Optimization models in the offshore wind industry

Dag Haugland in collaboration with Arne Klein and Joanna Bauer

Department of Informatics, University of Bergen

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Reducing Levelized Cost of Energy (LCoE) of offshore wind farms

- Increasing the energy production
 - optimize turbine positions while considering wake effects



 $({\sf Courtesy:\ Vattenfall})$



Reducing Levelized Cost of Energy (LCoE) of offshore wind farms

- Reducing the costs
 - ► Turbine costs
 - Operation and maintenance costs
 - Logistics costs (both installation phase and operational phase)
 - ► Fatigue costs
 - ► Cable costs
 - etc.



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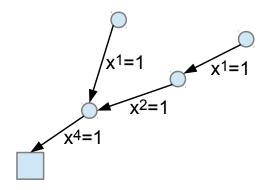
Problem

- ► Given:
 - ▶ a set *T* of turbine locations
 - ▶ a set *S* of substation locations
 - ▶ a set $A \subset L \times L$ of possible connections $(L = T \cup S)$
- ► Goal:
 - ► Connect each turbine to a substation
 - such that total cable length/cost is minimized
- ► Constraints:
 - ▶ Upper bound q (cable capacity) on turbines per cable
 - ▶ Upper bound b (branching capacity) on branches at turbines
 - Cables cannot cross



Integer programming model - variables

- ► Decision variables:





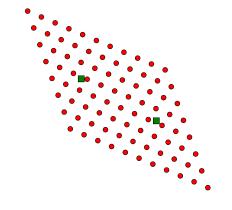
Integer programming model - objective and constraints

- Minimizing costs:
 - $\blacktriangleright \min \sum_{(i,j) \in A} \sum_{t=1}^{q} c_{ij} x_{ij}^{t}$
- Constraints:
 - ▶ Bound on the branches at j: $\sum_{i:(i,j)\in A} \sum_{t=1}^{q} x_{ij}^t \leq b$
 - etc.
- Extension: Two (or more) cable types
 - Costs: $c_{ij} < C_{ij}$
 - ► Capacities: *q* < *Q*
- ⇒ Integer programming model (INF170, INF270, INF271)



Wind farm data

- ► Turbine and substation position data of offshore wind farms
 - ► Sheringham Shoal
 - ► Walney 1
 - ► Walney 2
- ► Euclidean distances as edge cost c_{ij}
- ▶ All possible cable connections allowed $A = L \times L$
- ▶ Branching capacity b = 3



Sheringham Shoal

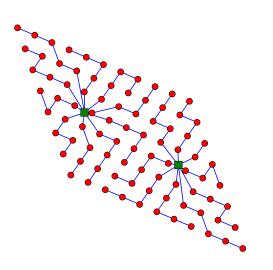
Walney 2



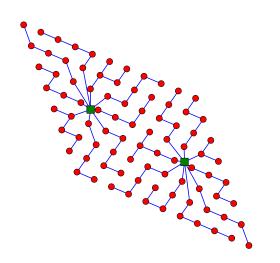
www.uib.no

Illustration of experimental results - one cable type

Example: Sheringham Shoal with q=5



No branching (b=1)

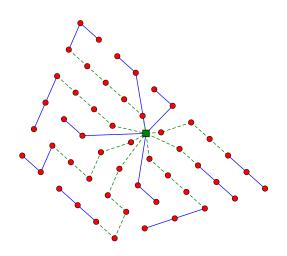


Branching (b = 3)

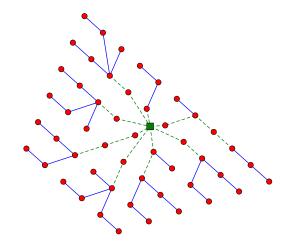


Illustration of experimental results - two cable types

Example: Walney 1, q = 2, Q = 7



No branching (b=1)

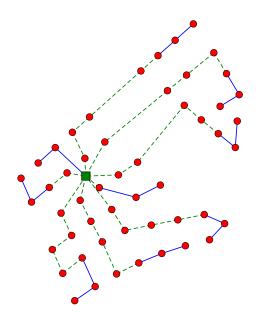


Branching (b=3)

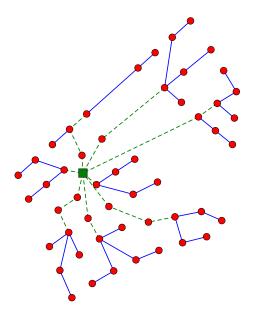


Illustration of experimental results - two cable types

Example: Walney 2, q=2, Q=7



No branching (b=1)



Branching (b=3)



Observations - Further work

Branching vs. no branching:

- One cable type: Small differences (< 1%) between b=1 and b=3
- ▶ Two cable types: Large differences ($\approx 14\%$ at Walney 2 when $q=2,\; Q=7$)

In progress (Klein et al. 2016):

- ► Parallel cables
- Cables around obstacles
 - Optional nodes in addition to turbines and substations
- More realistic cable costs

