

# History Matching Channelized Reservoirs Using the Ensemble Kalman Filter

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## Outline

- Estimating facies using EnKF and distance functions
- Example 1
- Example 2
- Summary



# Distance functions

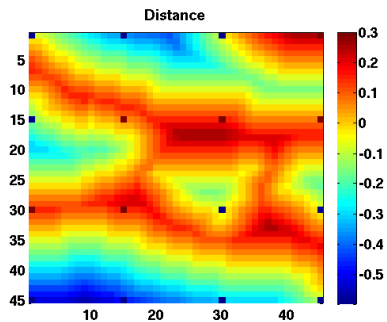
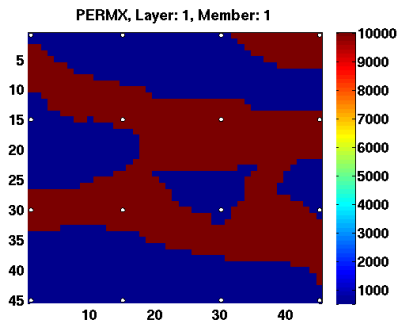
EnKF is applied to signed distances, defined by the shortest distance between a given position and the boundary separating facies types.

Motivated by the work by Moreno et al. [1].

Given an initial level set function,  $\phi_0$ , distances are calculated by evolving the following PDE to steady state (reinitialization equation):

$$\phi_t + \text{sign}(\phi_0)(\|\nabla\phi\| - 1) = 0.$$

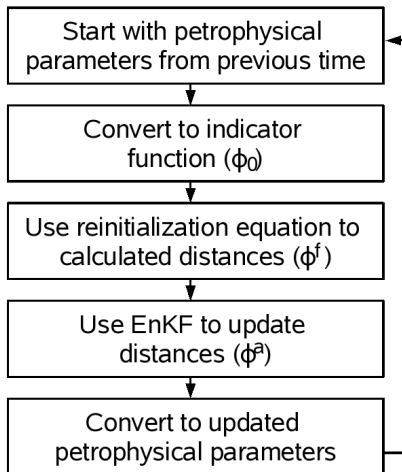
# Distance field



# Features

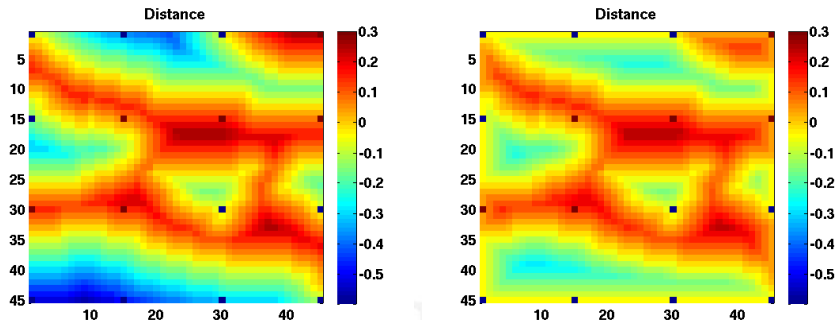
- The initial ensemble can be generated using any Geostatistical tool
- Possible to condition on facies types at well locations
- Conditioning is preserved by setting distances at well positions equal for all ensemble members
- Dynamic state variables are calculated after each assimilation step, by rerunning the simulator from time zero using the updated static parameters
- Distances recalculated after each assimilation step

# Update procedure



# Avoiding boundary effects

To avoid boundary effects, a frame of grid blocks with zero values have been added before (re)calculating the distances.



Left: Standard distances. Right: Distances with boundary treatment.

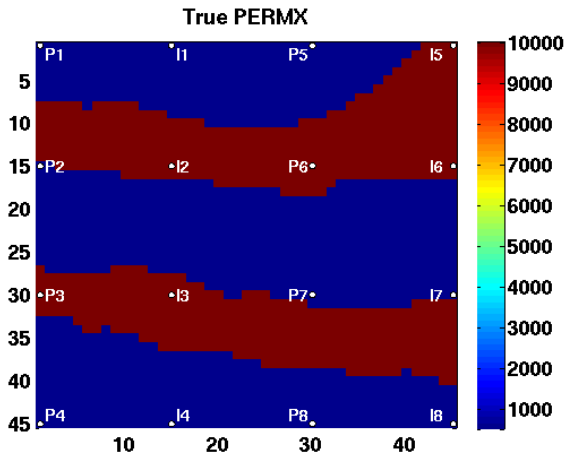
# Conditioning on statistical measures

To preserve the channel properties, we condition the models on the following measures (Soleng et al. [3]), computed from the initial ensemble:

- Mean value of area to volume ratio of bodies ( $\overline{A/V}$ )
- Maximal body extension in X-direction ( $\text{Max}(X)$ )
- Maximal body extension in Y-direction ( $\text{Max}(Y)$ )
- Mean volume of bodies ( $\overline{V}$ )
- Mean area of bodies ( $\overline{A}$ )
- p75 quartile for the extensions in the X-direction ( $\text{p75}(X)$ )
- Number of bodies ( $n$ )
- Global volume fraction ( $\mu$ )

# Example 1: reservoir overview

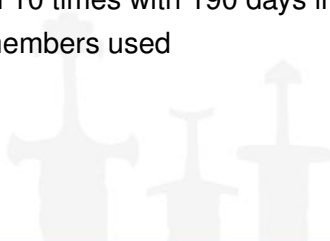
- Two dimensional channelized reservoir (Sarma and Chen [2])
- Initially saturated with oil (no gas)
- $45 \times 45$  gridblocks
- Eight water injectors and eight producers
- Steering strategy (true case):
  - water injection: 15.9 scm/day
  - target for pressure at producers: 400 bar



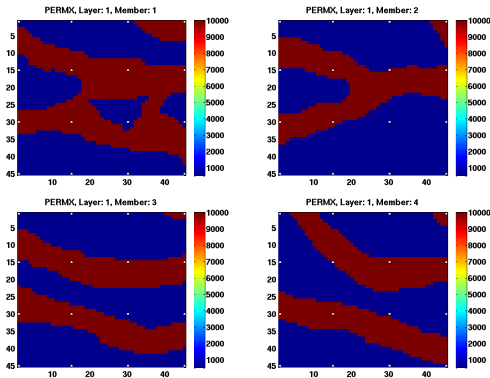
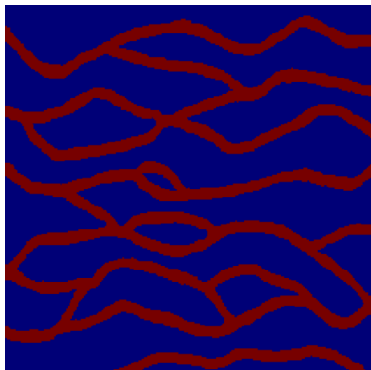
True field ( $K = 500 / 10000$  mD,  $\Phi = 0.1$ ).

# Assimilation overview

- Wells are controlled by reservoir volume rate
- Measurements are flow rates at producers ( $\sigma^2 = 0.16$ )
- Data assimilated 10 times with 190 days interval
- 100 ensemble members used



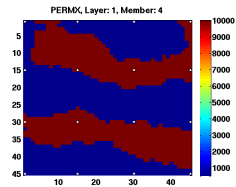
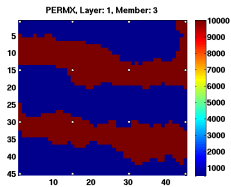
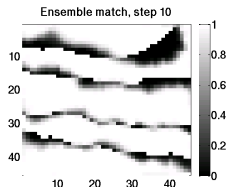
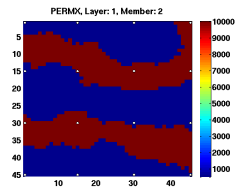
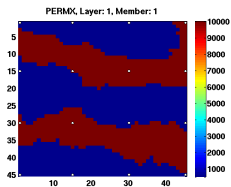
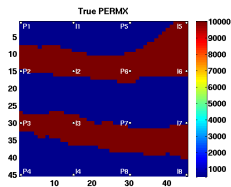
# Initial ensemble using SNESIM



Left: Training image ( $250 \times 250$  gridblocks).

Right: Four (first) initial members conditioned at well locations.

# Final fields

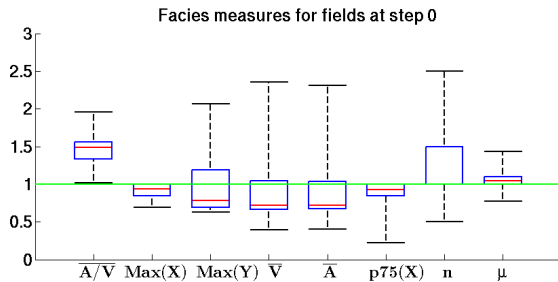


True field (top)

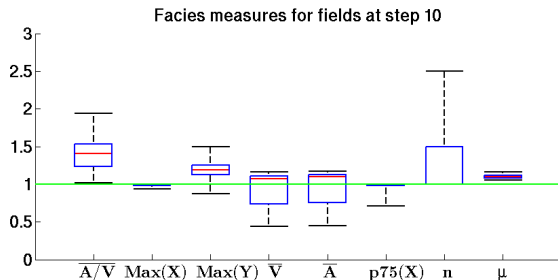
Ensemble match (bottom)

Four (first) final members

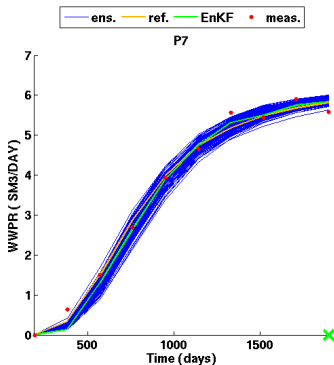
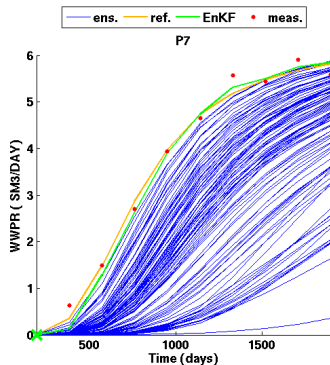
Initial



Final



# Forecasts of water rate at well P7



Forecasts from time zero using initial parameters (left) and using estimated parameters at final time (right).

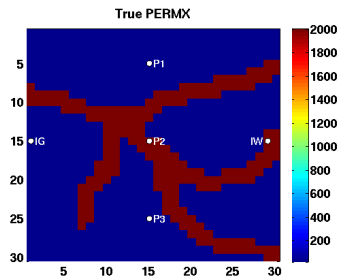
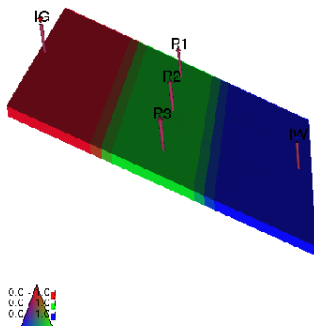
# Example 2: reservoir overview

- 2D tilted ( $30^\circ$ ) reservoir
- Filled with water, oil and **gas**
- $30 \times 30$  gridblocks
- True permeability is a complex channel structure (2 facies)
- Steering strategy (true case):
  - reinjection of gas
  - water injection: 6000 scm/day
  - target for oil production: 10000 scm/day
  - upper limit for gas production: 2000000 scm/day
  - “most offending” connection (well) shut down if the limit is violated

# Assimilation overview

- Wells are controlled by reservoir volume rate
- Measurements are flow rates at producers ( $\sigma = 5\%$ )
- Data assimilated 51 times with 30 days interval
- 100 ensemble members used

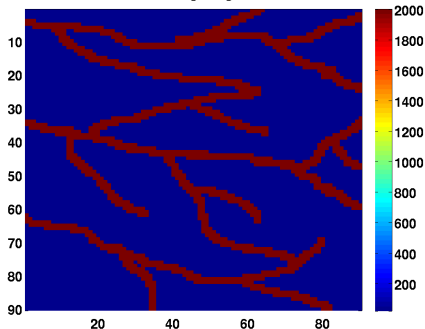




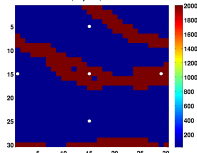
Left: Reservoir with initial saturations and well positions.  
 Right: True field ( $K = 20 / 2000$  mD,  $\Phi = 0.15 / 0.3$ ).

# Initial ensemble using SNESIM

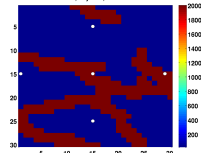
Training image



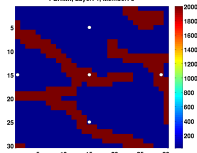
PERMX, Layer: 1, Member: 1



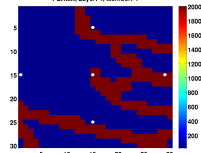
PERMX, Layer: 1, Member: 2



PERMX, Layer: 1, Member: 3



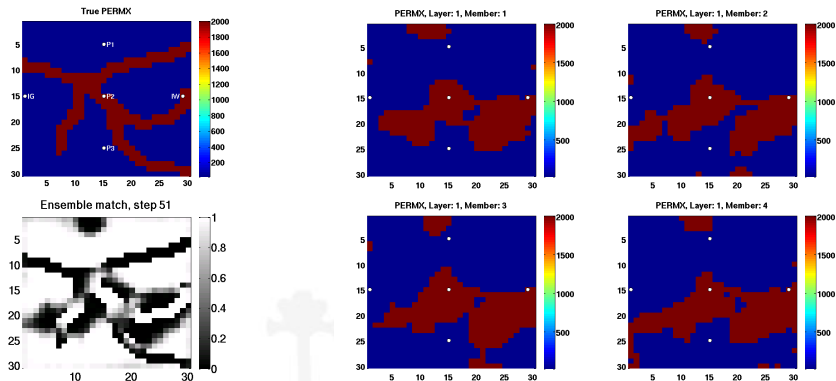
PERMX, Layer: 1, Member: 4



Left: Training image ( $90 \times 90$  gridblocks).

Right: Four (first) initial members conditioned at well locations.

# Final fields

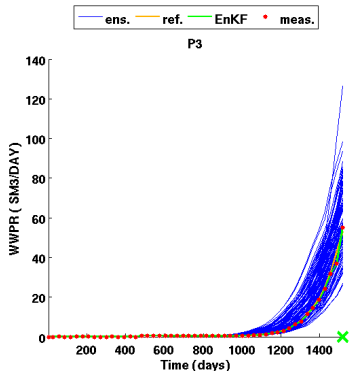
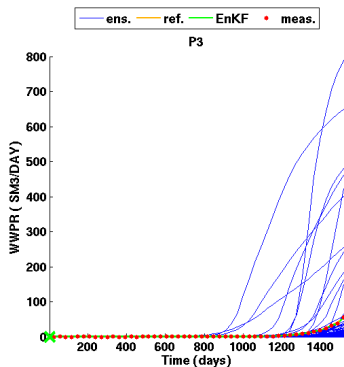


True field (top)

Ensemble match (bottom)

Four (first) final members

# Forecasts of water rate at well P3



Forecasts from time zero using initial parameters (left) and using estimated parameters at final time (right).

# Summary

- Use of EnKF for estimating facies fields introduced
- Updating distance functions
- Methodology tested on two examples
- Large history match improvements for both examples
- True permeability field recovered in Example 1
- Channels not completely recovered in Example 2

# Acknowledgments

- Reseach Council of Norway (PETROMAKS)
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  - ENI Norge AS
  - GdF Suez Norge AS
  - Total E&P Norge AS
- 
- Schlumberger (Eclipse)
  - Ian Mitchell (Level-Set toolbox)



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