

# Modelling and Simulation of Heterogeneous and Anisotropic Formations using Advanced Fractal Reservoir Models

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# Conventional Reservoir Modelling

## A justified educated guessing game:

- ❖ Physical properties obtained from few wells
- ❖ Data incomplete and variability completely unknown at smaller scales ( say  $< 50$  m)
- ❖ Interpolated in the inter-well volume using variogram-filtered krigging
- ❖ No information available for accurate well placement
- ❖ No information about reservoir heterogeneity measured or used
- ❖ No information about reservoir anisotropy measured or used in modelling and simulation

# Fractal Reservoir Modelling

- ❖ AFRMs can depict and control heterogeneity
- ❖ AFRMs can depict and control  $xy$ ,  $yz$  and  $zx$  anisotropy
- ❖ AFRM accuracy can be verified
- ❖ AFRM allows generic sensitivity tests for heterogeneity, anisotropy, well placement and orientation
- ❖ AFRM is more accurate than conventional models in simulations
- ❖ AFRM contains information at **all scales** larger than cell size
- ❖ **AFRMs can be fully reservoir-conditioned**

# ... in this presentation

What fractals can do for you ...

How to make Advanced Fractal Reservoir Model (AFRMs)

Generic fractal modelling

The effect of heterogeneity on oil production data

The effect of anisotropy on oil production data

The effect of well placement and orientation

Conditioned fractal reservoir modelling

How to use AFRMs with real reservoirs

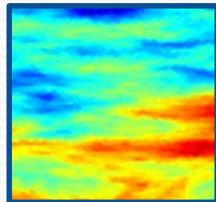
The Future

Creating flexible software for modelling

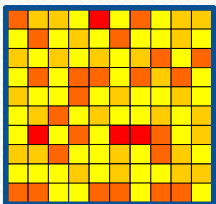
Structured objects exhibiting self-similar behaviour at all scales.



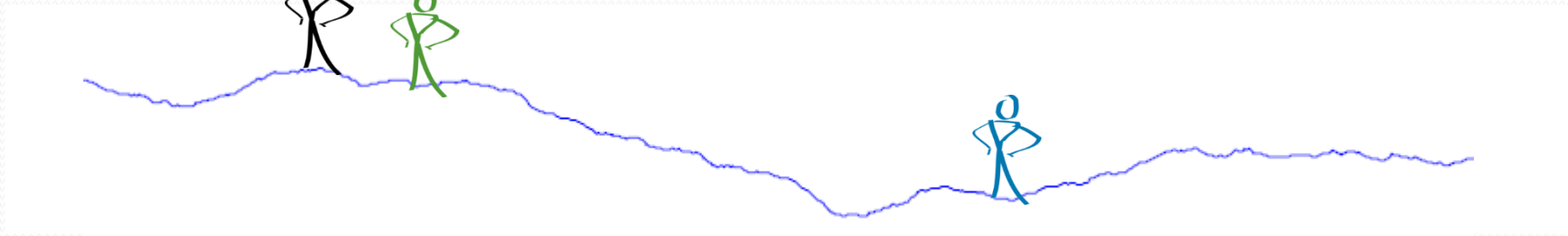
Well-defined structure at a given scale:  
Full spatial correlation



Fractal:  
Partial spatial correlation



Random distributions:  
No spatial correlation



# Scales and variability

## Interpolation of wells:

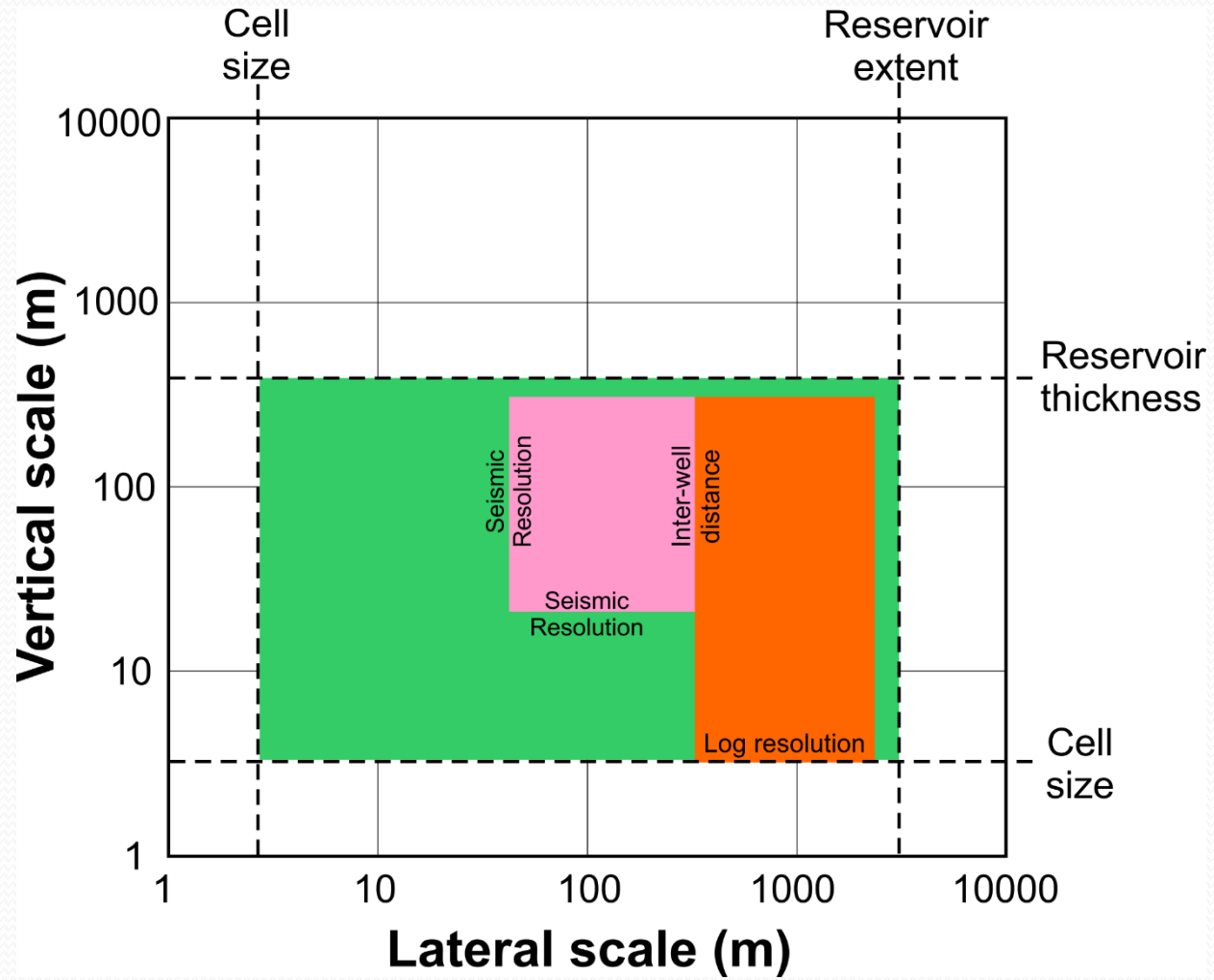
Only large scale variability is taken account of

## Interpolation of wells with seismic input:

Range of scales in inter-well volume extended to seismic resolution

## Fractal Interpolation (FSMA):

Takes account of all data from the reservoir scale to the cell scale

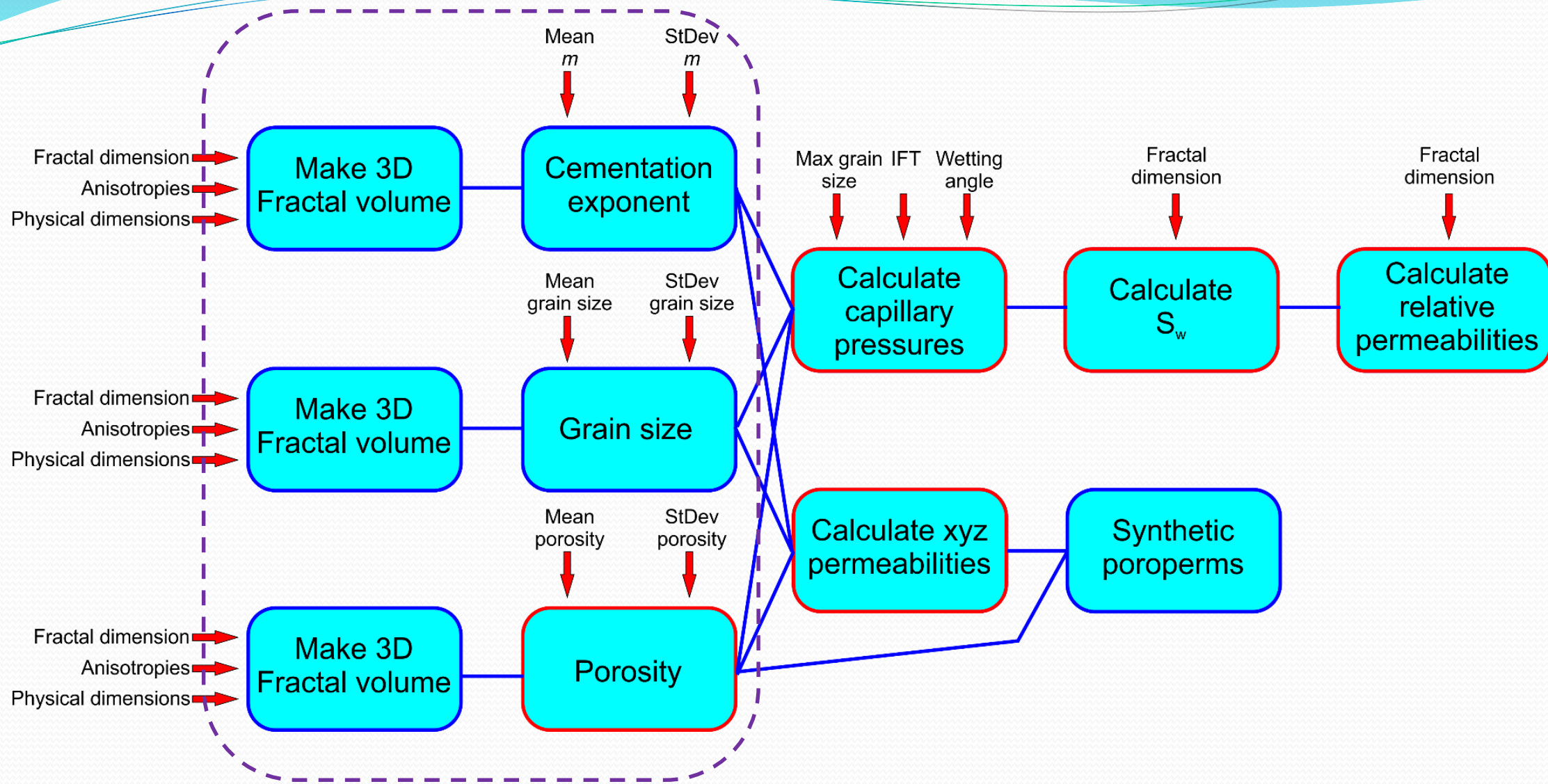


# Making AFRMs

How is it possible to make fractal reservoir models which have:

- 3D
- controlled heterogeneity
- controlled anisotropy
- can be fully validated, and
- can be used to model poroperm curves

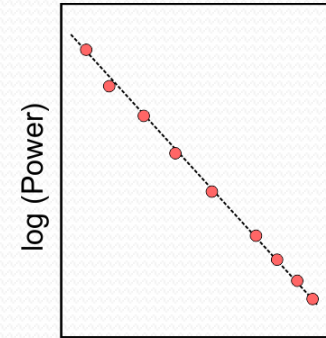
Piroska Lorinczi, Saud Al-Zainaldin





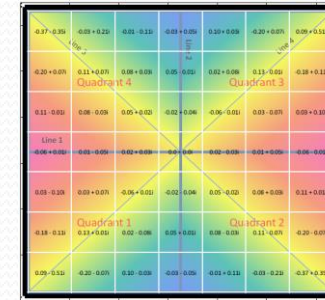
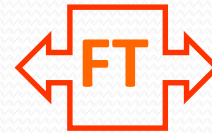
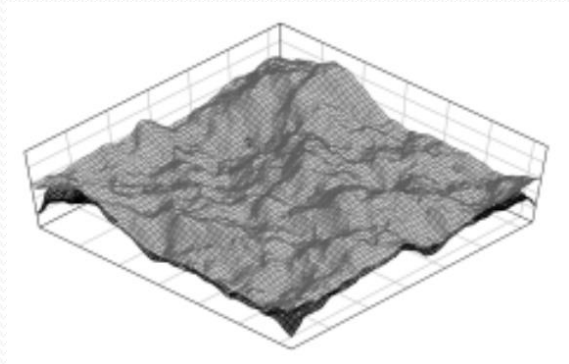
# Fourier Filtering method in xD

1D

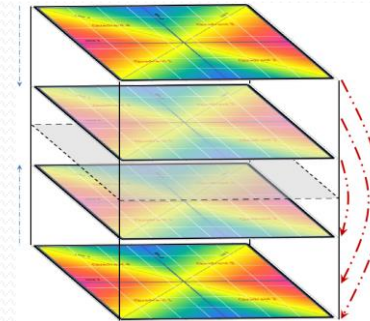
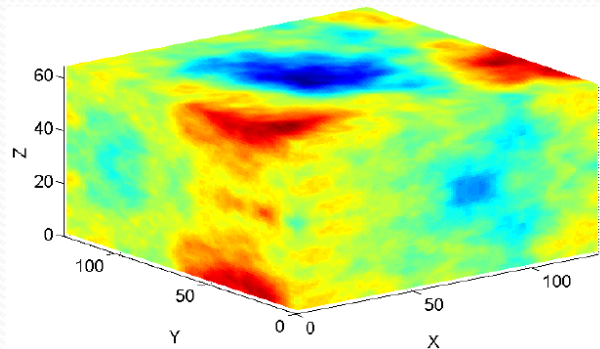


log (wavelength)

2D



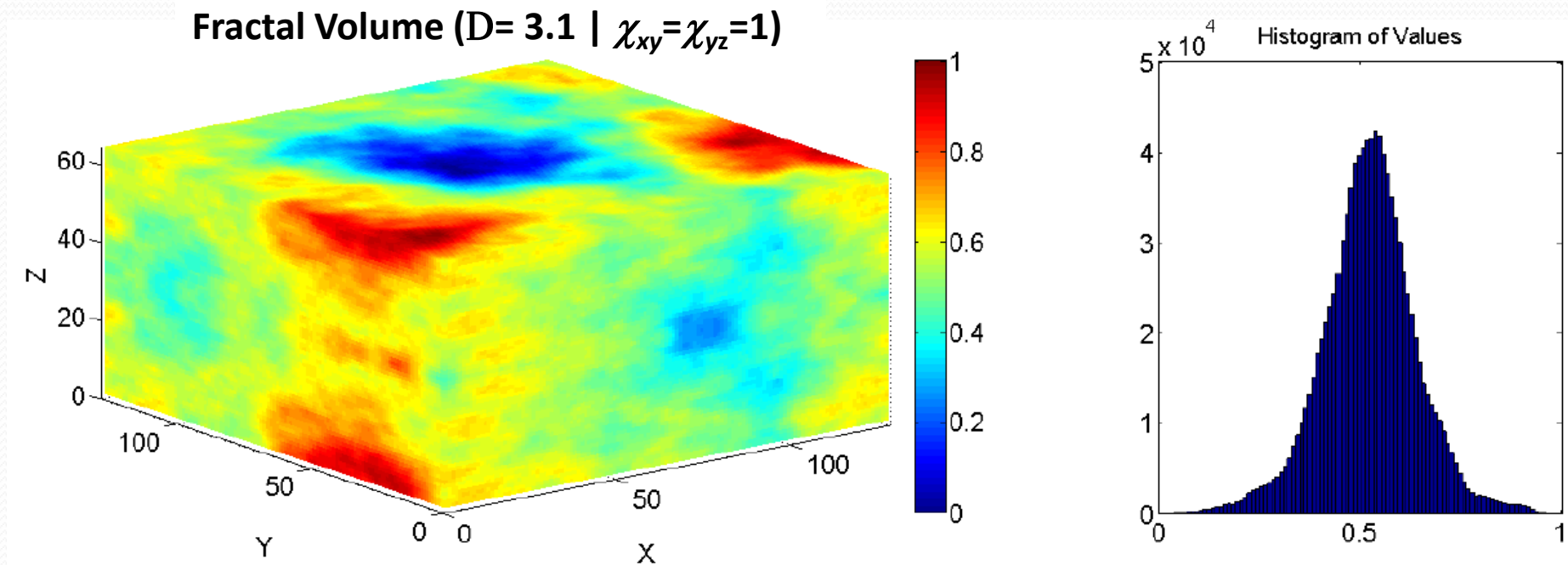
3D



# The Fourier Filtering method

Fractal dimension and anisotropy controlled

Exact and repeatable structure defined by a unique random number key



**Data required:** Physical and fractal dimension and two anisotropy factors

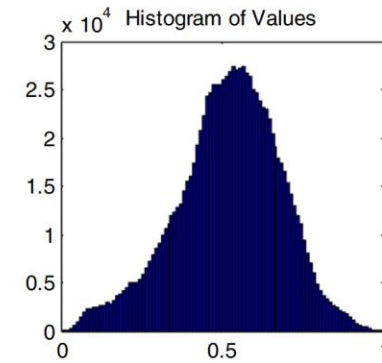
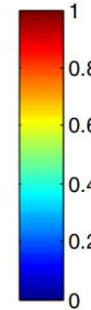
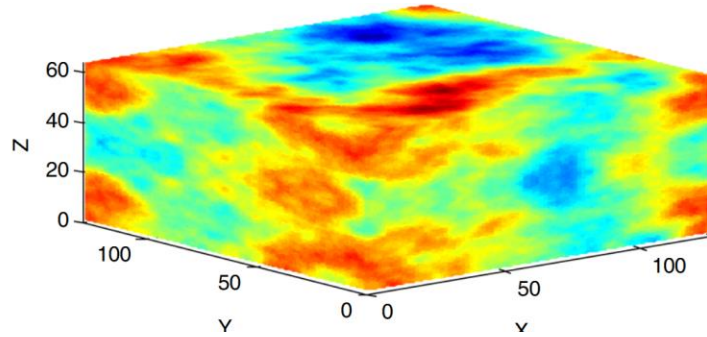
Fractal volumes for different heterogeneities (fractal dimensions) and the same isotropy

**Data required:**  
Physical and fractal dimension and two anisotropy factors

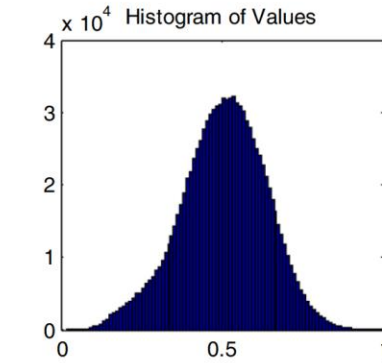
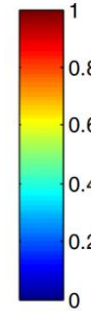
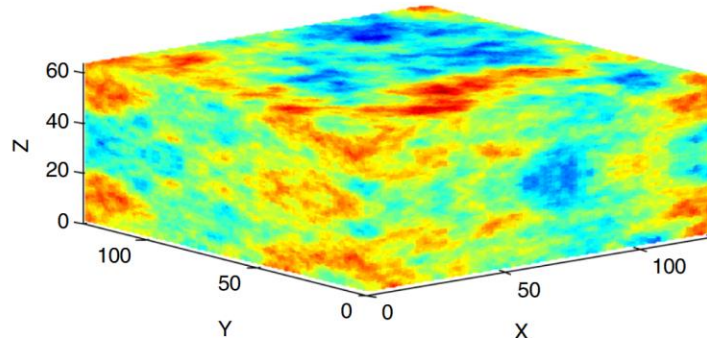
**Increasing Heterogeneity**



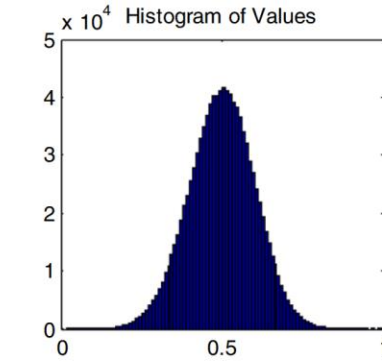
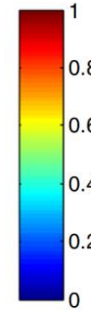
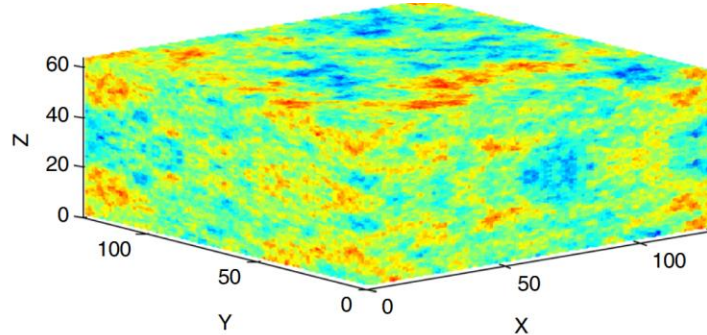
Fractal Volume ( $D= 3.1 \mid \chi_{xy}=\chi_{yz}=1$ )



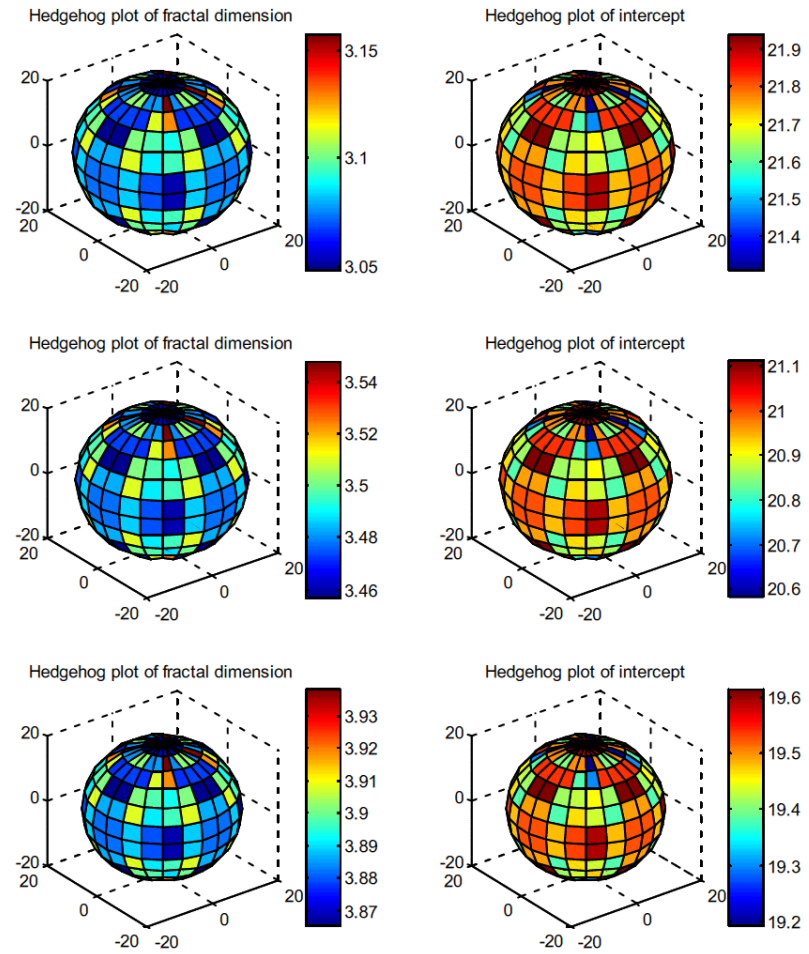
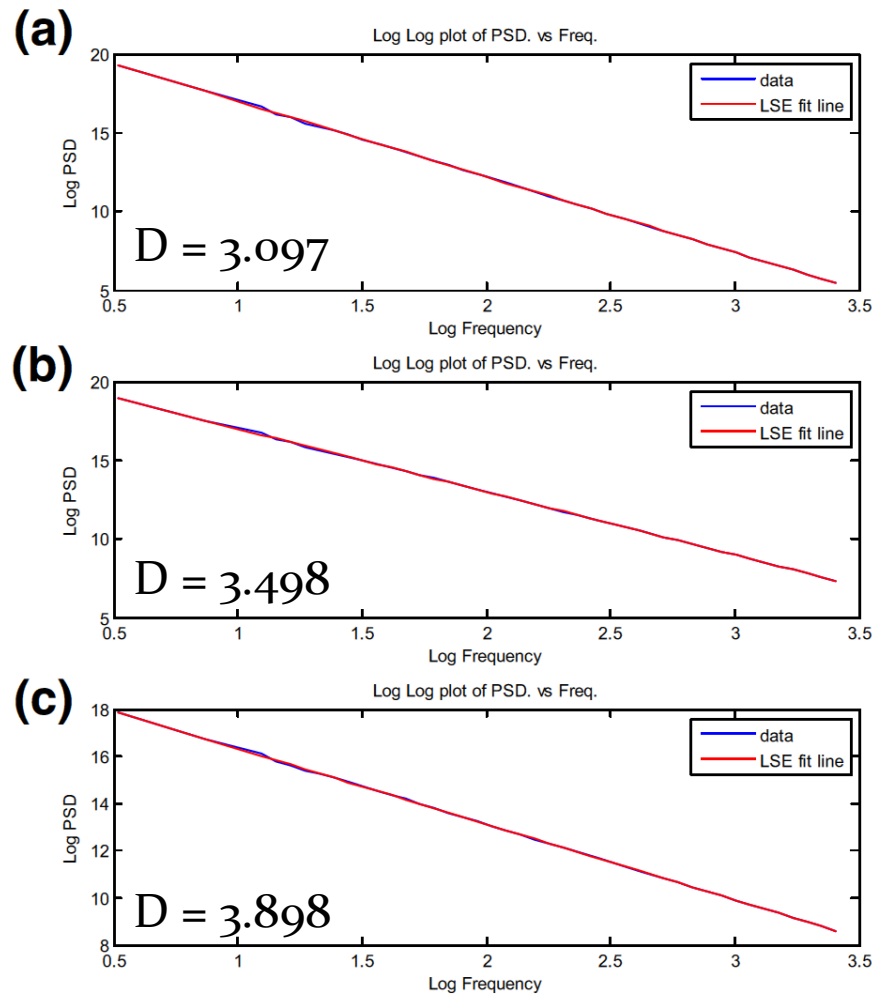
Fractal Volume ( $D= 3.5 \mid \chi_{xy}=\chi_{yz}=1$ )



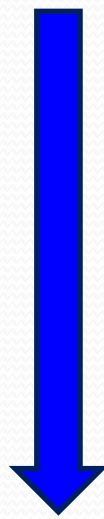
Fractal Volume ( $D= 3.9 \mid \chi_{xy}=\chi_{yz}=1$ )



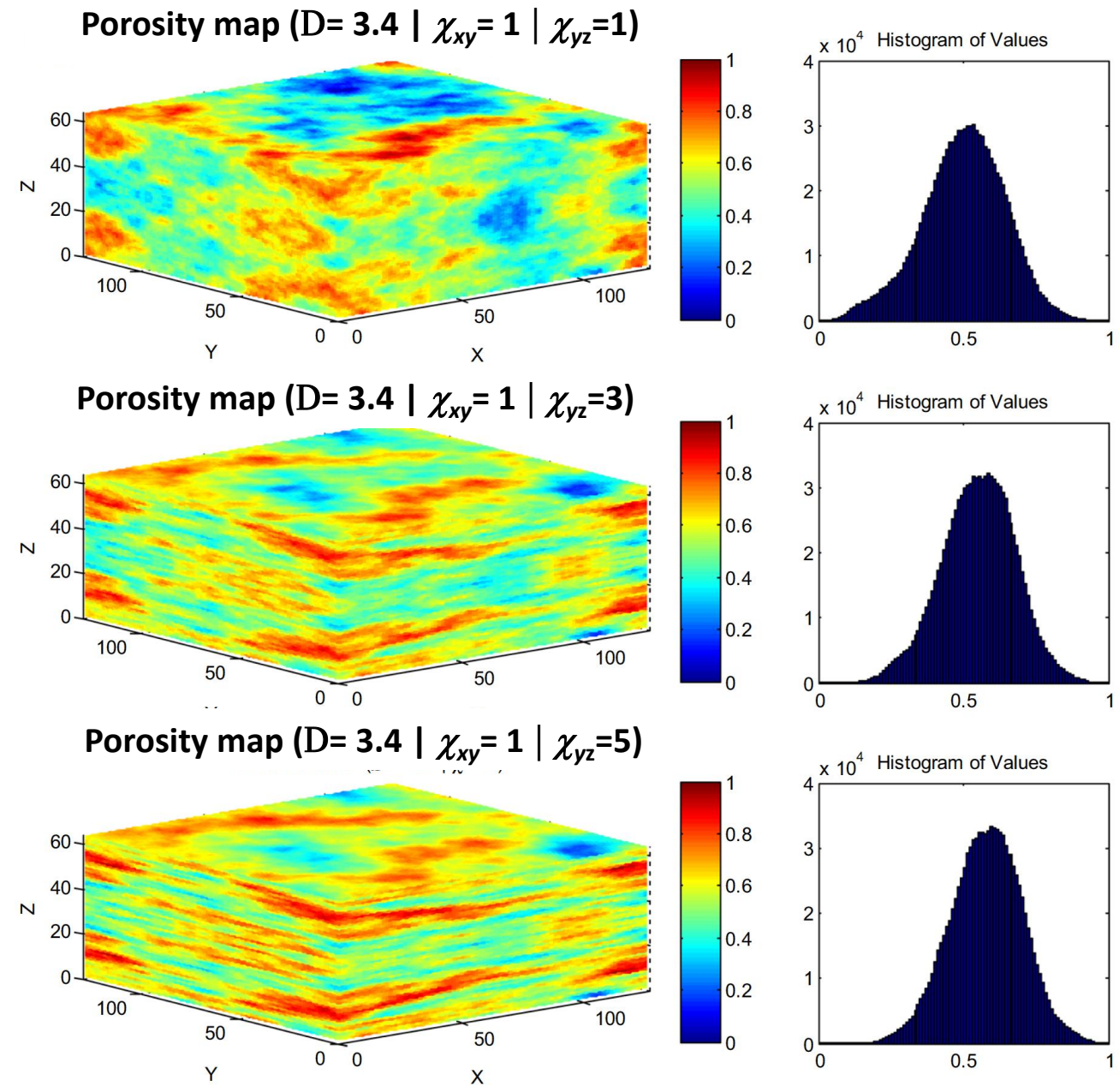
# Testing the fractal dimensions



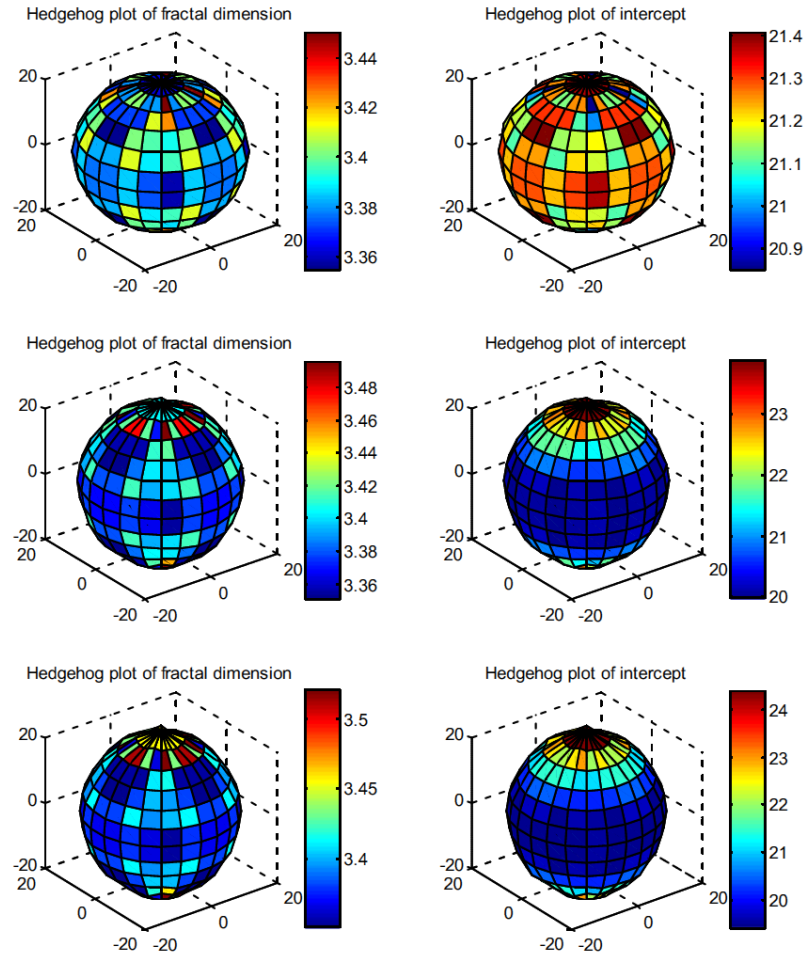
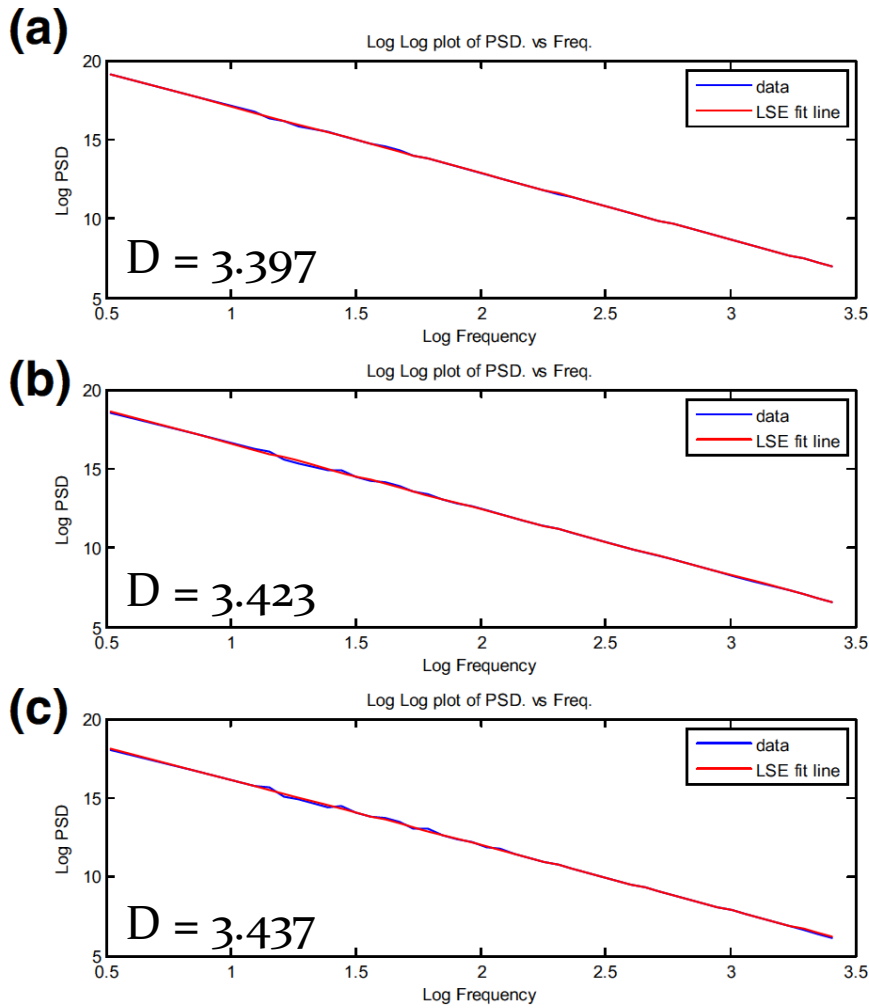
Fractal volumes for different heterogeneities (fractal dimensions) and the same isotropy

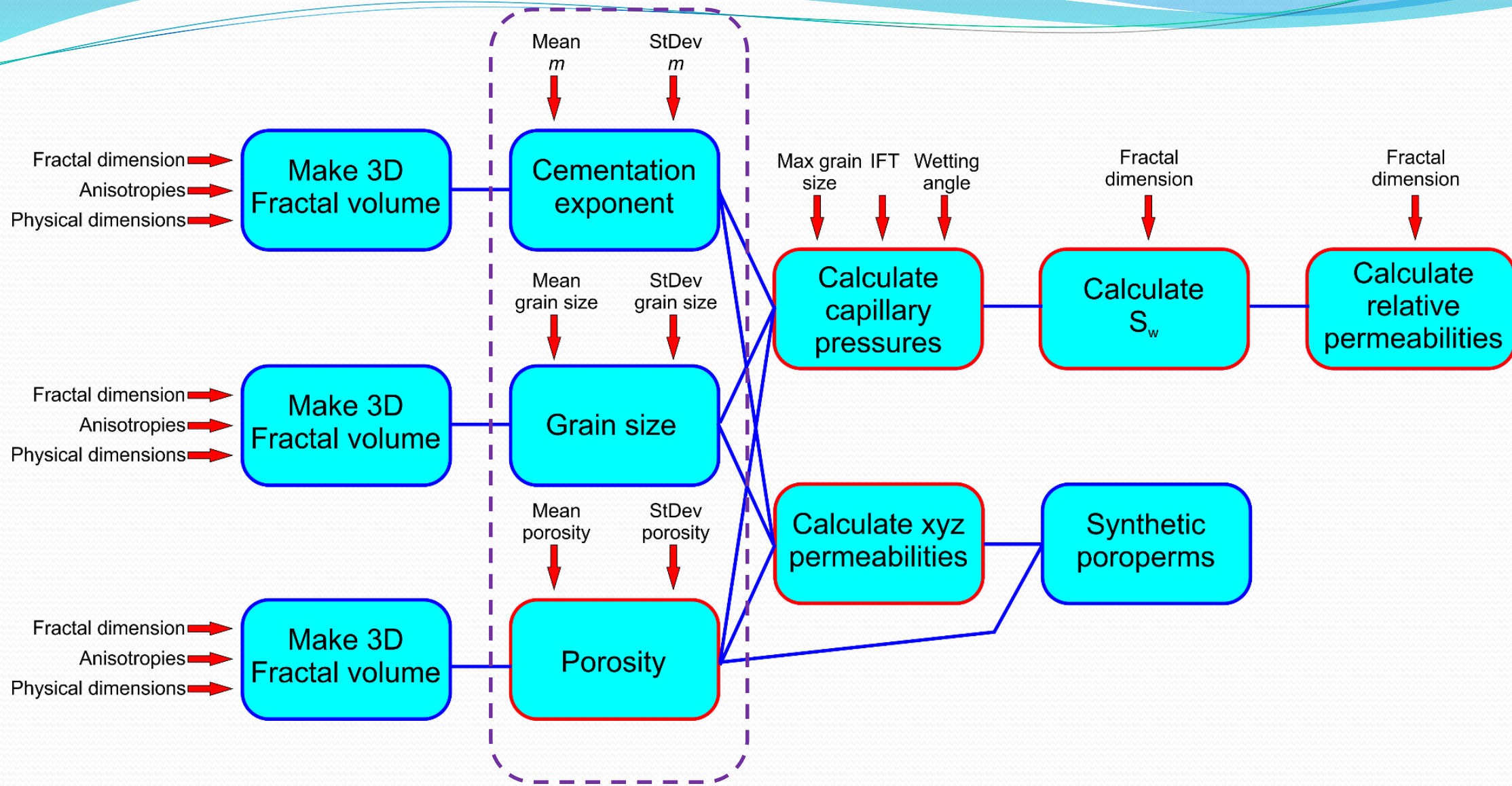


Increasing Anisotropy

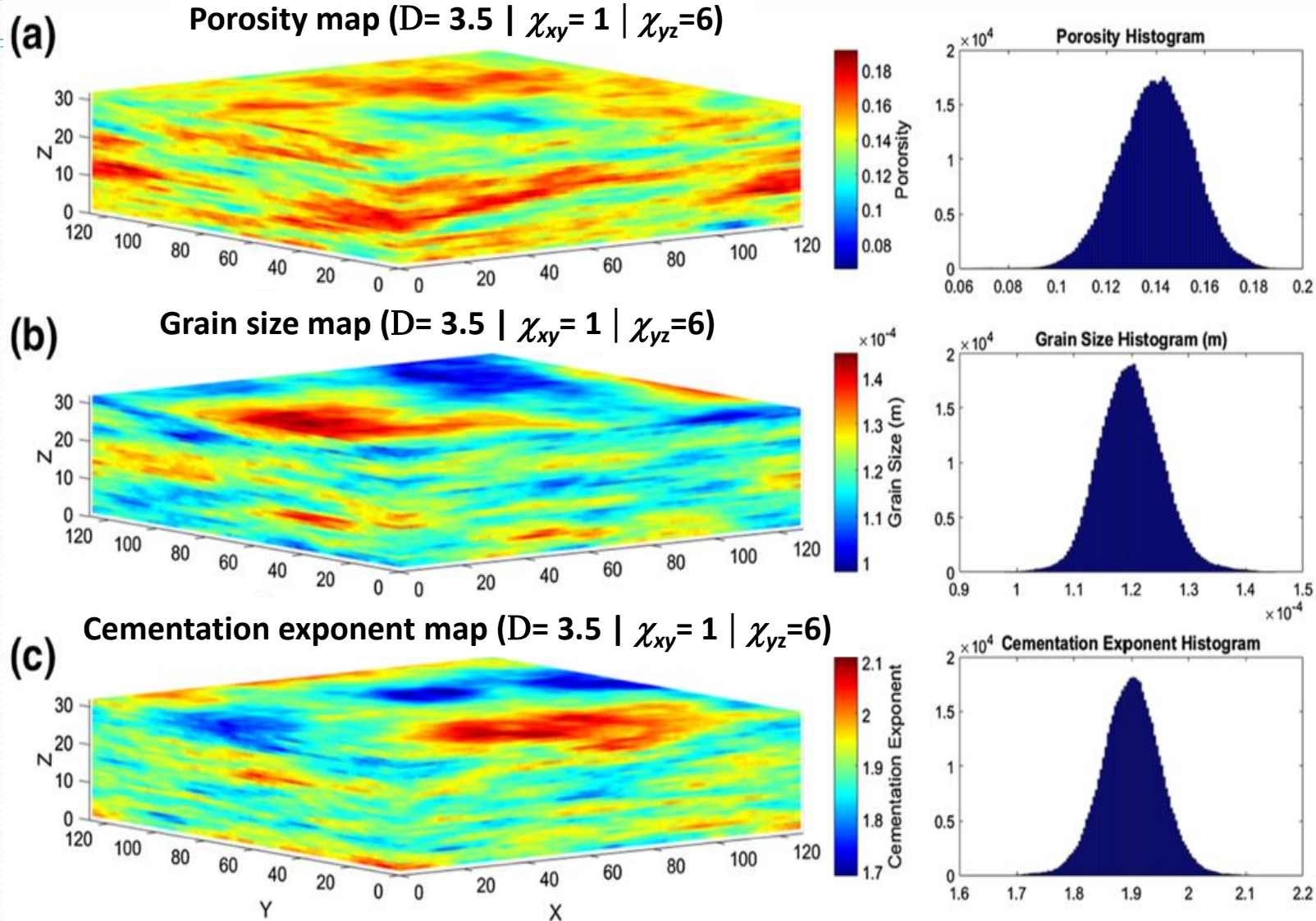


# Testing the anisotropies



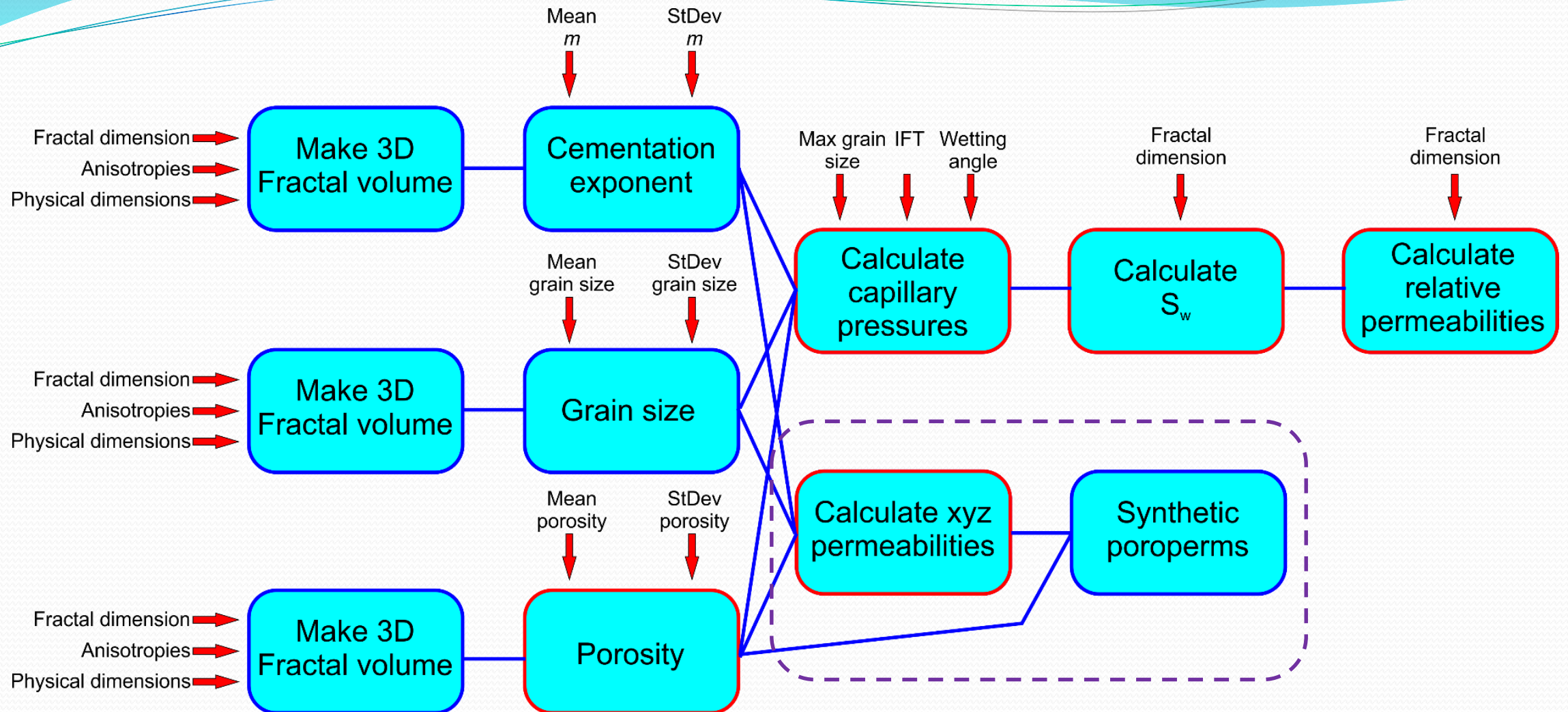


# Conditioning to reservoir properties



**Data required:** Mean and standard deviation of each parameter



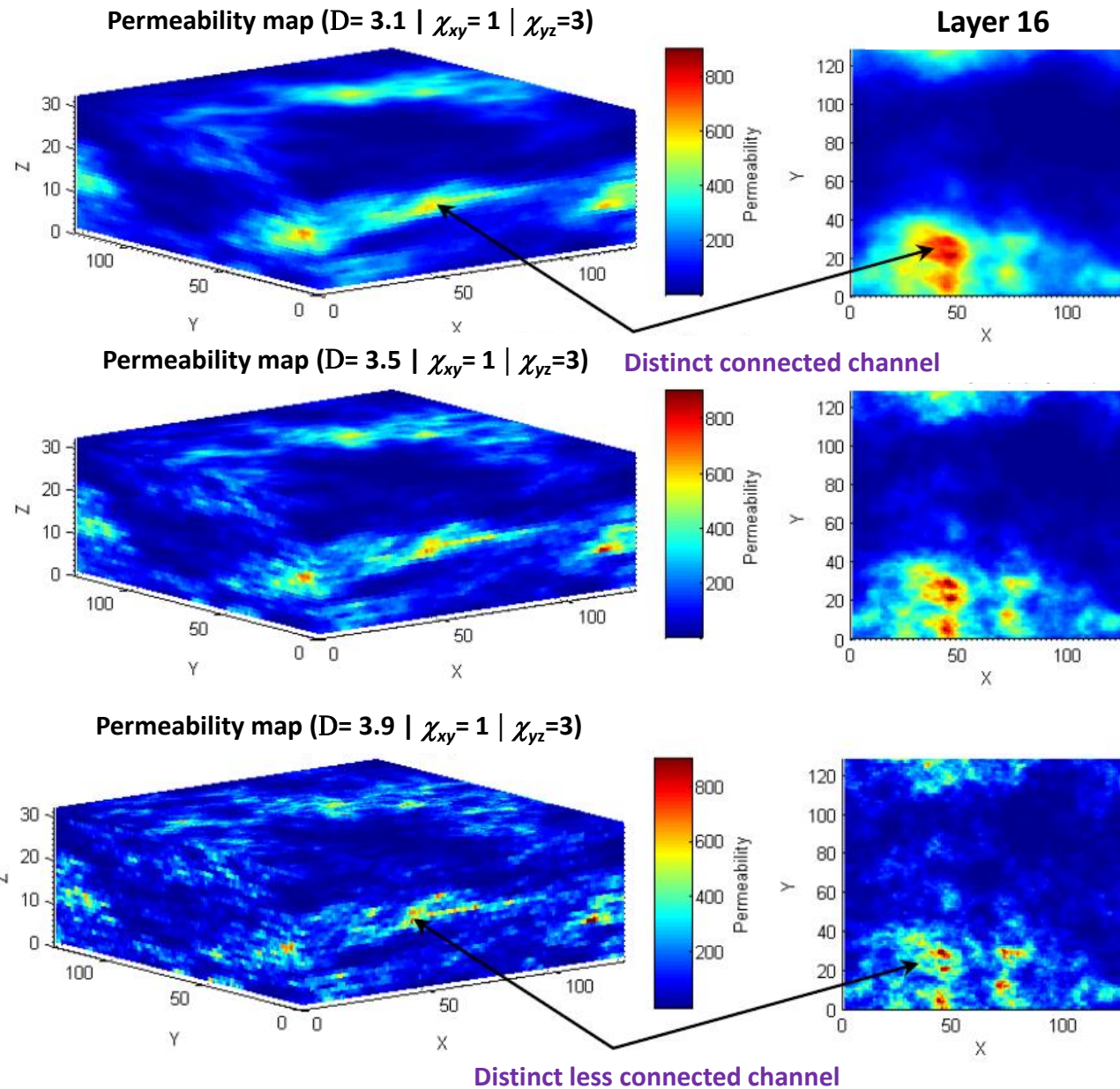


# Calculating permeability

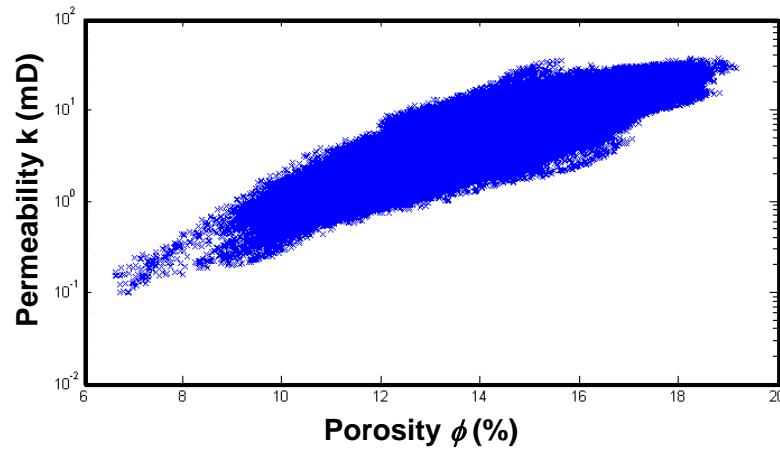
Using the RGPZ method for clastic rocks

$$k = \frac{d_{grain}^2 \phi^{3m}}{4am^2}$$

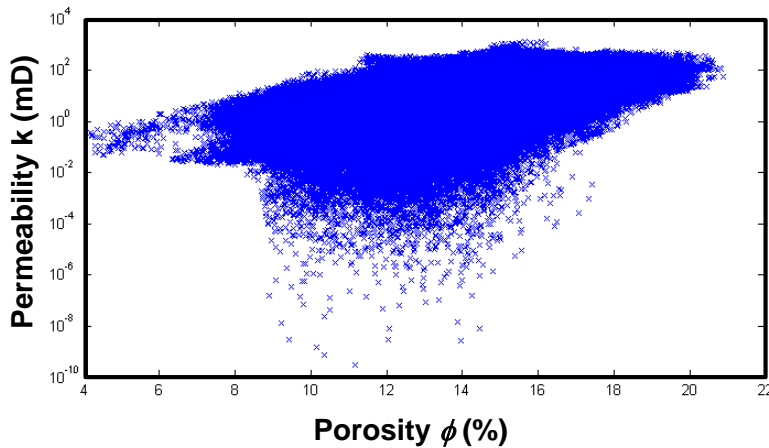
or its carbonate or generic modifications appropriately.



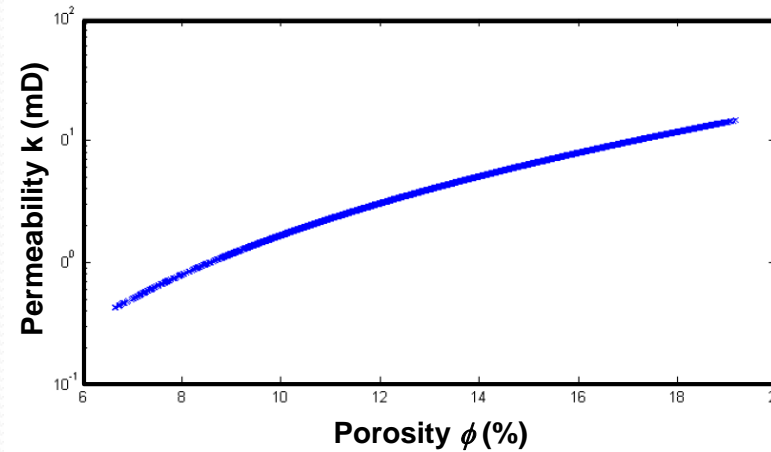
# Synthetic poroperm plots



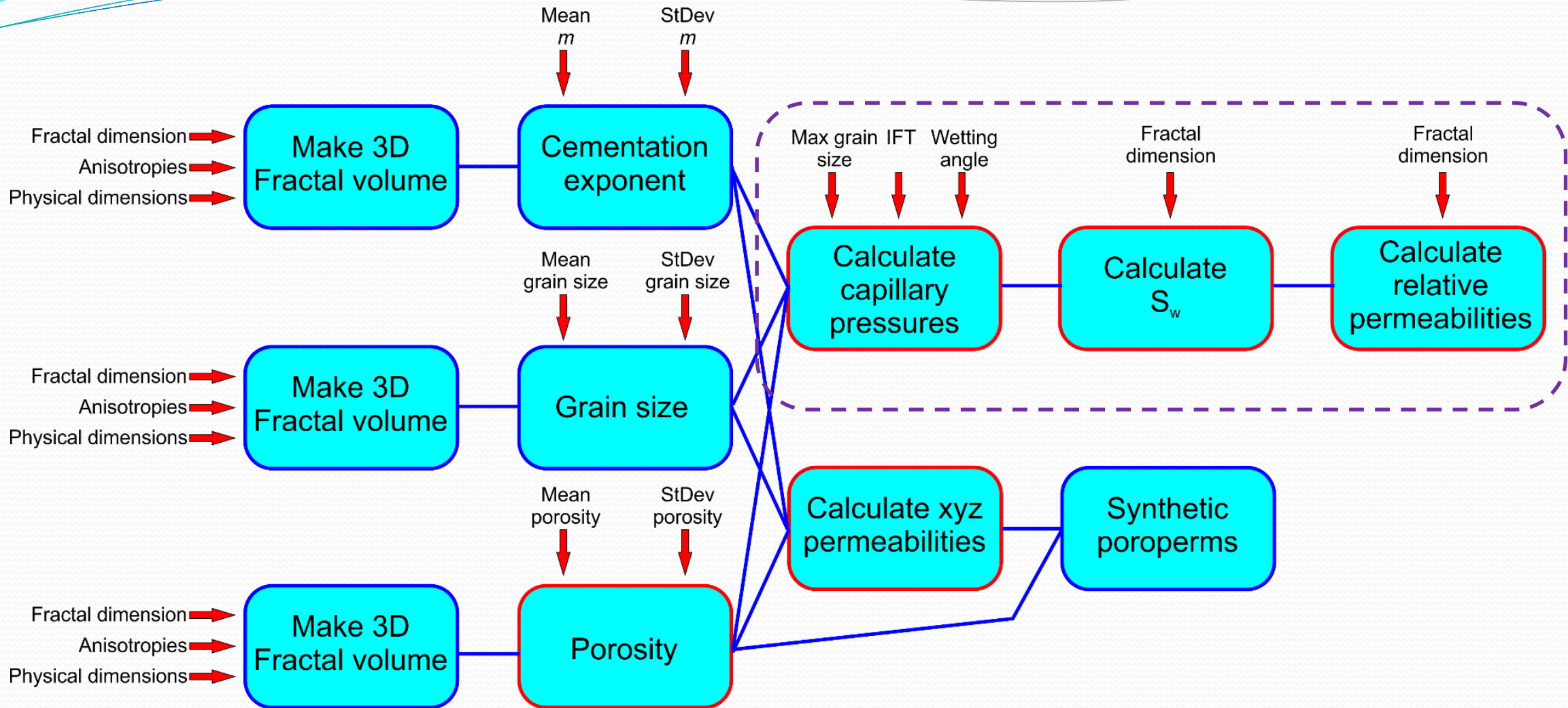
Typical poroperm plot for  $D=3.4$ , different fractal volumes of main parameters and typical standard deviations of input fractal volumes



Increasing standard deviations of input fractal volumes increases scatter



Using the same map for all input parameters collapses the poroperm plot



## Capillary pressures

### Capillary pressure

$$P_c = \frac{2A\sigma \cos \theta}{d_{\text{grain}}} \sqrt{\frac{am^2}{2\phi^{2m}}}$$

### Entry pressure

$$P_e = \frac{2A\sigma \cos \theta}{d_{\text{largest grain}}} \sqrt{\frac{am^2}{2\phi^{2m}}}$$

## Water saturation

$$S_w^* = \left( \frac{d_g}{d_{g,\text{max}}} \right)^{3-\mathcal{D}}$$

$$\lambda = 3 - \mathcal{D}$$

## Relative permeabilities

### Brooks-Corey-Mualem

$$k_{\text{rw}} = (S_w^*)^{\frac{4+5\lambda}{2\lambda}}$$

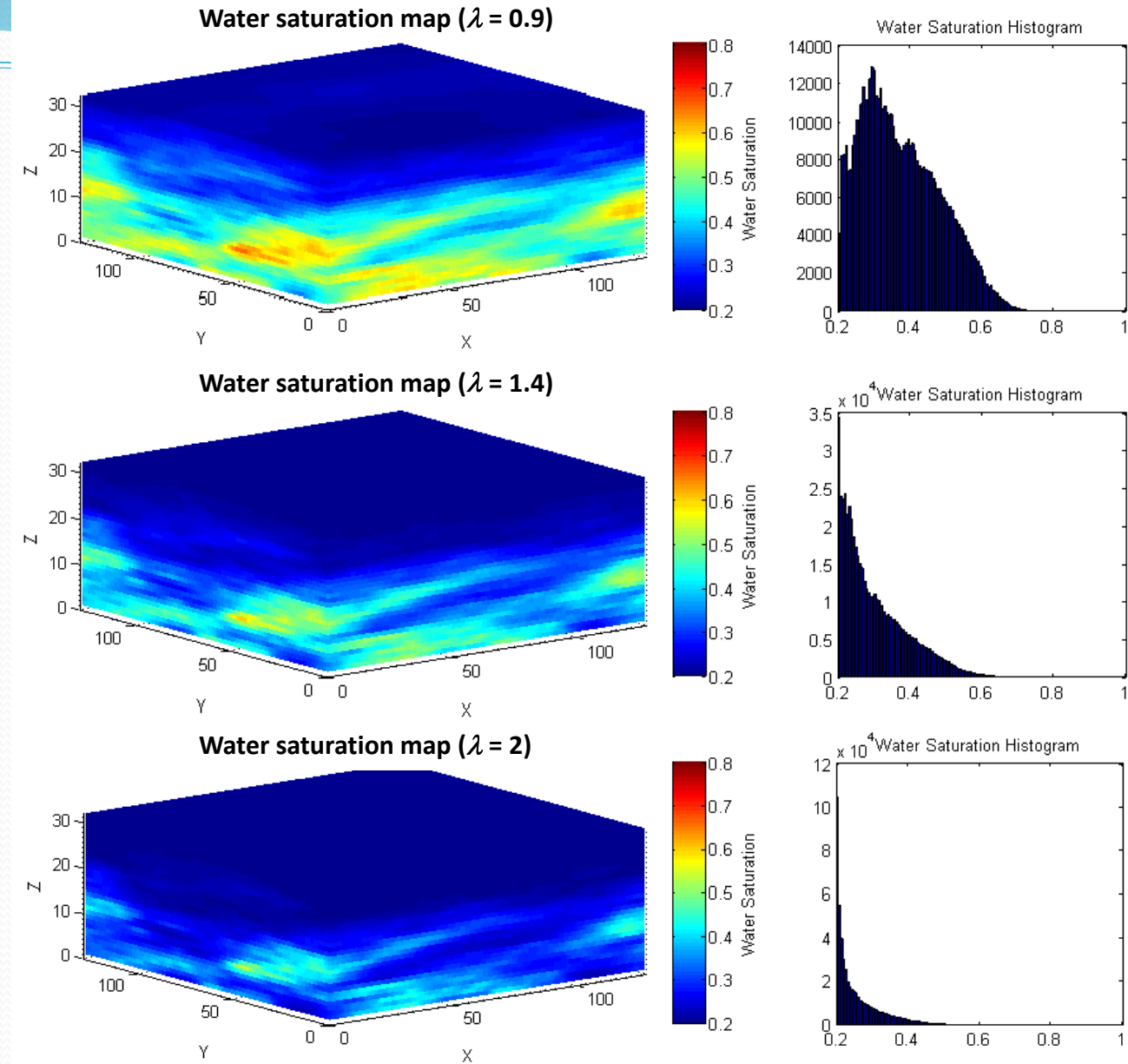
$$k_{\text{rnw}} = (1 - S_w^*)^{\frac{1}{2}} \left[ 1 - (S_w^*)^{\frac{1+\lambda}{\lambda}} \right]^2$$

**Data required:** Pore throat conversion factor, interfacial tension, wetting angle

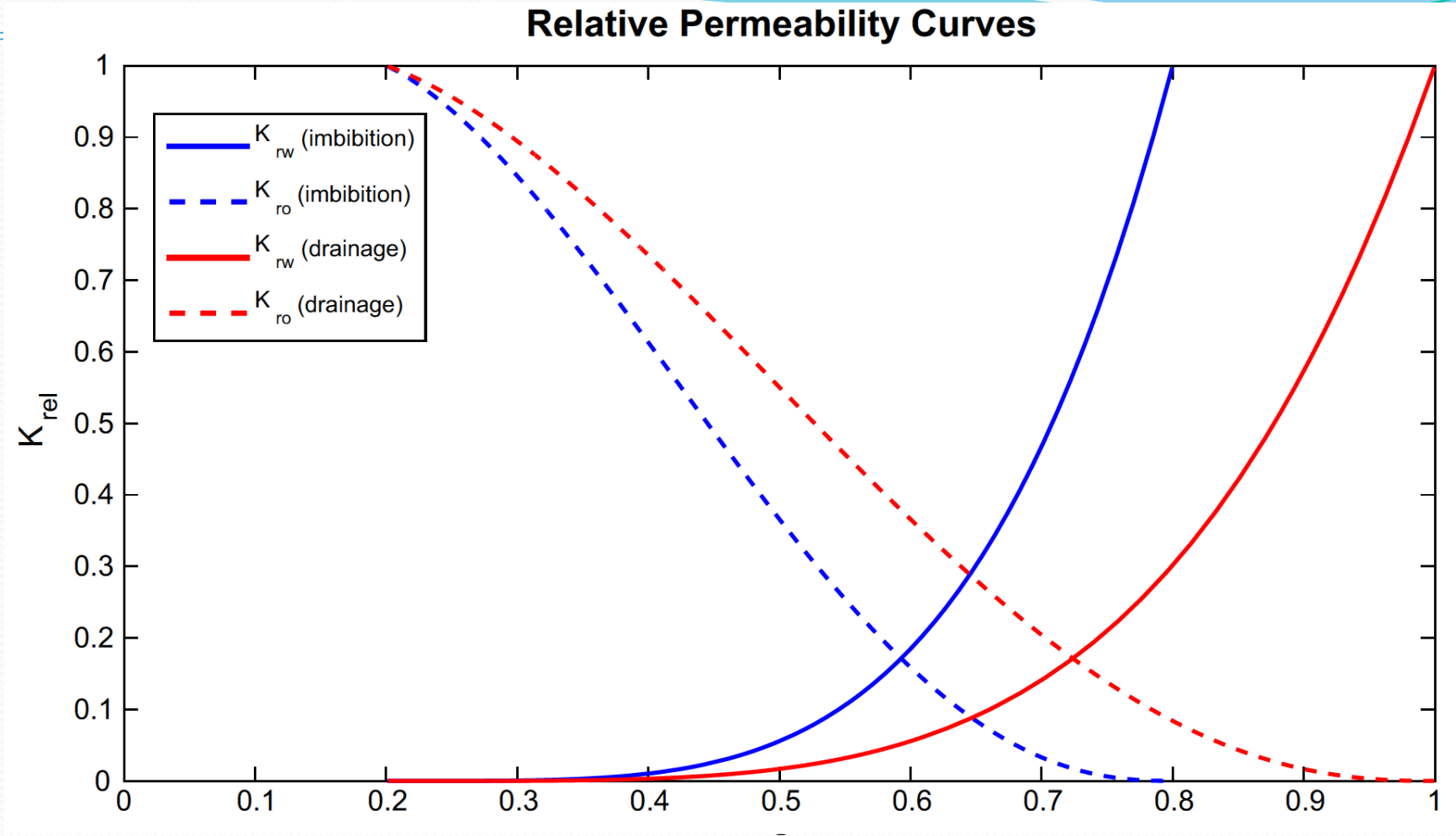
# Water saturation

Water saturation depends on  $\lambda$ , which depends on the fractal dimension

$$\lambda = 3 - \mathcal{D}$$



# Relative permeabilities



Can be calculated with any of the 4 main models – here the Brooks-Corey-Mualem model

# Generic modelling

What is the effect of:

- Heterogeneity
- Anisotropy
- Well Placement
- Orientation

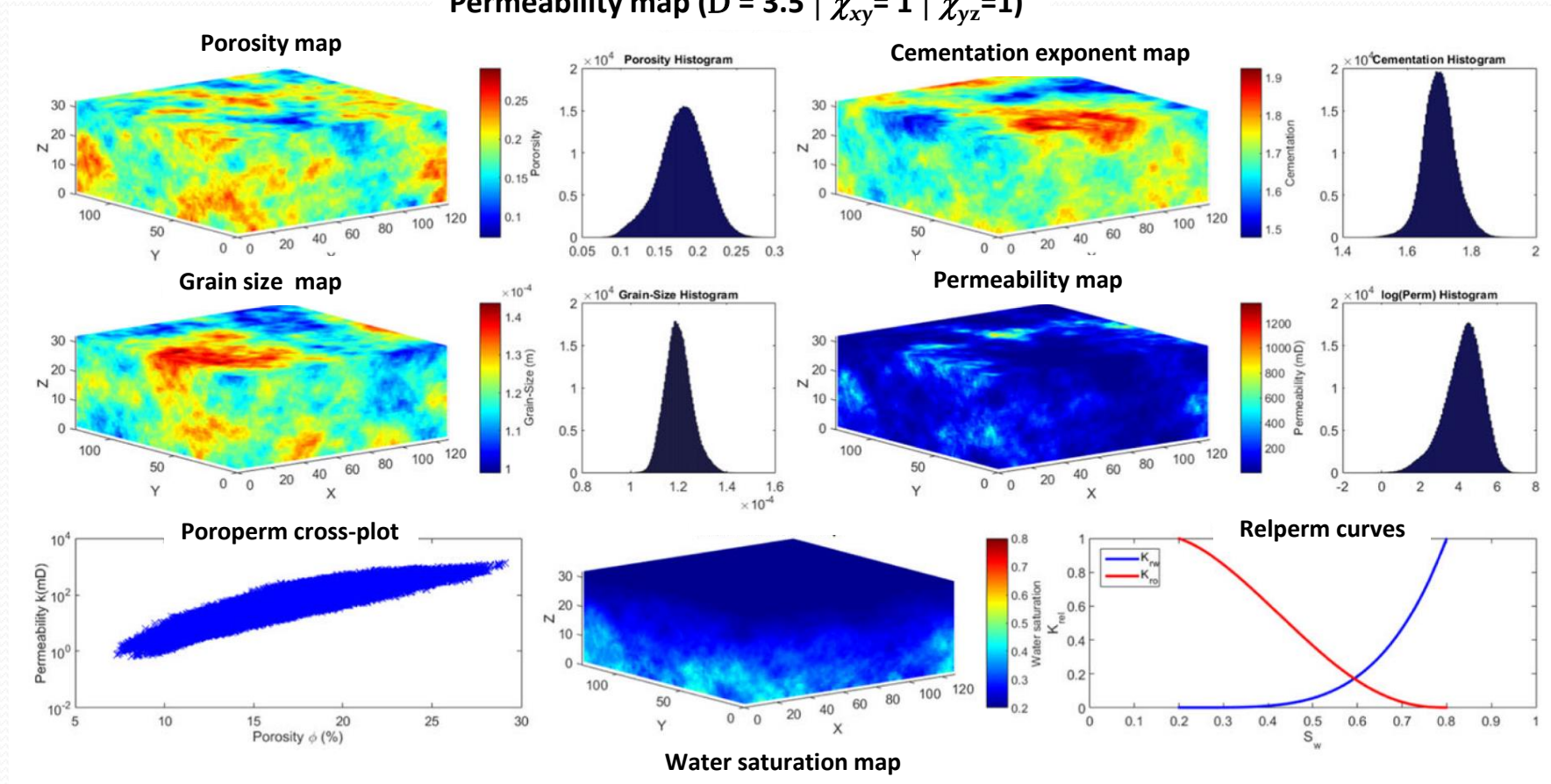
on reservoir production from a model reservoir?

Saud Al-Zainaldin, George Daniel, Saddam Sinan, Piroska Lorinczi



# A Typical Finished AFRM

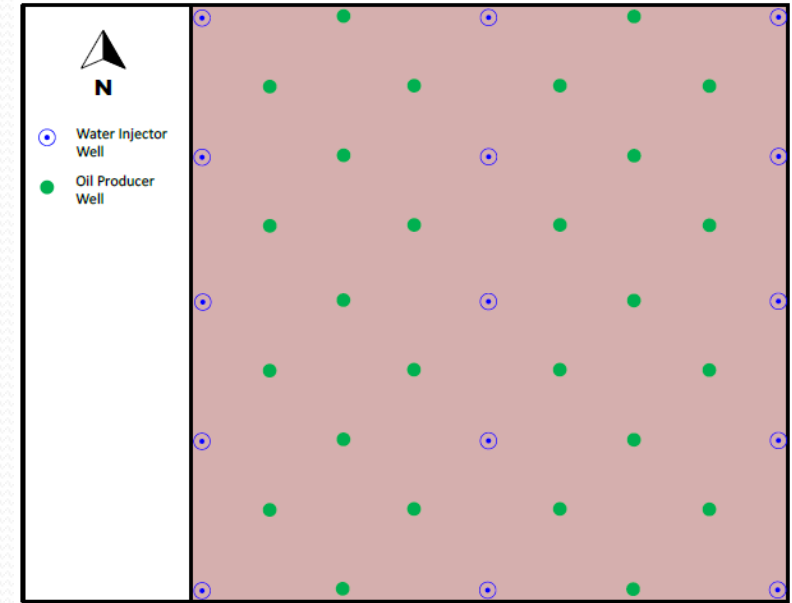
Permeability map ( $D = 3.5 \mid \chi_{xy} = 1 \mid \chi_{yz} = 1$ )



All the input parameters needed for full simulation.  
Fully specified, unique structure, repeatable model. Not stochastic.

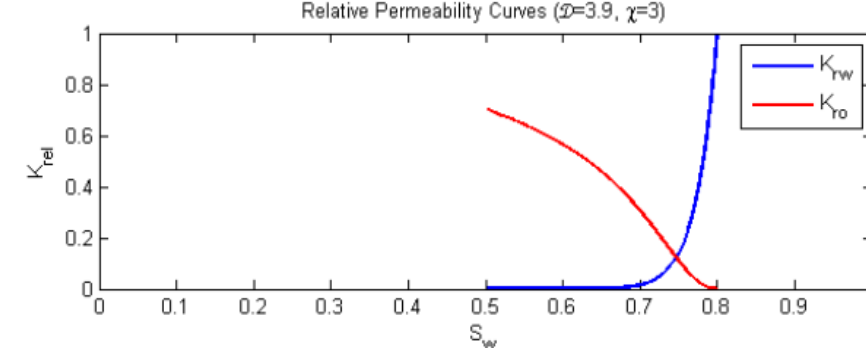
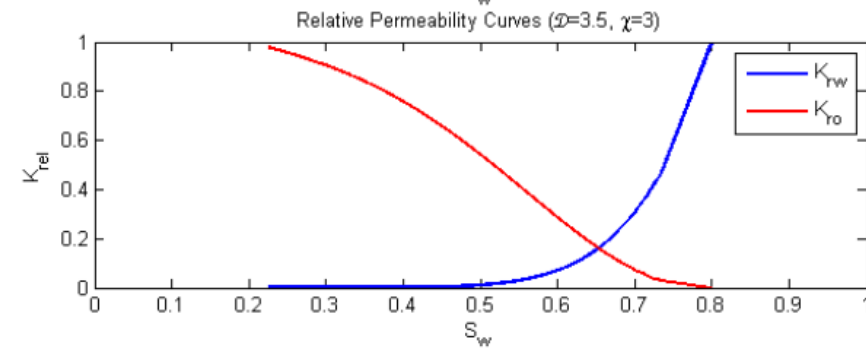
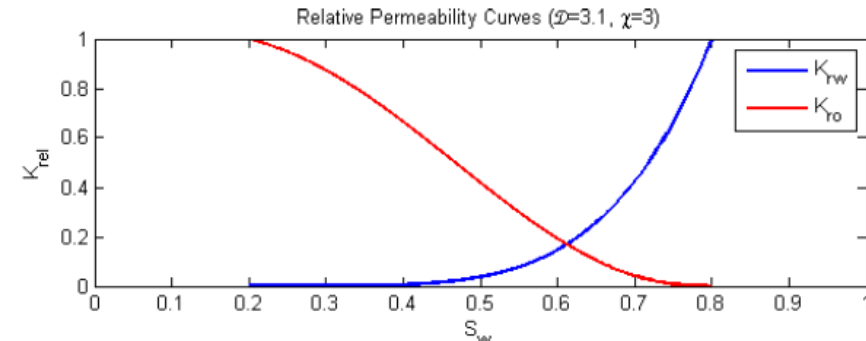
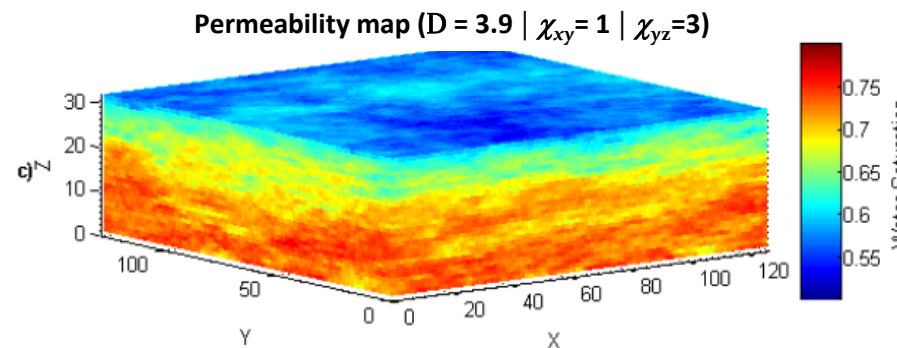
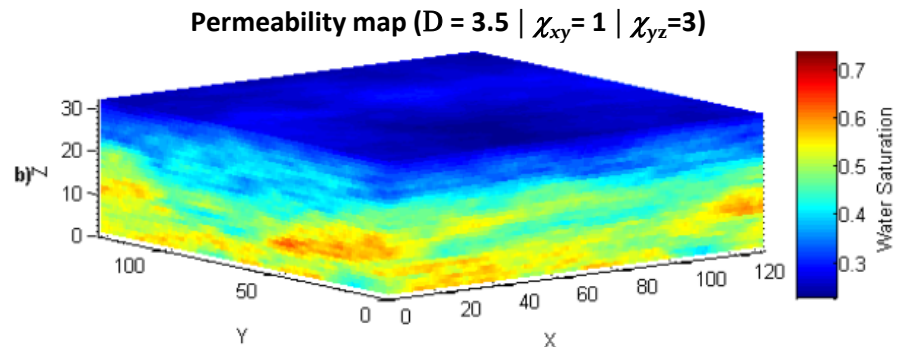
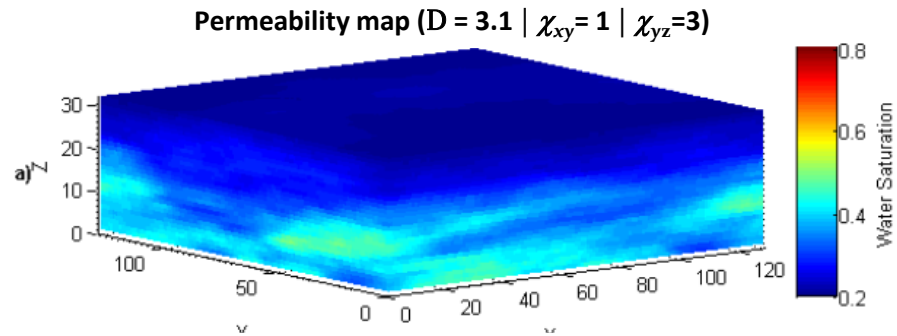
# Simulation for testing the effect of heterogeneity and anisotropy

- Finite-difference Roxar Tempest® Black-Oil simulator (ver. 7.0.4)
- Anisotropy causes striping in the  $x$ -lateral direction



Parameter	Value
Number of grid blocks	128 × 128 × 32; 524288 voxels
Reservoir dimensional extent	12.8 km laterally and 96 m vertically
Depth of top reservoir	2000 ft
Layers thickness	3 m
Oil-water contact depth	2096 ft

# Fractal capillary pressure and water saturations

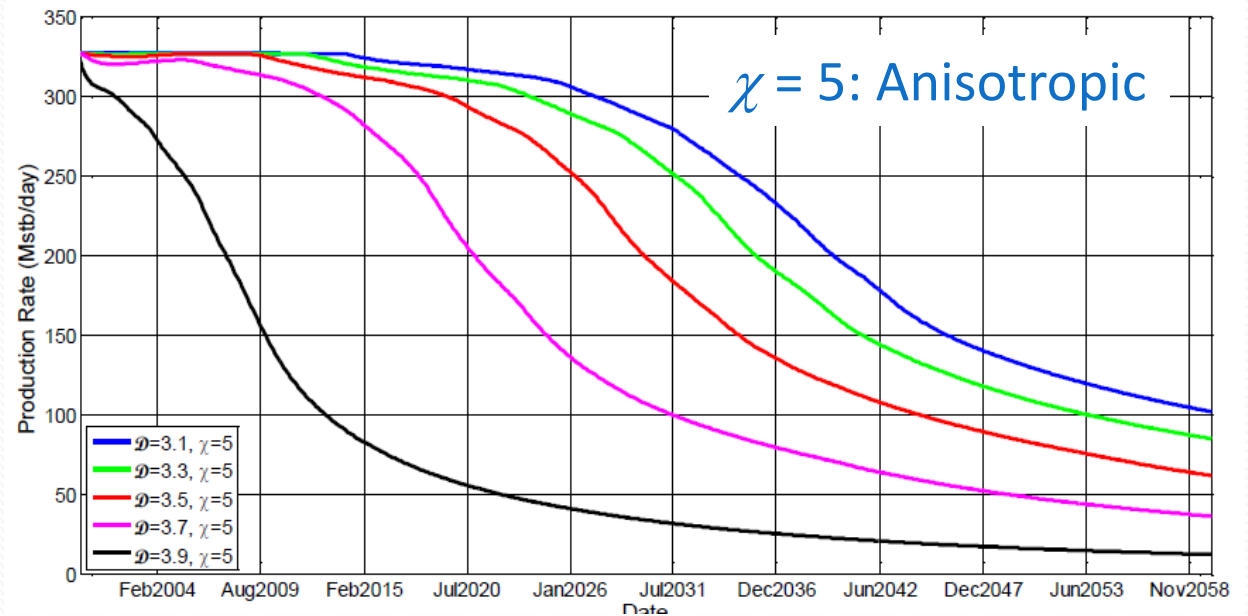
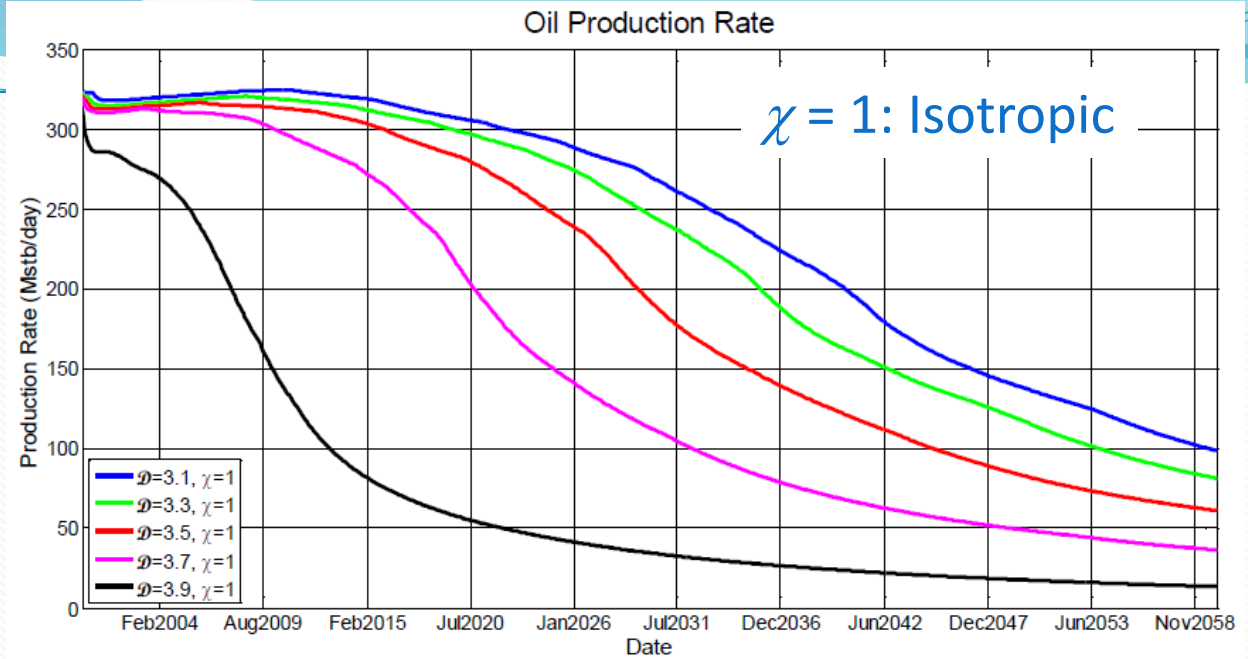


# Effect of changing heterogeneity:

## Oil Production Rates

Homogeneous reservoirs (low  $D$ ) produce at a **higher rate for longer** than heterogeneous reservoirs (higher  $D$ )

Greater anisotropy  $\chi$  reduces production rate slightly at each time point

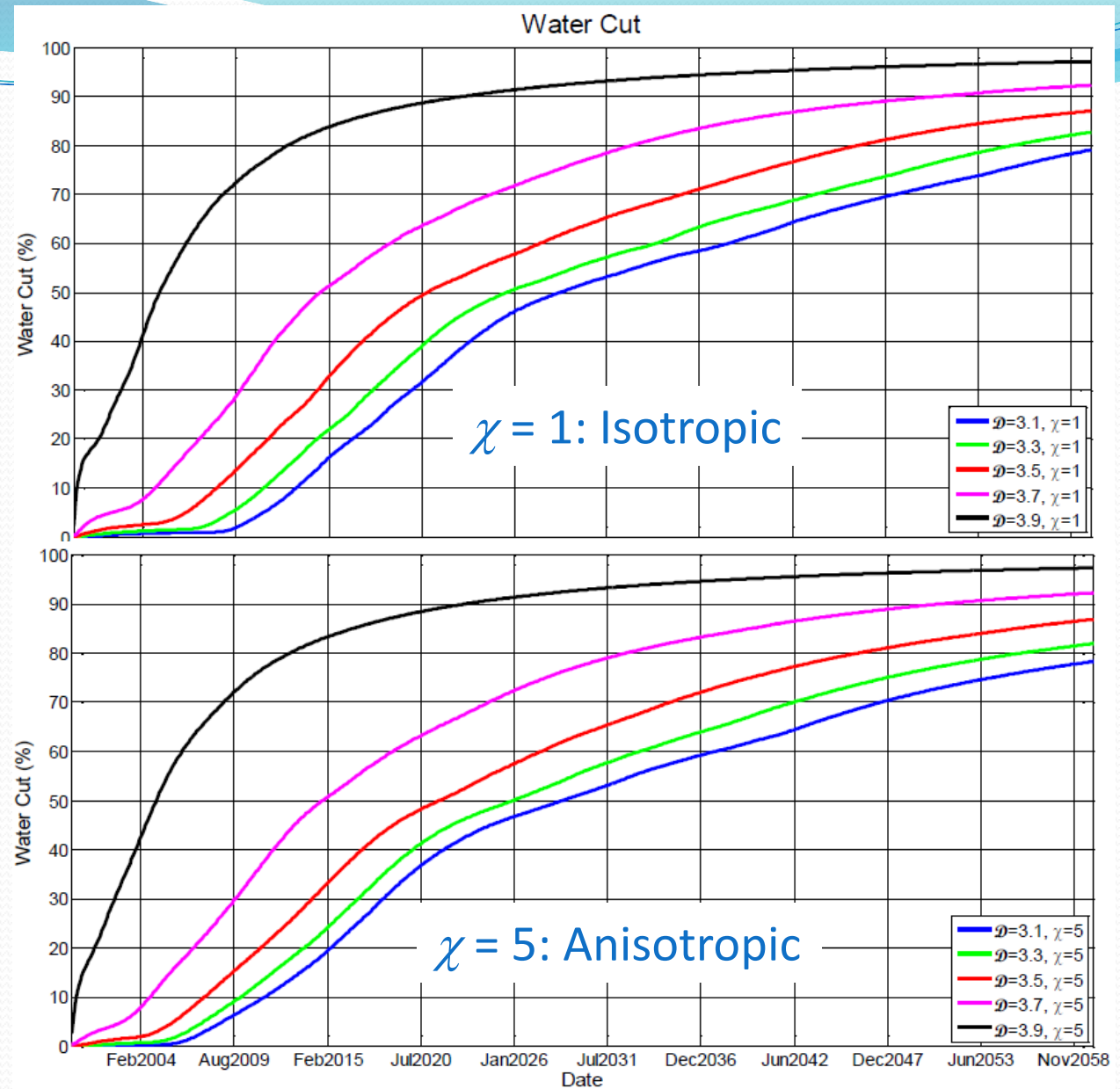


# Effect of changing heterogeneity:

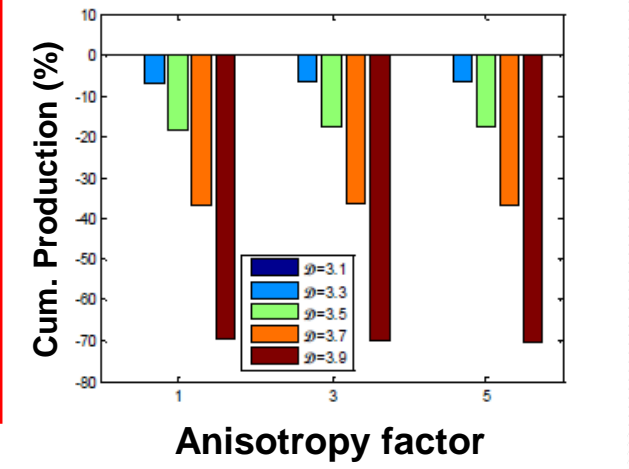
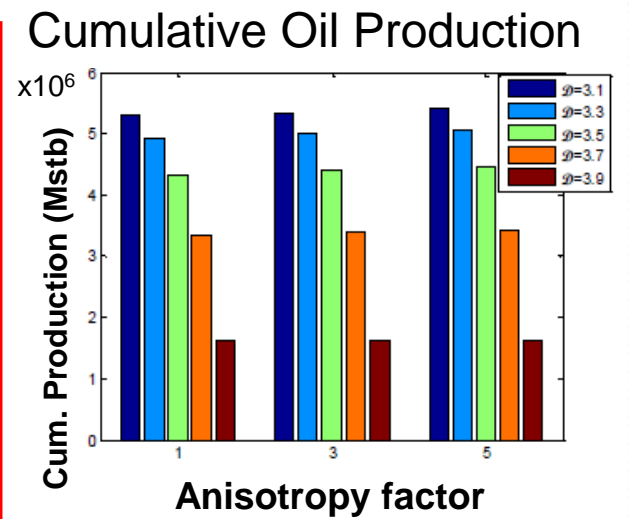
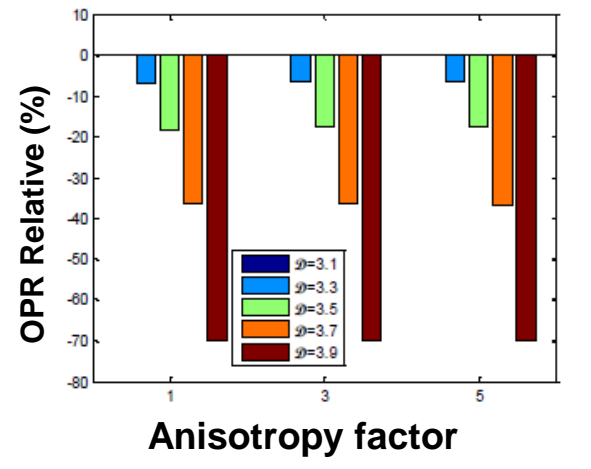
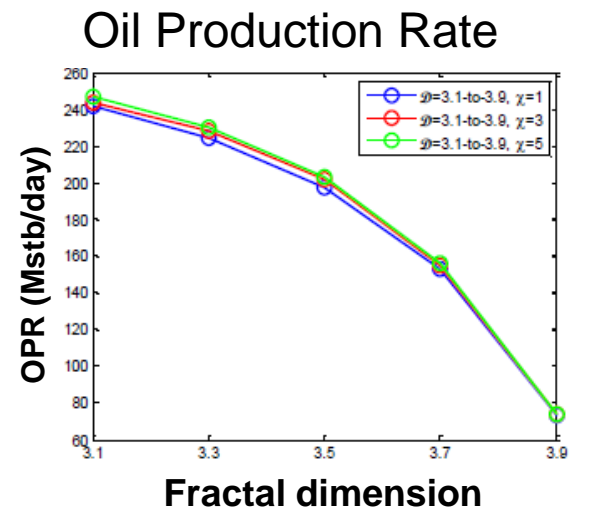
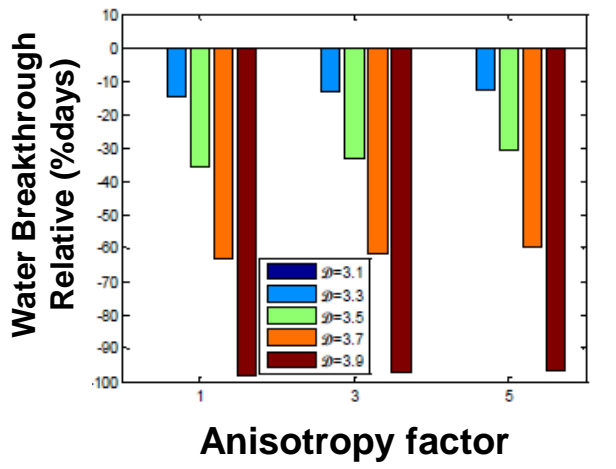
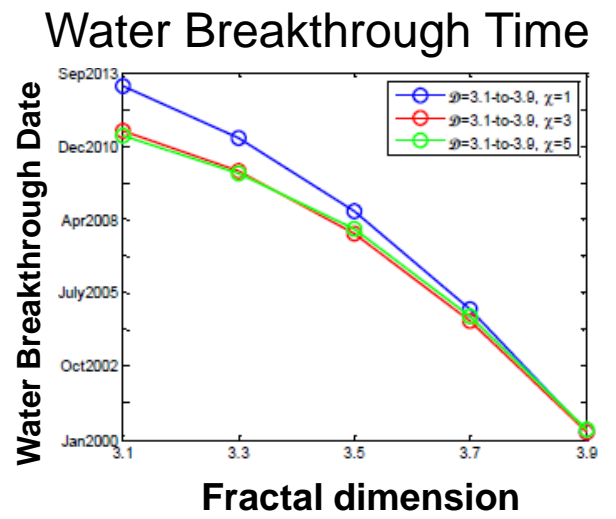
## Water cut

Homogeneous reservoirs (low D) keep the water cut **lower** for **longer** than heterogeneous reservoirs (higher D).

Greater anisotropy  $\chi$  leads to earlier water breakthrough



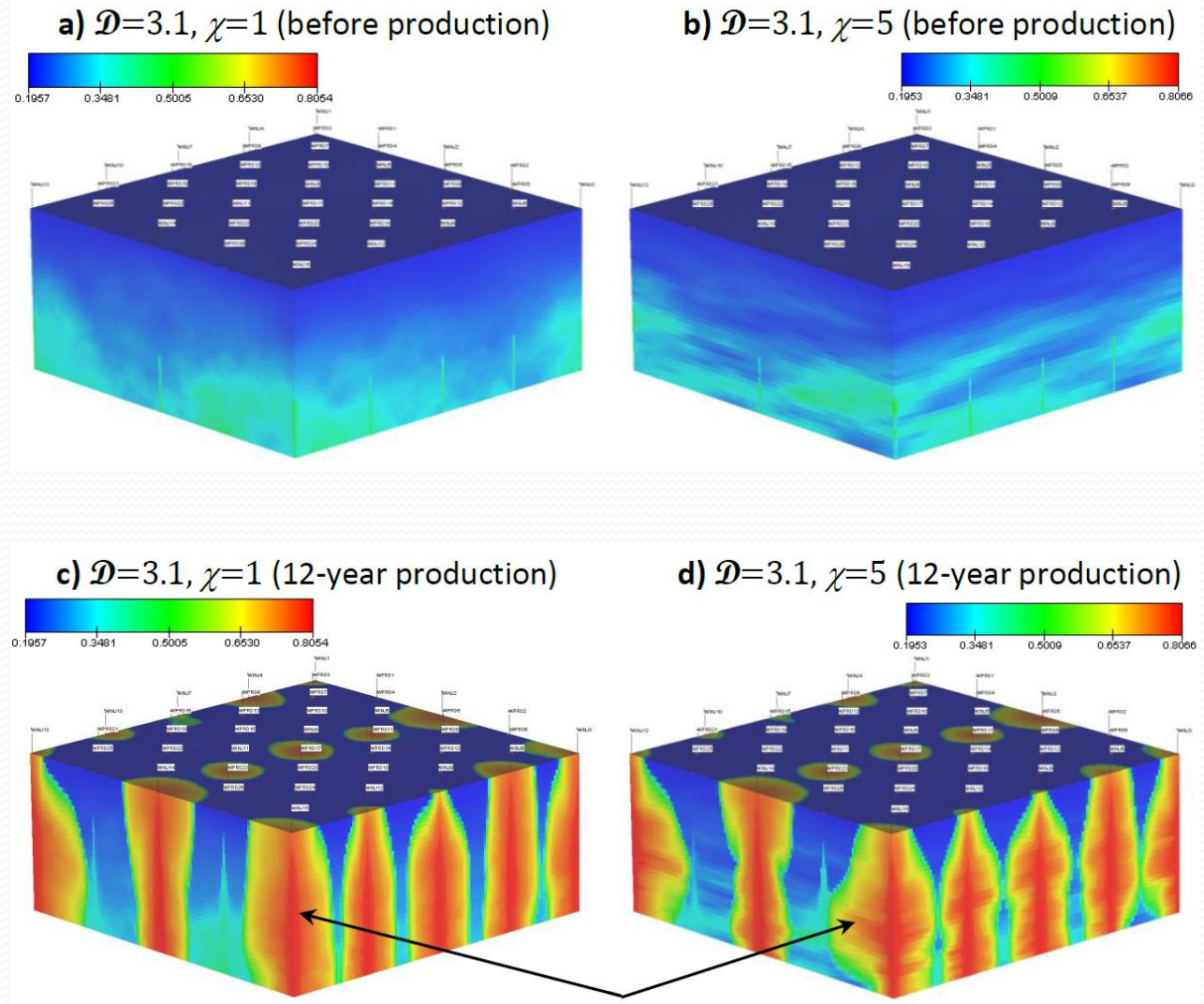
# Effect of changing heterogeneity & anisotropy



# Water saturation maps

## Effect of anisotropy: Production

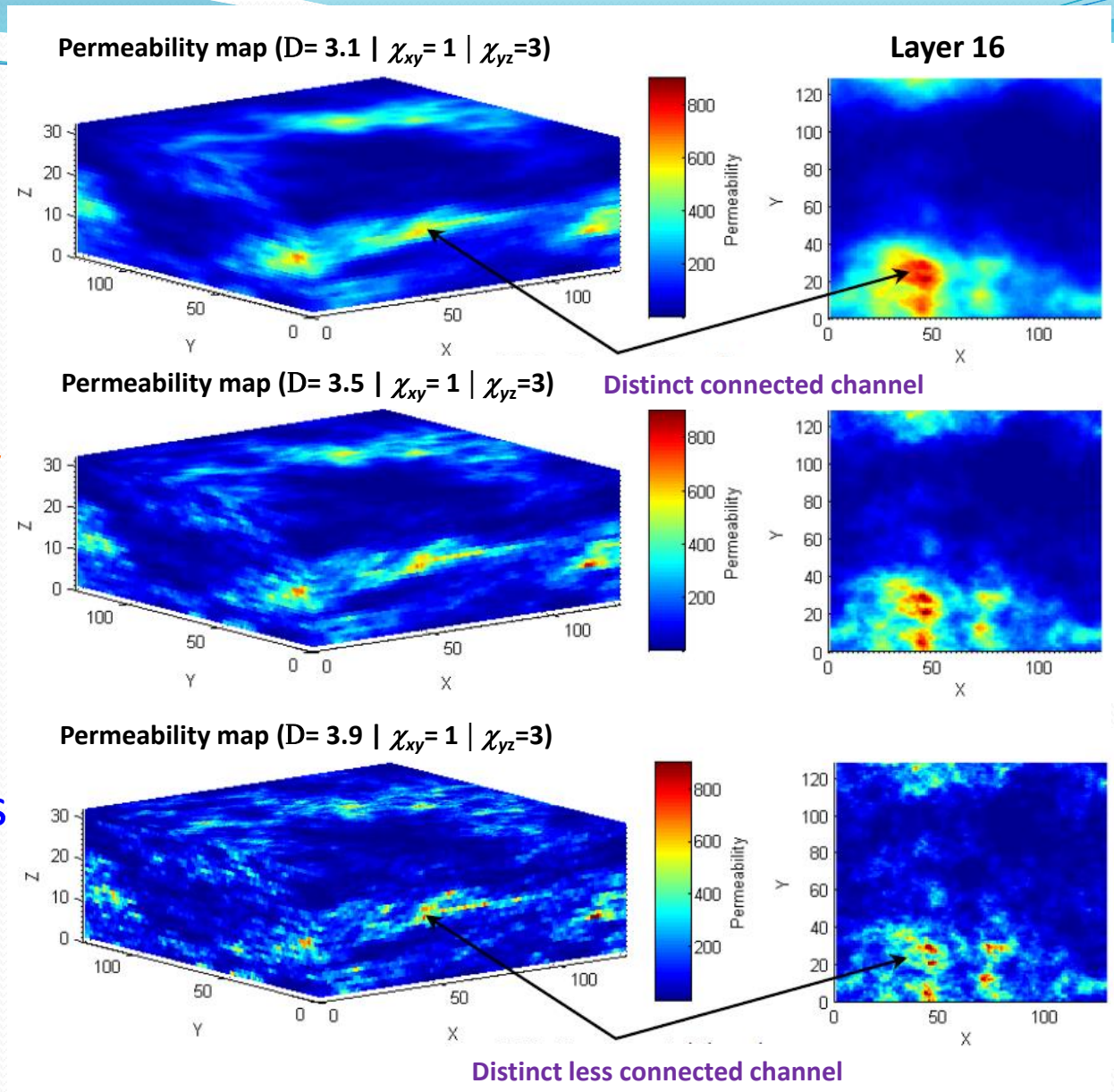
- Higher anisotropy
- Higher anisotropic flow
- Advance water break-through
- Slightly increased residual oil
- No change in production rates



# Effect of heterogeneity:

## Production

- Higher heterogeneity
- Higher fractal dimension
- Less spatial correlation
- Less distinct channels of high permeability
- Lower production rates



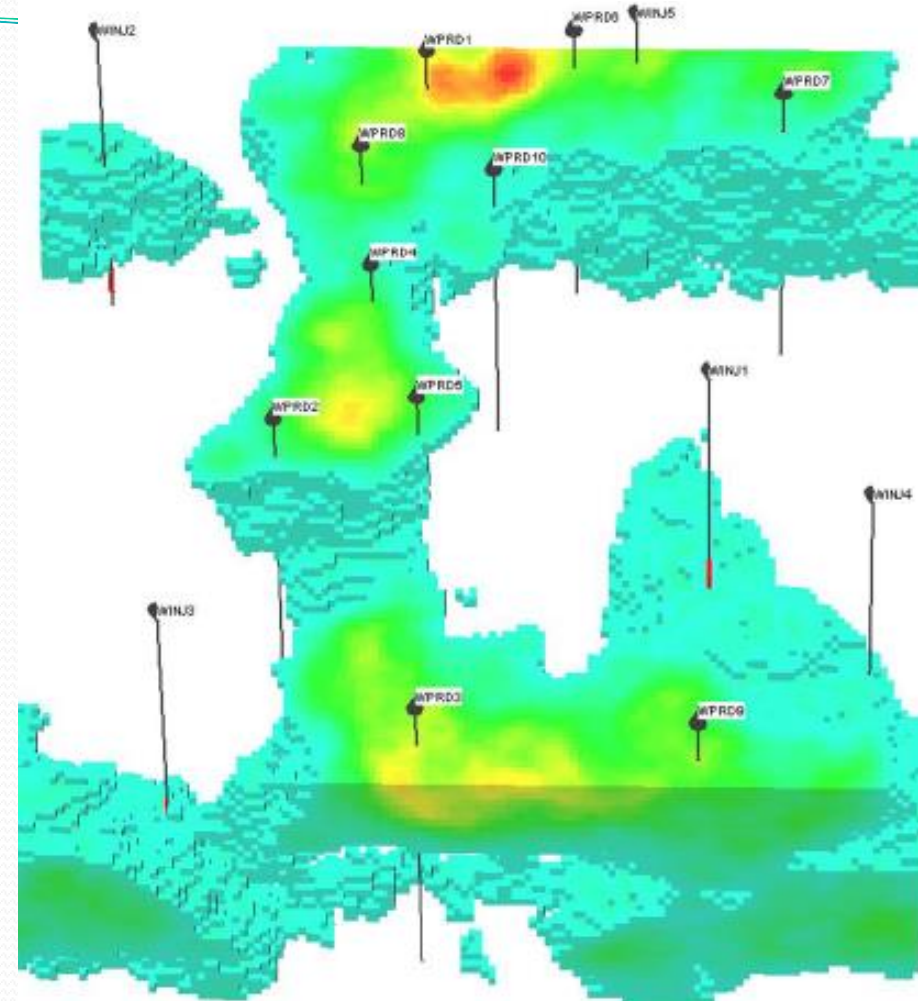


# Well placement in isotropic reservoirs

Tests done for:

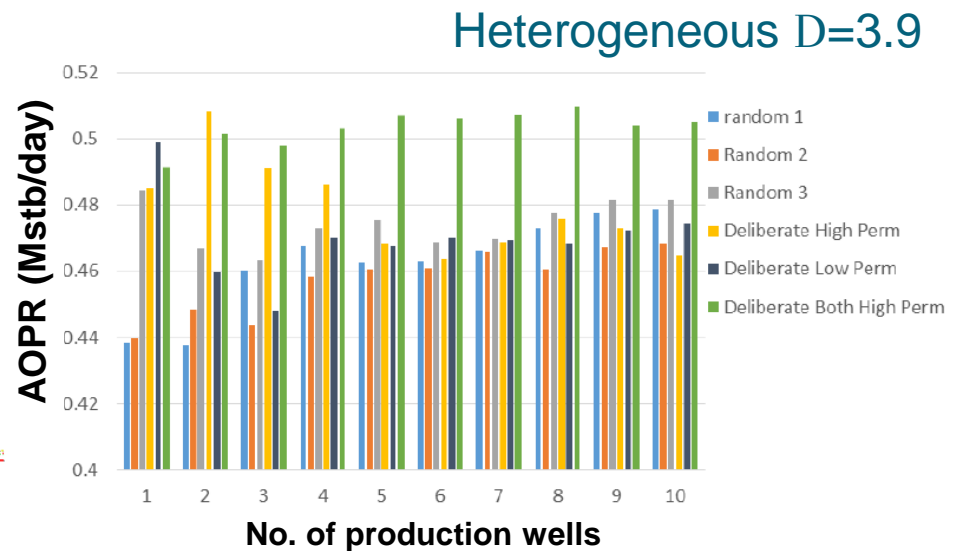
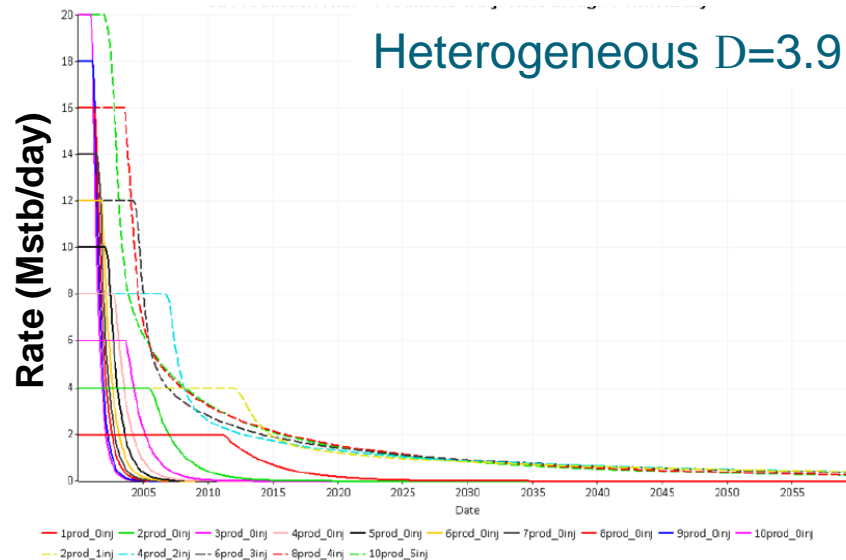
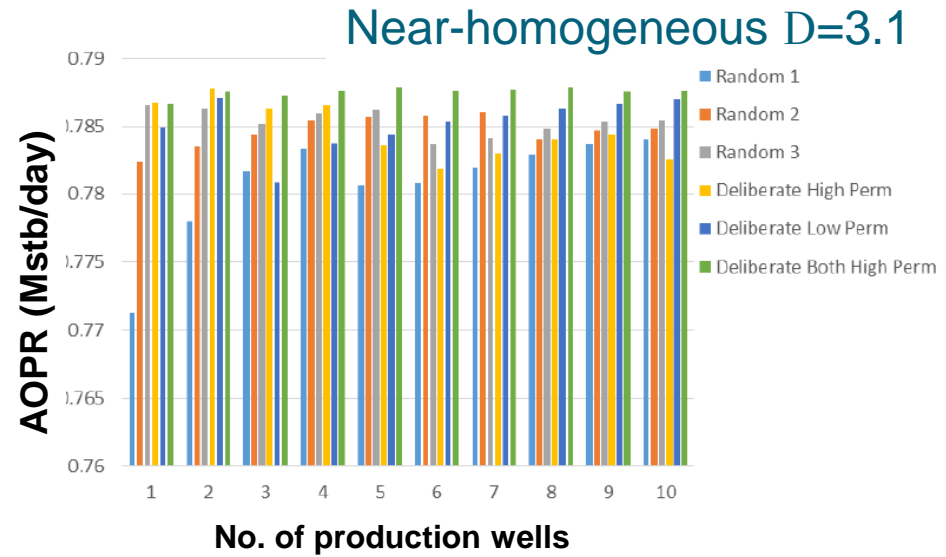
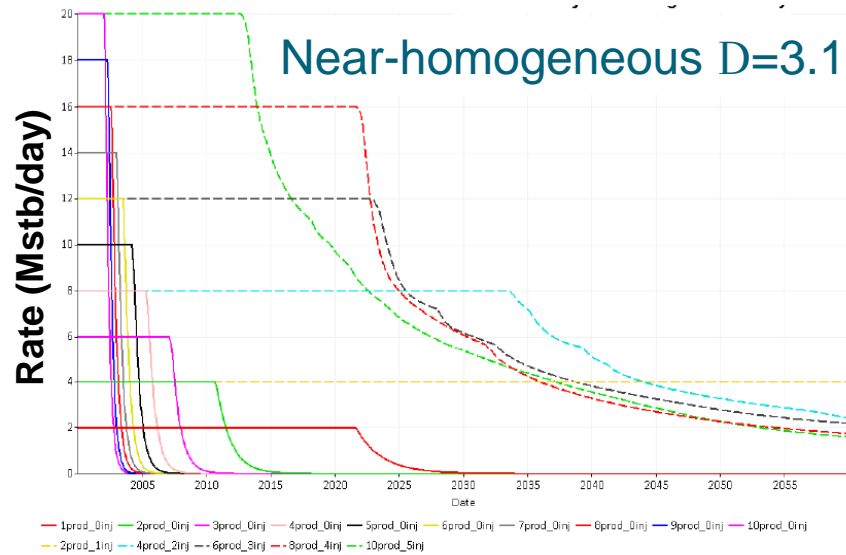
- 3 configurations of random well placement
- Combinations of Injectors  $I$  and/or producers  $P$  in low or high permeability zones
- 1 to 10 producers and 1 to 5 Injectors
- For conventional and tight reservoirs
- Fractal Dimensions 3.1, 3.5 and 3.9
- Oil production profile, Oil recovery factor, Water cut

54 profiles, each with 15 curves



Well placements  $I$  and  $P$  in high permeability ( $k > 120$  mD cut-off)

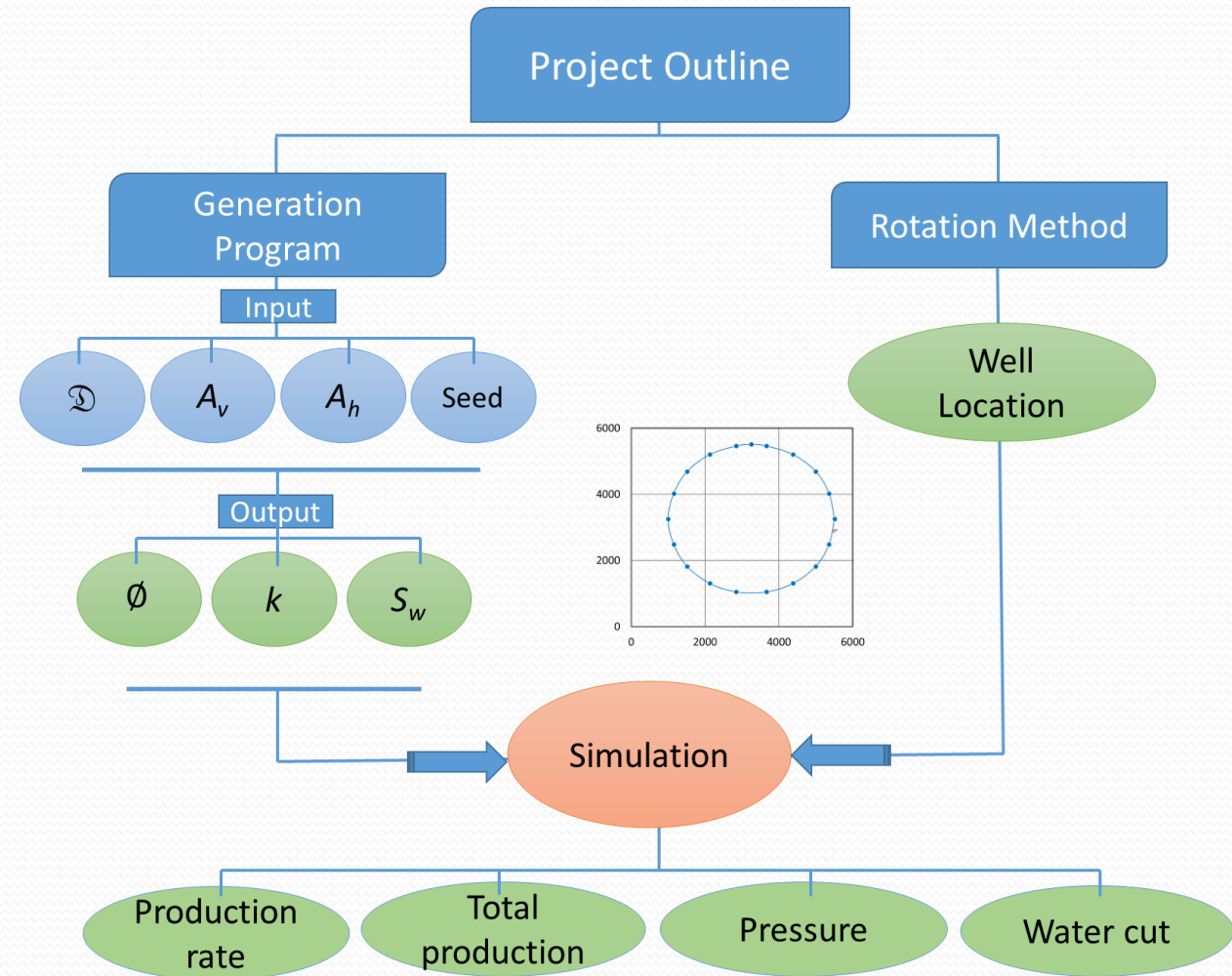
# Typical well placement results



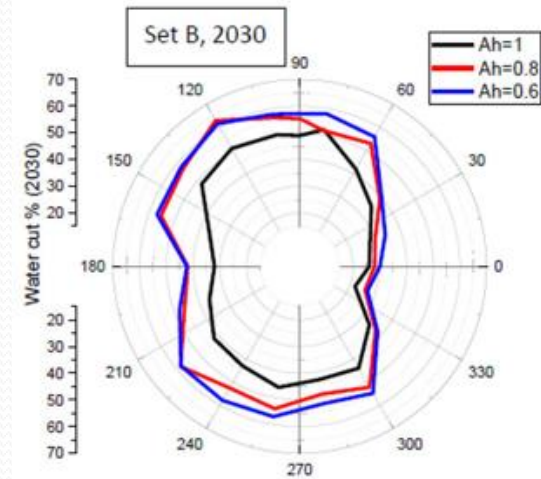
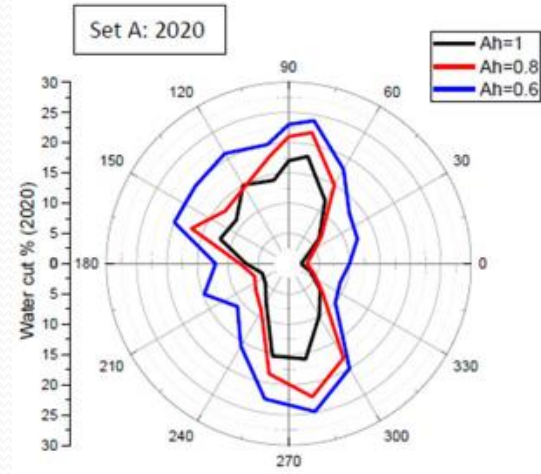
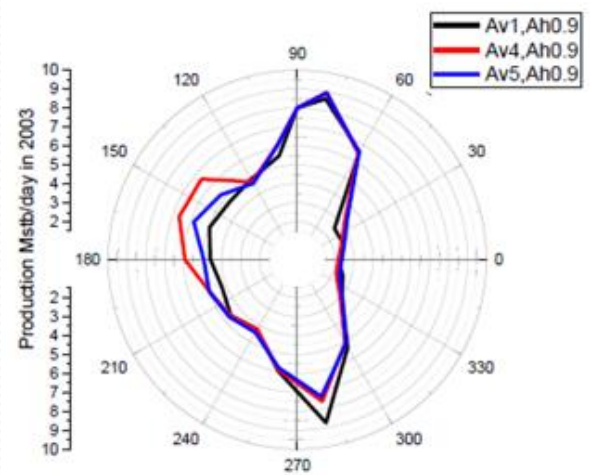
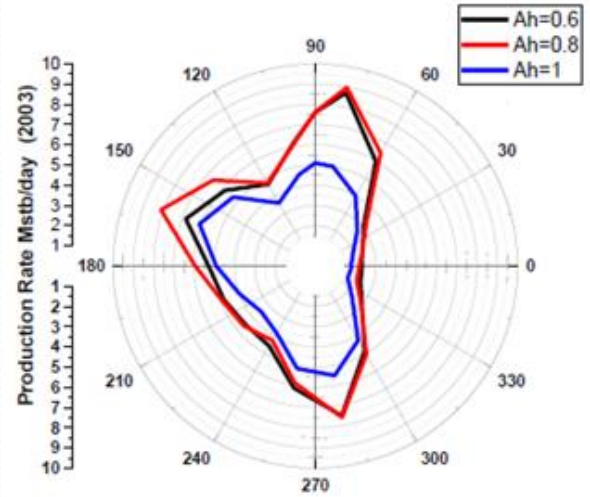
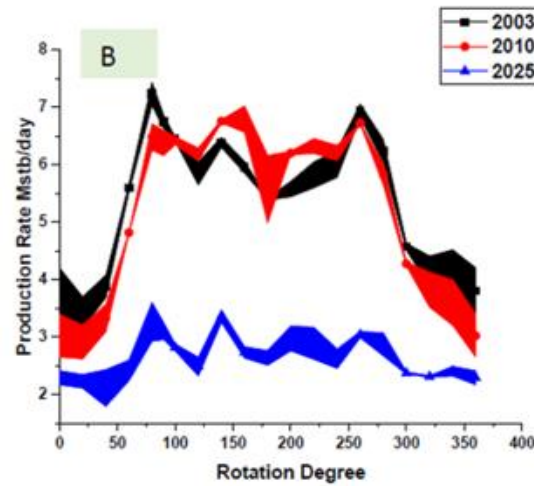
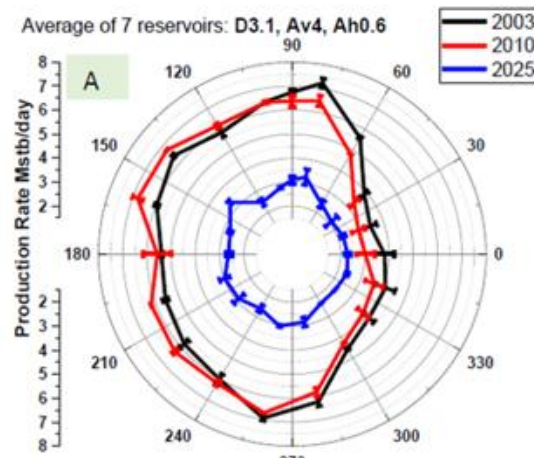
- Well numbers important but well placement not important for producer only scenarios (irrespective of reservoir type or fractal dimension)
- AOPR increases significantly by adding injector wells (irrespective of reservoir type or fractal dimension)
- AOPR benefits from placing both producers and injectors in high permeability zones
- Time to water break-through not consistently related to a particular well placement but is affected by heterogeneity

# Well Orientation and Anisotropy

- **AFRMs created with different heterogeneities and anisotropies**
- Define simple injector-producer well pattern
- **Rotate well pattern with respect to AFRM**
- Simulate major reservoir production parameters at each orientation



# Well orientation and anisotropy



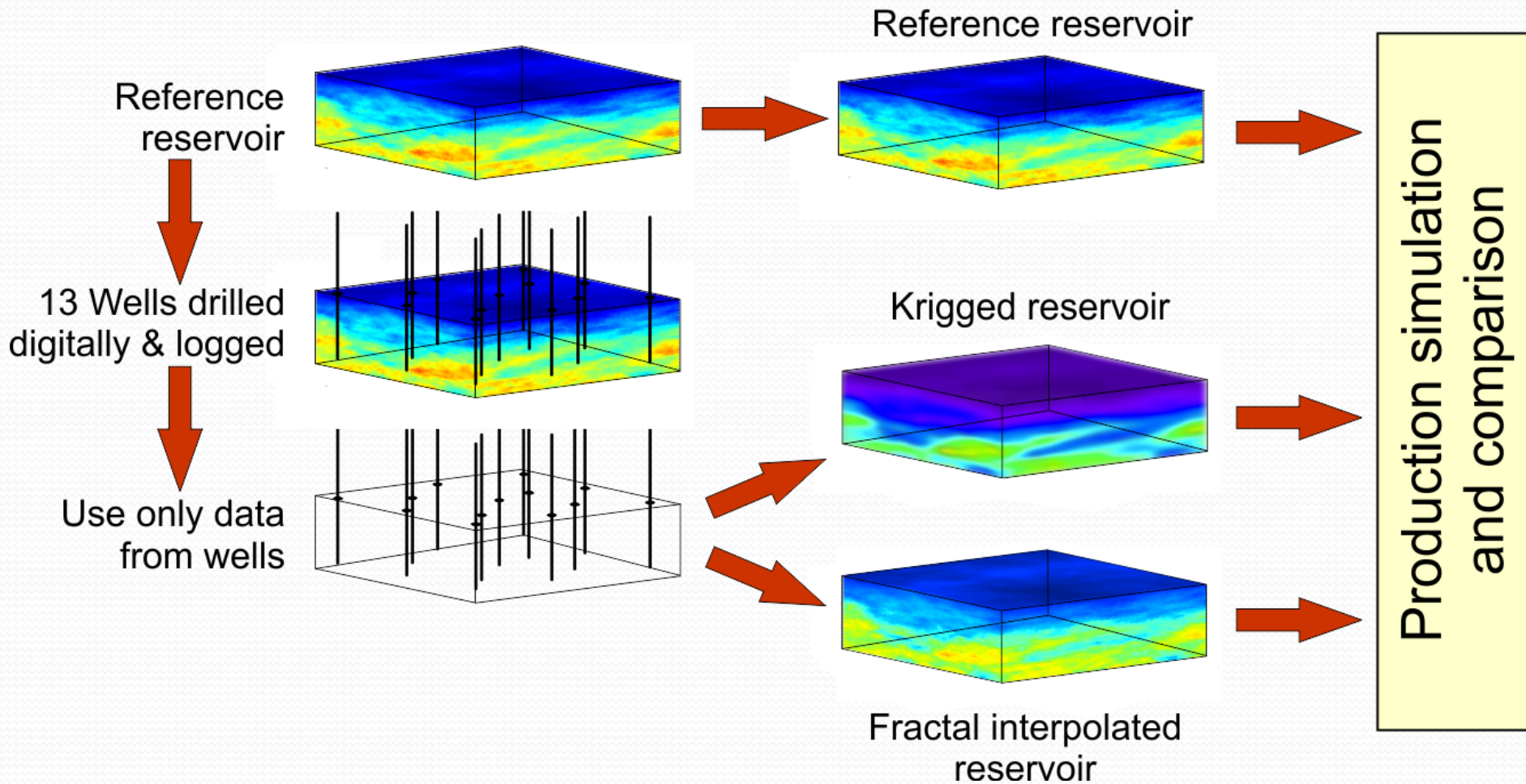
Production rate initially higher in anisotropic direction, becoming isotropic by late production

# Conditioning to real reservoirs

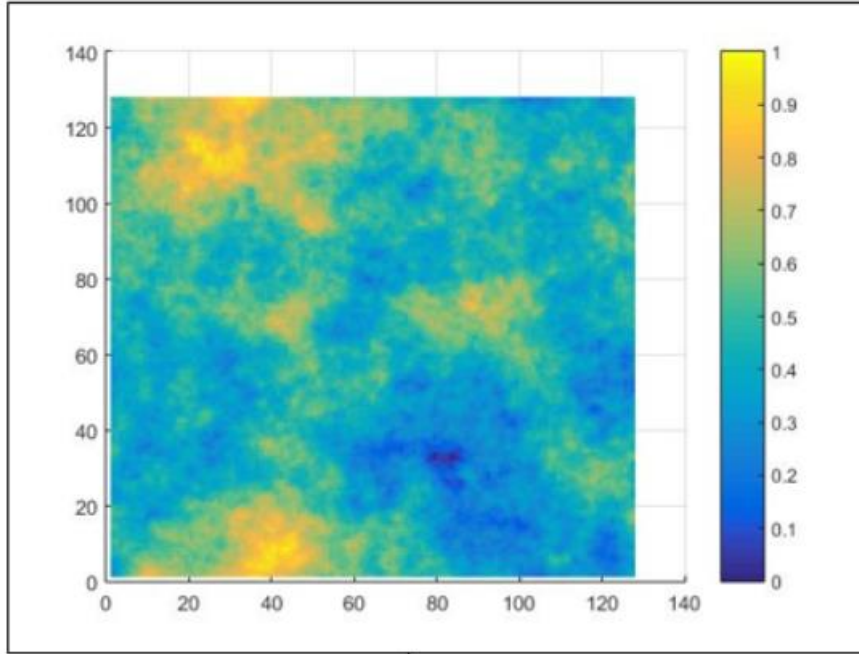
How can AFRMs be used to represent real reservoirs?

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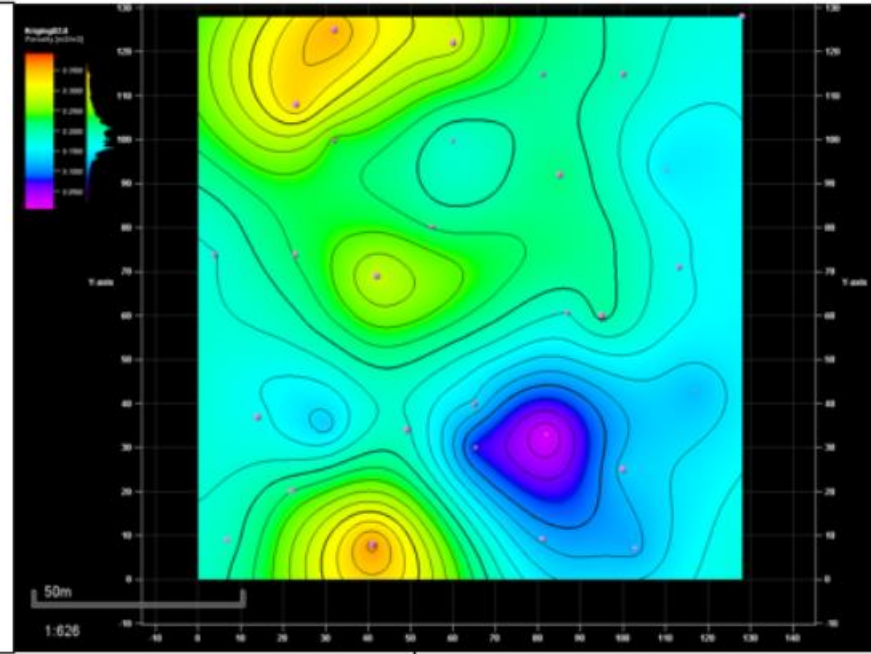
# Conditioning to real reservoirs



The fractal interpolation method allows data to be retained at all scales.



Fractal interpolation

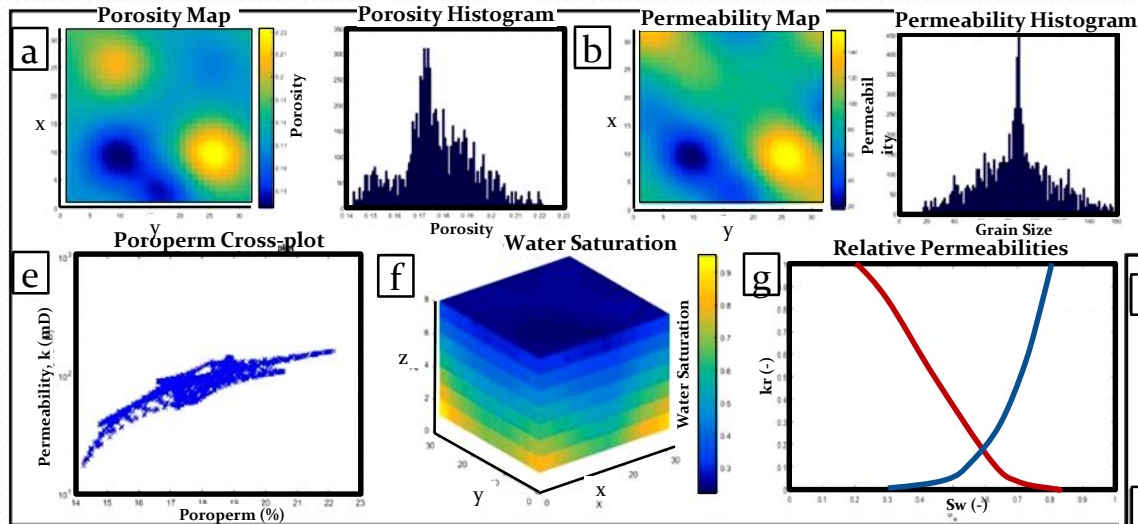


Krigged interpolation

The fractal interpolation is not identical to the gold standard reference  
But it contains information over the whole range of frequencies, whereas the  
conventional interpolation contains only long wavelength information.

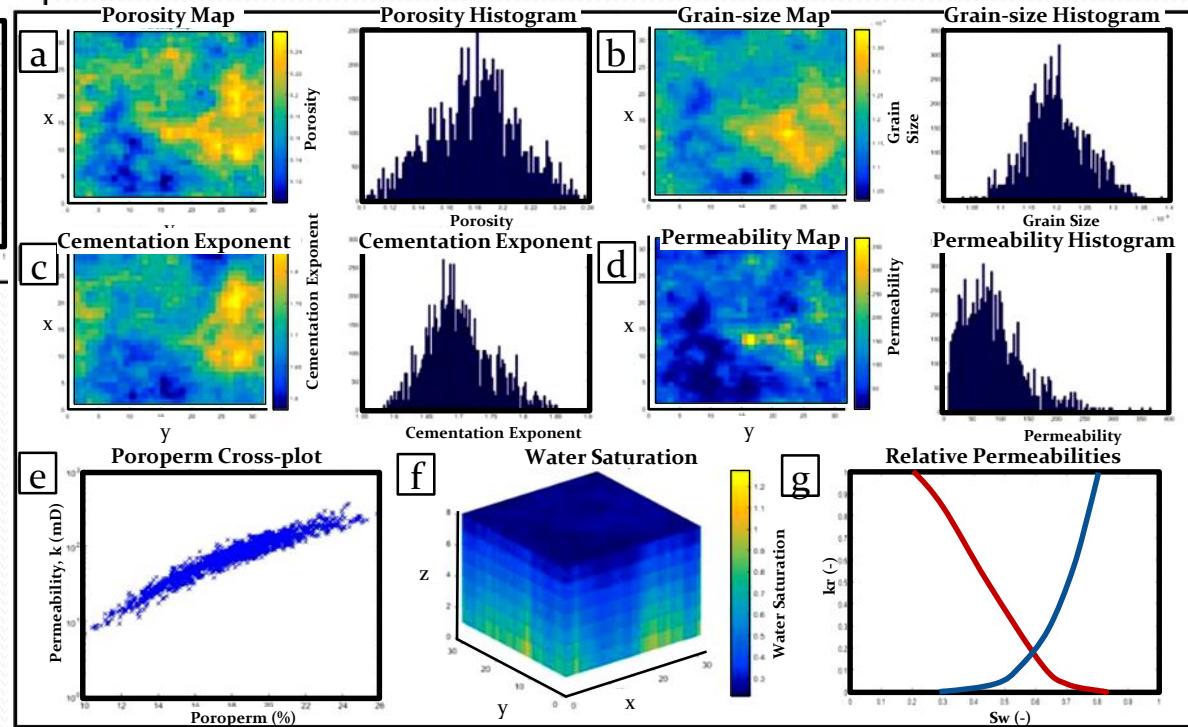


# Fractal interpolation and scale conservation



← **Conventional interpolation** Emphasises highs and lows with information lost in the mid-range.

- High frequency information lost.  $D = 2.6$



→ **Fractal interpolation** Depth of information in the mid-range retained but not at the expense of the highs and lows.

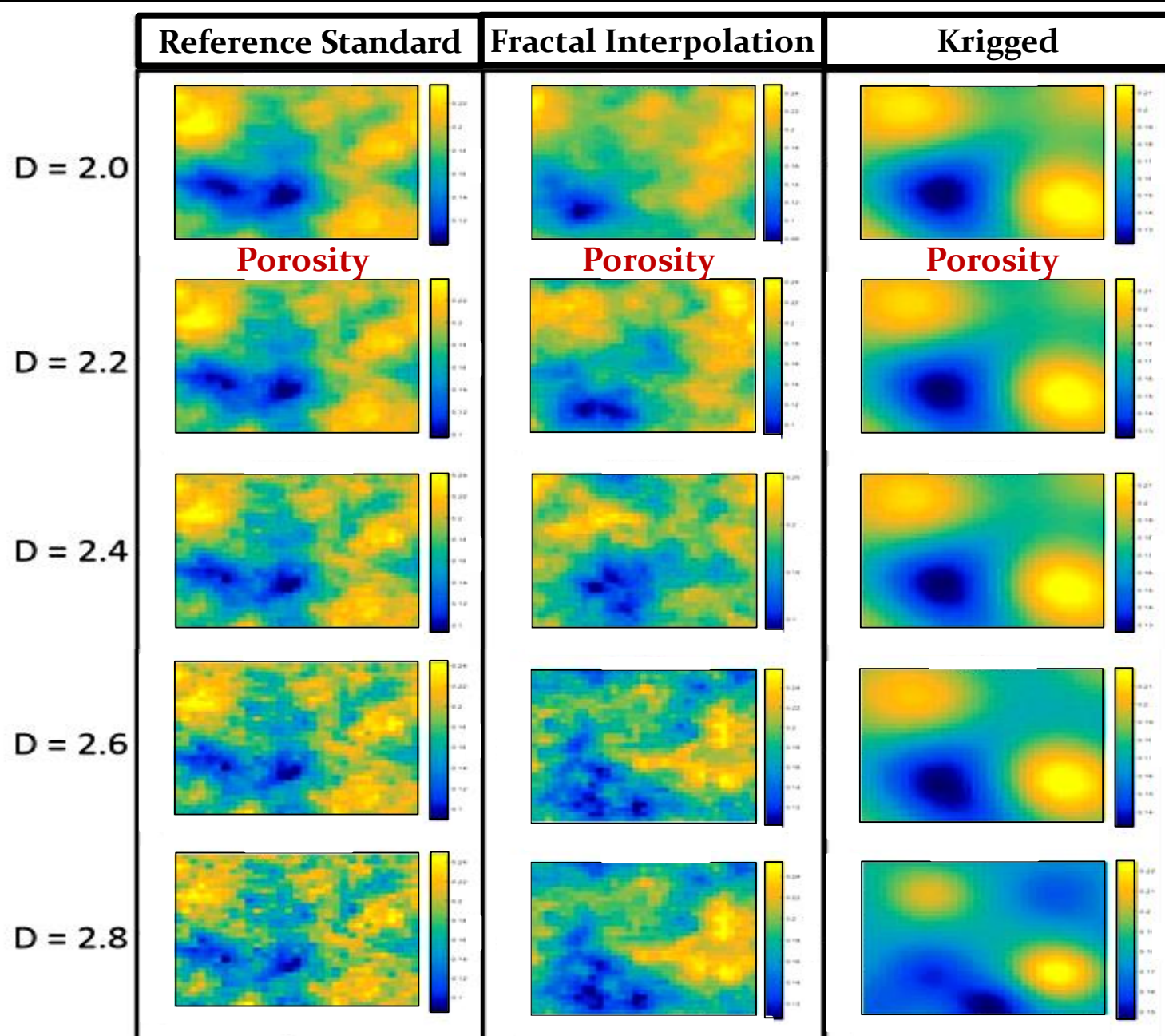
- Contains information at all frequencies.
- Poroperms are more realistic.

# Fractal Interpolation

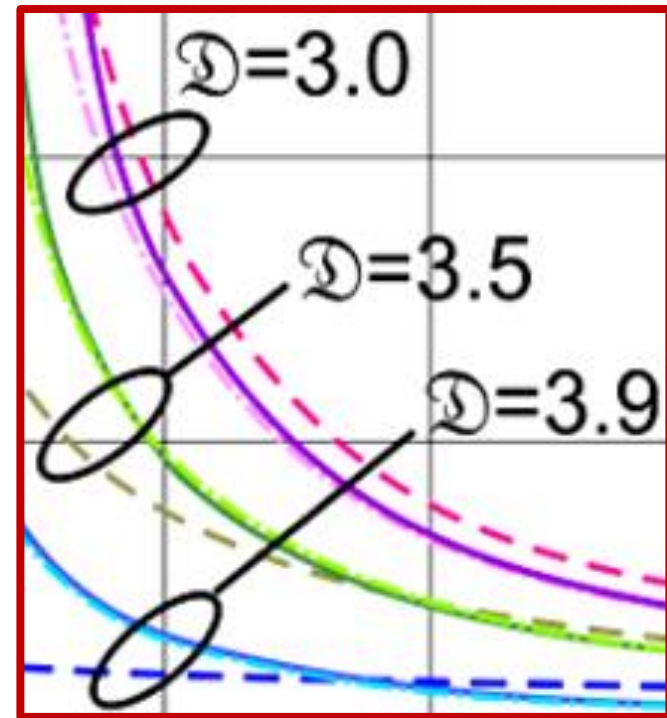
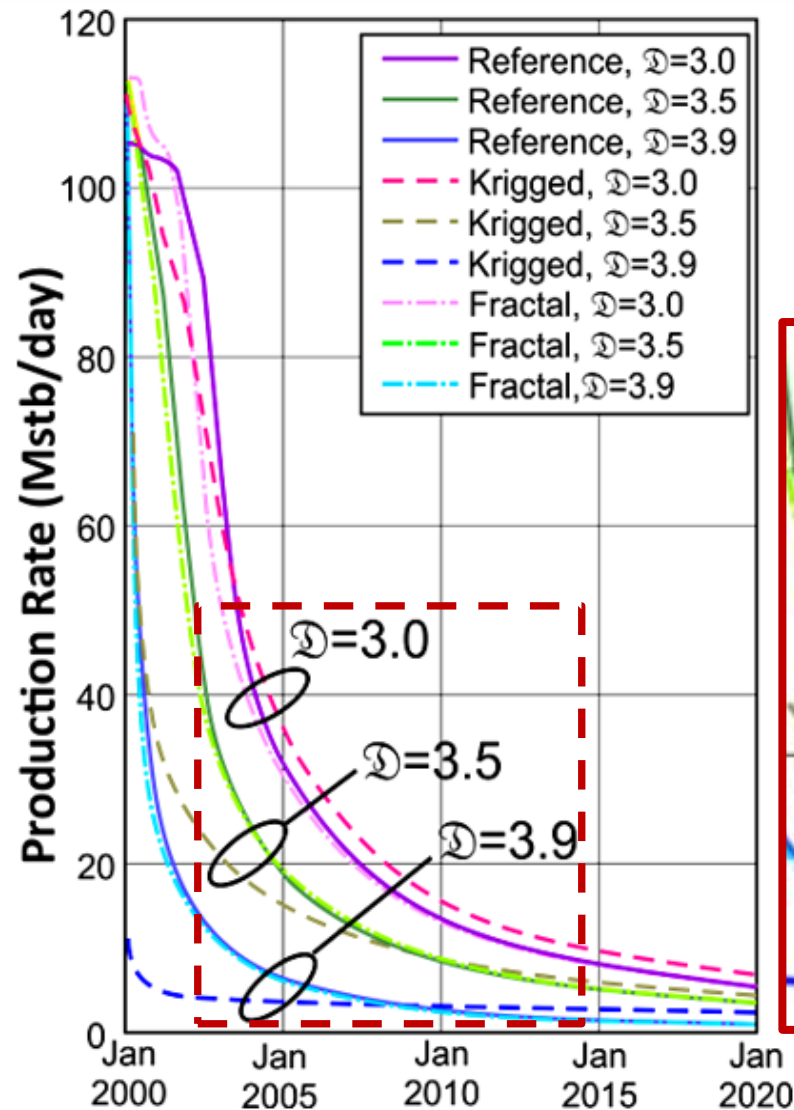
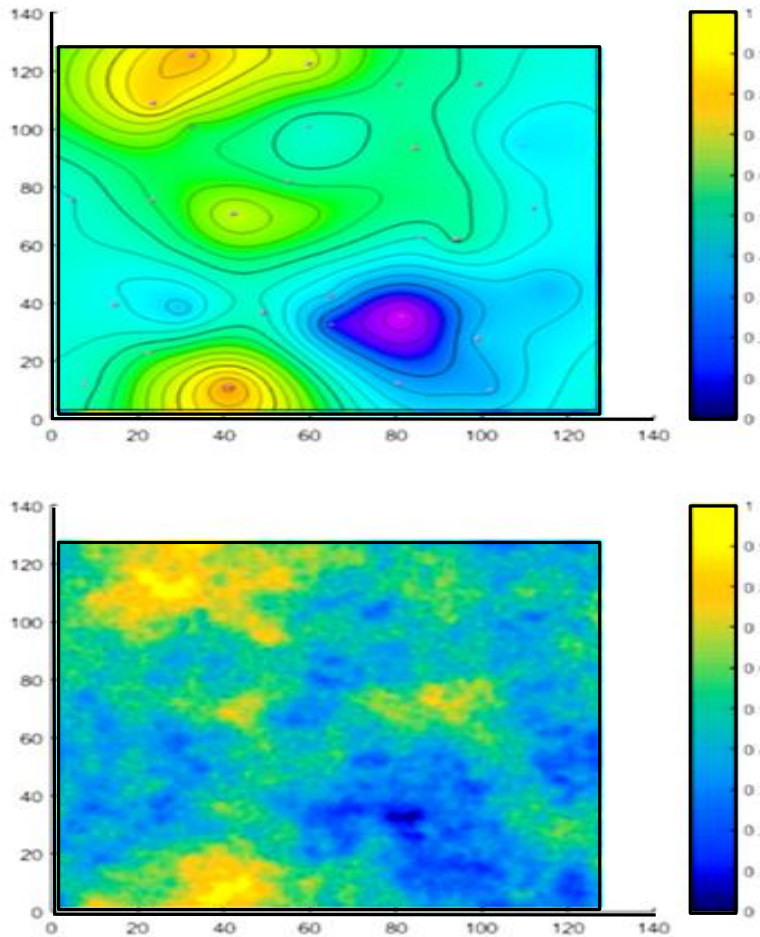
The **FRACTAL INTERPOLATION** mimics the reference model very well. It contains information over all wavelength scales.

The conventional **KRIGGED INTERPOLATION** contains only long wavelength information

Consequently, production data is simulated from a fractal model of the reservoir



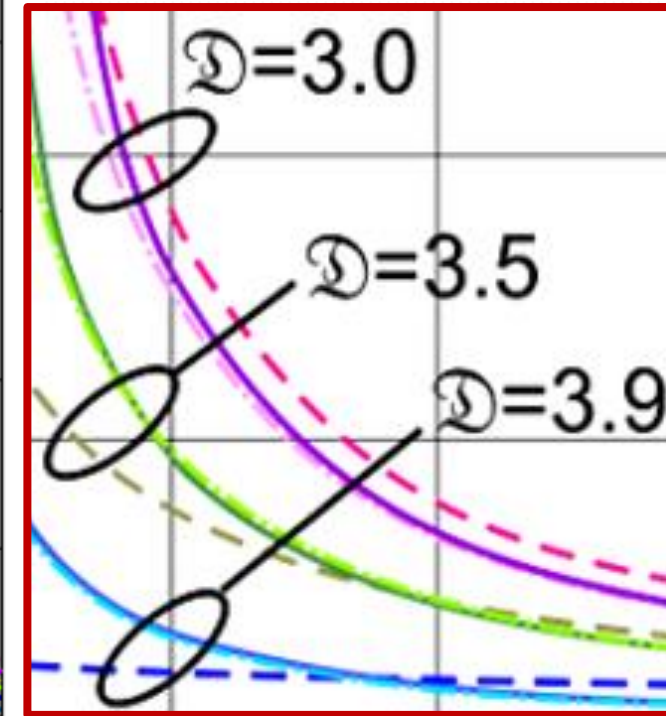
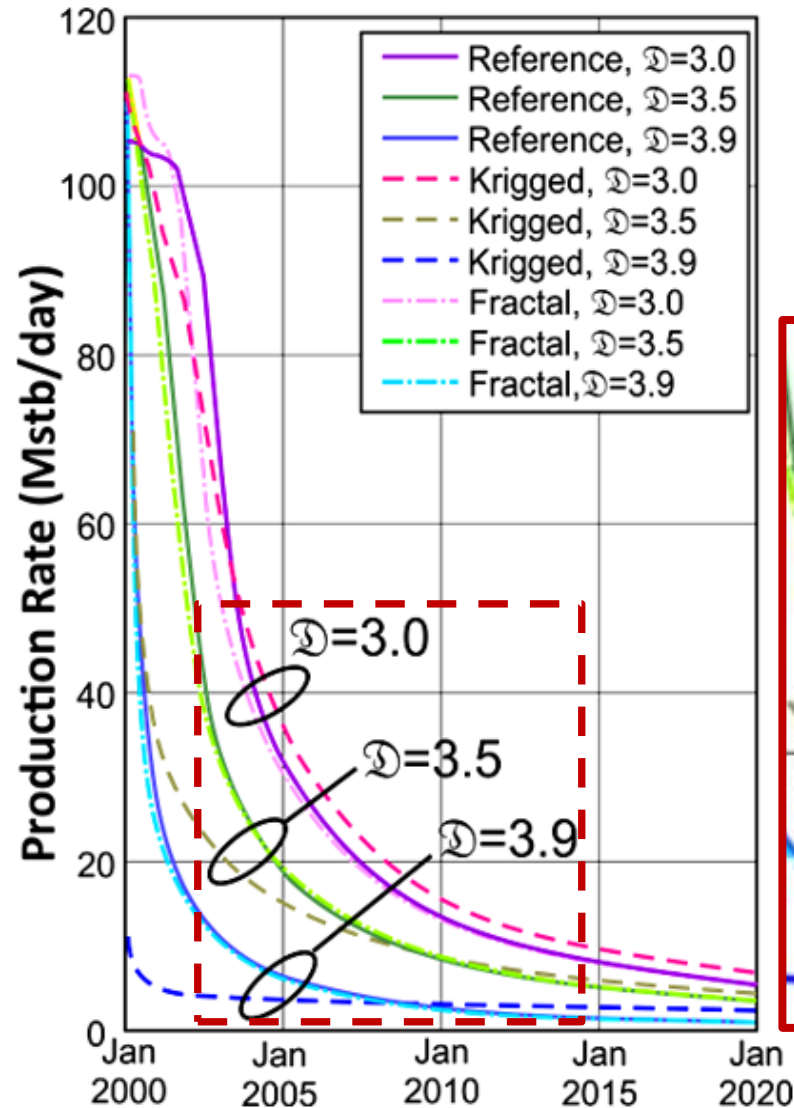
# Fractal interpolation versus kriging



# Fractal interpolation versus kriging

**Homogeneous Reservoir ( $D=3.0$ )** – Both krigged and fractal interpolations match the reference well.

**Heterogeneous Reservoirs ( $D=3.5$  and  $3.9$ )** – Krigged interpolations badly underestimate production rates, while fractal interpolation matches the gold standard reference well.



# The Future

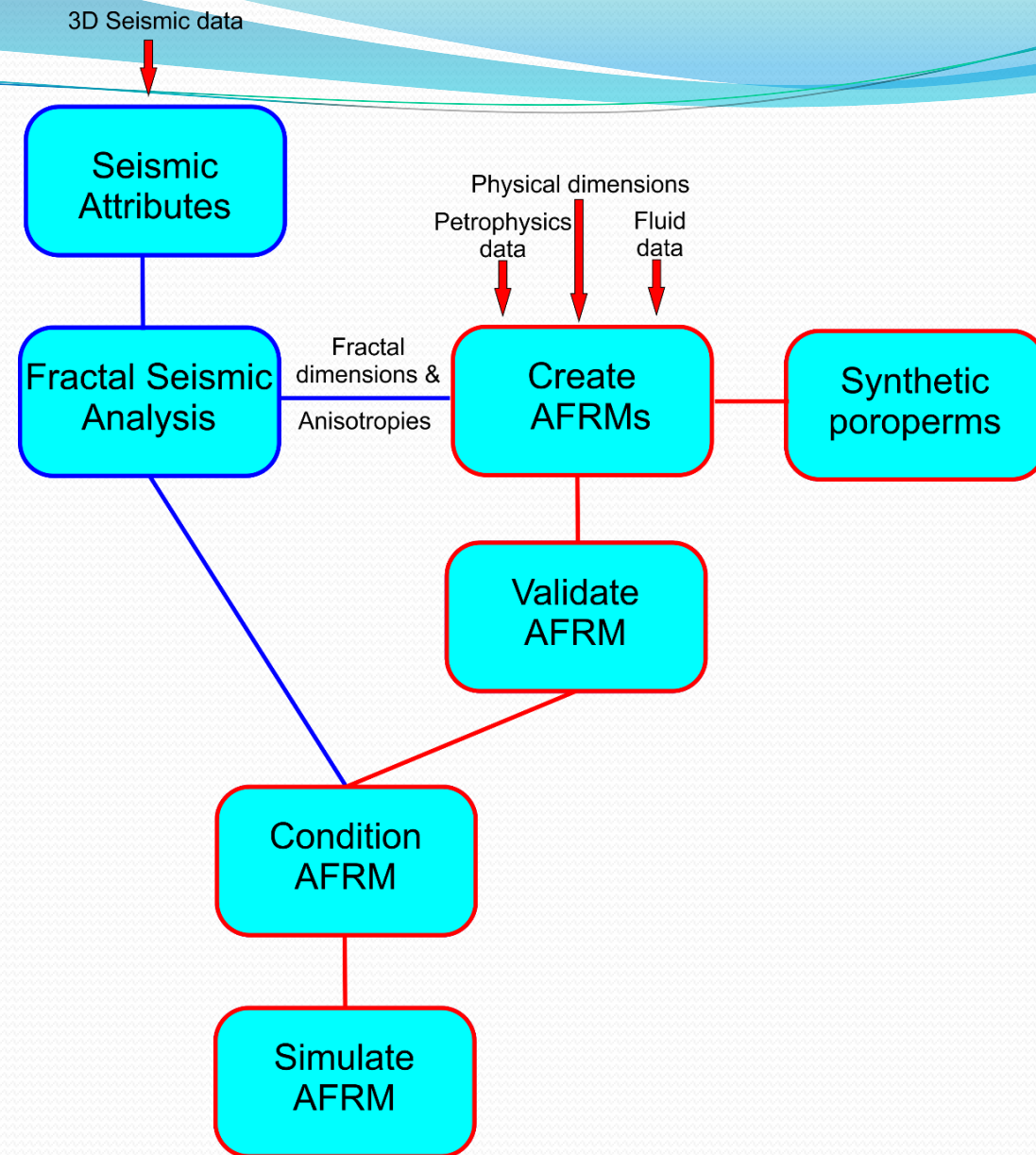
...Putting it all together.

# The AFRM advantage

- ❖ AFRMs can depict and control heterogeneity
- ❖ AFRMs can depict and control  $xy$ ,  $yz$  and  $zx$  anisotropy
- ❖ AFRM accuracy can be verified
- ❖ AFRM allows generic sensitivity tests for heterogeneity, anisotropy, well placement and orientation
- ❖ AFRM is more accurate than conventional models in simulations
- ❖ AFRM contains information at all scales larger than cell size
- ❖ **AFRMs can be fully reservoir-conditioned**

## To do:

- ❖ Create methods for deriving fractal dimensions and anisotropies from seismic attribute data
- ❖ Synthesise all methodologies and code into a professional UOI
- ❖ Run a number of case study scenarios in clastic, carbonate and unconventional reservoirs



# Final Message

AFRMs are a powerful new approach to creating realistic 3D geological models of reservoirs for simulation...

... giving insight into how heterogeneity and anisotropy affect reservoir production at all scales and capable of being conditioned to represent real reservoirs.



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