

# **A spatially resolved agent-based analysis of potential shale gas development in Poland**

**S. Giaccaria**  
**N. Zaccarelli**

## Research question:

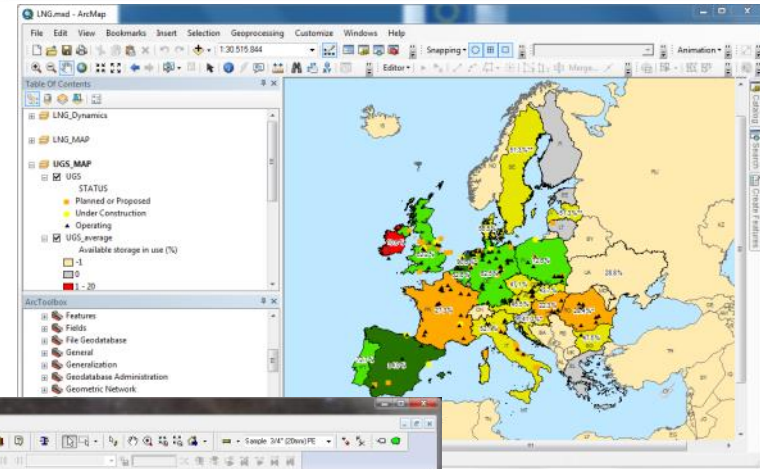
Impacts of a future development of unconventional gas on job creation and additional infrastructures (case of Poland).

Choice of the modeling approach: considering Input-Output and GCE.

- modelling exercise should generate a tool for policy support. A scenario generator for exploring determinants, barriers and impacts of the development of shale gas projects. Aimed at investigate what-if scenarios: agent based modelling (ABM)
- Main difference from a pure optimization approach: we should be able to reproduce failures, out-of equilibrium situations.
- «*What should be*» (optimization) versus «*What it could be if...*» (agent based modelling).
- Agent-Based Models: is a family of computational models. Used in the field(s) of theory of consumer behavior, game theory, complex systems, computational sociology. Entities (agents) with a set of goals and behavioral rules.
- Usually very simplified rules, driving (at a micro level) actions and interaction of agents, generate (at a macro level) complex and not intuitive patterns.
- Advantage and disadvantages
  - KISS (A/D)
  - Explicitly representing different phases of projects
  - Integration of monetary and non monetary factors
  - Heterogeneity of agents
  - Interactions (context)
  - Time dynamic

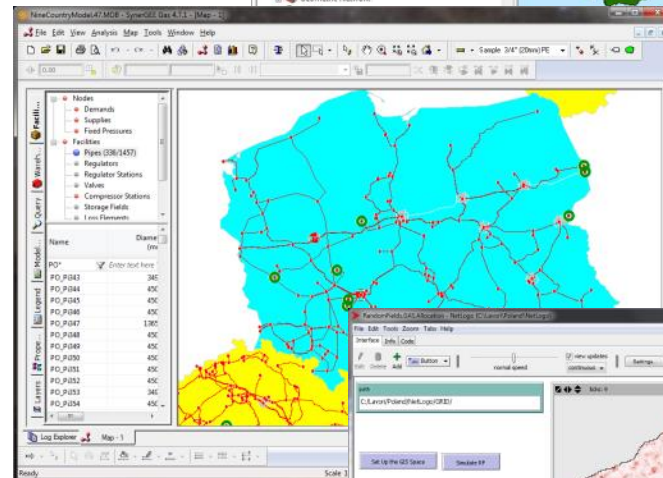
- **Spatial modelling**

- *ESRI ArcGIS Desktop*



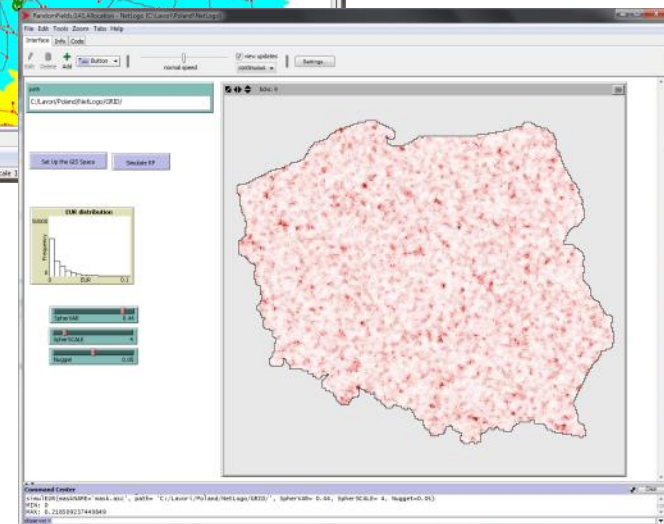
- **Hydraulic modelling**

- *GL Noble Denton Synergee GAS*



- **Agent Based Modelling**

- *NetLogo*



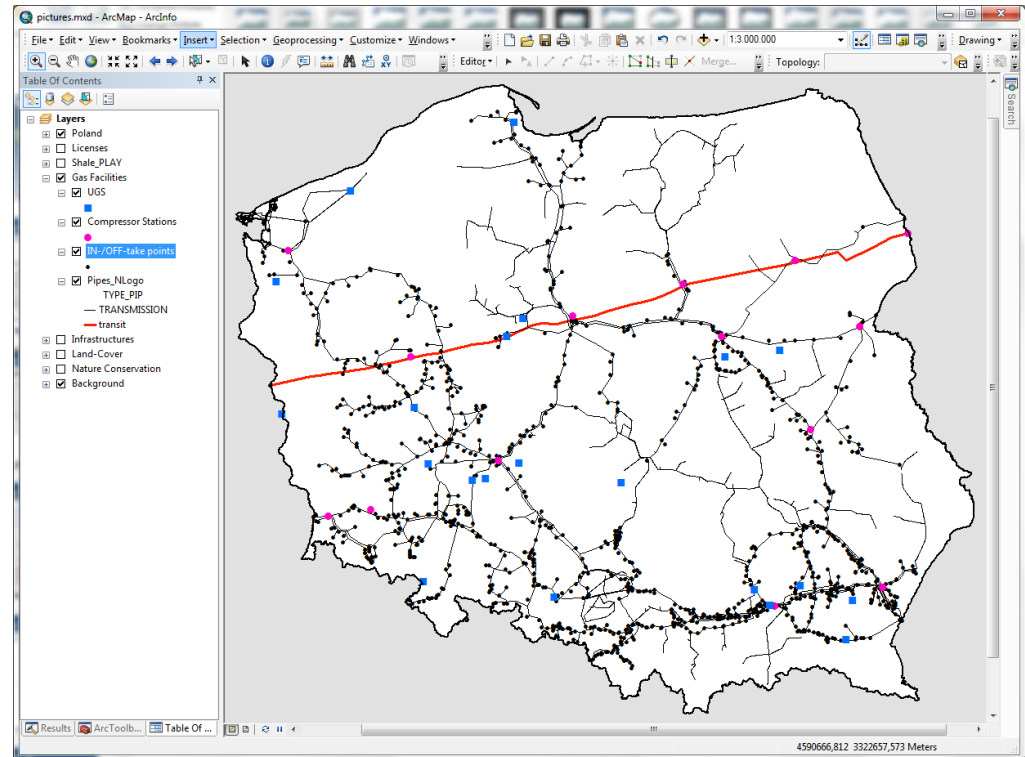
## Spatial modelling

### National Gas Transmission System (from TSO):

- Pipelines (transit and transmission);
- In-/Off-take points;
- Compressor Stations and UGS.

### Necessary to:

- Gas infrastructure accessibility
- NGTS spare capacity



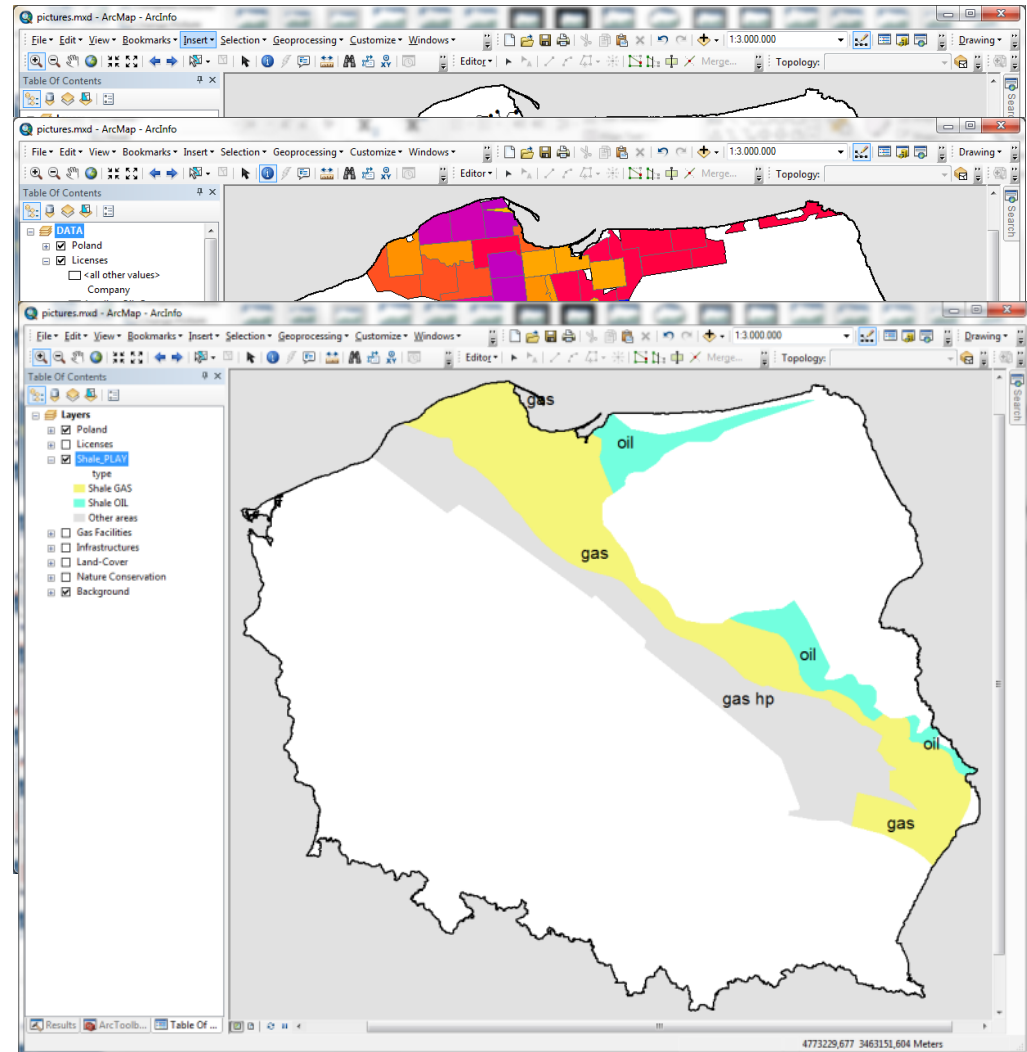
## Spatial modelling

### National Gas Transmission System (from TSO):

- Pipelines (transit and transmission);
- In-/Off-take points;
- CS and UGS.

### Drilling Licenses (at 01.01.2014) from the Ministry of Environment.

### Shale gas basin (Lower Paleozoic) from the PGI



## Spatial modelling

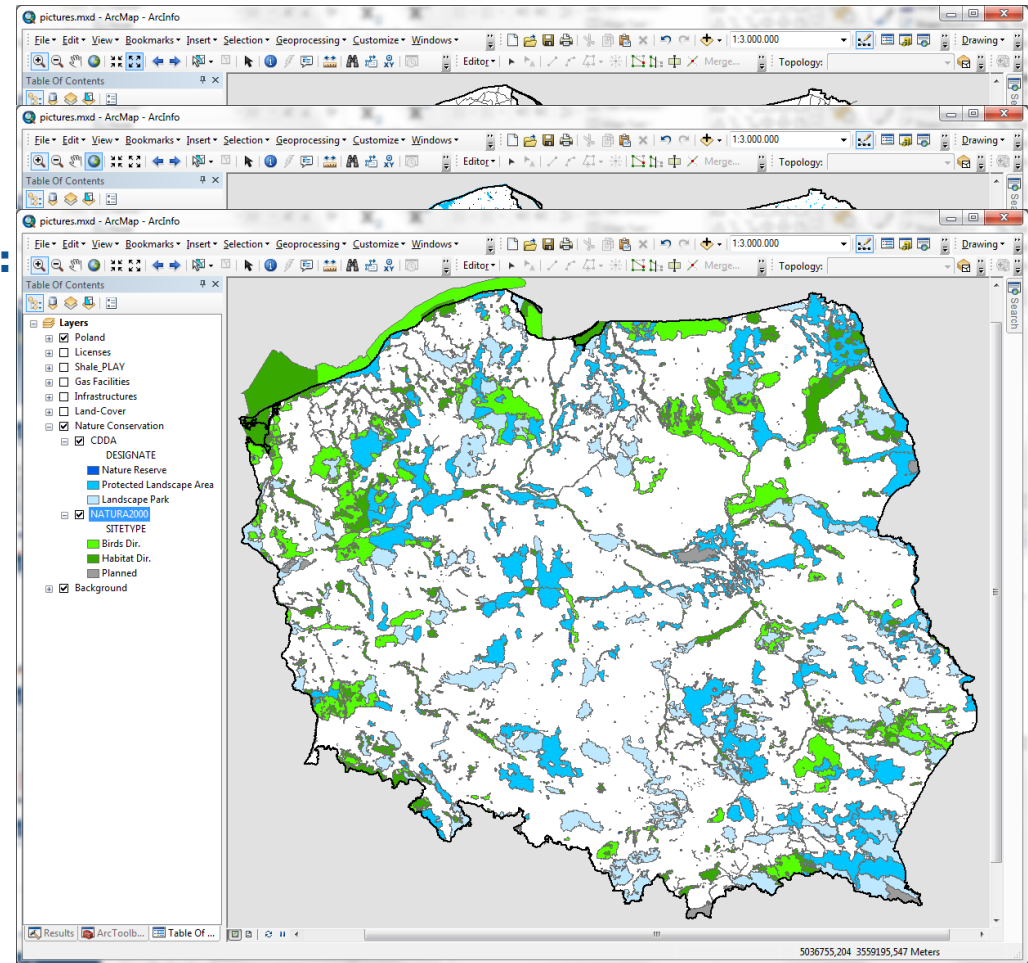
### National transport system (from GISCO):

- main roads;
- railroads.

### Urban areas and Inland Water Bodies (from CORINE LandCover)

### Natural Protected Areas:

- National Parks and Reserves (Min. Env.);
- NATURA 2000 (EEA).





## Spatial modelling

### Reference Grid for NetLogo world

- 3x3 km squares for each well pad;
- enlarged for boundary conditions;
- define the grain of the analysis.

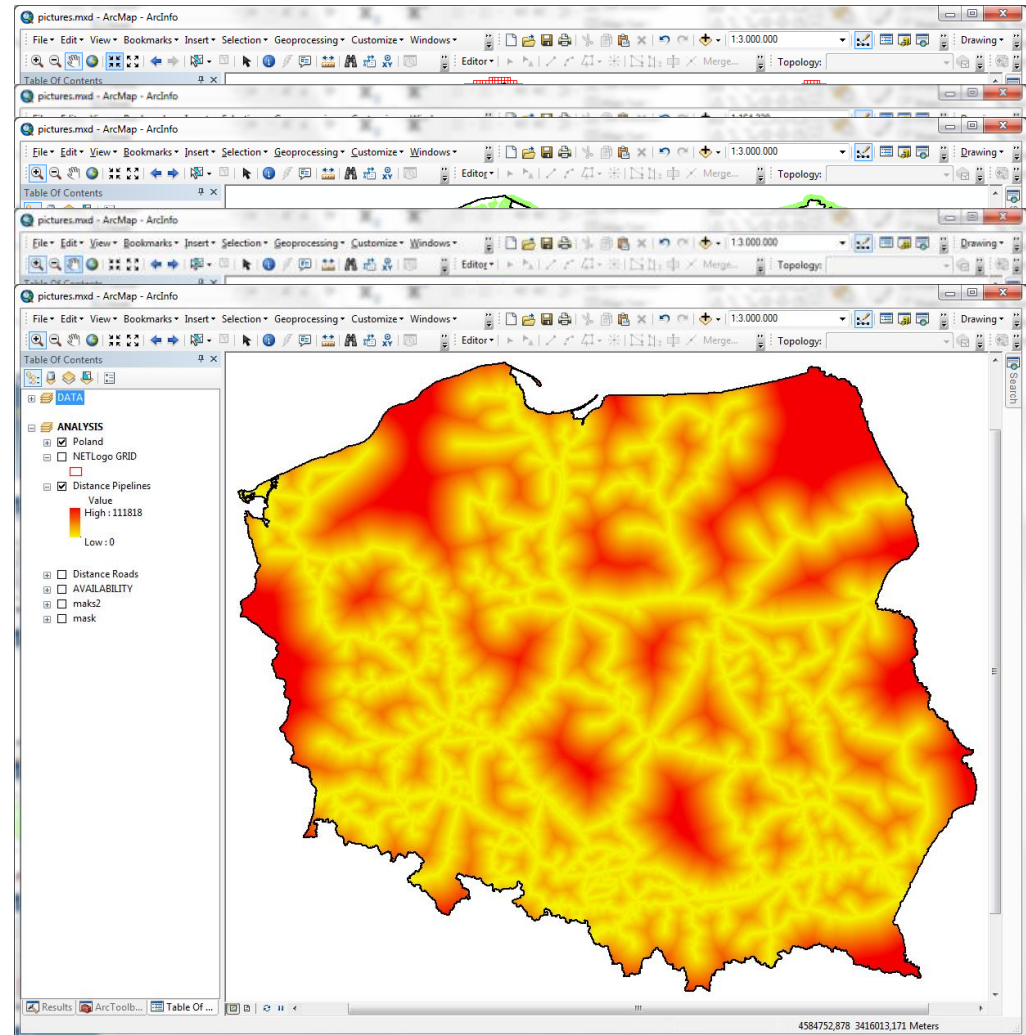
*From previous base data we derive:*

**Land availability (no legal constraints) with buffers**

**Distance and Density of roads**

**Distance and Density of Pipelines**

**Distance to Industrial areas**





Polish Geological Institute  
National Research Institute

4, Rakowiecka Street, 00-975 Warsaw, Poland; Tel. (+48) 22 45 92 000; Fax (+48) 22 45 92 001; sekretariat@pgi.gov.pl

[www.pgi.gov.pl](http://www.pgi.gov.pl)

Polish Geological  
Survey  
Polish  
Hydrogeological  
Survey

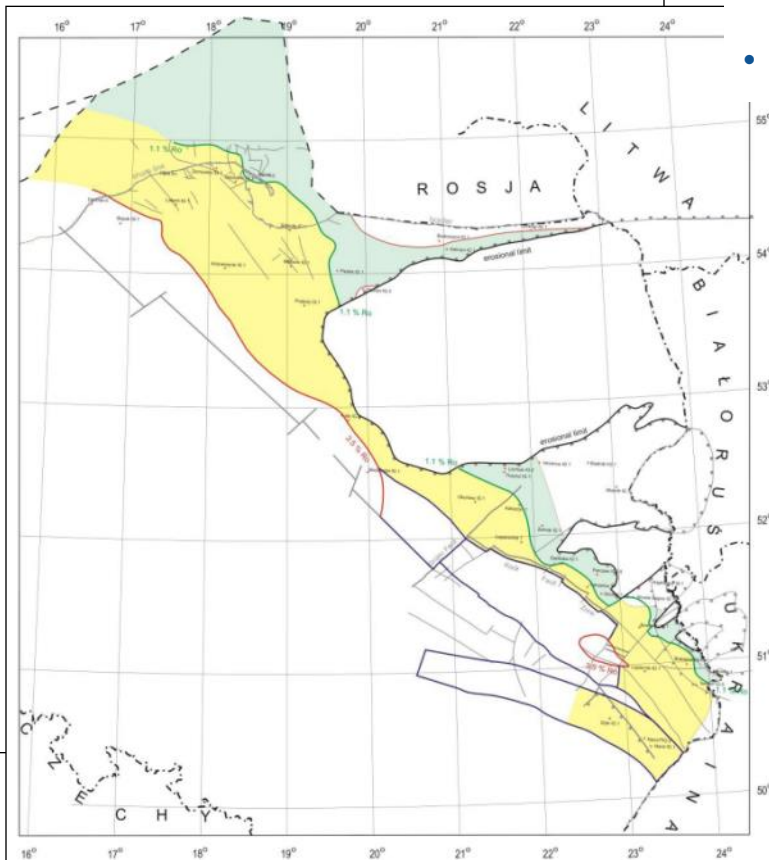


Figure 14.  
The acreage incorporated into assessment units and qualified into calculation of resources of shale gas (yellow color) and shale oil (green color) in a model with maximum thickness of shale intervals with TOC contents > 2 % wt on the basis of 39 exploratory drillings from 1950-1990

The report of 2012 is based on:

- historical data (39 expl. drillings from 1950 to 1990);
- assumptions on TOC and other variables;
- EUR and average acreage drained by wells from US.

Table 1

Recoverable resources of shale gas in the Lower Paleozoic basin. Bcf – billion cubic feet. Bcm – billion cubic meters. EUR – Estimated Ultimate Recovery.

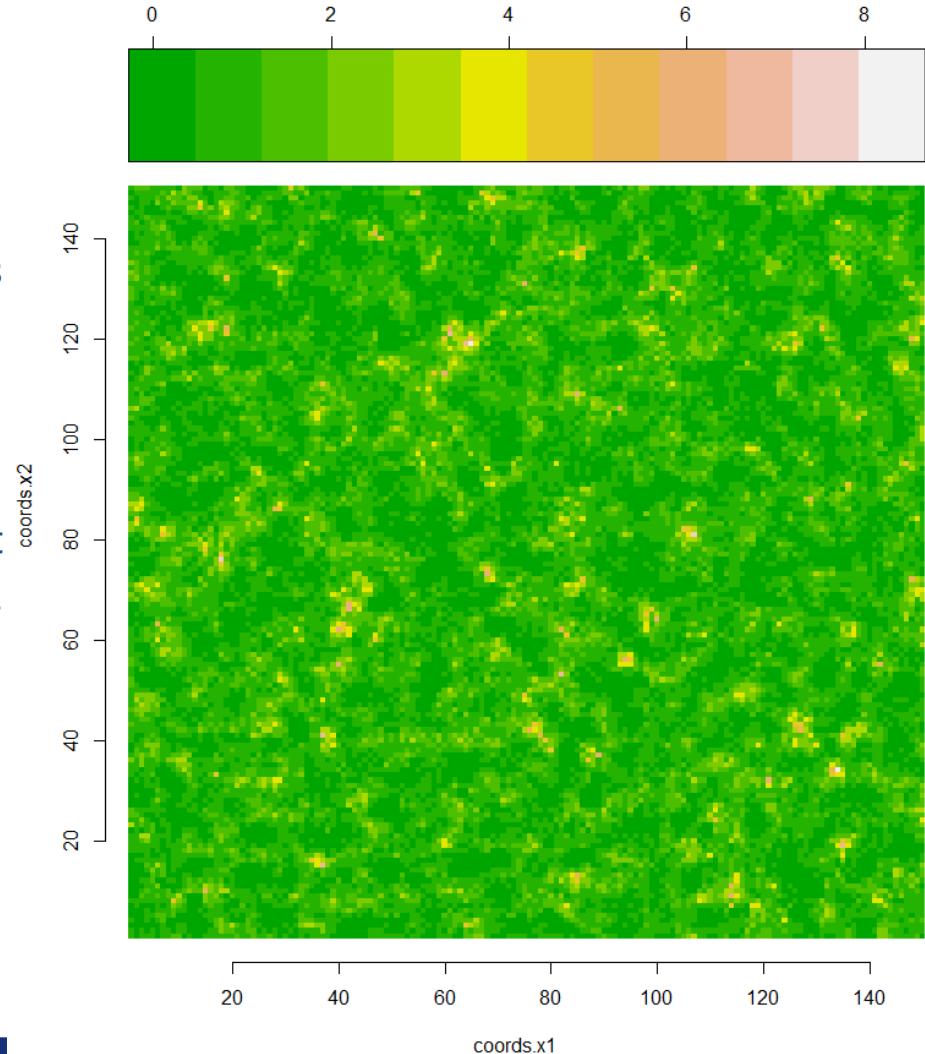
	EUR minimum 0.04 Bcf = 1,13 MMcm),	EUR optimum (0,4 Bcf = 11,3 MMcm)	EUR maximum (1 Bcf = 28,3 MMcm ),
offshore acreage max. 7 952,4 km <sup>2</sup>	14,8 Bcm	148,4 Bcm	371,1 Bcm
offshore acreage min. 6 192,4 km <sup>2</sup>	11,6 Bcm	115,6 Bcm	289,0 Bcm
onshore basin acreage max. 33 183,3km <sup>2</sup>	61,9 Bcm	619,4 Bcm	1 548,6 Bcm
onshore basin acreage min. 12 347,3km <sup>2</sup>	23,0 Bcm	230,5 Bcm	576,2 Bcm



The EUR spatial distribution is modeled as a random field.

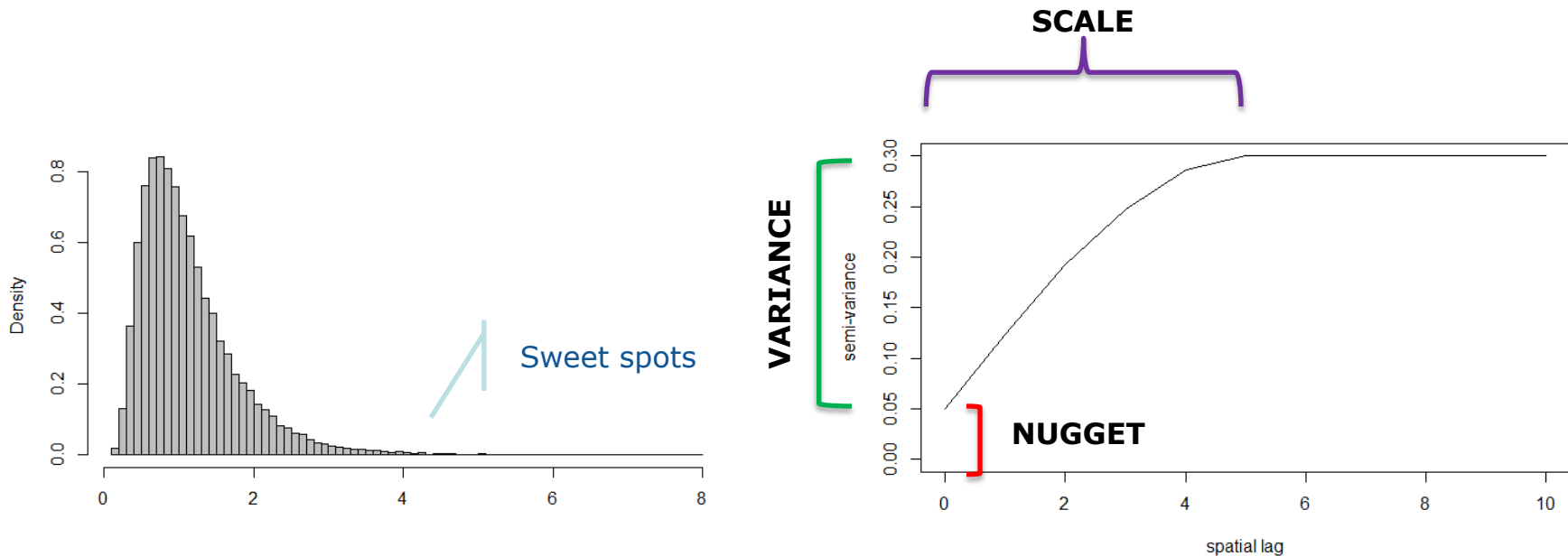
**Random field** is a list of random numbers whose values are mapped onto a space and are spatially correlated.

In its most basic form this might mean that that nearby values are more similar than far-apart values.

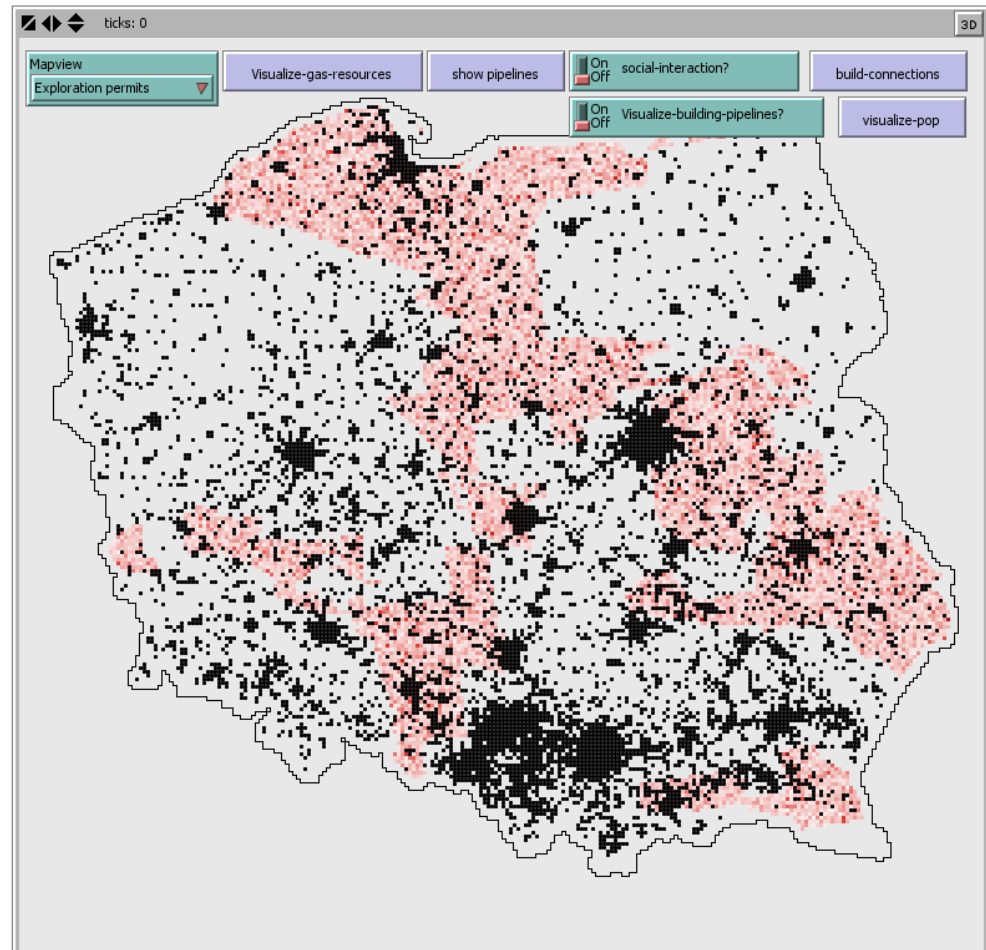
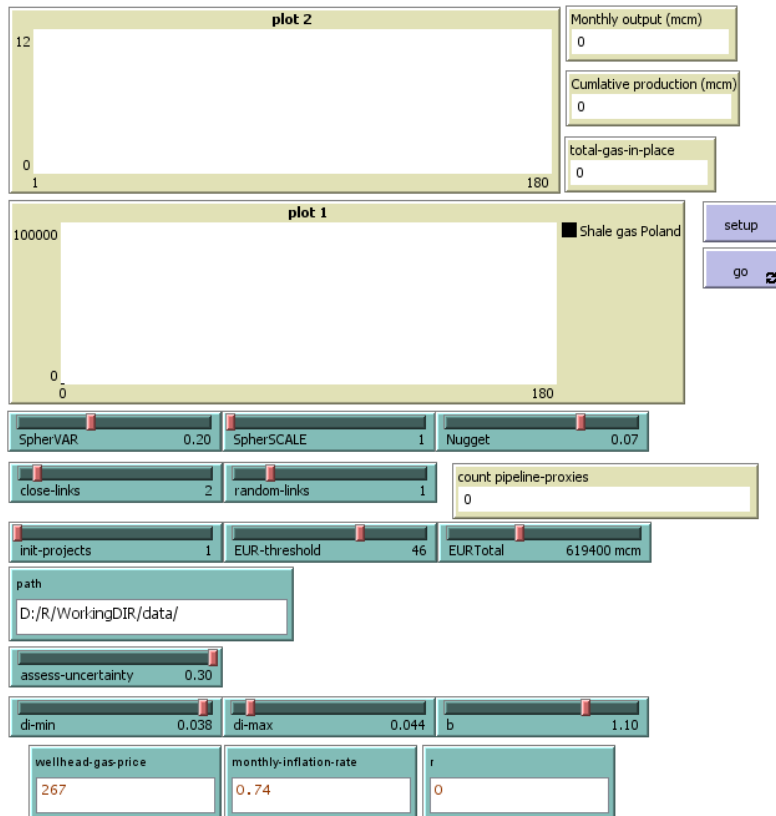


The EUR spatial distribution is modeled as a random field with:

- identical distributed random variables following a lognormal distribution;
- a spherical semi-variogram model (nugget, variance, scale);
- a stationary and isotropic process.



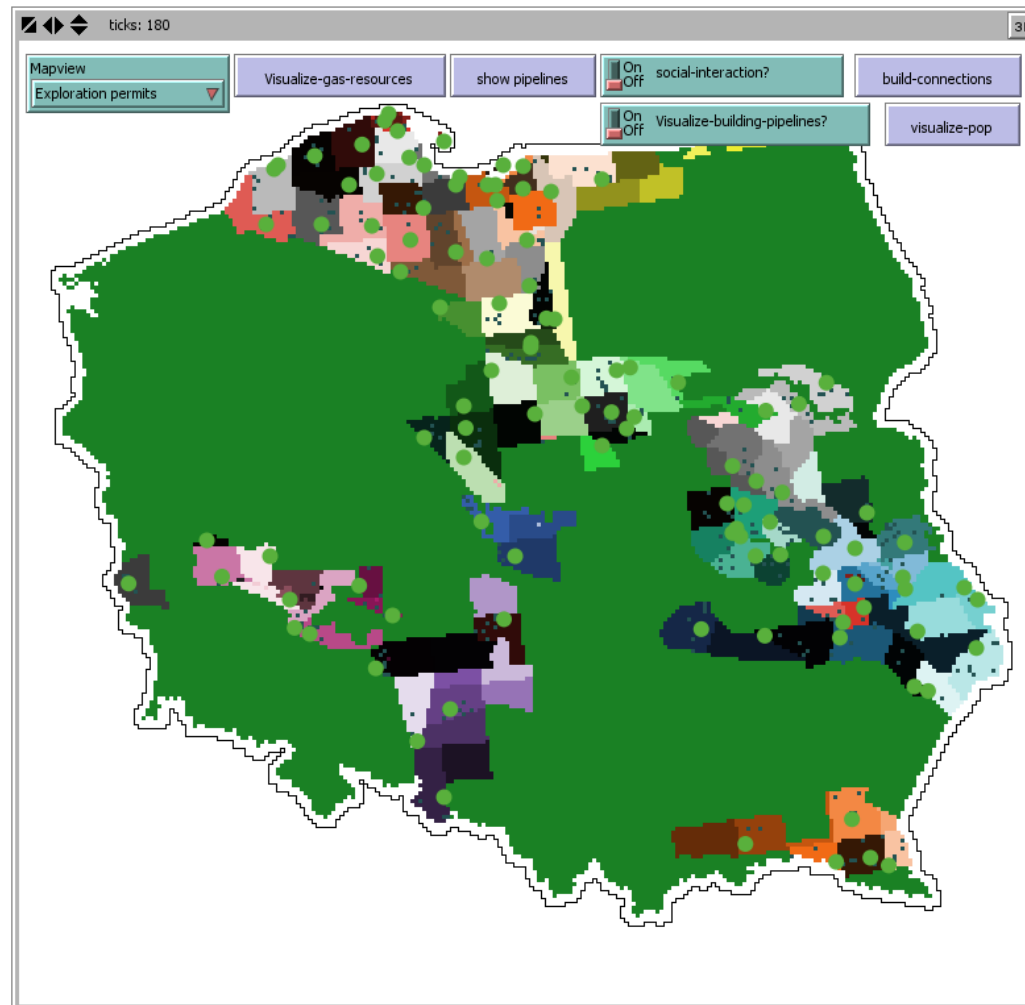
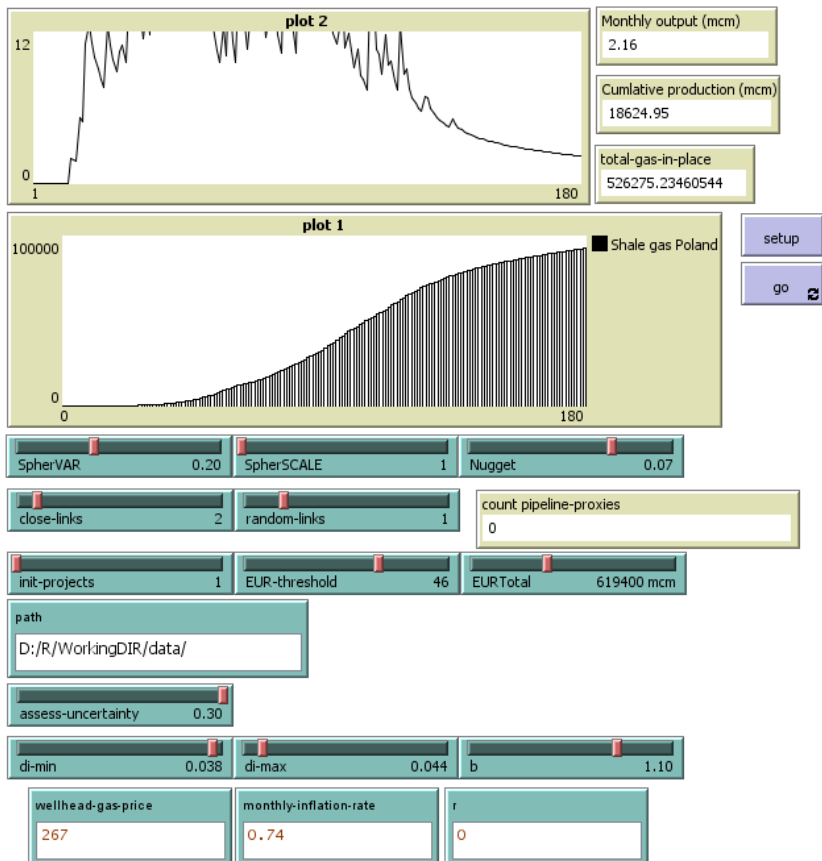
## The interface



WHITE low values  
DARK RED high values

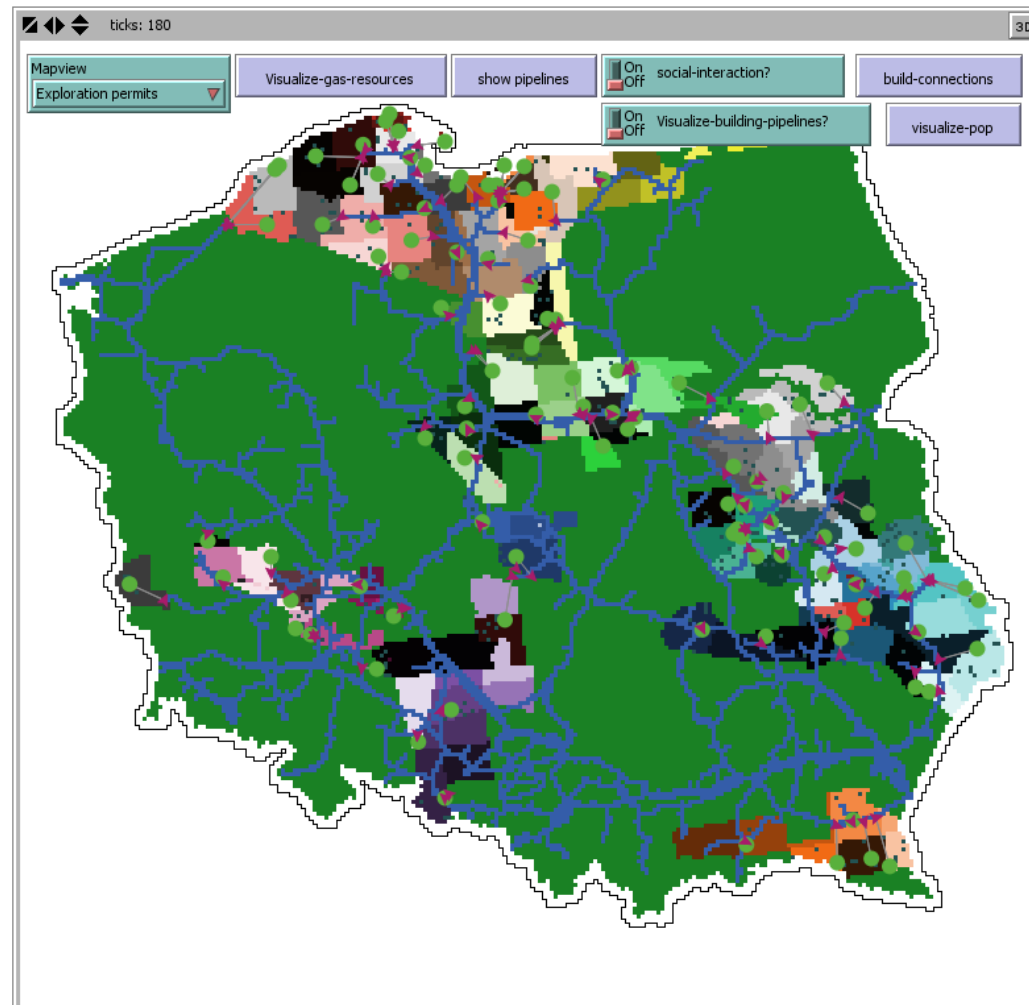
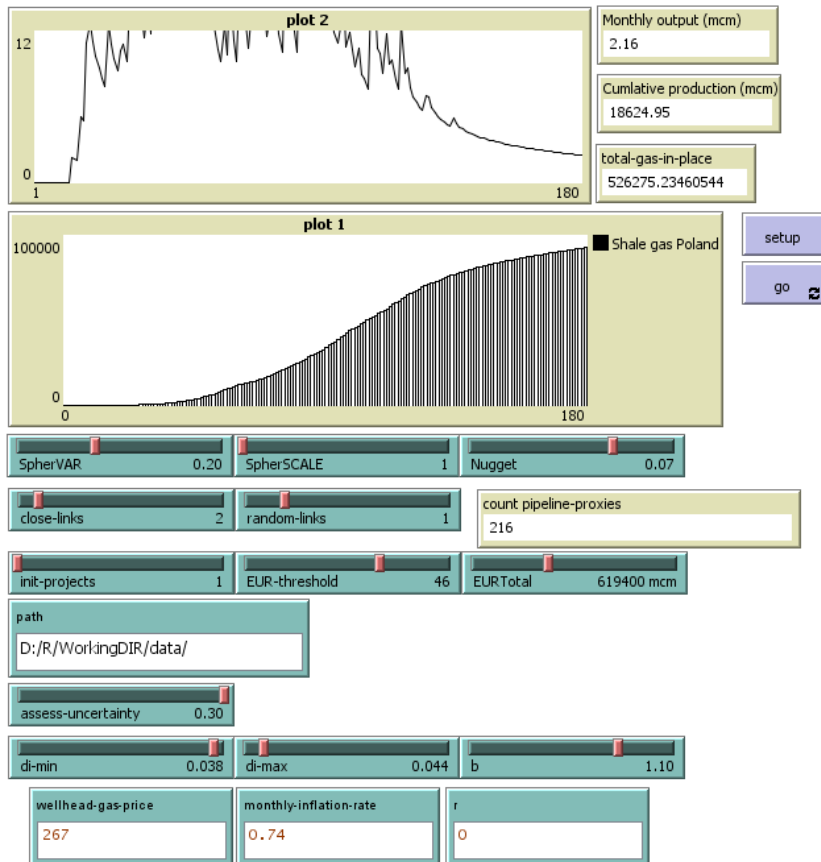


European  
Commission

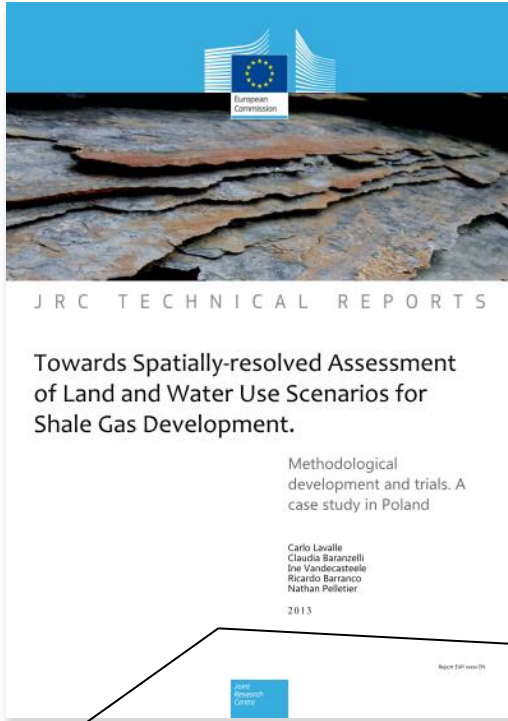




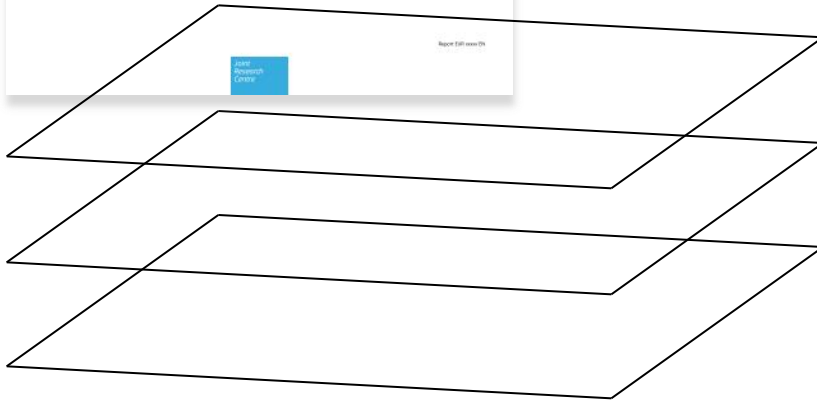
European  
Commission



# Overlapping the dimensions



**Assess impact on water;**  
Spatially resolved;  
No economic assumptions.



*Financial/Economic space (investment decisions, technology, ...)*

*Physical space (geology, infrastructures, ...)*

*Societal actors (residents, institutions, organizations, ...)*

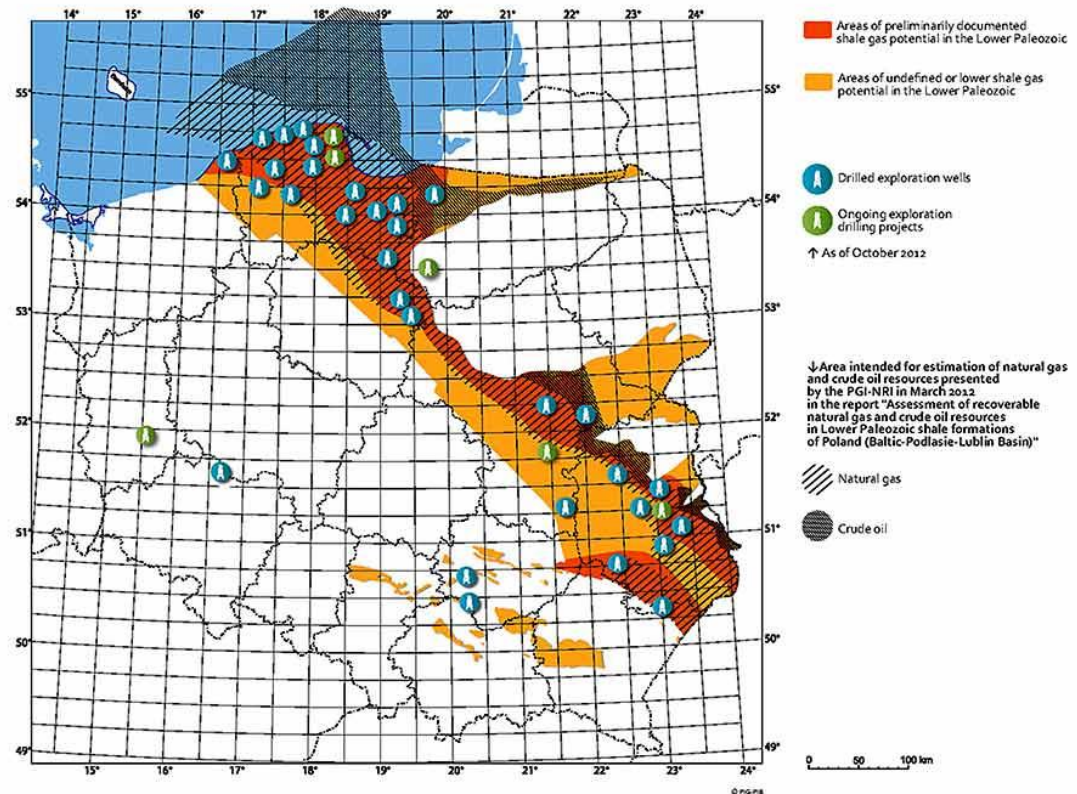


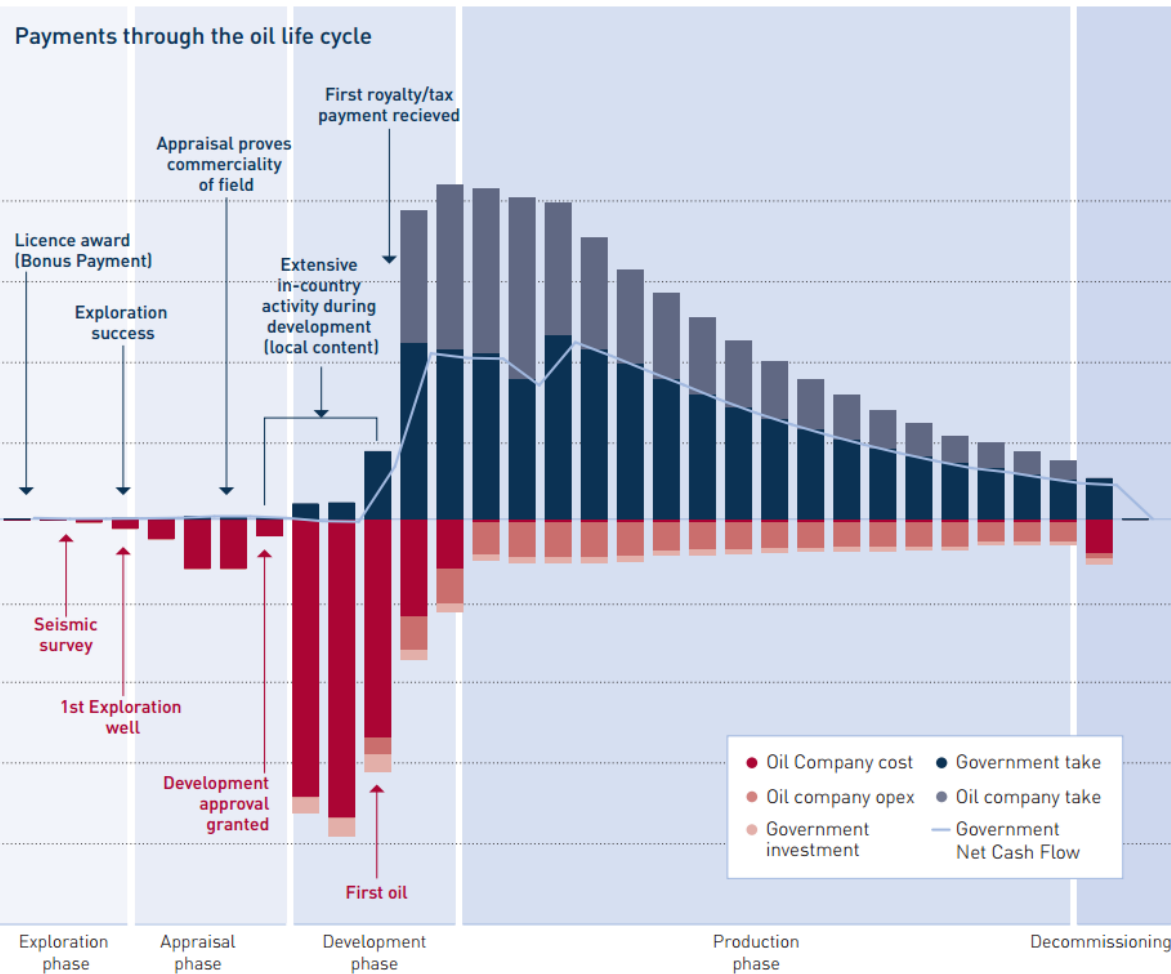
## Agents: projects or companies?

3Legs Resources, BNK Petroleum, CalEnergy, Chevron, CNOOC, ConocoPhillips, Cuadrilla Resources, Dart Energy, DPVService, ENI, ExxonMobil, HuttonEnergy, LNG Energy, LOTOS MacOil, Marathon oil, Mitsui, PKN Orlen, Petrolinvest, PGNiG, RAG, San Leon Energy, Sorigenia, Stena, Total, Wiswnt Oil&Gas

In order to empirically inform the simulation, some indicators related to **the level of capitalization**, debt situation, diversification of activity are to be introduced as agents' attributes.

**Different companies are assumed to have access to the same set of technologies.**





### Local cost components

expenditures

For building road, power, gas connections are site specific.

### Institutionally driven cost components

timing of the authorization process

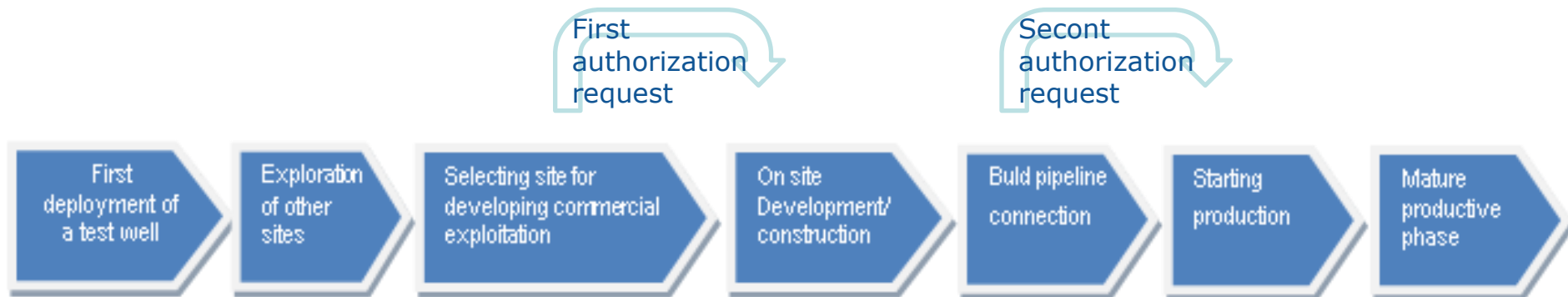
### Global, or not site specific cost components

Expenditures for drilling, fracking and water waste treatments

In the actual version of the model, companies interact with central governmental institutions in the form of authorization requests:

- a first between the exploration and the development phase
- a second in between the development and the production

The agent (agency) takes a definite number of time steps to assess each single application, so the waiting time is defined by the number of concurrent applicants.

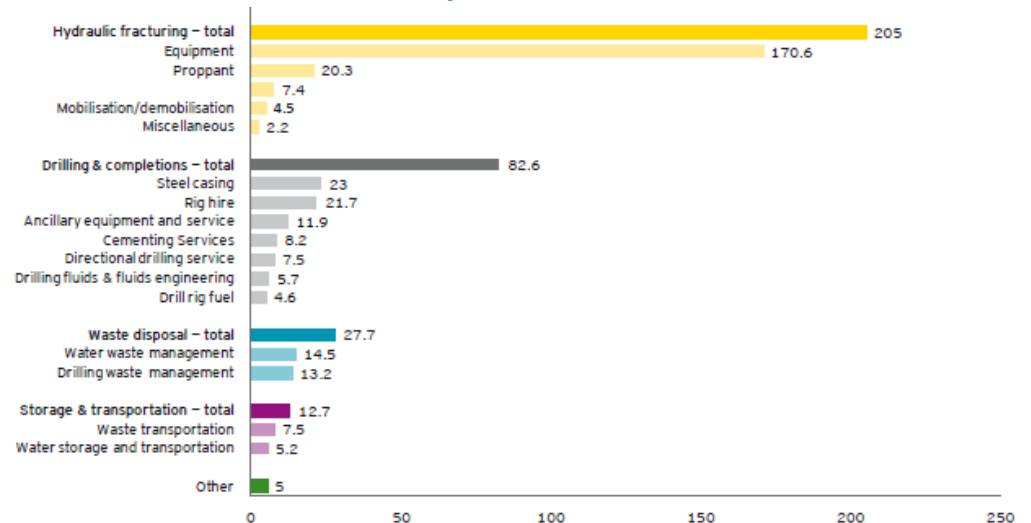


# How much... (where and when?)



**The essential information we are actually implementing to structure the DCF is the allocation of costs across the lifecycle of the investment.**

*Breakdown of spend £m categories for a single pad (10 vertical wells, 40 lateral wells)*

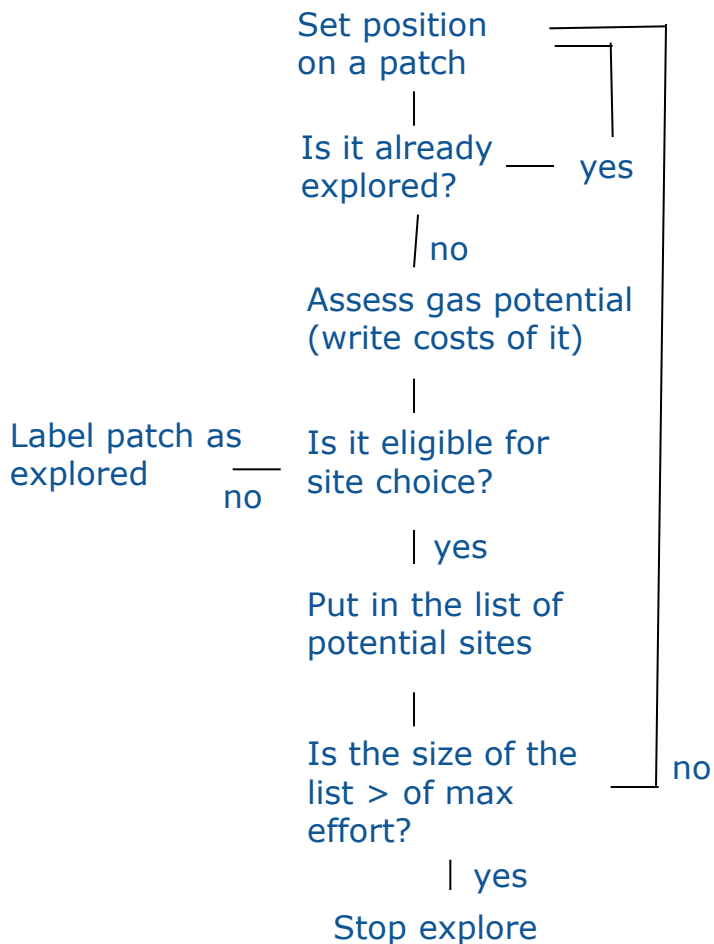


## Getting ready for UK shale gas

Supply chain and skills requirements  
and opportunities

April 2014

# Reshape DCF



The basic rule for financial investor is to compute the project value as a sum of discounted flows. All the financial costs written at each round in the project accounts are compared to a baseline reference series of cash flow (to be found...) according to the formula:

$$\Delta NPV = \sum_{year=1}^t \frac{(R_a - C_a)}{(1+r)^t} - \sum_{year=1}^t \frac{(R_{ref} - C_{ref})}{(1+r)^t}$$

The tick (time unit) of the simulation is monthly, while the financial check is done every 12 ticks.

The actual implementation of the model performs NPV calculation, and the behavioral rules for adjusting decision are still to be designed (this should follow feedbacks and collaboration from E&P companies).

If the surplus is negative, the company can go to debt funding without changing the baseline profile, or adjusting her discount rate. The firms can risk financial failures, opting for increasing their expectation in terms of gas production.

The adjustment of the baseline expectation is an attempt to model a process of learning of firms working on an innovative playing field with high uncertainty and imperfect foresight.

## Exploration

Financial expenditures :

- Acquisition of acreage
- Seismic data collection
- Exploration

The early exploration effort is quantified (random distribution 2.5 - 5 M€) for each patch (3x3 km).

The assessed gas content for each patch is revealed to the explorer as:

$$g_a = g_e + \varepsilon$$

$g_a$  is the assessed gas amount (TRR). we need to pass from URR to TRR through a recovery factor.

$g_e$  is the actual presence of gas (parameter  $g_e$  of patches in NetLogo)

epsilon an error, dependent from  $g_e$ ,

normal distributed with  $\mu = 0$  and  $s.d. = x \%$  of  $g_e$  (parameter  $g_e$ ).

The company explores groups of patches. A threshold can be adopted as criteria to consider the patches as potentially suitable for drilling a test well  $g_a > g_{\min}$

The size of the group of patches explored (parameter  $\text{max-effort}$ ) varies according to the capitalization level of the company (which determines the potential capacity of financial exposure).

A set of possible locations is built making a list of patches with  $g_a > g_{\min}$ .



# Site choice



## Exploration (cont'd)

After having defined a list of patches eligible well drilling (`eligible` attribute of patches), the company should choose one site. Two possible ways have been considered

- Lexicographic preferences: choosing the site with the highest value of gas assessed  $g_a$
- Multiattribute choice: the assessed gas potential remaining the leading factor, some other issue can also have an influence on the probability to chose one of the set of explored. We can adopt the specification of the deterministic component of multinomial processes (McFadden, 1973) that is usually employed for modelling qualitative choice behaviours . The probability of preferring the patch  $i$  among the  $j$  alternatives is accordingly defined as a function of the attributes of  $i$ , and the other  $j$  attributes over the entire choice set.

$$P(i|J) = \frac{\exp(\beta_1 x_{i1} + \beta_2 x_{i2} + \beta_{\dots} x_{\dots} + \beta_{in} x_{in})}{\sum_{j=1}^J \exp(\beta_1 x_{j1} + \beta_2 x_{j2} + \beta_{\dots} x_{\dots} + \beta_{in} x_{in})}$$

### Possible attributes:

- Distances from other ongoing gas extraction activities (`B_neighbors_wells`)
- Accessibility (proximity) to existing gas pipelines, load points (`B_grid_proximity`)
- ....

## Government

Permitting  
explorations

Permitting production

Setting taxes  
(corporate, royalties  
and production)

Gas market regulation  
(spot or contract)

presence and stability  
of a regulatory  
framework drive  
investment decision of  
**Gas companies.**

## Gas companies

DCF for

- Exploration
- Development
- Production

**Environmental**  
constraints and  
resource drive many  
capital and operating  
costs.  
Government actions  
induce cost  
variations, time lags  
etc.

## Social actors

Acceptance  
  
Job creation

Driven by **Gas  
companies**  
(+) by job creation  
(-) by environmental  
externalities  
  
Depending from social  
interactions  
  
General perception of  
the technology affects  
**Central government**

## Environment

Accessibility to gas  
resources

Accessibility to  
transport services

Existing gas pipelines

**Gas companies**  
activities induce  
externalities,  
perceived by  
residents.

# Development and production



## Drilling, site completion

GIS data allows to specify, for each development site, the cost for connecting the site to the road network (to be input as `road-cost`)

## Production

Once the stock of gas is quantified ( $g_e$ ) the time dynamic of the extraction activity can assumed to follow a decline curve.

Here we assume the hyperbolic type, based on the evidence based works on the US wells (alternatively the exponential form is suitable).

We introduce heterogeneity on  $b$  and  $D$

$$f_n = f_i(1 + bDt)^{-b}$$

Where

$f_n$  is the gas production in year  $n$

$f_i$  is the starting flow in the first year

$a$  is a negative fraction expressing the decline in production

## Two key issues:

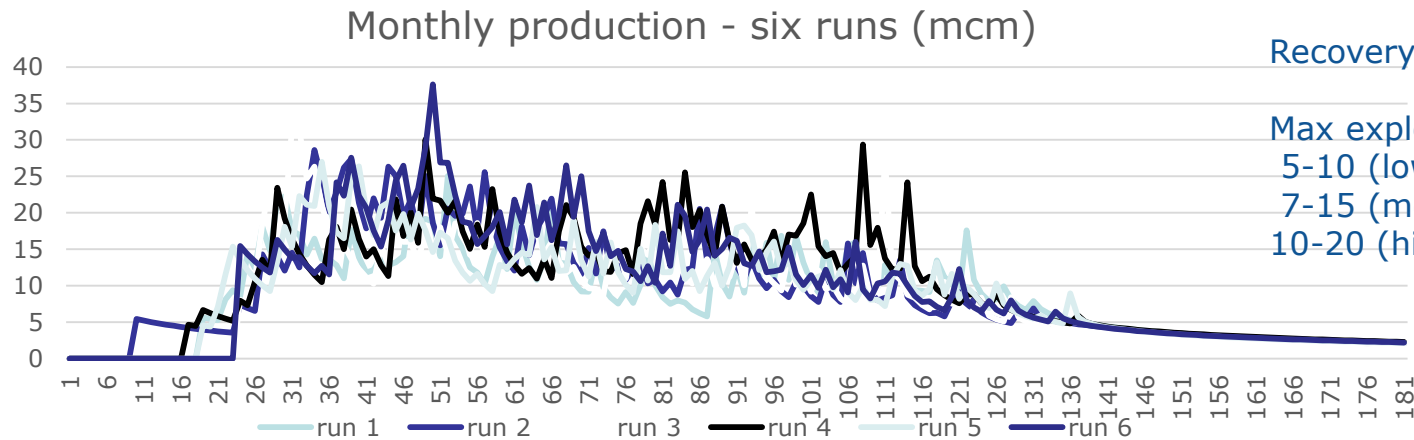
Construction of a power generator on the site, to be connected to the existing electricity grid

Construction of the connection to the existing pipeline (according to real constraints in term of transport capacities)

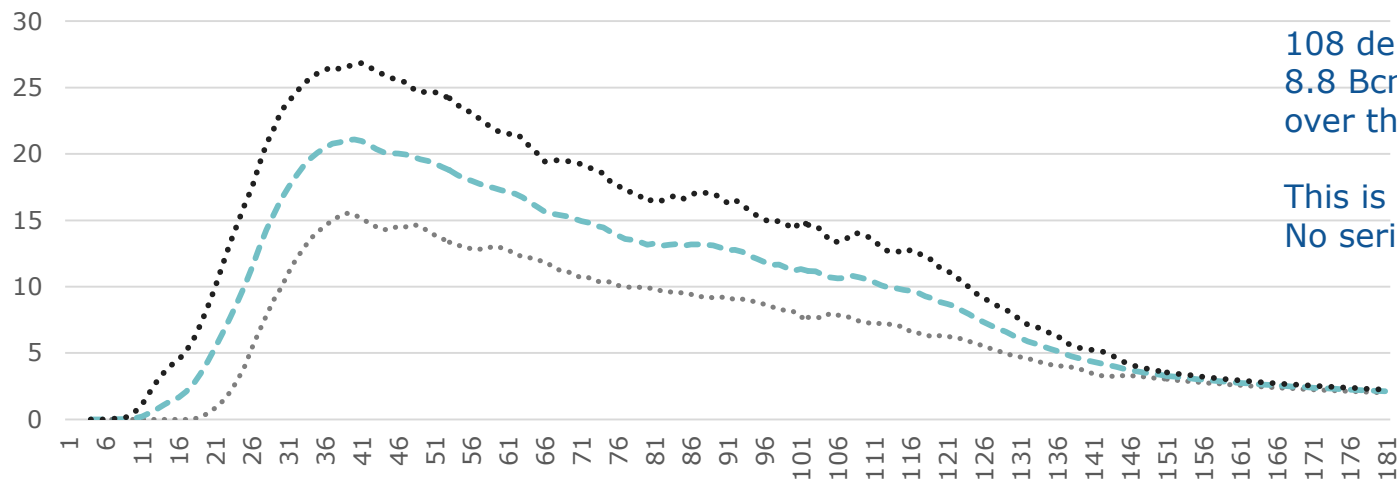
131 pilot wells with TRR below the threshold (20 mcm)

Recovery factor u.d. 10-25%

Max exploration effort  
5-10 (low capital. level)  
7-15 (medium capital. level)  
10-20 (high capital. level)

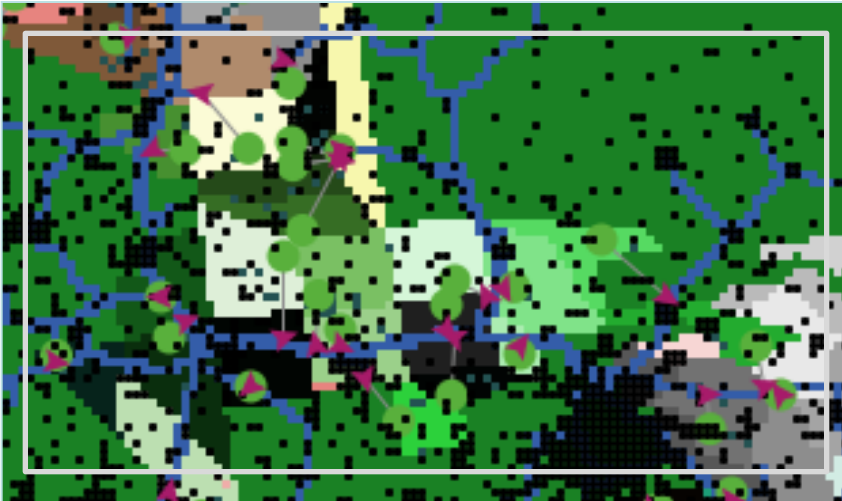


Monthly production - 100 runs (mcm) average and st.dev.



108 deployed projects  
8.8 Bcm of cumulative production  
over the whole time period

This is an illustrative run.  
No serial drilling activity



Results: length and location of additional pipelines to deliver the gas to the existing grid

**Need to assess the spare capacity of the NGTS to formulate hypothesis on infrastructure improvements.**

**Assumption:**

- Average winter demand
- Average flow of last 5 years
- Average production
- Average level of storage (5 years)