy’ investment
- Transmission: constant flow limits
- Demand:
 - constant regional fractions
 - no demand response
- Renewables targets: met in most efficient way
- Storage

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Assumptions II - Numerical



- Wind data from Neuhoff et al. (2006)
 - One year of wind output in each region
- Transmission constraints from National Grid
- Existing capacity and demand data from DECC
- Transmission investment alternatives from ENSG
- Sampling

Assumptions II - Numerical

Regions and

Transmission investment alternatives

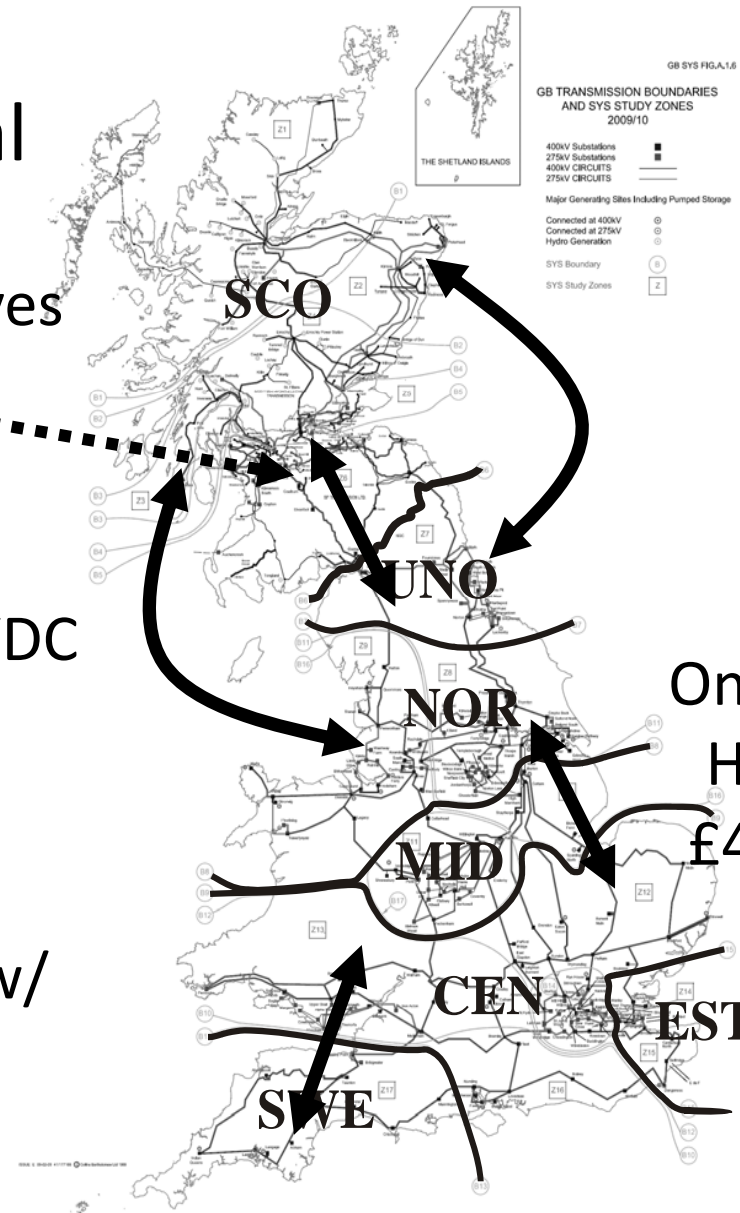
Various new/
upgrades
£260M

Subsea HVDC
£575M

Various new/
upgrades
£410M

Subsea
HVDC
£575M

Onshore
HVDC
£410M



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Assumptions II – Numerical Scenarios



	Investment cost	Fuel cost	Trans. Cost	Demand	CO ₂ price	Other
Status Quo		CC/GT/DG: +30/+80%		+2.5%/+5%	15/15	No Renewables target
Low cost DG	DG -50%	CC/GT -10/-20% DG: -50%		+2.5%/+5%	30/50	RT: 10/20% No new nuclear
Low Cost Large Scale Green	Renewables -40%	CC/GT/DG +60/+160		-20%/ - 30%	50/80	RT: 20/30%

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Assumptions II – Numerical

Scenarios



	Investment cost	Fuel cost	Trans. Cost	Demand	CO ₂ price	Other
Low Cost Conventional	Conventional -30%	CC/GT/DG: -10/-20%		+20%/ +40%	20/25	No RT
Paralysis	All except offshore wind +100%	CC/GT/DG: +30/+80%	Onshore +100% Others +20%	+20%/ +40%	30/50	RT: 10/20%; No new nuclear
Techno+	All -30%	CC/GT/DG: +30/+80%	All -20%	+10%/ +20%	30/50	20/30%

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Results



1. Optimal robust solution
 - Two-stage stochastic model
2. Value of Information (EVPI)
 - Deterministic model (best trans & gen solution for each scenario) \rightarrow $EVPI_{T\&G}$
 - Deterministic model with generation decisions fixed \rightarrow $EVPI_{Trans}$ (lower bound)
3. Cost of naïve decision (ECIU)
 - Stochastic model, imposing naïve 1st stage transmission decisions \rightarrow $ECIU_{Trans}$
4. Option value of transmission
 - Stochastic with same transmission decision in every scenario \rightarrow Option value_{Trans}

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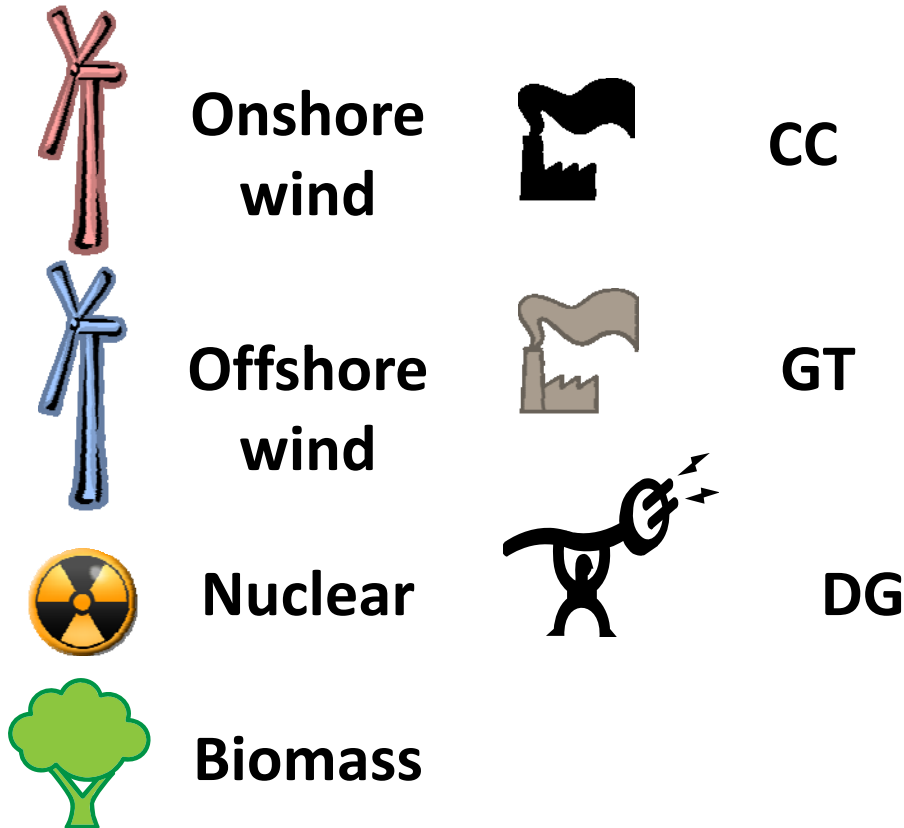
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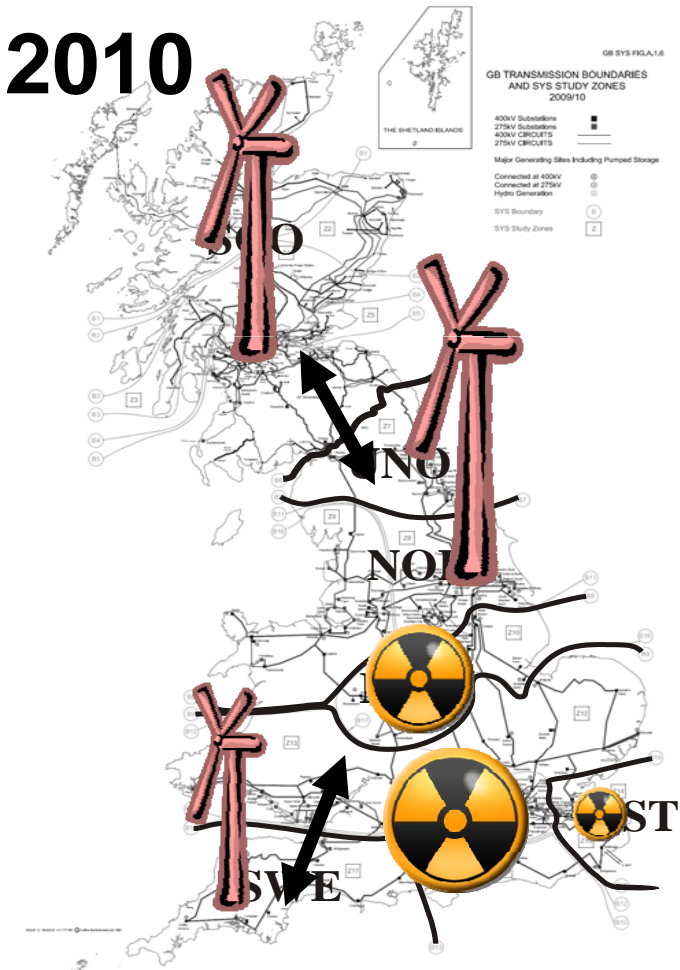
Disclaimer

The following results are (very) preliminary and used for method illustration purposes only. They cannot be used to evaluate proposed transmission investments.

Stochastic model – stage 1



2010

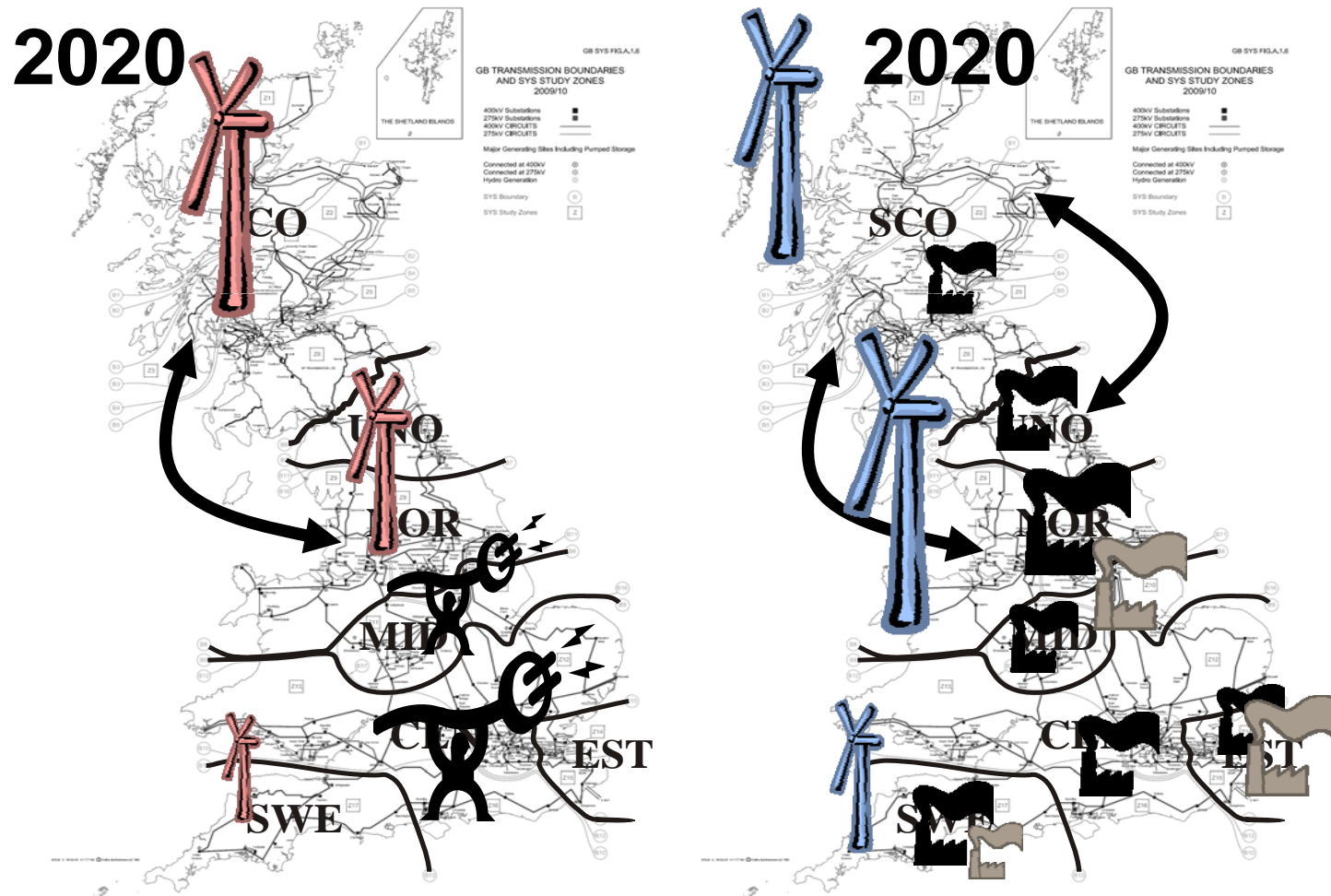


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Stochastic model – stage 2

Scenarios: Low Cost DG; Paralysis

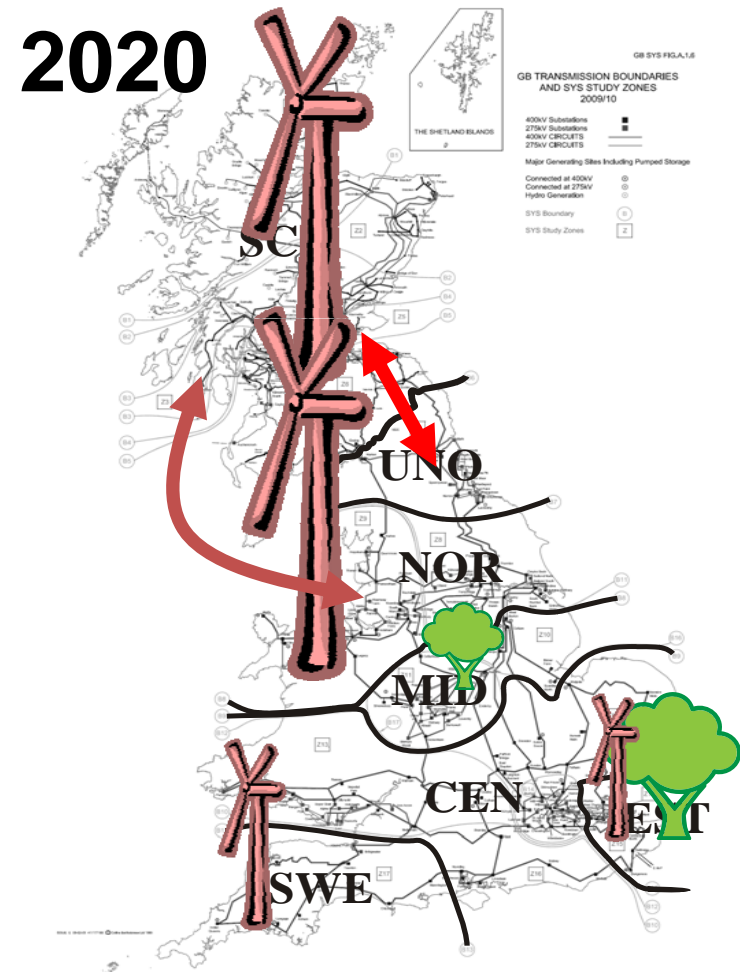
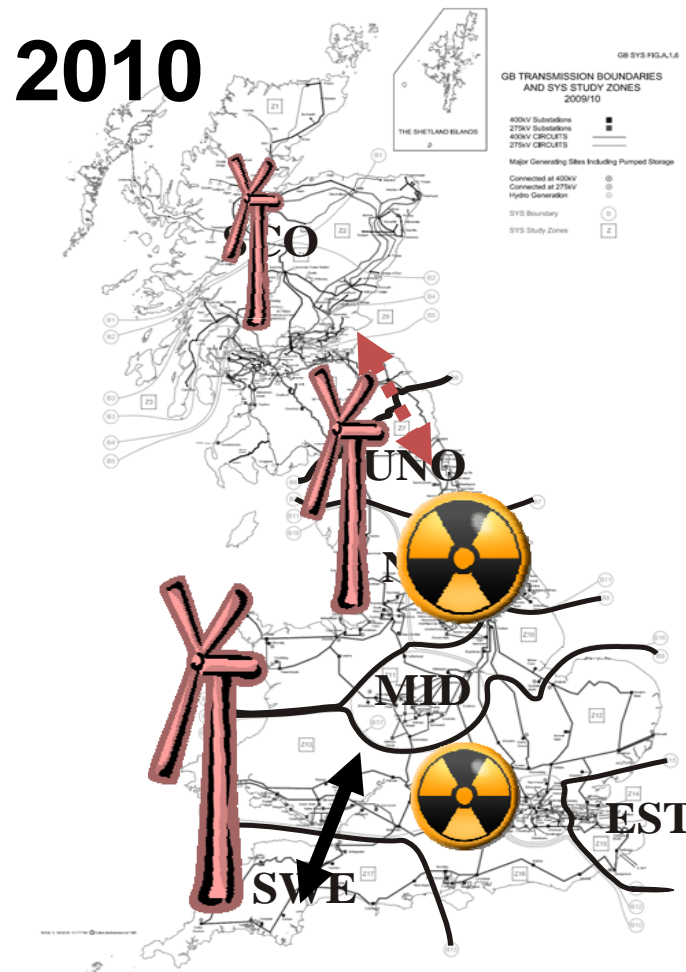


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What if you had perfect foresight?

Low Cost Large Scale Green, stages 1 & 2



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Value of Perfect Information



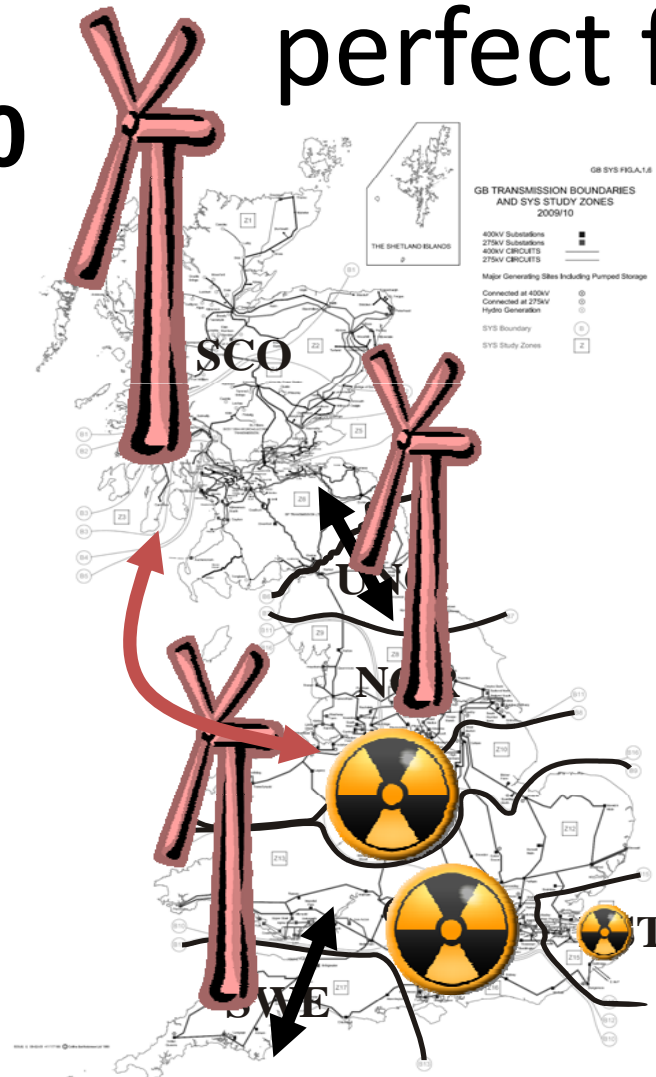
- Total EVPI = $TC_{stoch} - \sum^s \pi^s TC_{determ}^s$
= £7,182M (7.37% of TC_{stoch}^s)
- EVPI when generators do in the 1st stage what they did in the stochastic model
= £10M (0.01%)
= lower bound on $EVPI_{Trans}$

What if you think you have perfect foresight?



2010

E.g., Paralysis imposed stage 1



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Cost of Naïve Decisions:

ECIU_{Trans}



Impose Status Quo	£261M	0.27%
Impose Low Cost DG	£261M	0.27%
Impose Low Cost Large Scale Green	£ 79M	0.08%
Impose Low Cost Conventional	£261M	0.27%
Impose Paralysis	£ 36M	0.04%
Impose Techno+	£ 36M	0.04%
Average	£156M	0.16%

Comparable to 1st stage Transmission Investments

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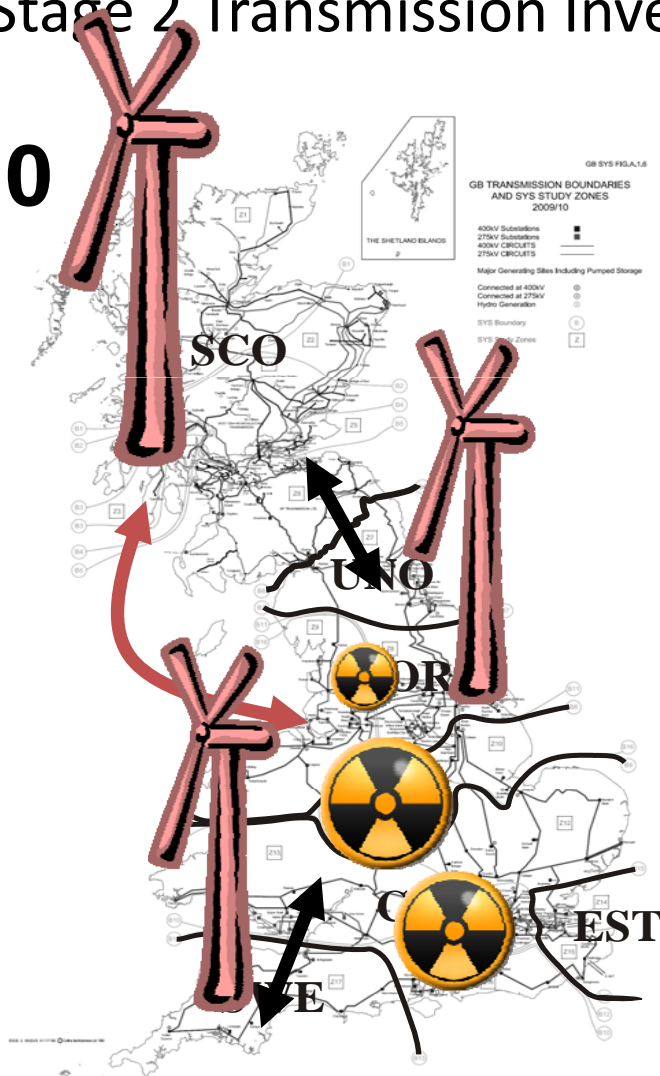
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What if there is no optionality?



Same Stage 2 Transmission Investments in all scenarios

2010



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Option Value (Transmission)



= Increase in cost when eliminate optionality

= £117M (0.12%)

Conclusions



- Main insights
 - Ignoring risk has quantifiable economic consequences
 - Option values can be significant
 - Approach useful for policy/planning questions
- Future work
 - Revisit assumptions
 - Bi-level formulation