Wood Mackenzie

A Verisk Analytics Business

Energy market models at Wood Mackenzie - applications and challenges

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Agenda

Energy market models at Wood Mackenzie - applications and challenges

- Overview of Wood Mackenzie
- Energy Market Models Applications
- Energy Market Models Current Challenges



Overview of Wood Mackenzie





We are a Verisk Analytics business

Helping risk-bearing businesses understand and manage their risk

WoodMac joined the Verisk family in May 2015, forming a strategic alliance between two industry leaders.

Through a partnership with Verisk and Verisk Maplecroft, we deliver an unrivalled commercial intelligence portfolio for the world's natural resource markets, helping clients make complete risk-adjusted decisions that will strengthen their operations.













Promoting integration and collaboration with the client at the centre of it all



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Energy, Metals and Mining Market forecasting to 2035

Ingredients: Data, Models and People

- Methods used:
 - » Various Statistical Methods
 - » Optimisation Type Models
- Data, detailed and bottom up:
 - » Publicly available
 - » Proprietary with a particular strength on the supply side







Wood Mackenzie A Verisk Analytics Business		Repo	orts 🔻	Search	n reports, i	nsights an	d data	۹				X
	Production (2005-2014)											Britannia 822.50 KB (xls)
Table of contents		2005	2006	2007	2008	2009	2010	2011	2012	2013	2014	
	Condensate ('000 b/d)	18	14	13	12	9	6	5	4	3	3	DOWNLOAD ALL (1.43 MB)
Key facts	Sales Gas (mmcfd)	535	420	391	375	304	257	223	207	146	152	Analysts
Summary and key issues	Source: Wood Mackenzie											Analysis
Location maps												Related tools
Participation	Production (2015-2024)											
Geology		2015	2016	2017	2018	2019	2020	2021	2022	2023	2024	🕑 Upstream Data Tool
Well data	Condensate ('000 b/d)	3	3	3	3	3	2	2	2	2	1	Asset Valuations – Upst
Exploration	Sales Gas (mmcfd)	150	160	160	140	112	90	76	64	56	44	Global Economic Model
Reserves and resources	Source: Wood Mackenzie											Upstream (Desktop)
Production	Please refer to our Upstream	n Data Too	I (UDT) for	life of field	production	data.						PathFinder (Desktop)
Development												Upstream Asset Valuation
Infrastructure	Britannia Production Pro	file						_				C Launch Asset Valuation
Costs	'000 b/d						mmcfd					
Sales contracts	120						[70	D				Britannia BASE UK Concession Calc File Novem
Fiscal and regulatory							- 60	0				2015 4.81 MB
Economic assumptions	100	1					- 50	D				Related searches
Economic analysis	80	6					40	D				Annal and the shares of a
	60						- 30	0				Asset report: Upstream oil a gas United Kingdom

300

200

100

The Wood Mackenzie Portal

Development

Source: Wood Mackenzie

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20

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Key Development Metrics

· Two wells per year are expected to be drilled between 2015 and 2019.

õ

Liquids

2 2 2

Gas

- We assume these will cost £21 million per well.
- We also assume £50 million for rig reactivation in 2014.

Platform Details

ations – Upstream nomic Model ktop) (Desktop) Valuation set Valuation ASE UK IC File November pstream oil and gas United Kingdom Country report: United Kingdom Insight: Upstream oil and gas United Kingdom Asset report: Upstream oil and gas Chevron ConocoPhillips Mitsui E&P UK Tags • All Regions Asset report Britannia Central North Sea Chevron ConocoPhillips Costs Europe Exploration Field Gas Infrastructure Mitsui E&P UK Moray Firth Northern Europe Operational Production Reserves and resources

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Other Wood Mackenzie Products and Database

Non-exhaustive list

- Global Economic Model (GEM) for Oil & Gas and Mining (Coal/Metals) Valuations
- Refinery Valuations
- Country-by-county energy balance forecast
- Global Oil Supply
- North American tight oil and shale gas databases
- Power Plant Databases
- Chemicals markets forecasts
- and many more....
- And of course optimisation models



Energy Market Models - Applications



Optimisation Models at Wood Mackenzie - Overview

Proprietary models developed by Wood Mackenzie

- Internal Models:
 - » Regional power models
 - » Regional gas and power models
 - » Regional coal and power models
 - » Coal trade model

- Internal and Commercial Models:
 - » Global Gas Model
 - » Refinery model
- Consulting solutions:
 - » Bespoke models
 - » Bespoke analysis based on models

3rd Party Modelling solutions used at Wood Mackenzie

- » Regional pipeline utilisation model
- » Regional power model

There is clearly a demand for commercial off-the-shelf modelling solution and we believe that Wood Mackenzie with it's rich data is ideally place to offer more energy market models.



Optimisation Models at Wood Mackenzie - Techniques

Types of Models Used

- Energy market models, mainly LPs with additional heuristic elements
- Power market models, LPs and some IPs
- Refinery models, NLPs







Case Study: Wood Mackenzie's Global Gas Model

General Overview of the Model

- Fairly standard supply and demand network model
- All aspects of the infrastructure (pipelines, LNG terminals) included
- Demand Response via stepwise demand function
- LP setup allows you to integrate elements of expert knowledge:
 - » Contracts via a database of more that 800 contracts
 - » Basic representation of producer market power
- Main difference with academic resource models is the investment mechanism
 - » Driven by data: we know the production profiles and cost breakevens
 - » No broad-brush marginal investment mechanism X\$ investments -> X added capacity
 - » Mechanism is closer to a scheduling mechanism
 - » Could have been implemented as an IP but an approach of sequentially solving LPs with some post-processing heuristics works faster.



Global Gas Modelling Process

1. Input Assumptions

- Supply and demand
- Infrastructure (pipe/LNG)
- Contracts
- Storage
- Producer power
- etc



2. Supply Scheduling

Automatic scheduling of new gas supply resources / gas fields (in the presence of producer power where appropriate)

4. Reporting and Review

- Manual review of outputs
- Identification of refinements
- (Optional) Modification of inputs for new run
- 17 Trusted commercial intelligence www.woodmac.com

3. Gas Flows and Clearing Prices

Forecasting flows and clearing prices (in the presence of producer power where appropriate)



Supply Scheduling: Competition Between New Build and Existing Assets

- During supply scheduling ("New Phase"), the GGM meets demand with the least cost combination of existing or forced schedule assets offered at Short Run Marginal Costs and new/unscheduled assets offered at Long Run Marginal Costs (overwritten by appropriate market power element if present)
- In any year when an unscheduled new asset is not required, its production profile is pushed back by a year. This "push back" decision process continues until the asset is either used for the first time (and its profile is fixed) or the end of the forecast period is reached.



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Energy Market Models – Challenges



Optimisation Models at Wood Mackenzie – Challenges I

Not hard problems – recurring problems...

- Data and data management:
 - » Volume of data from different sources (DBs, regions, units, etc.)
 - » Integration for data flows in and out of models
- Market knowledge:
 - » Integrating soft market knowledge
 - » Getting non-modellers comfortable with the models and their outcomes



Optimisation Models at Wood Mackenzie – Challenges II

What is the best modelling platform?

- Wood Mackenzie is a data and analysis company, not a software company
- Models used and built in different platforms reflect the historical evolution of our analysis:
 - » Internally we use GAMS or AIMMS + ACCESS
 - » 3rd party platforms
 - » Python for prototypes
- Goal is to create a new modern modelling platform for data management, running the model and result visualisation
 - » Flexible for internal use and model development
 - » Intuitive and easy to use for clients even without a hard modelling background through a graphical user interface







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