



# Deep<sup>\*</sup>light

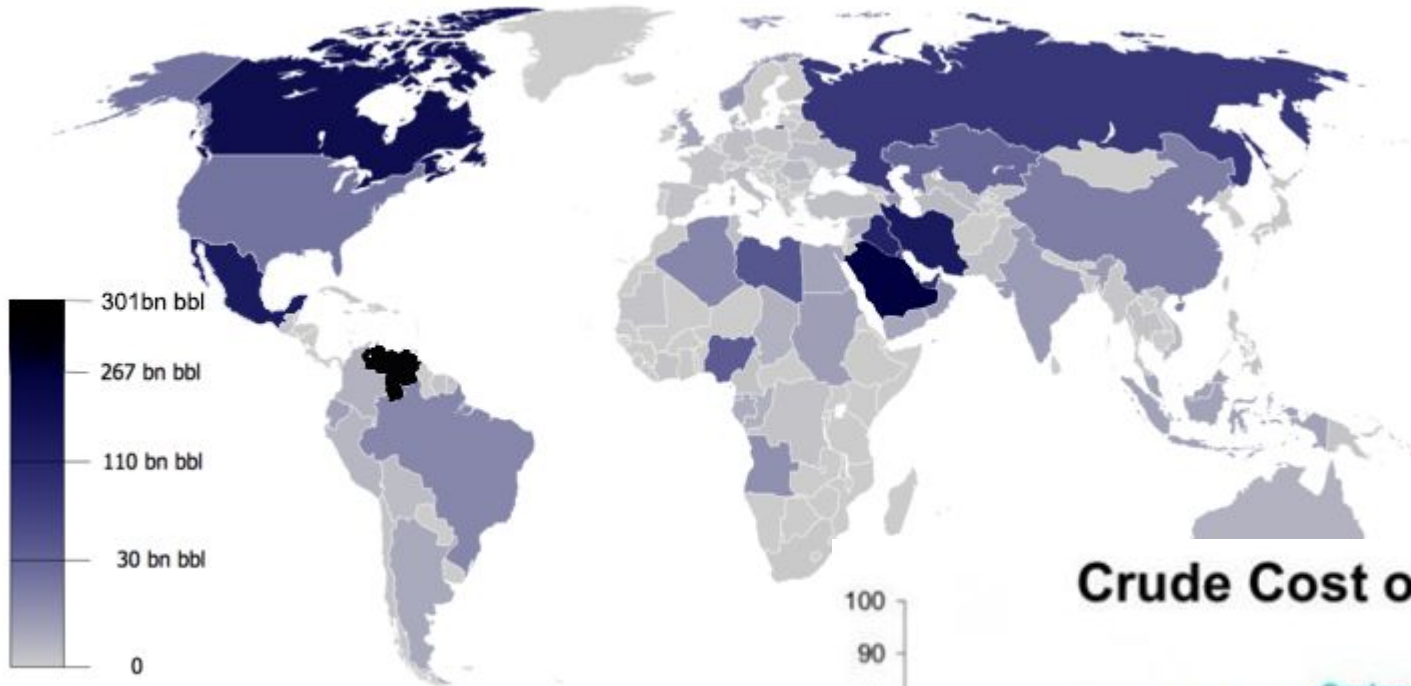
VENTURES

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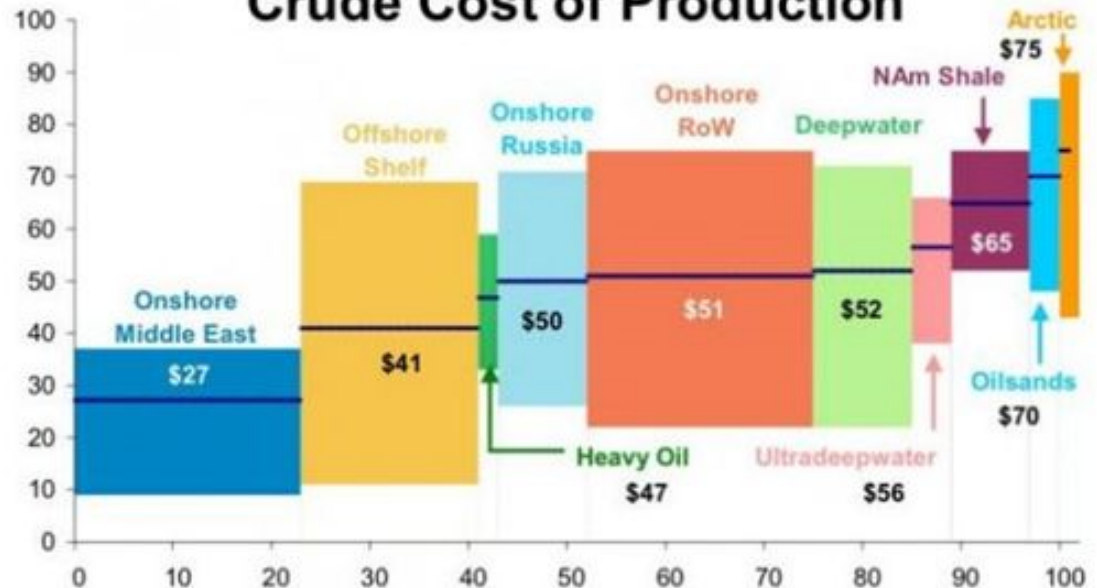
## Research Plan: Machine Learning in Oil and Gas Industry

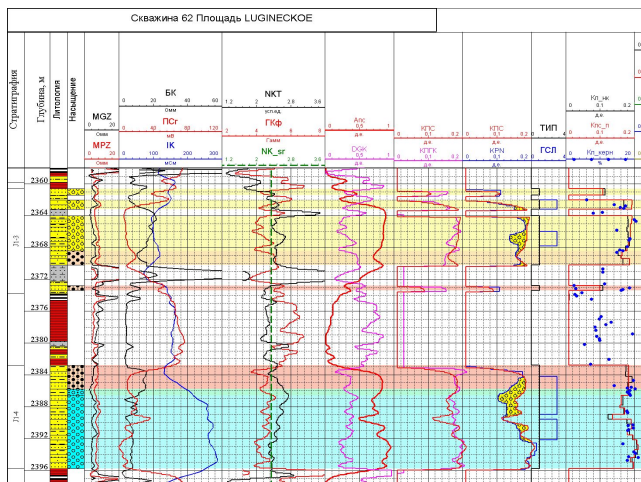
# World hydrocarbon resources

A map of world oil reserves, 2013.

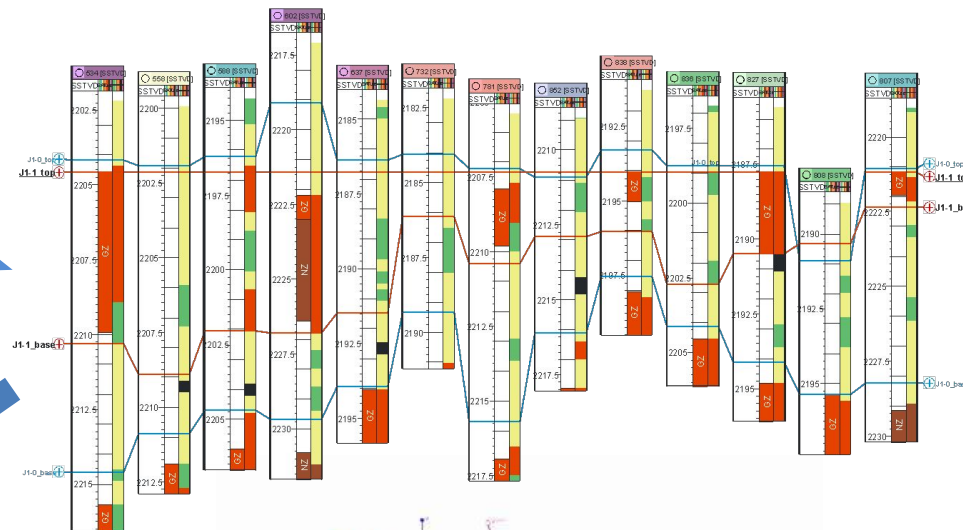


## Crude Cost of Production

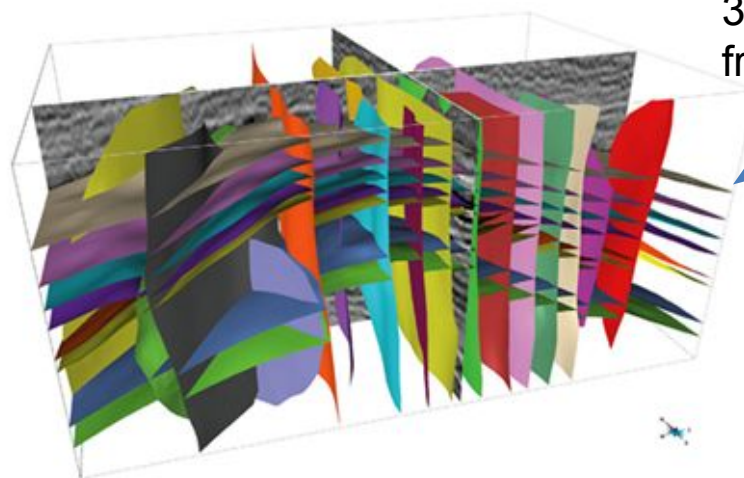




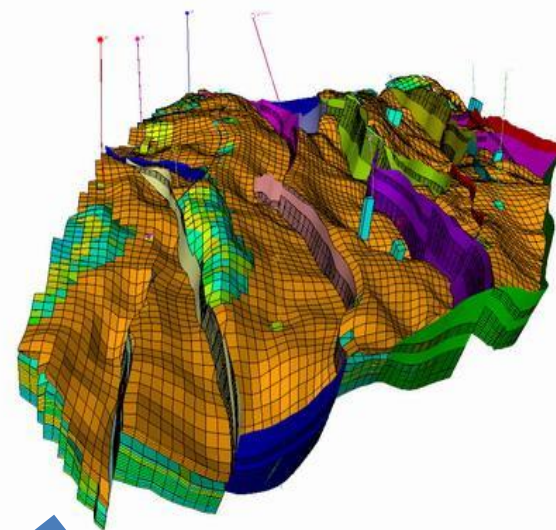
well correlation



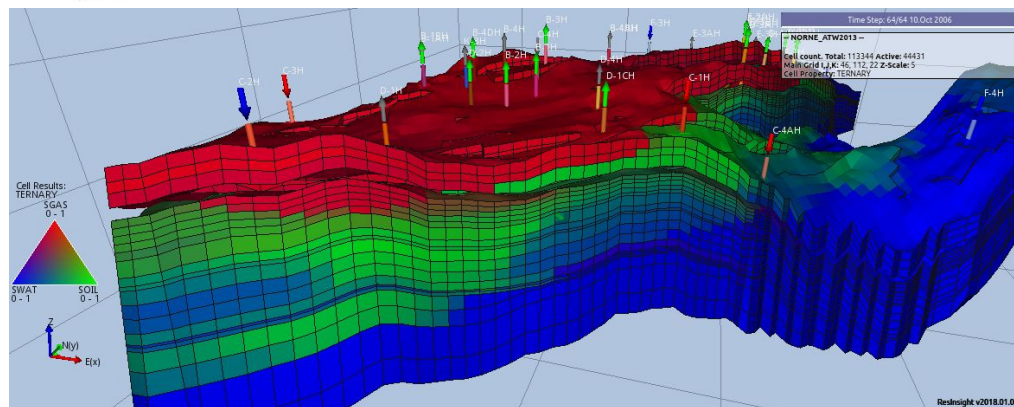
3d model  
frame



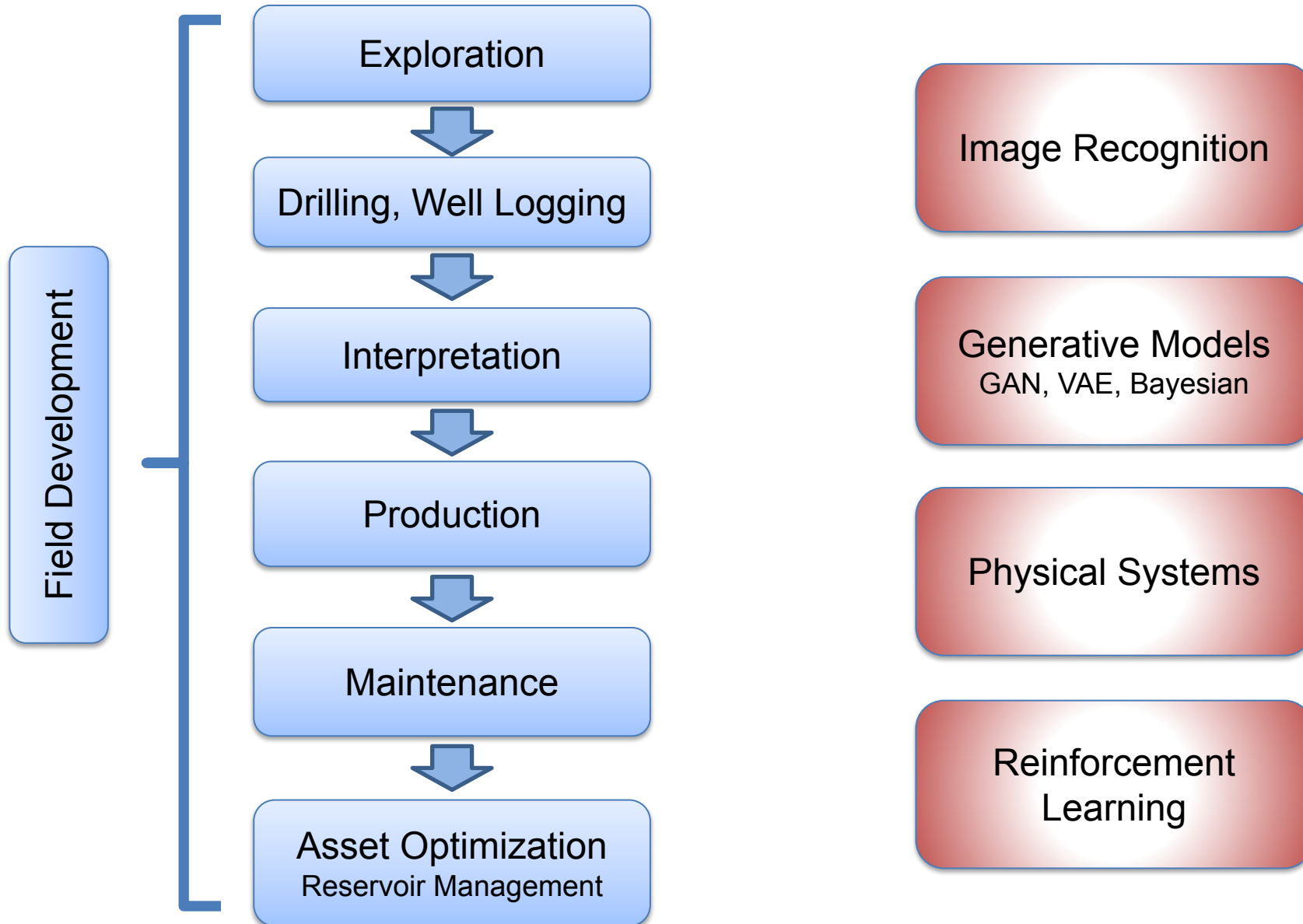
3d physical  
model



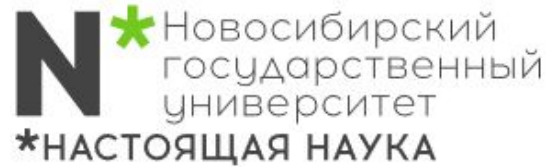
hydrodynamic  
simulation



# Machine Learning in Oil & Gas



# Partnership



## Laboratory on Machine Learning in Oil & Gas Industry

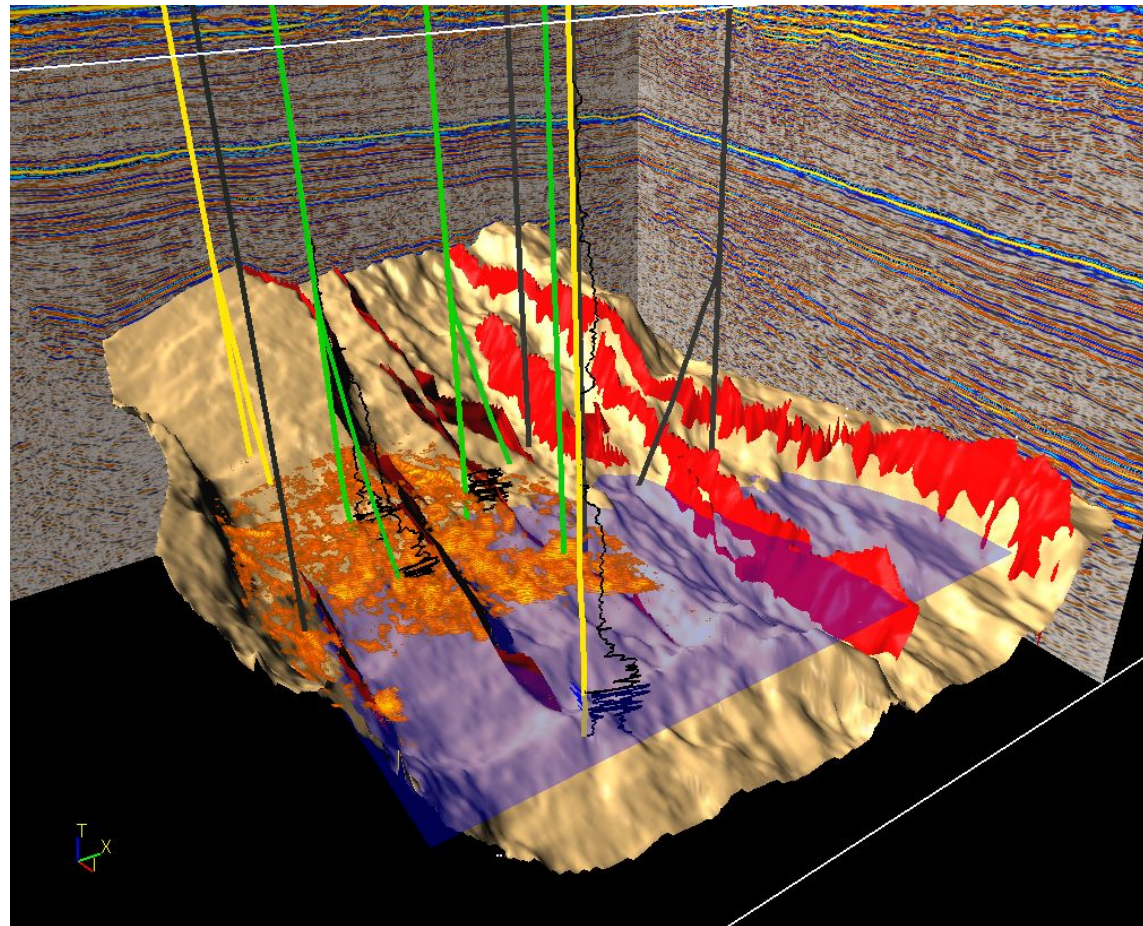
### Research and Innovation Projects:

- applied projects
- partnership with oil/gas companies

### Student Training:

- student thesis projects
- publications
- student professional activities

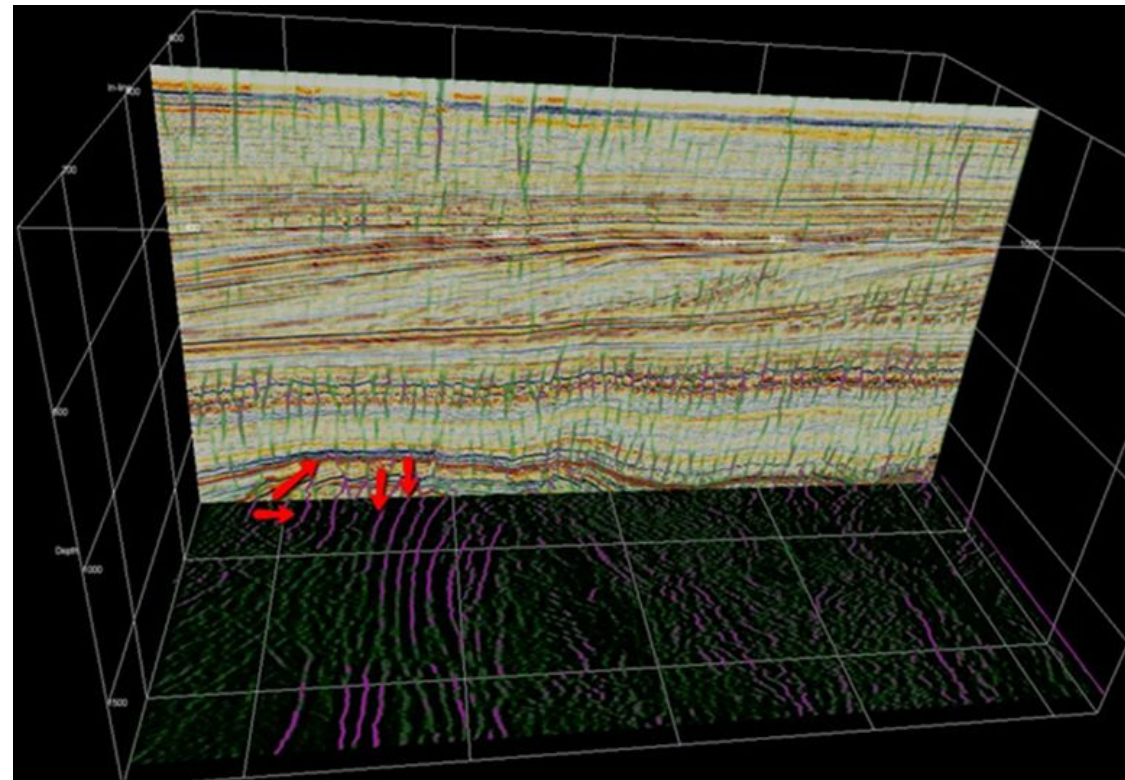
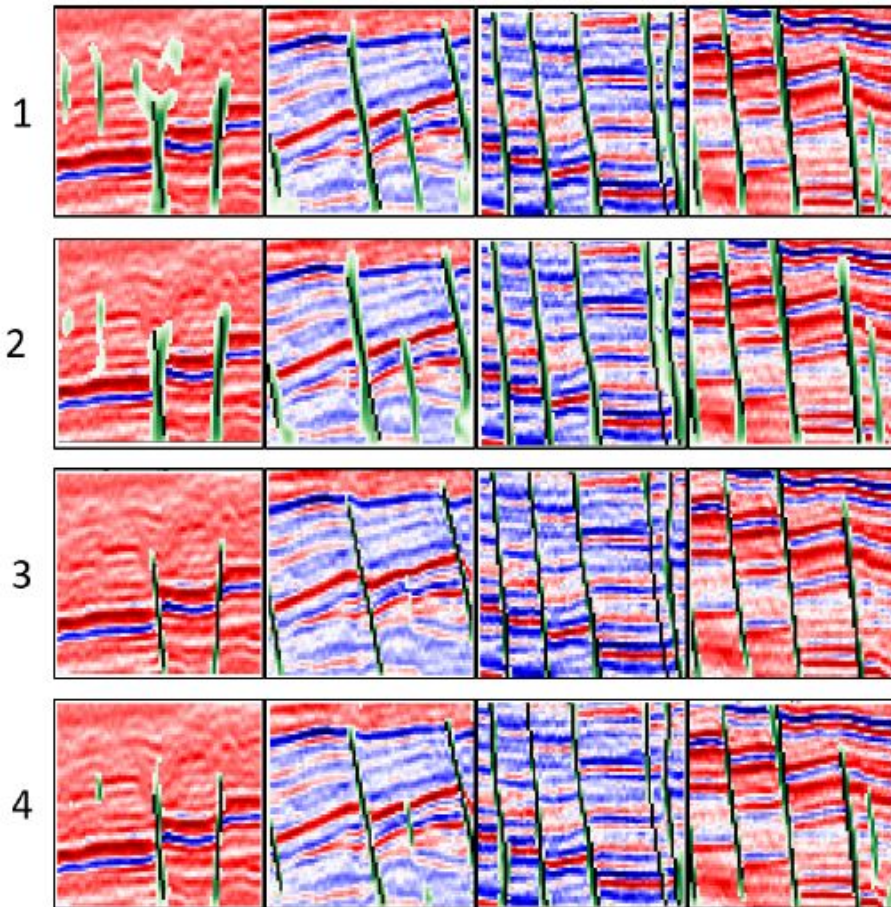
# Interpretation



# Fault Detection 0

Image Recognition  
(CNN)

Generative Models  
GAN, VAE, Bayesian

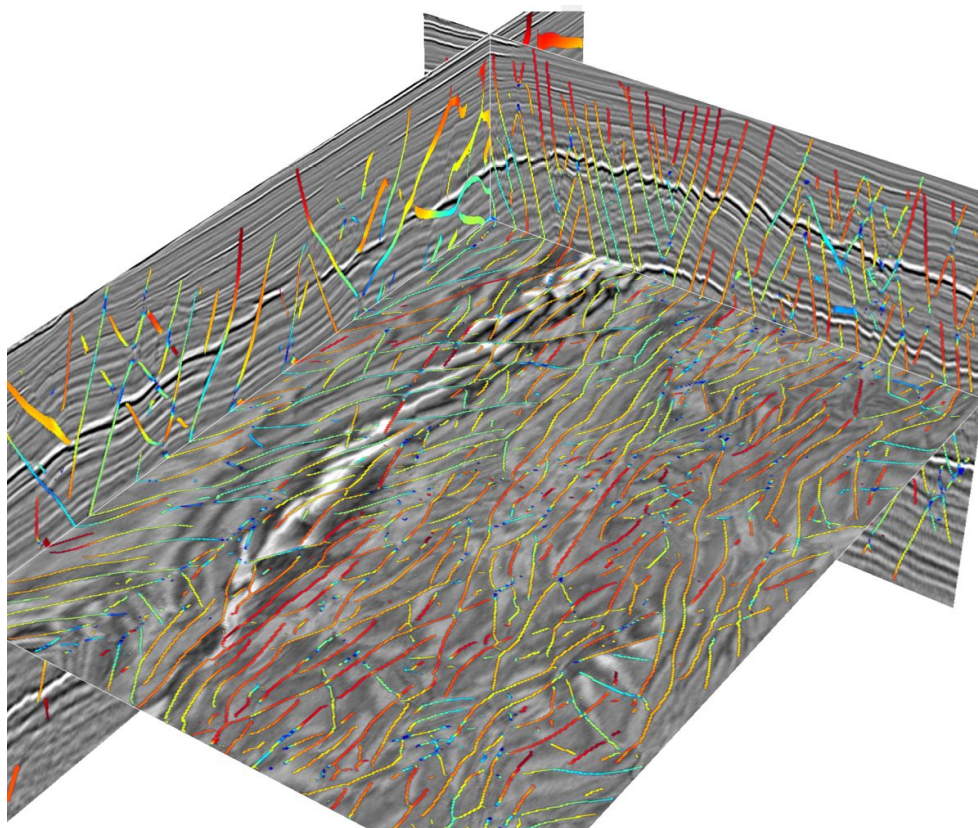


# Fault Detection 1

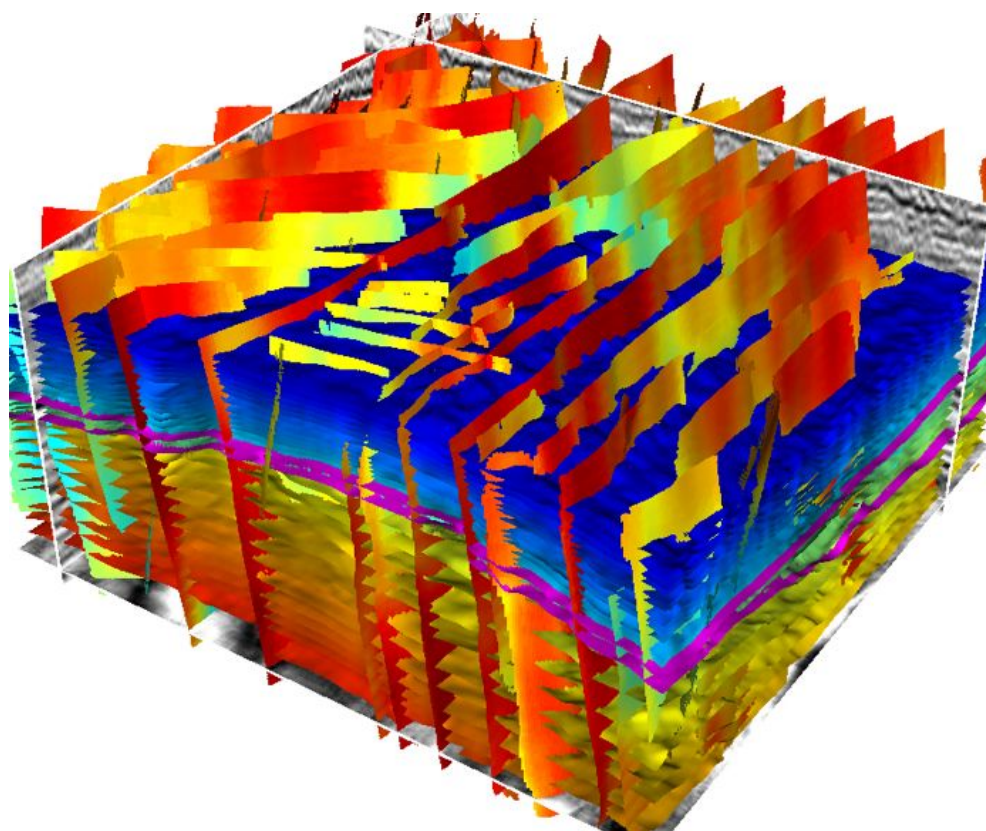
Image Recognition  
(CNN)

Generative Models  
GAN, VAE, Bayesian

Fault detection in slices

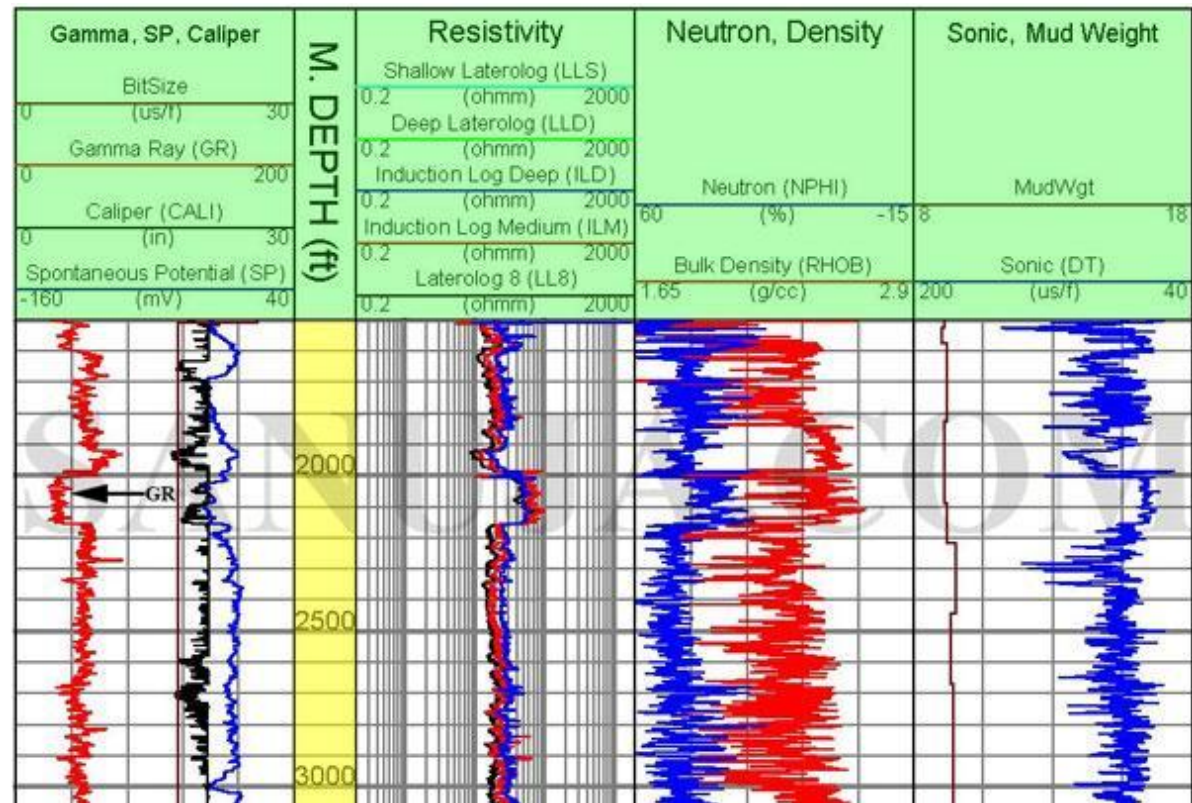
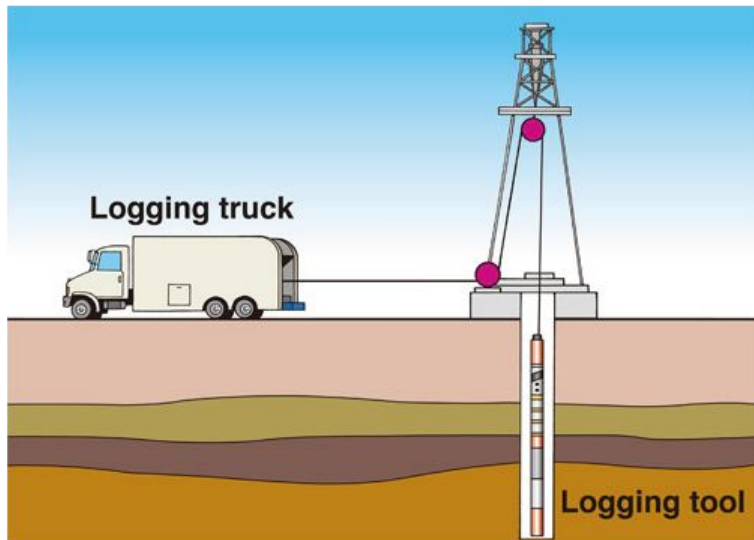


Fault surface construction





# Well logging

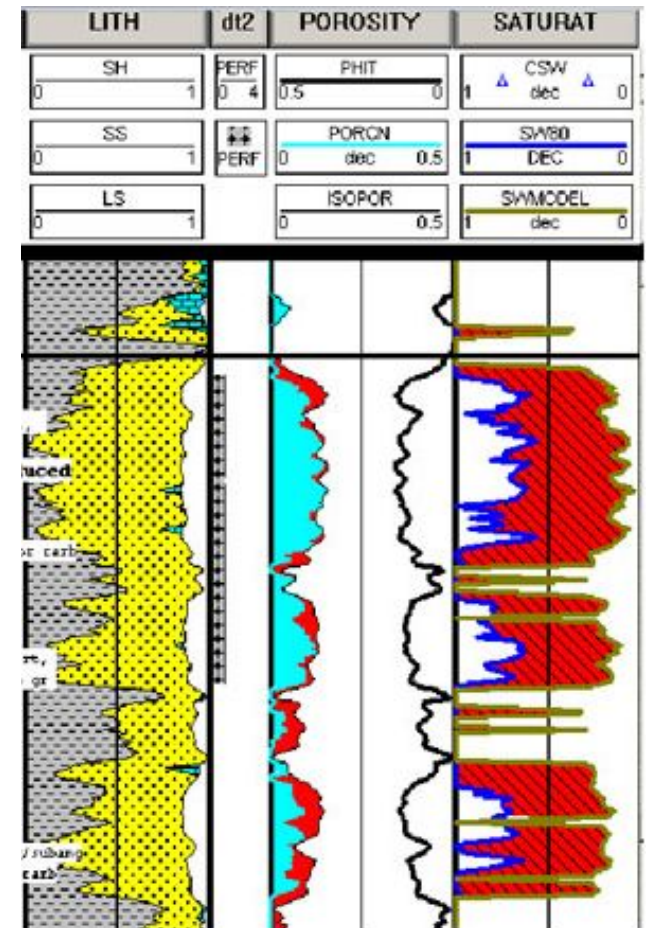
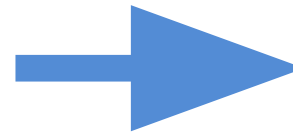
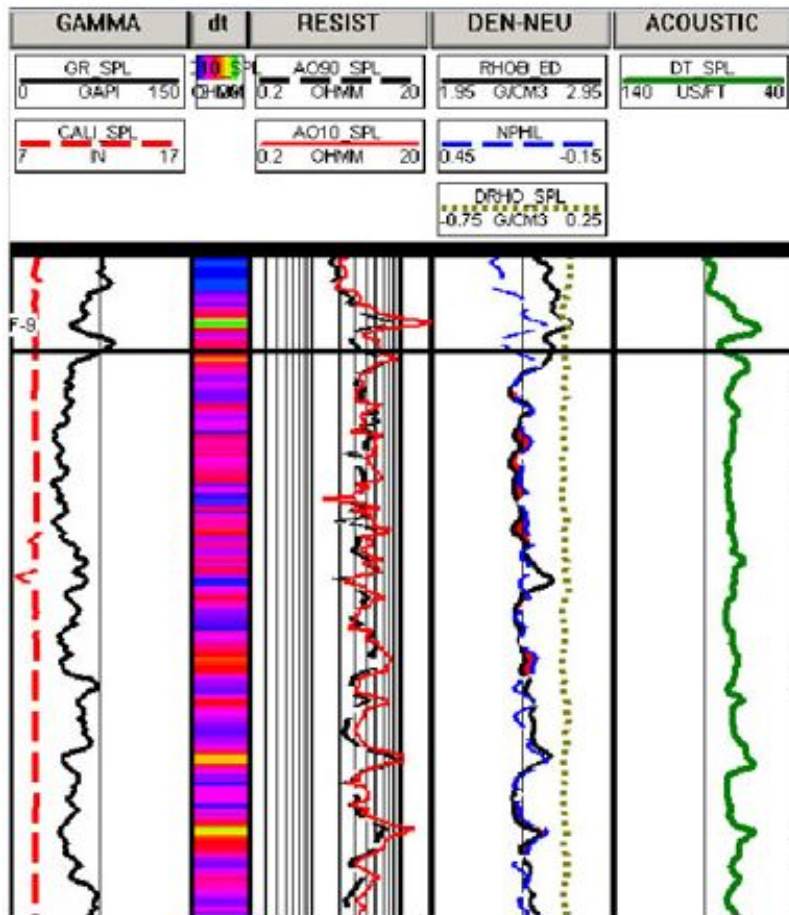


# Petrophysical model

Image Recognition  
(CNN)

Generative Models  
GAN, VAE, Bayesian

Convert well logs to petrophysical models

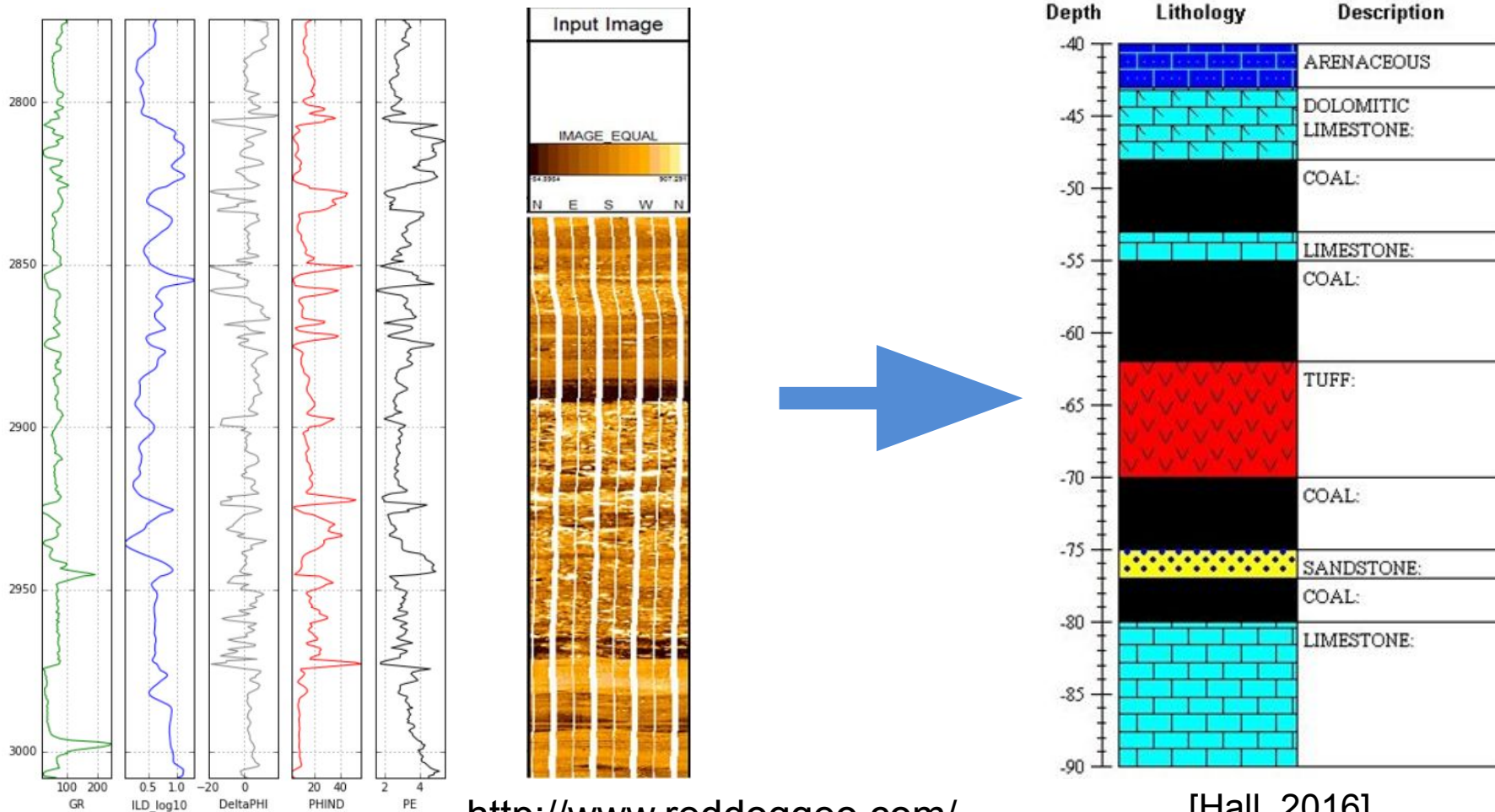


# Lithological model

Image Recognition  
(CNN)

Generative Models  
GAN, VAE, Bayesian

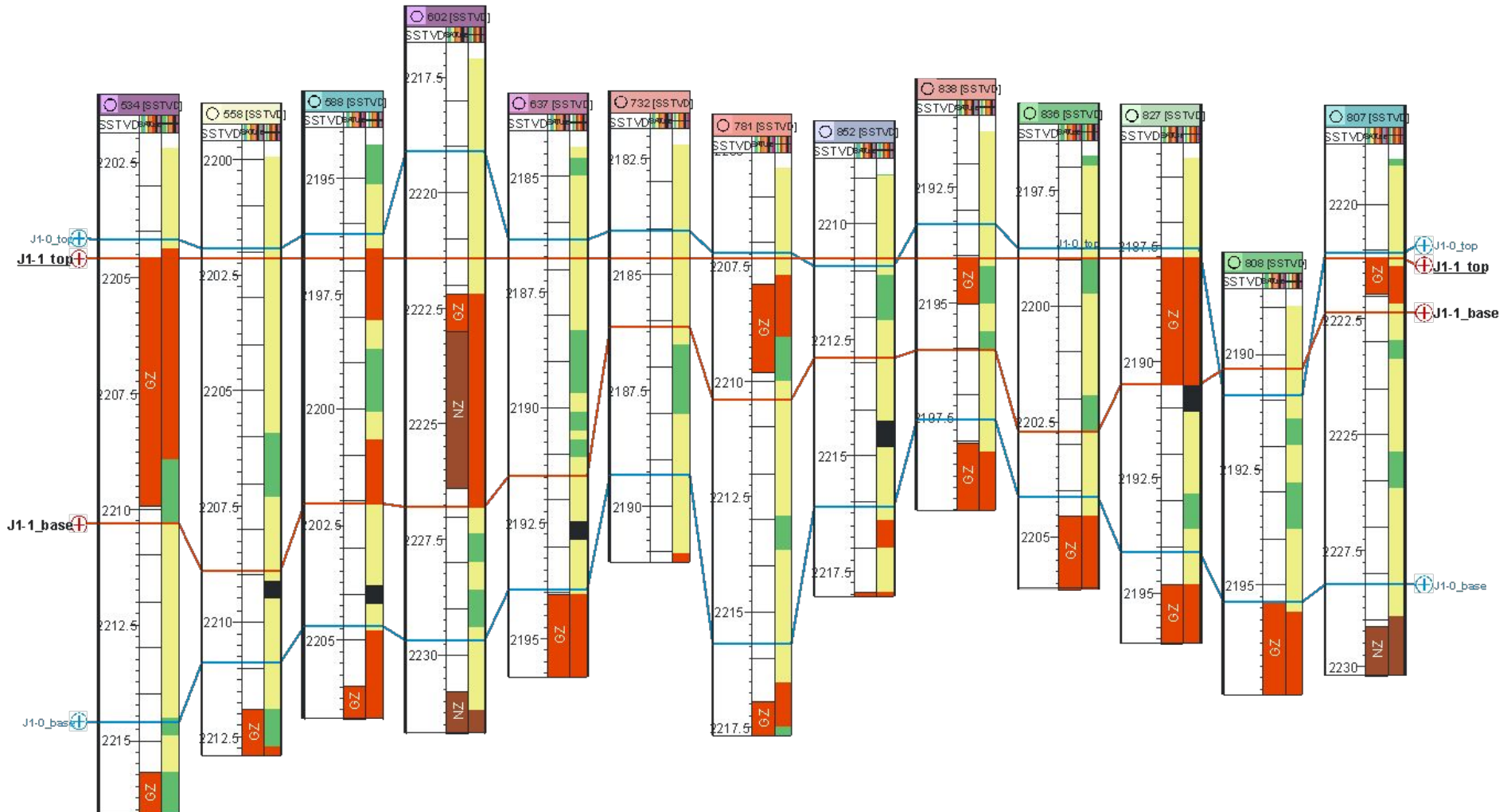
Convert well logs to rock types



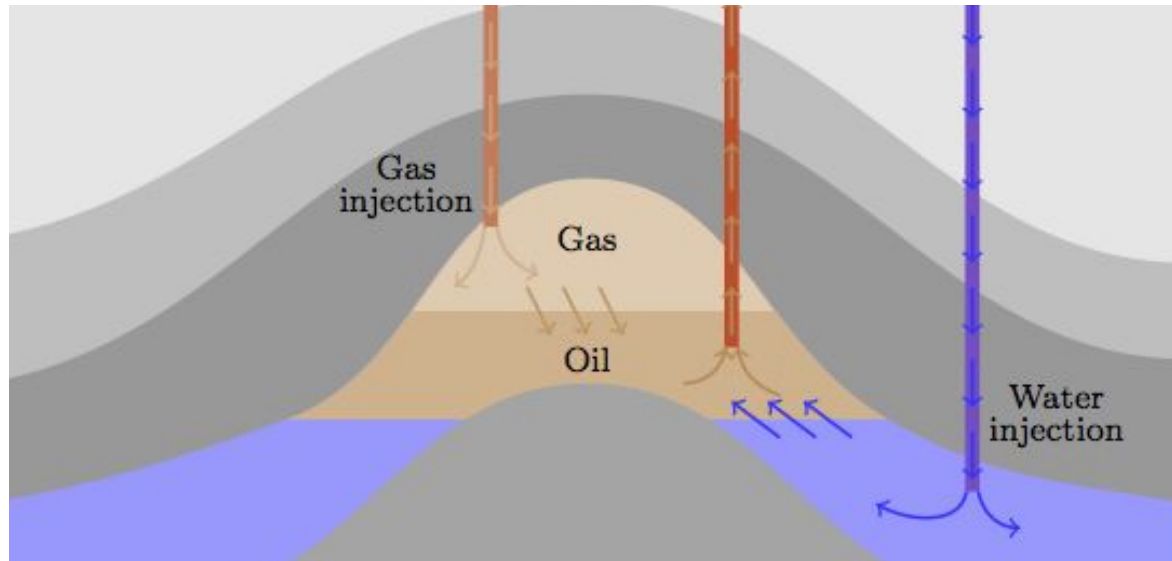
# Well Correlation

Image Recognition  
(CNN)

Generative Models  
GAN, VAE, Bayesian



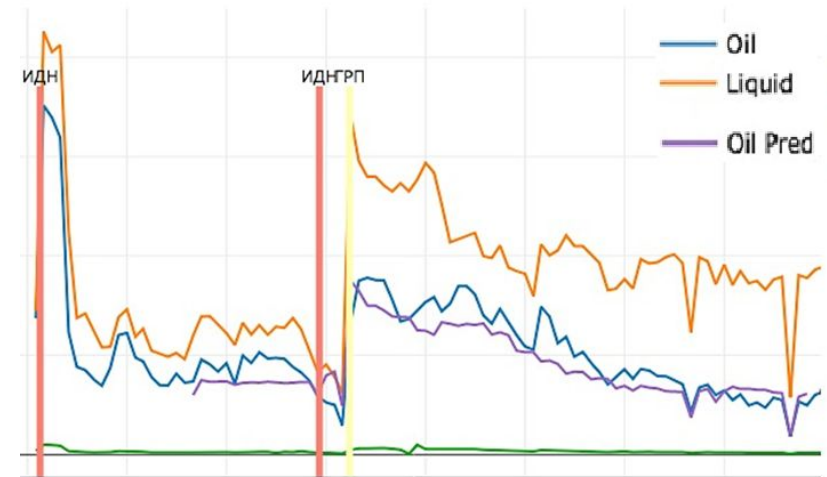
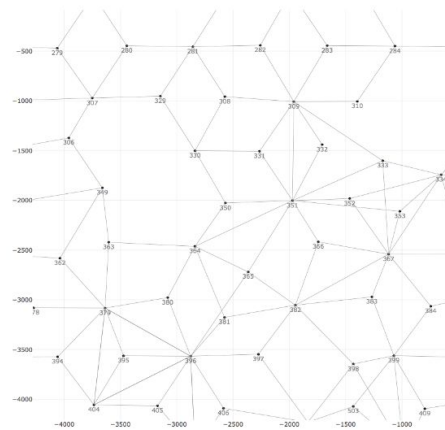
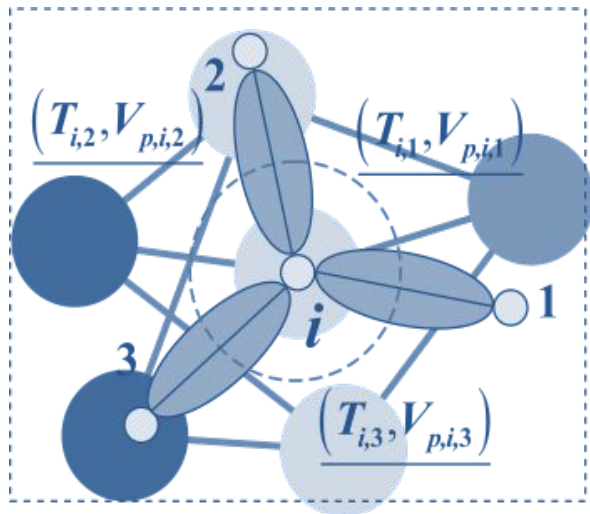
# Production



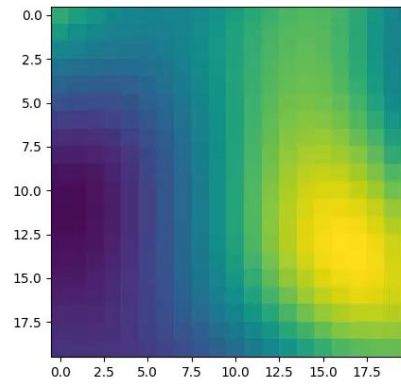
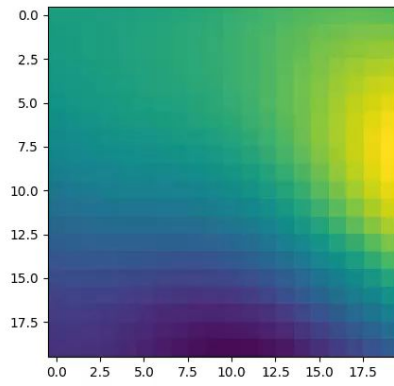
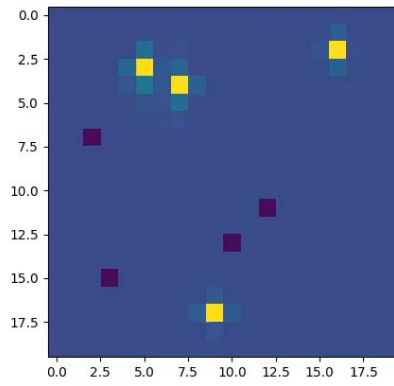
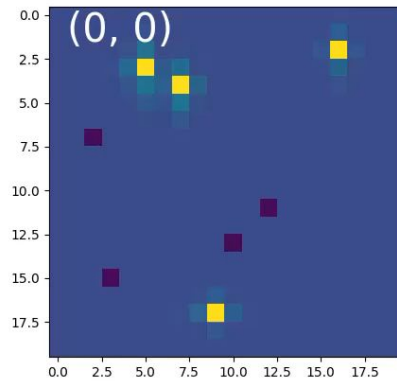
# Production 0

Physical Systems  
(explicit PDE)

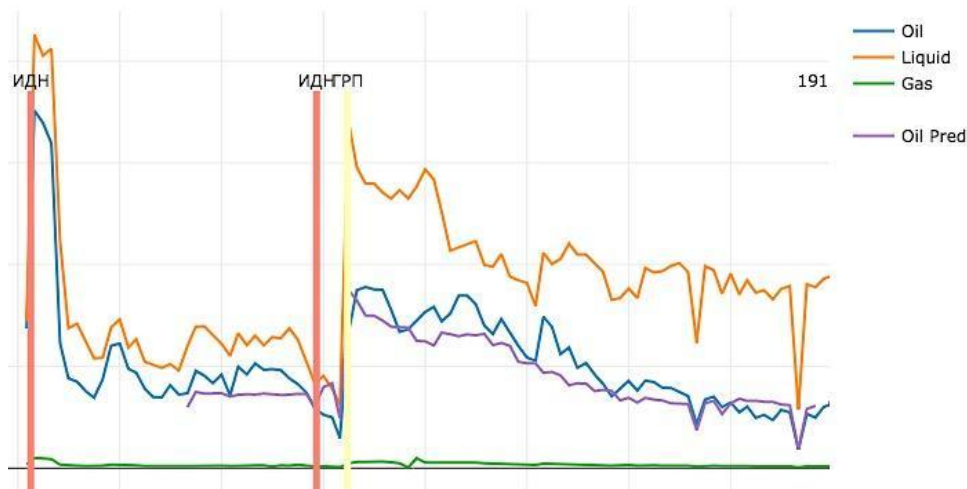
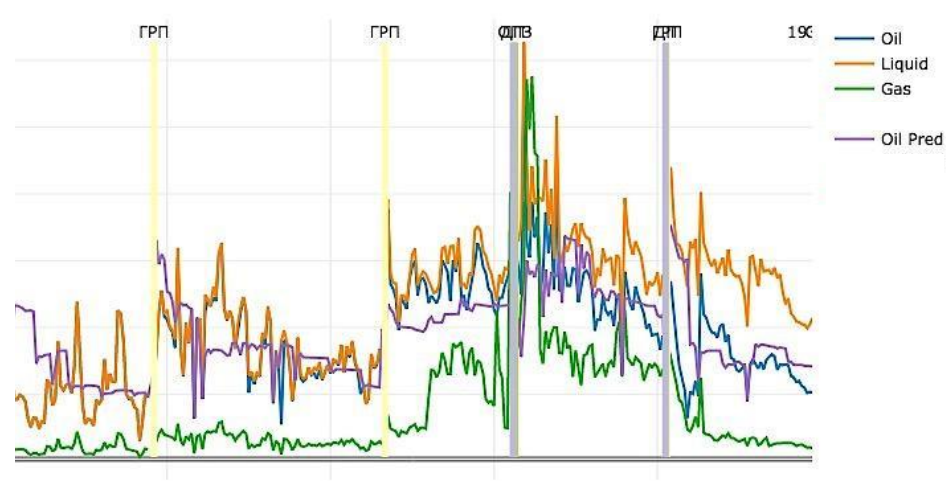
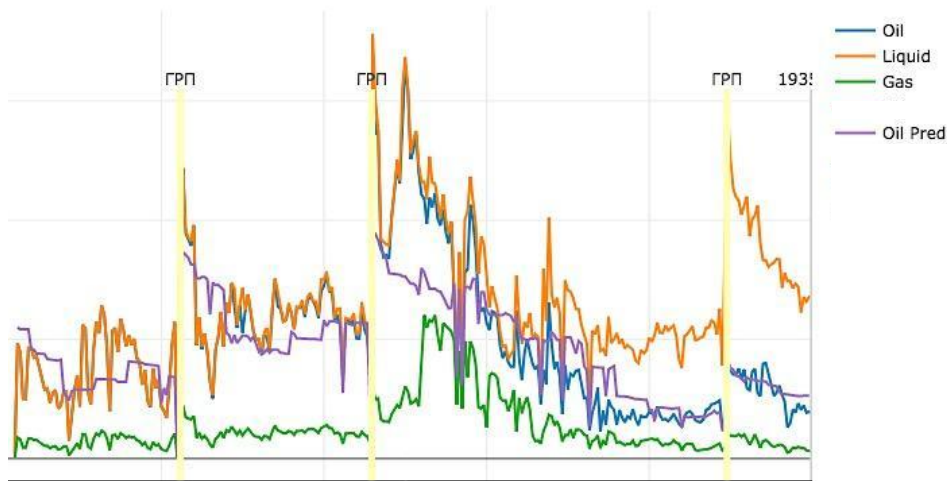
Production Modelling using Proxy Models. History matching of physical Proxy Models to production data.



Simple equations: 
$$cV_i \frac{dp_i}{dt} = \sum_j T_{ij}(p_j - p_i) + q_i$$



# Examples. Monthly well production.



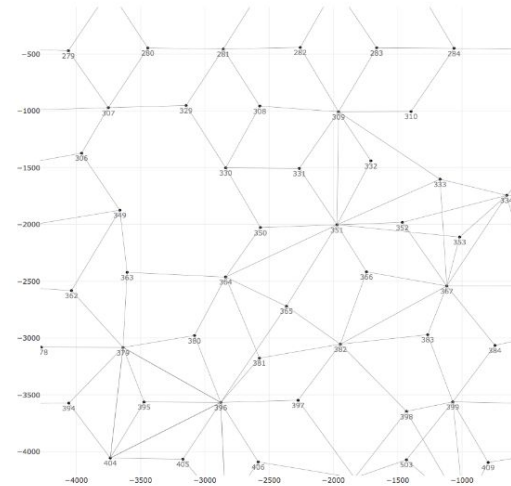
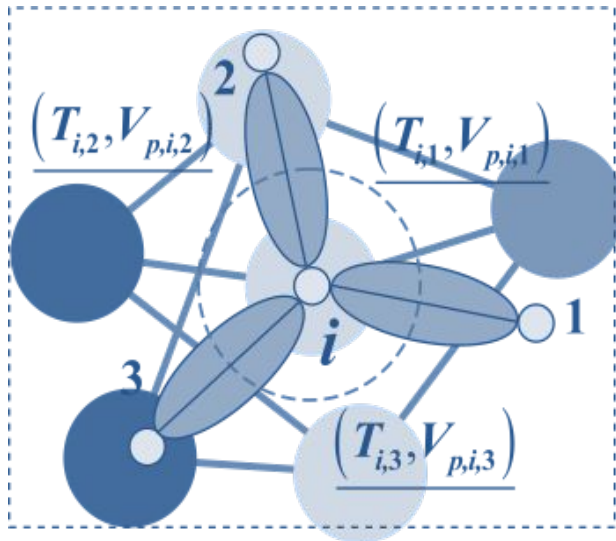


# Production 1

Generative Models  
(GAN, VAE, Bayesian)

Physical Systems  
(explicit PDE)

Production Modelling using Proxy Models. History matching of physical Proxy Models to production data with uncertainty.



Simple equations:

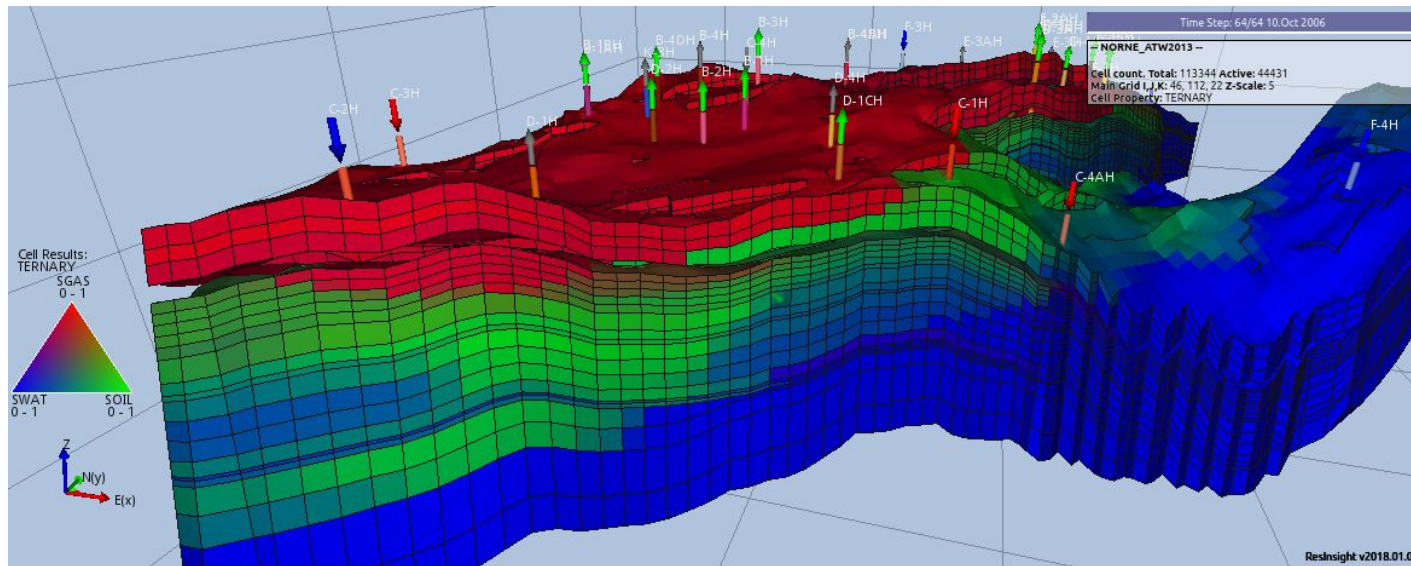
$$cV_i \frac{dp_i}{dt} = \sum_j T_{ij}(p_j - p_i) + q_i$$

# Production 2

Generative Models  
(GAN, VAE, Bayesian)

Physical Systems  
(learn from simulator)

Production Modelling using simulator. History matching of simulator models to production data with uncertainty.



Pressure equation: 
$$c\phi\rho \frac{\partial p}{\partial t} = \nabla \frac{\rho K}{\mu} \nabla p + \rho q$$

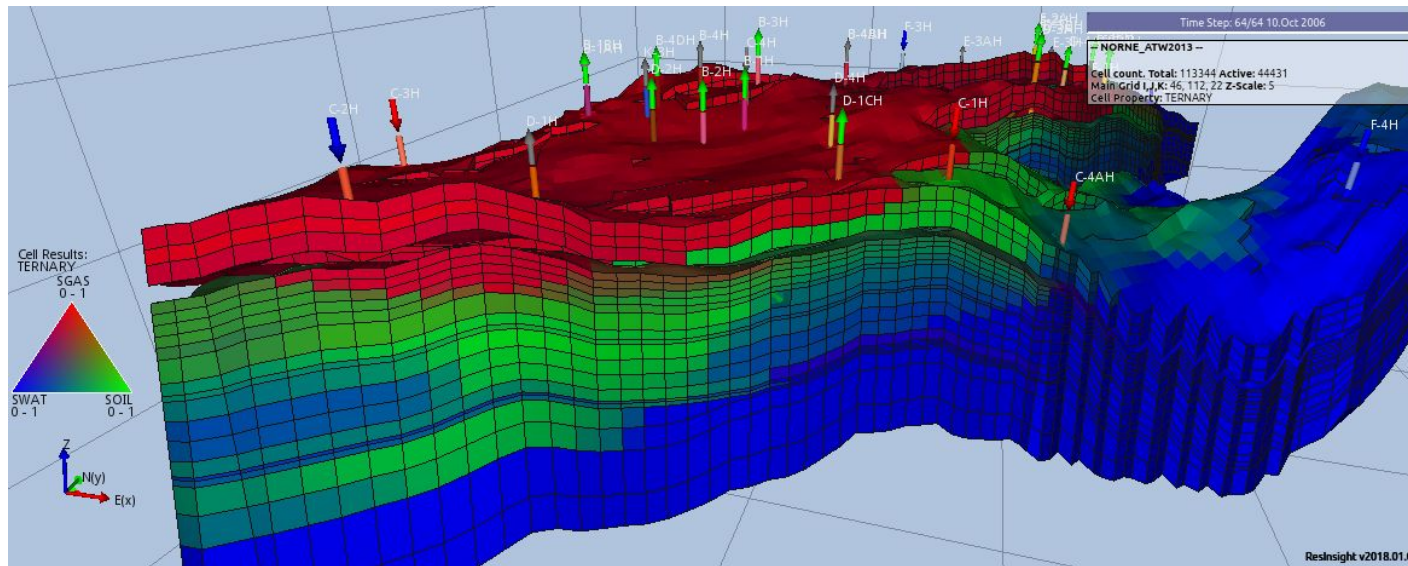
# Production 3

Generative Models  
(GAN, VAE, Bayesian)

Physical Systems  
(explicit PDE)

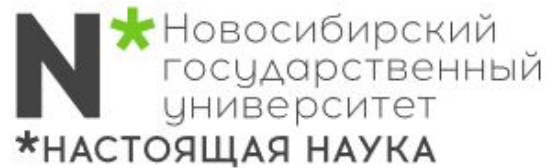
Reinforcement  
Learning

Optimization of production using simulator with uncertainty.



Pressure equation: 
$$c\phi\rho \frac{\partial p}{\partial t} = \nabla \frac{\rho K}{\mu} \nabla p + \rho q$$

# Partnership



## Laboratory on Machine Learning in Oil & Gas Industry

### Research and Innovation Projects:

- applied projects
- partnership with oil/gas companies

### Student Training:

- student thesis projects
- publications
- student professional activities

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