

# Level set methods for simulating multiphase displacements on the pore scale

Johan Olav Helland

PhD Course Pore-Network Modelling 2015

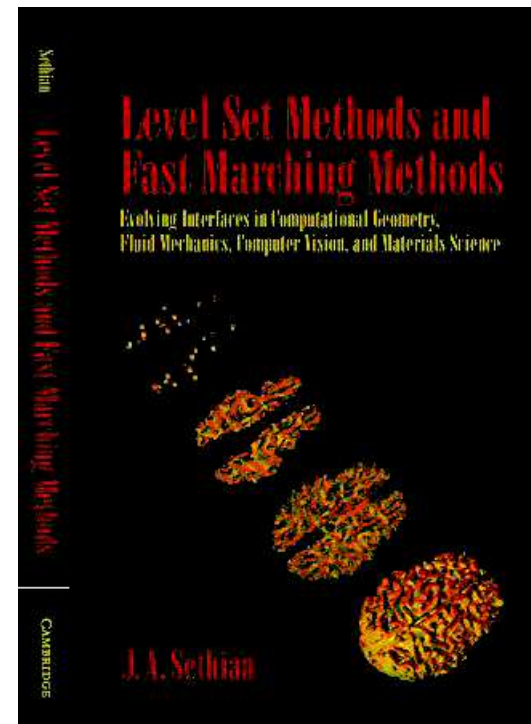
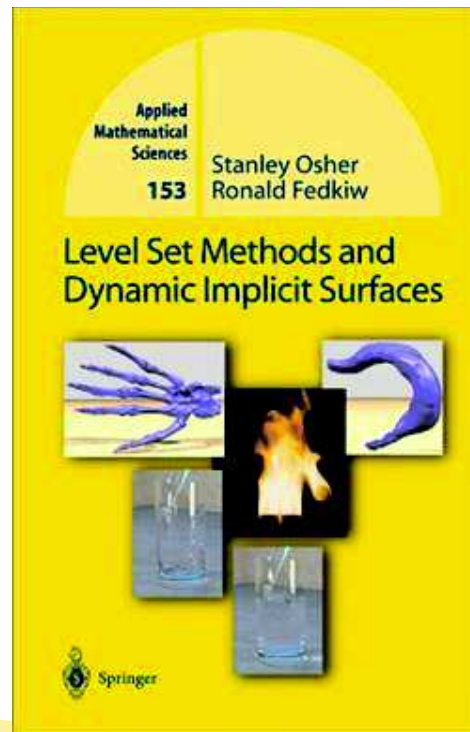


# Level Set Methods



## › Reference textbooks:

- Osher, S. and Fedkiw, R.: «Level set methods and dynamic implicit surfaces», Springer Verlag, 2003.
- Sethian, J.: «Level set methods and fast marching methods», Cambridge University Press, 1999.



# Level set method



- › A method to describe evolution of interfaces between fluids (or materials) that may change shape and topology (e.g., merge, split, deform)
- › Some applications:
  - Computational fluid dynamics
  - Fracture mechanics
  - Crystal growth, grain rearrangement
  - Visualization
  - Image analysis (e.g., for medical use)
    - Segmentation, Noise removal, Extraction of objects etc..

## Some interesting links...



- › Ron Fedkiw: <http://physbam.stanford.edu/~fedkiw/>
  - 2 times Oscar winner for developing techniques for better visual effects in movies (Harry Potter, Star Wars, Terminator, Pirates of the Caribbean, etc...), Examples: simulation of hair, water splash, fire, wind, cloth, destruction etc...
  
- › James Sethian: <https://math.berkeley.edu/~sethian/>
  - Award-winning soap bubble animation using VIIM (Saye & Sethian JCP 2012, Science 2013):  
<http://crd.lbl.gov/news-and-publications/news/2013/math-of-popping-bubbles-in-a-foam/>

# Contents



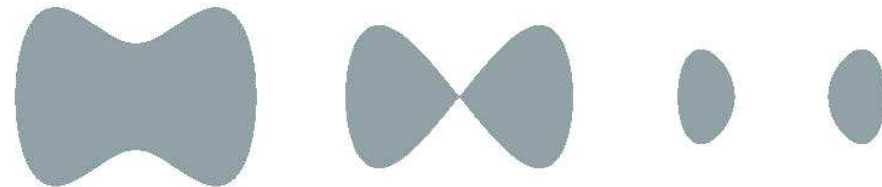
- › Level set methods and related techniques
  - Reinitialization (Sussman et al., JCP 1994, Peng et al., 1999)
  - Extension velocities (Peng et al., 1999; Adalsteinsson and Sethian, 1999)
  
- › Application example within «Digital Rock Physics» :
  - Level set methods for simulating capillary-controlled multiphase displacements on the pore scale:
    - Capillary pressure
    - Hysteresis
    - Trapping and remobilization

# Level Set Methods

- › An interface tracking method where the interface is given as the zero contour of an implicit function  $\phi: \phi(\vec{x}, t) = 0$
- › The LS function  $\phi$  is one dimension higher than the interface.
- › Regions inside/outside of the interface are defined through the sign of  $\phi$ :

$$\Omega^+ = \{\vec{x}: \phi(\vec{x}, t) > 0\}$$

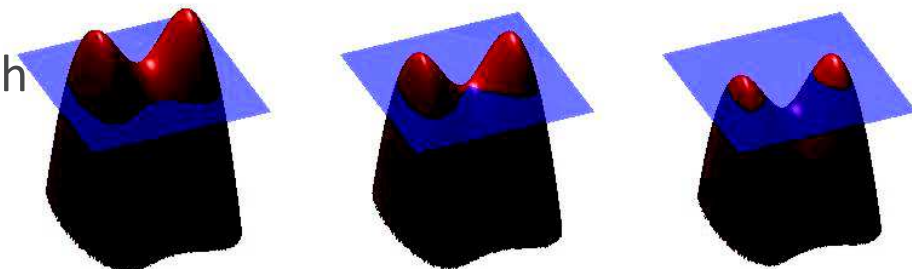
$$\Omega^- = \{\vec{x}: \phi(\vec{x}, t) < 0\}$$



- › Normally  $\phi$  is given by the signed distance function (SDF):

$$\phi(\vec{x}, t) = \pm|\vec{x} - \vec{x}_0|, \text{ where } \vec{x}_0 \text{ is located on the interface.}$$

- › SDF has the property  $|\nabla\phi| = 1$  which ensures numerical stability.



(from Wikipedia)<sub>6</sub>

# Level Set Method (LSM)

(Sethian & Osher, 1988)



› Interfaces are described by  $\phi(\vec{x}(t), t) = 0$ :

$$\Rightarrow \phi_t + \nabla\phi \cdot \frac{d\vec{x}}{dt} = 0, \vec{V} = \frac{d\vec{x}}{dt} \text{ (velocity).}$$

Assume  $\vec{V} = V_n \vec{N} + V_T \vec{T}$ ,  $\vec{T}$  = tangential vector.

$$\vec{N} \cdot \nabla\phi = |\nabla\phi| \text{ and } \vec{T} \cdot \nabla\phi = 0.$$

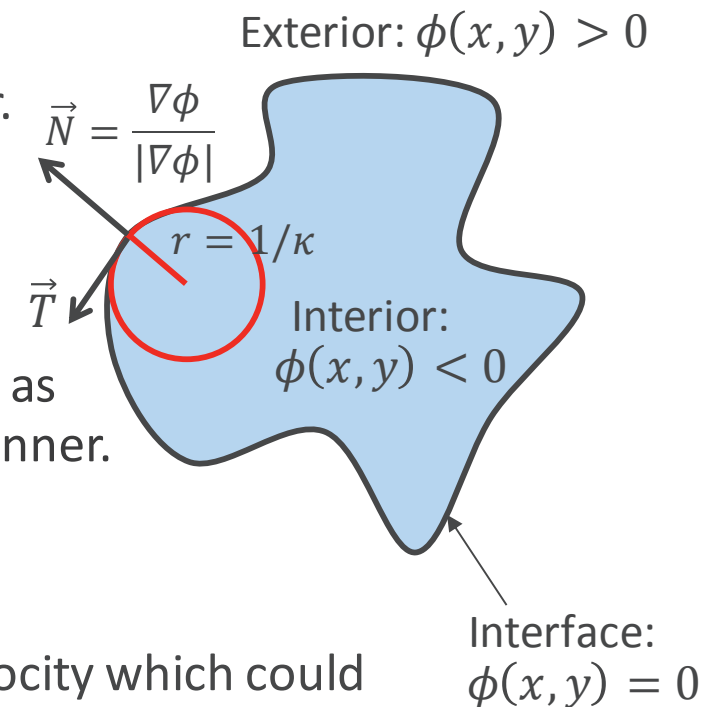
$$\Rightarrow \phi_t + V_N |\nabla\phi| = 0$$

› The method handles topological changes, such as interface merging and splitting, in a natural manner.

› Surface normal  $\vec{N}$  and curvature  $\kappa = \nabla \cdot \vec{N}$  are directly related to  $\phi$

› The surface evolves by specifying a surface velocity which could include a normal and advective component:

$$\phi_t + V_N |\nabla\phi| + \vec{V}_{adv} \cdot \nabla\phi = 0$$

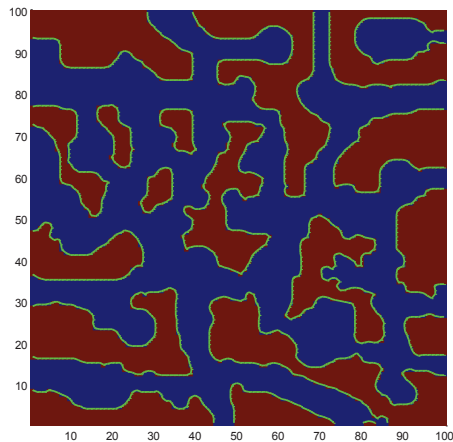


# Reinitialization

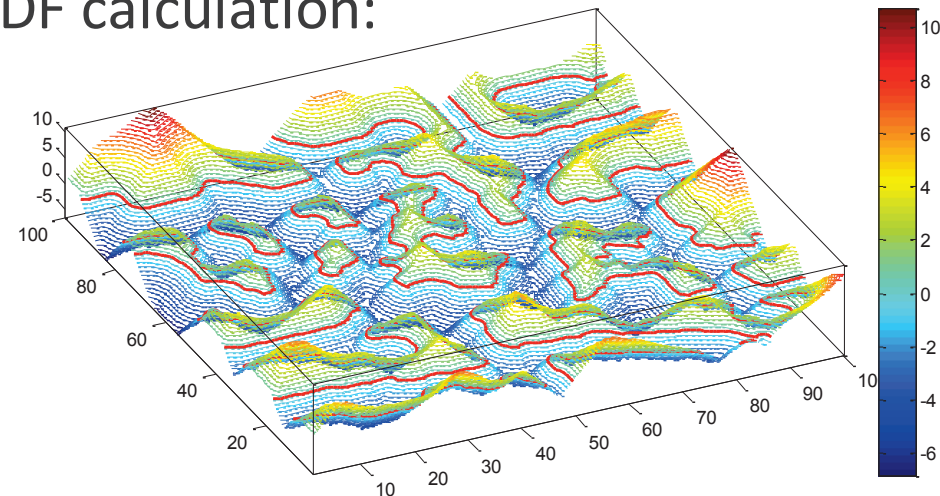


- › During iterations with the evolution equation, steep gradients  $\nabla\phi$  may develop and  $\phi$  will lose its SDF property ( $|\nabla\phi| = 1$ )
- › Therefore, to maintain numerical stability, the LS function  $\phi$  must be reinitialized to SDF occasionally. This is done by solving 
$$\phi_t + S(\phi)(|\nabla\phi| - 1) = 0, \quad S(\phi) = \text{sign function}$$

› An example of void/solid SDF calculation:



—  $\psi = 0$  (void/solid LS function)



—  $\psi = 0$

# Simulation Procedure



1. Initialize LS-function  $\phi$  to a signed distance function by solving:

$$\phi_t + S(\phi)(|\nabla\phi| - 1) = 0 \quad (*)$$

2. Iterate  $\phi$  forward in time with LS evolution equation

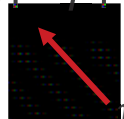
$$\phi_t + v_N |\nabla\phi| + \vec{v}_{adv} \cdot \nabla\phi = 0 \quad (**)$$

$\phi_t$ :



Time iteration with  
Runge-Kutta Methods  
(e.g., 3rd order)

$v_N |\nabla\phi|$ :



WENO & upwinding schemes.  
Central differences for curvature  
( $\kappa = \nabla\phi / |\nabla\phi|$ )

$\vec{v}_{adv} \cdot \nabla\phi$ :

WENO &  
advective upwinding scheme

WENO = Weighted Essentially Non-Oscillatory

[1st order RK: Forward Euler step:  $\phi^{n+1} = \phi^n - \Delta t(v_N^n |\nabla\phi^n| + \vec{v}_{adv}^n \cdot \nabla\phi^n)$  ]

3. Repeat from step 1.
4. Reinitialize  $\phi$  by solving (\*) after specified time iterations. Similar techniques are used for solving (\*) and (\*\*).

## Extension Velocity



- › WHAT: Velocity (given on the interface) extended (extrapolated) in the normal direction OFF the interface such that:

$$\nabla v_{ext} \cdot \nabla \phi = 0$$

- › WHY: Extension velocity provides a meaningful velocity for problems it is not known away from the interface regions
- › Advantages:
  - Extension velocity preserves  $\phi$  as an SDF ( $|\nabla \phi| = 1$ ), allowing less frequent reinitializations in numerical implementations
  - Allows for larger time steps (based on CFL conditions)
- › HOW: Construct extension velocity by solving PDE:

$$v_t + S(\phi) \vec{N} \cdot \nabla v = 0, \quad v = \text{velocity component}$$

$$\vec{N} = \frac{\nabla \phi}{|\nabla \phi|}$$

## Extension Velocity



› We shall show that, for an LS evolution equation,

$$\phi_t + v_N |\nabla \phi| + \vec{v}_{adv} \cdot \nabla \phi = 0, \quad \vec{v}_{adv} = (v_1, v_2, v_3),$$

we can construct extension velocities satisfying

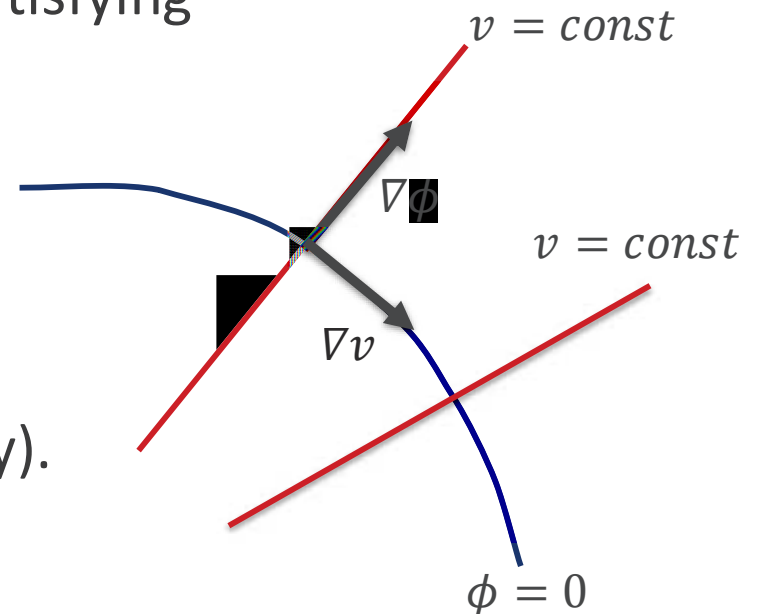
$$\nabla v_N \cdot \nabla \phi = 0$$

$$\nabla v_1 \cdot \nabla \phi = 0$$

$$\nabla v_2 \cdot \nabla \phi = 0$$

$$\nabla v_3 \cdot \nabla \phi = 0,$$

such that  $|\nabla \phi| = 1$  for all time (in theory).



## Extension Velocity (Proof)



1. Normal velocity,  $v_N$ :

$$\phi_t + v_N |\nabla \phi| = 0$$

$$\frac{d}{dt} |\nabla \phi|^2 = 2 \nabla \phi \frac{d}{dt} \nabla \phi$$

$$\Rightarrow \nabla \phi_t = -\nabla (v_n |\nabla \phi|)$$

$$= -2 \nabla \phi \cdot \nabla (v_n |\nabla \phi|)$$

$$= -2 \nabla \phi \cdot \nabla v_n |\nabla \phi| - 2 \nabla \phi \cdot v_n \nabla |\nabla \phi|$$

$$= 0. \quad \underbrace{\hspace{10em}}_{=0} \quad \underbrace{\hspace{10em}}_{=0}$$

2. Advective velocity components,  $v_i$ :  $\phi_t + v_1 \phi_x = 0$

$$\frac{d}{dt} |\nabla \phi|^2 = 2 \nabla \phi \frac{d}{dt} \nabla \phi$$

$$\Rightarrow \nabla \phi_t = -\nabla (v_1 \phi_x)$$

$$= -2 \nabla \phi \cdot \nabla (v_1 \phi_x)$$

$$= -2 \underbrace{(\nabla \phi \cdot \nabla v_1)}_{=0} \phi_x - 2 v_1 \underbrace{\nabla \phi \cdot \nabla \phi_x}_{=0}$$

$$= 0. \quad \underbrace{\hspace{10em}}_{=0} \quad = \frac{1}{2} \frac{\partial}{\partial x} |\nabla \phi|^2 = 0$$

› Similar for y- and z-components.

## Extension Velocity



› Simulation procedure:

1. Construct extension velocities by solving

$$v_t + S(\phi)\vec{N} \cdot \nabla v = 0, \quad \text{for each velocity component } v.$$

2. Iterate  $\phi$  one time step forward with LS evolution equation

$$\phi_t + v_N |\nabla \phi| + \vec{v}_{adv} \cdot \nabla \phi = 0,$$

using extension velocities from step 1.

3. Repeat from step 1.

4. Perform reinitialization periodically.

# Applications - Objective



› Develop pore-scale models for simulating capillary-controlled motion of two & three fluids directly on 3D rock geometries

› At equilibrium:

- Young-Laplace equation satisfied in pore space:

$$P_{cij} = \sigma_{ij} C_{ij}, \quad ij = go, ow, gw.$$

- Young's equation satisfied on pore walls:

$$\sigma_{ij} \cos \theta_{ij} = \sigma_{is} - \sigma_{js}, \quad ij = go, ow, gw.$$

This yields a constraint on  $\sigma_{ij}$  and  $\theta_{ij}$ :

$$\sigma_{gw} \cos \theta_{gw} = \sigma_{go} \cos \theta_{go} + \sigma_{ow} \cos \theta_{ow} \quad (\text{Bartell-Osterhof Eq.}).$$

$C_{ij}$  = Interface curvature

$\sigma_{ij}$  = Interfacial tension

$\theta_{ij}$  = Contact angle

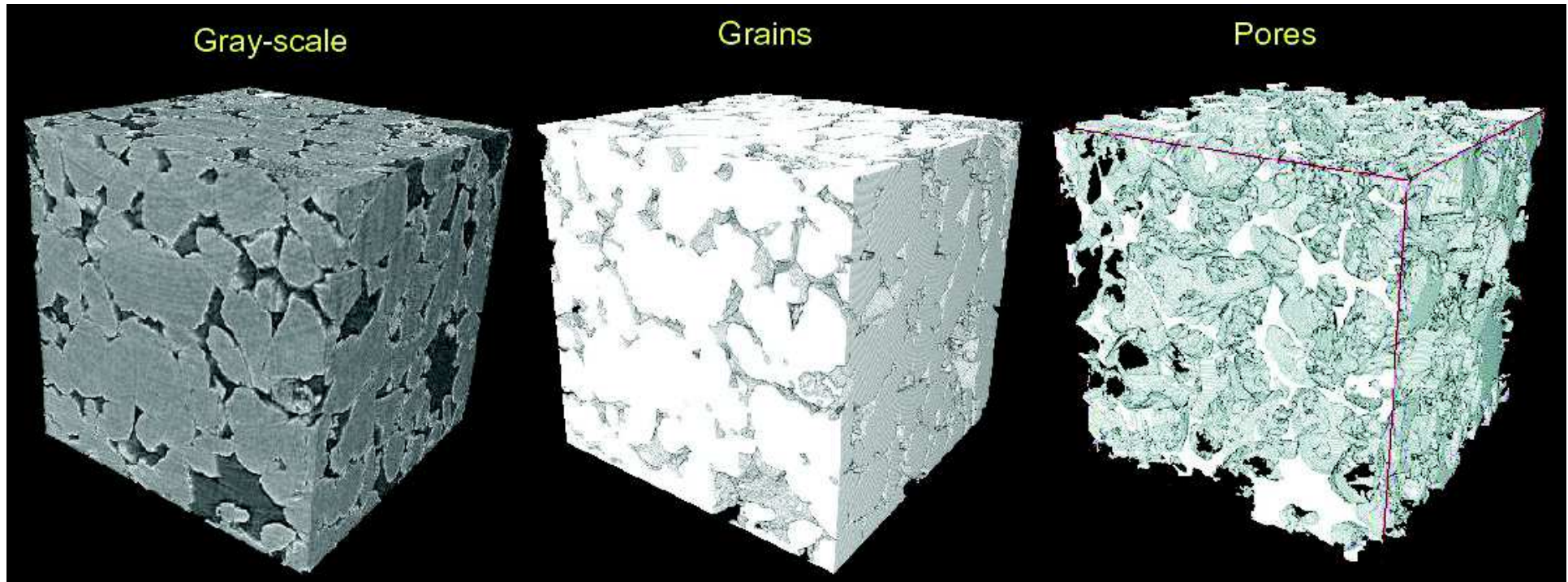
› Two fluids: Level set method

› Three fluids: Variational (or Multiple) level set method

# Rock imaging: Micro-CT at LBNL



› Reconstructed and segmented Bentheim sandstone sample



- Size of subset: 750x750x750 voxels

- Resolution 4.5 microns

- Total sample size 5x5x5 mm<sup>3</sup>

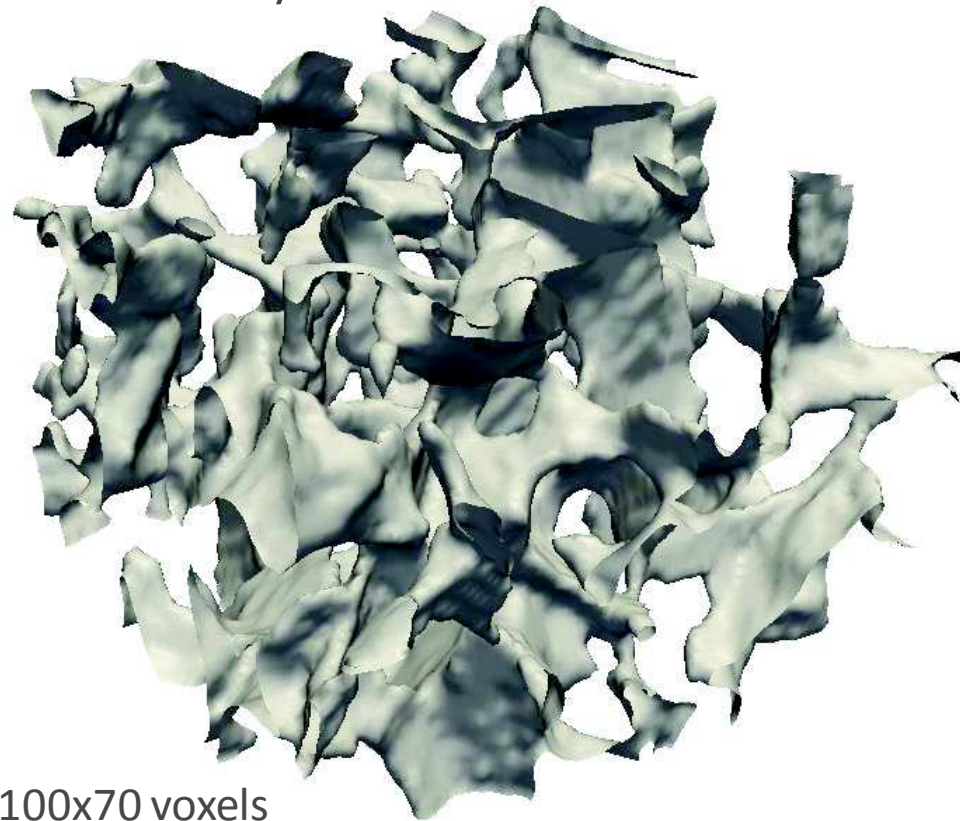




# 3D Simulation: Castlegate Sandstone



- Void-solid surface described by  $\psi = 0$ :



- Porosity 20.6 %
- Voxel size 5.6  $\mu\text{m}$
- Small subset 100x100x70 voxels

Data set available on the internet (Network Generation Comparison Forum):

[http://xct.anu.edu.au/network\\_comparison/](http://xct.anu.edu.au/network_comparison/)

# Castlegate Sandstone

$$C = 0.30$$

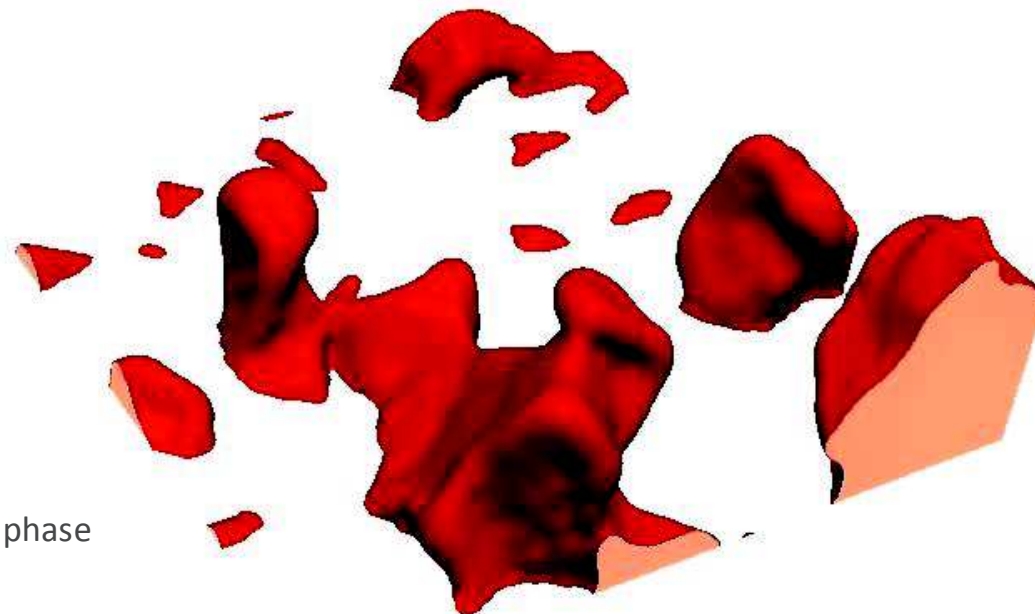


— = Non-wetting phase  
( $\phi_{nw} < 0$ )

# Castlegate Sandstone



$$C = 0.50$$

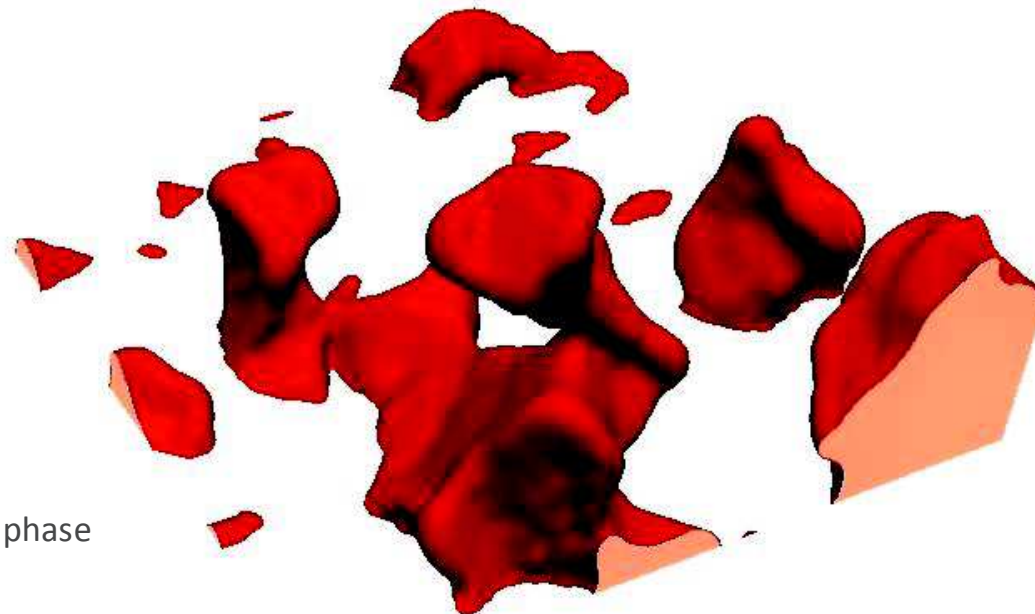


 = Non-wetting phase

# Castlegate Sandstone



$$C = 0.60$$

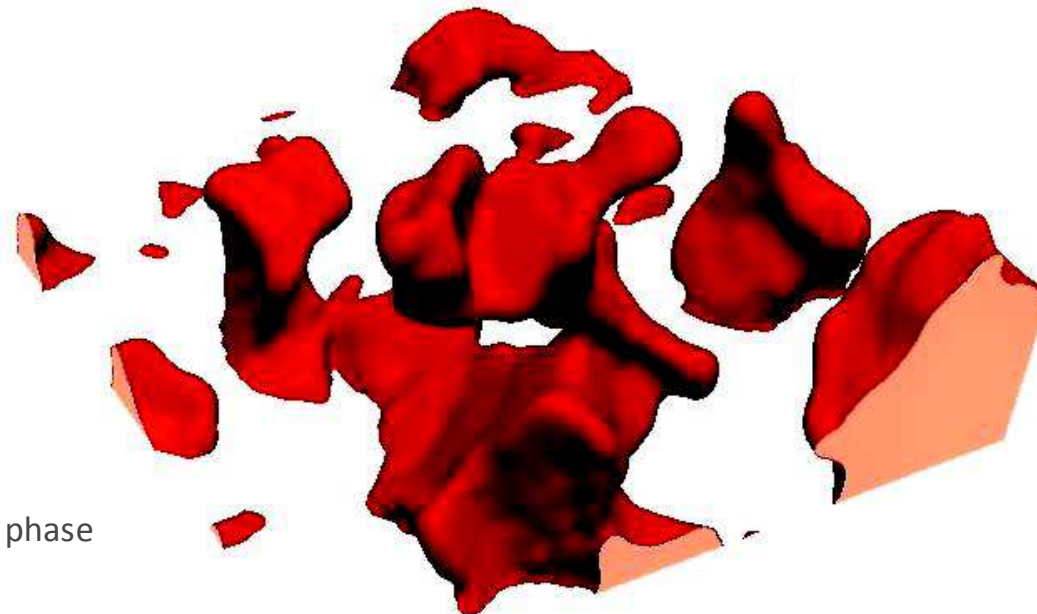


— = Non-wetting phase

# Castlegate Sandstone



$$C = 0.75$$



— = Non-wetting phase

# Castlegate Sandstone



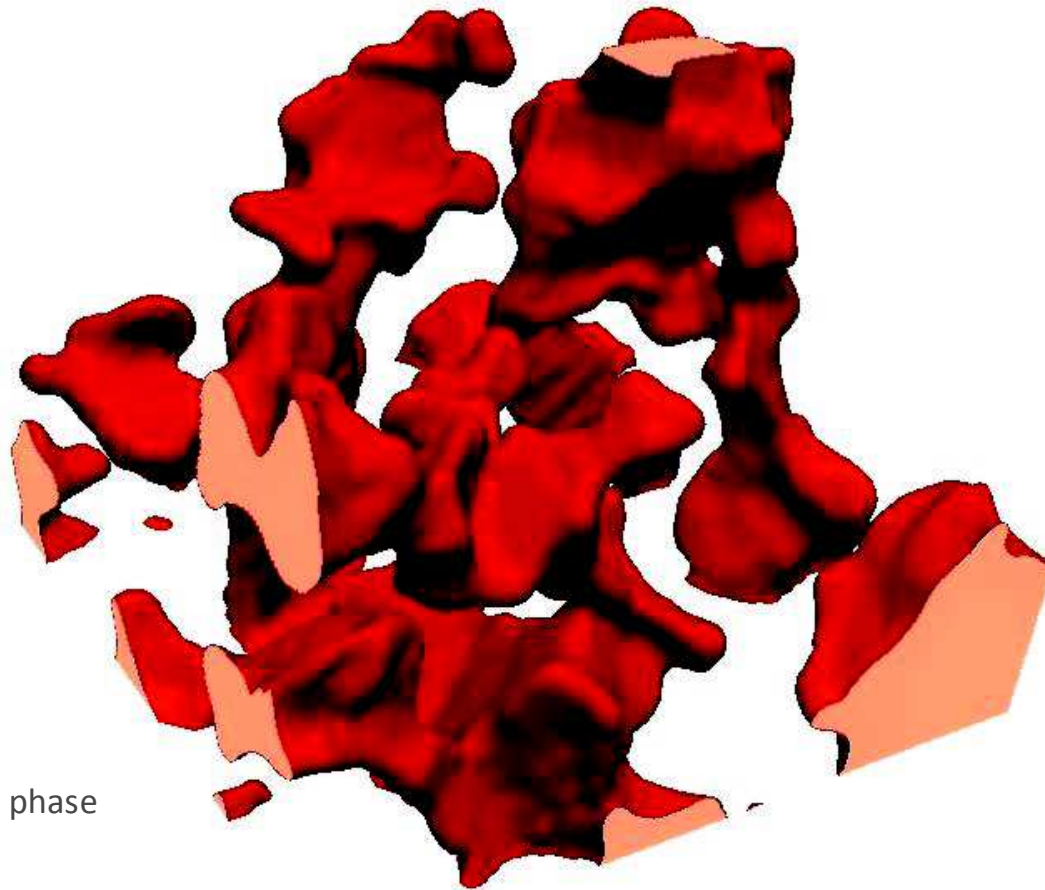
$C = 0.80$



 = Non-wetting phase

# Castlegate Sandstone

$C = 0.85$

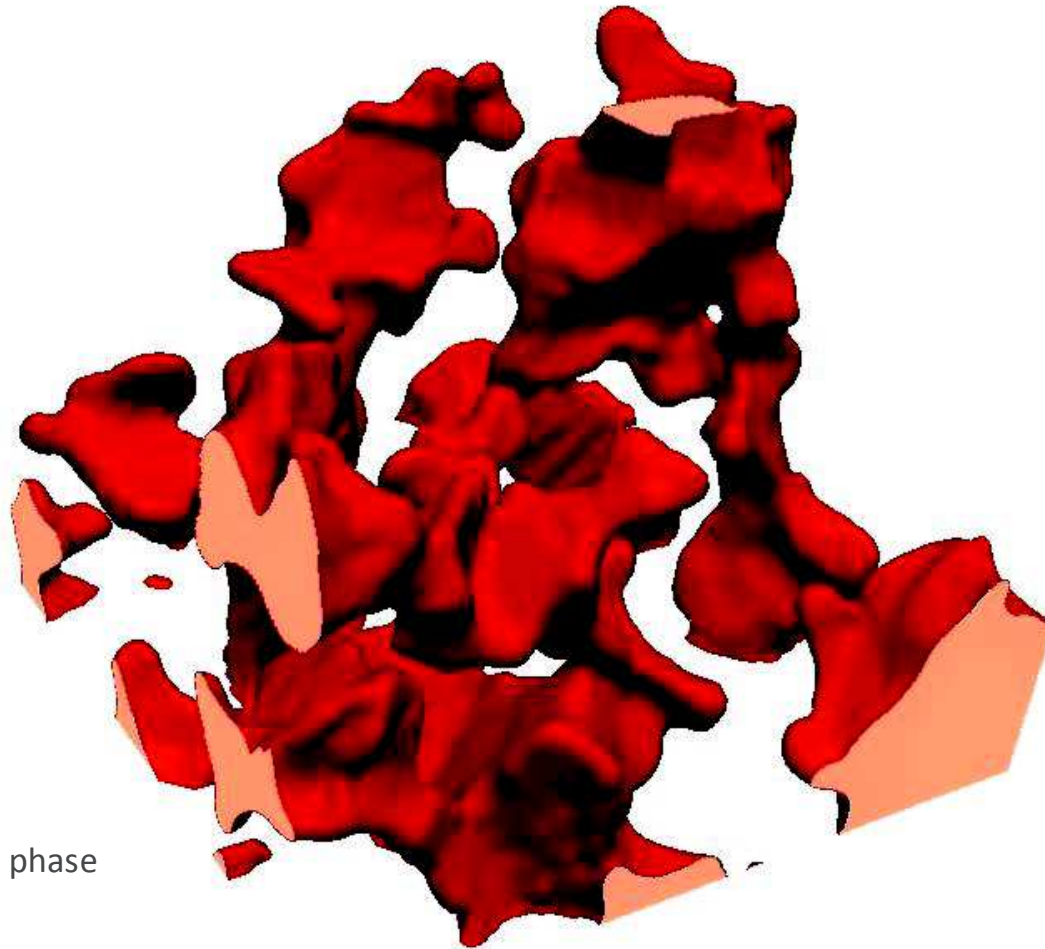


 = Non-wetting phase

# Castlegate Sandstone



$C = 0.95$



— = Non-wetting phase

# Castlegate Sandstone

$C = 1.05$



 = Non-wetting phase

# Castlegate Sandstone



$C = 1.15$

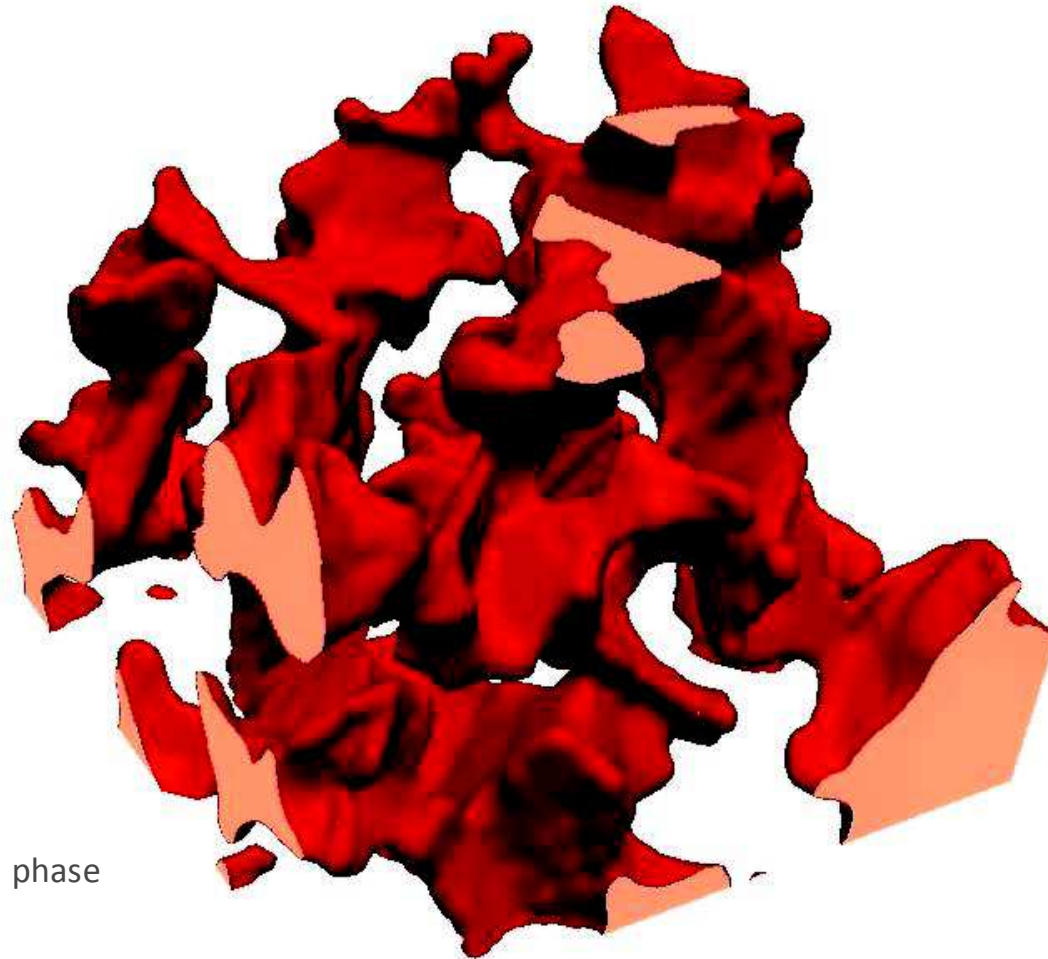


— = Non-wetting phase

# Castlegate Sandstone



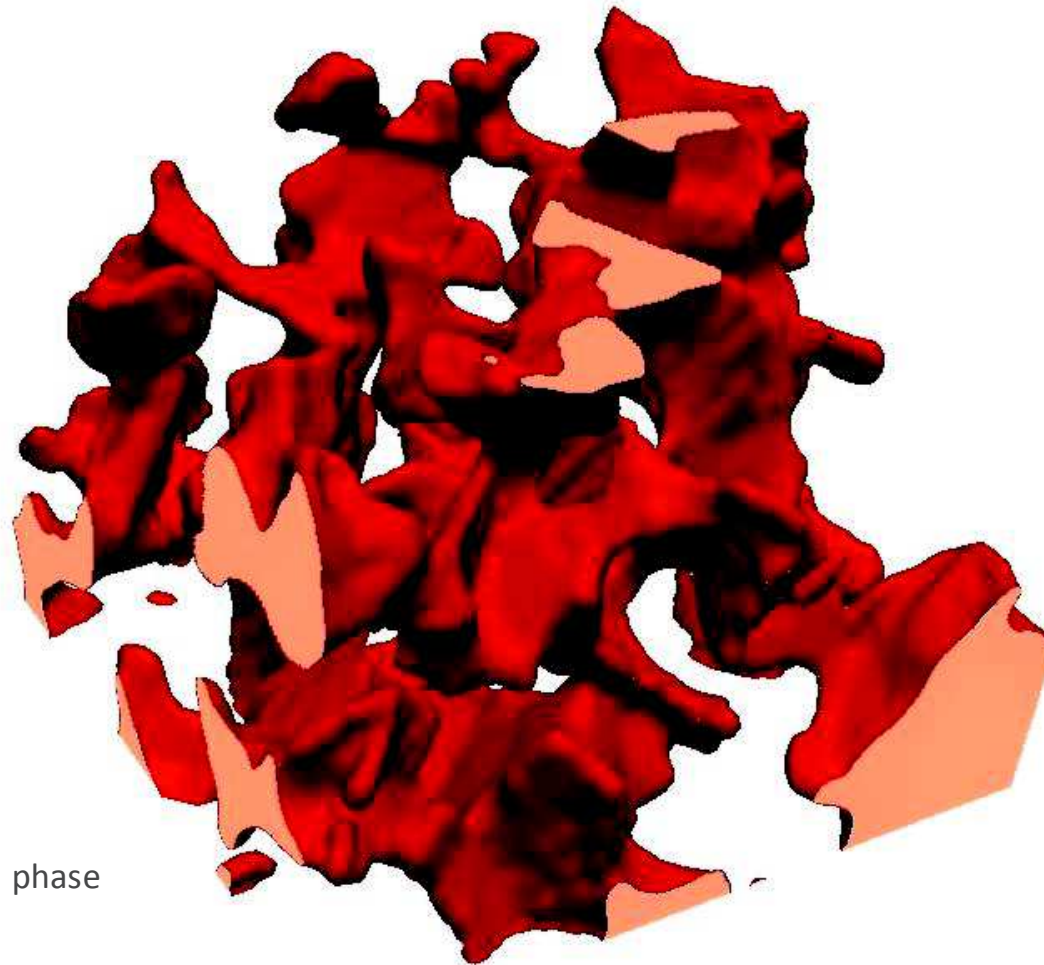
$$C = 1.35$$



 = Non-wetting phase

# Castlegate Sandstone

$C = 1.5$

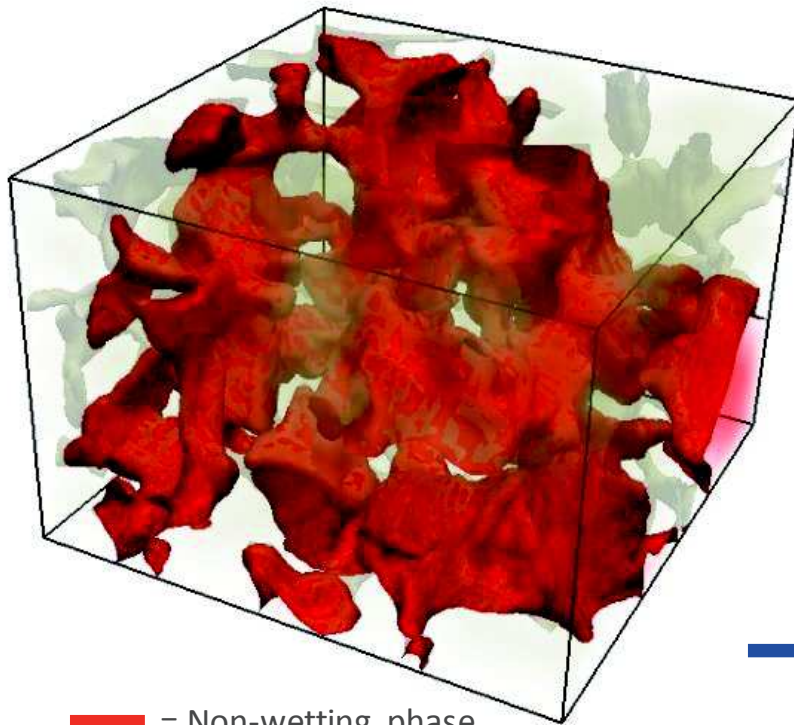


 = Non-wetting phase

# 3D LSM simulation: Castlegate sandstone

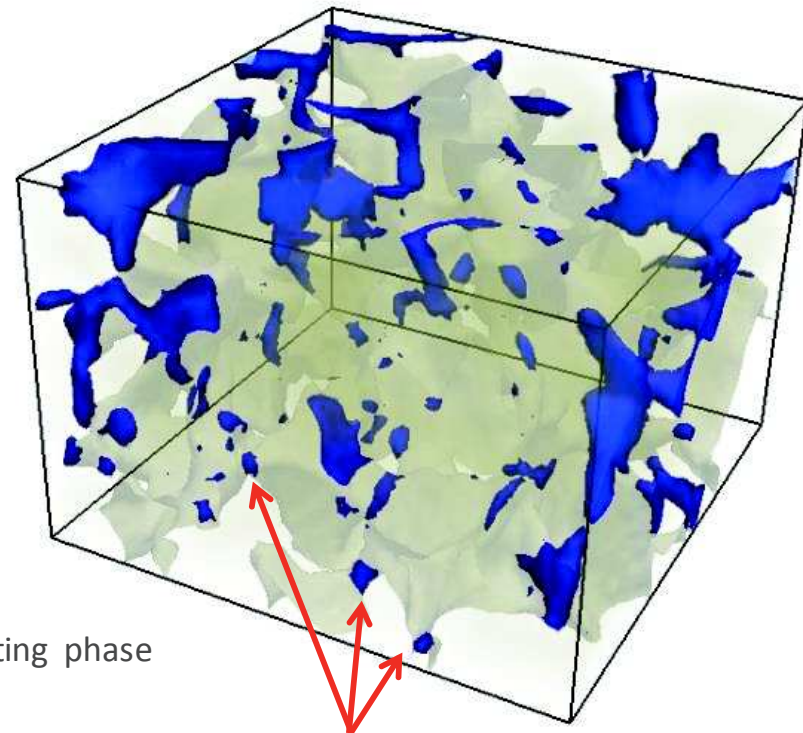


$C = 1.6$



— = Non-wetting phase

Structure of the wetting phase:

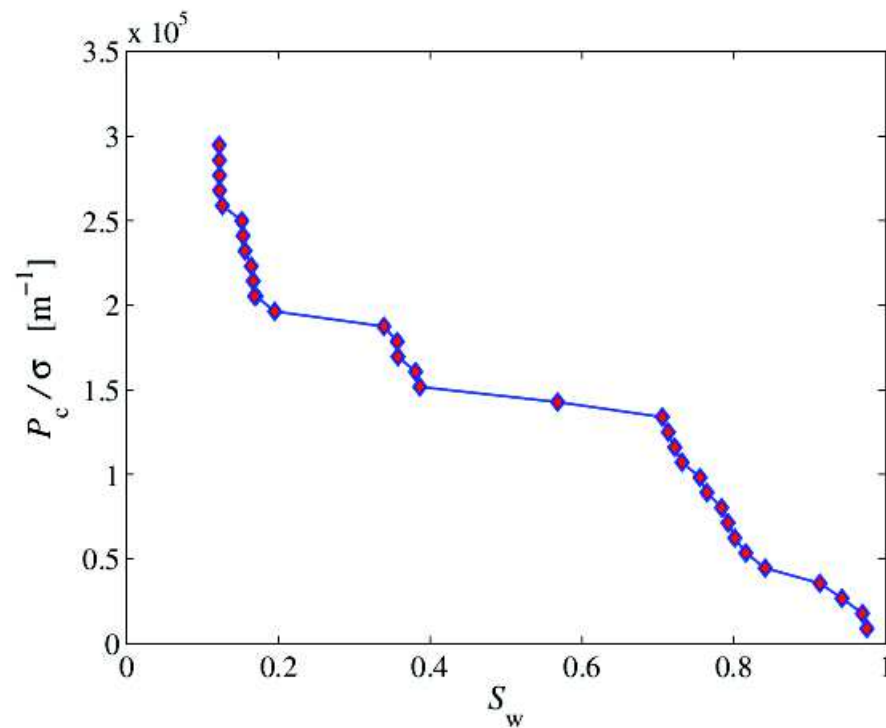


— = Wetting phase

Isolated wetting phase is located in narrow pore throats and constrictions

# Castlegate sandstone

Capillary pressure curve:

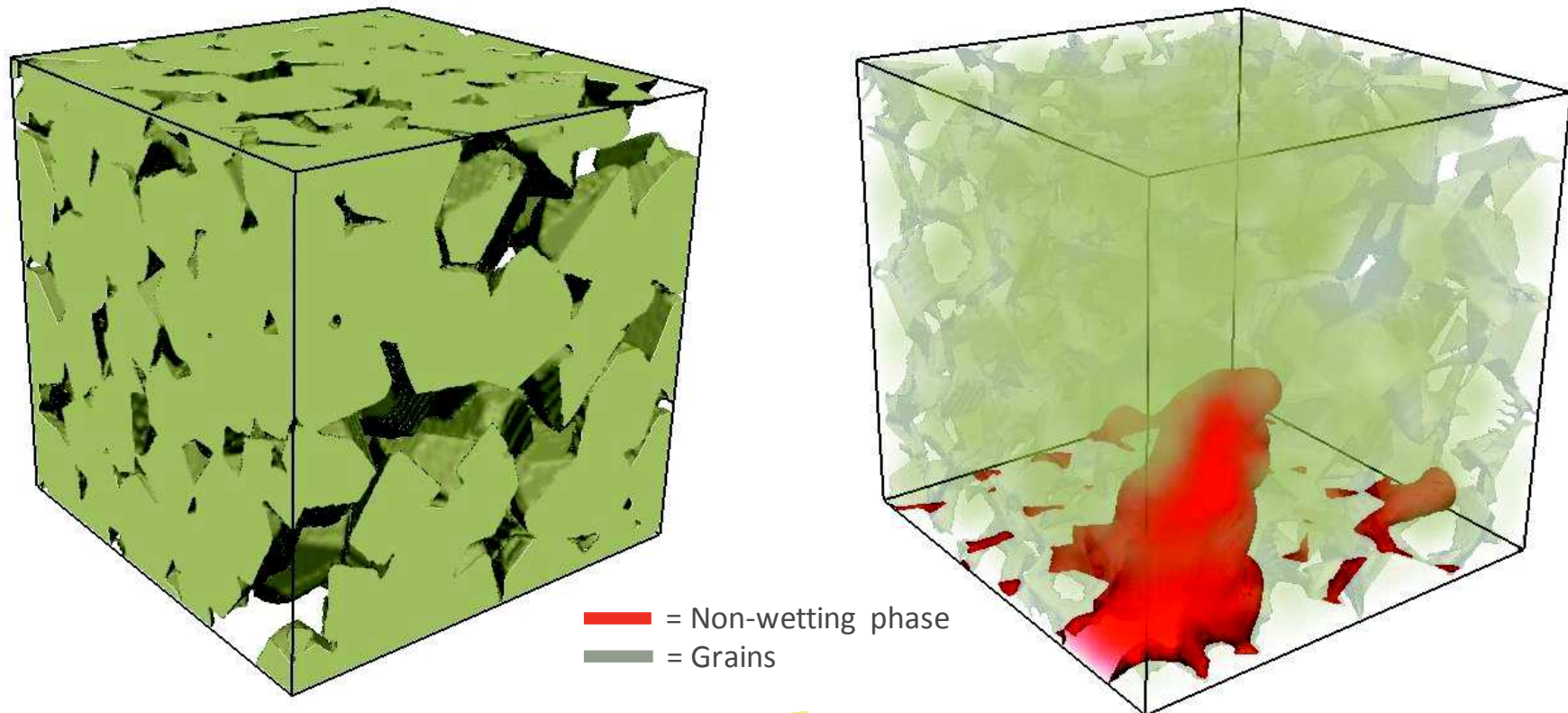


# Simulation in fractured rock



- › Computer-generated fractured sample from LBNL
- › The non-wetting phase invades the diagonal micro-fracture and some of the large pores first

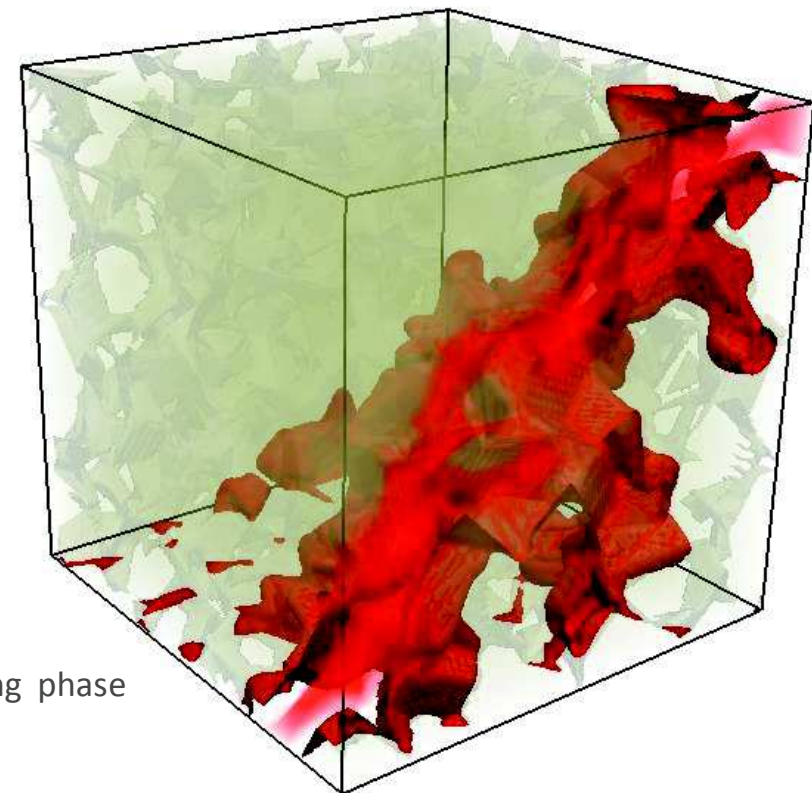
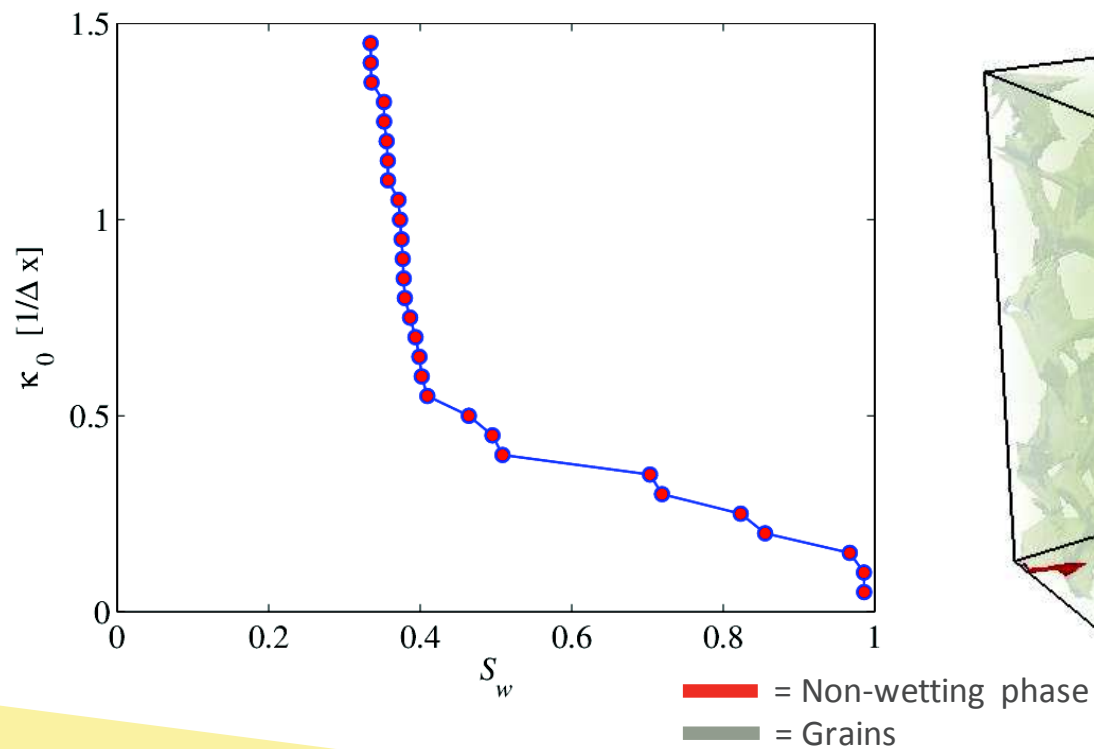
$$C = 0.25$$



# Simulation in fractured rock

- › Computer-generated fractured sample from LBNL
- › The non-wetting phase invades the diagonal micro-fracture and some of the large pores first

$C = 0.55$



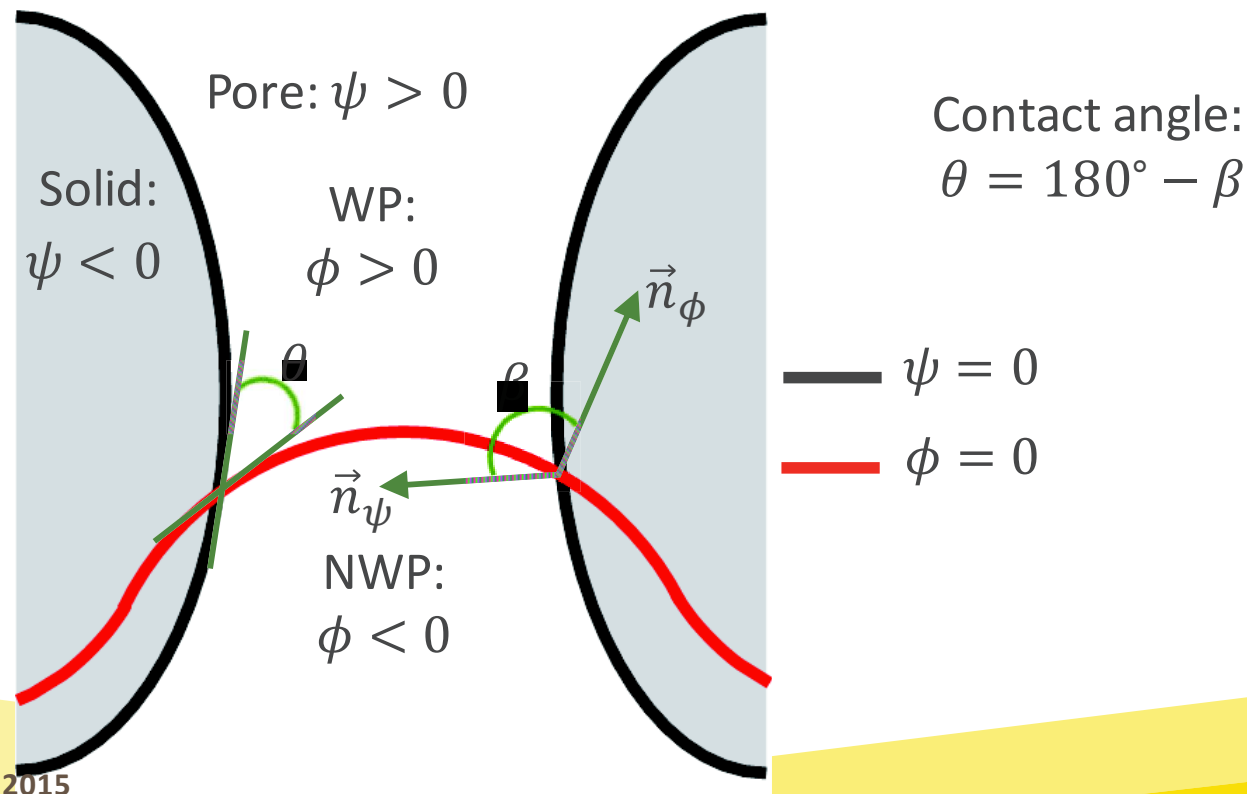
# LS Method with Contact Angle (CA-LSM)



(Jettestuen, et al., WRR 2013)

› Formation of the contact angle in the solid at steady state:

$$\cos \beta = \vec{n}_\psi \cdot \vec{n}_\phi = \frac{\nabla \psi}{|\nabla \psi|} \cdot \frac{\nabla \phi}{|\nabla \phi|} = -\cos \theta$$

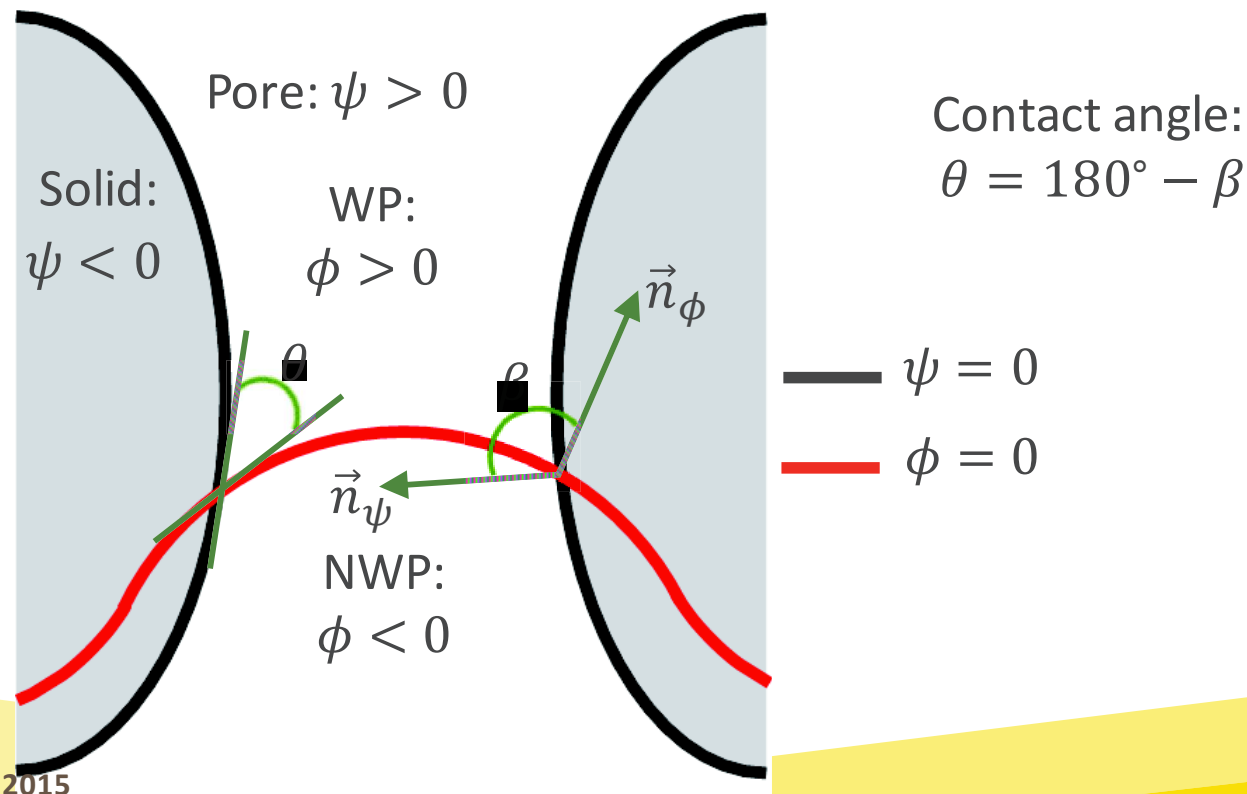


# LS Method with Contact Angle (CA-LSM)



› Formation of the contact angle in the solid at steady state:

$$\nabla\psi \cdot \nabla\phi - \cos\beta |\nabla\psi||\nabla\phi| = 0$$



# LS Method with Contact Angle (CA-LSM)



› Resulting evolution equation:

$$\phi_t + H(\psi)(C - \kappa)|\nabla\phi| + H(-\psi)S(\psi)B(\nabla\psi \cdot \nabla\phi - \cos\beta|\nabla\psi||\nabla\phi|) = 0$$

Pore space:  $\psi > 0$

Solid phase:  $\psi < 0$

Balance between capillary and interfacial forces in the pore space

Formation of the contact angle in the solid phase

$B = O(1/\Delta x)$  constant

$\theta = 180^\circ - \beta = \text{Contact angle}$

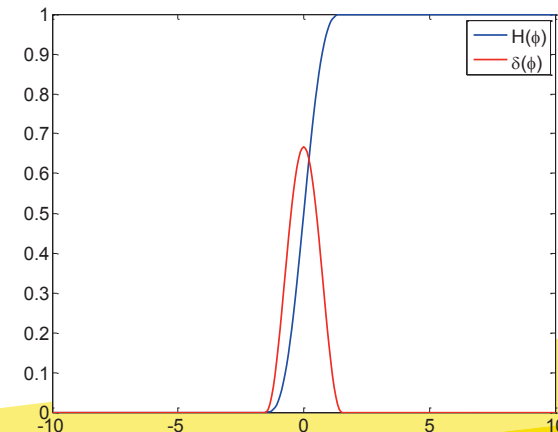
$\psi = \text{LS function describing the pore walls}$

$H = \text{Heaviside step function}$

$S = \text{Sign function}$

(Jettestuen, et al., WRR 2013)

Heaviside  $H(\phi)$  and delta  $\delta(\phi)$  functions facilitates phase volume and interfacial area calculation.



# Castlegate sandstone - Drainage

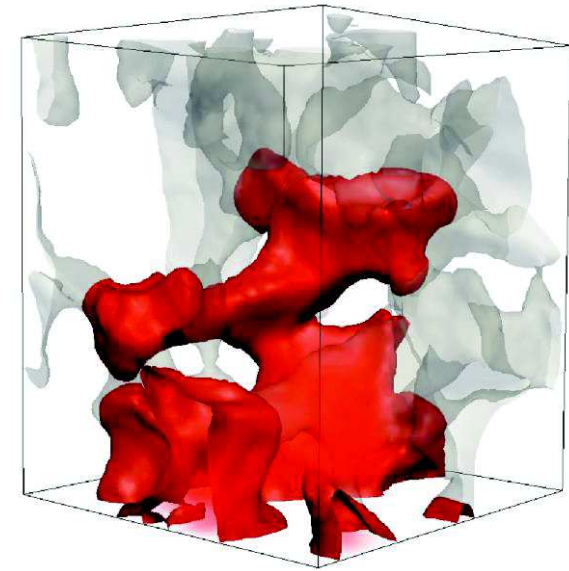
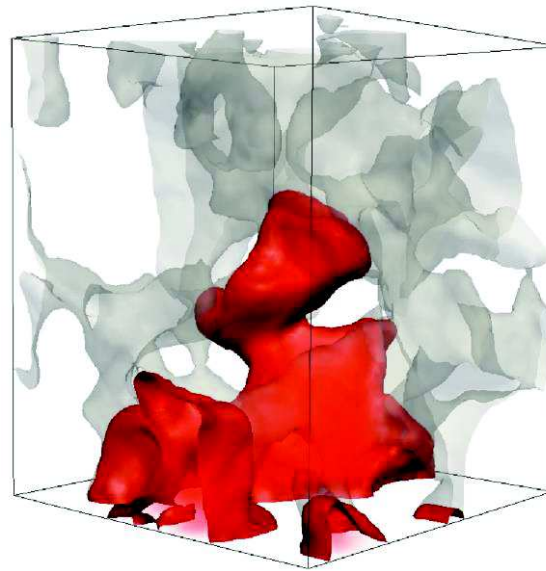
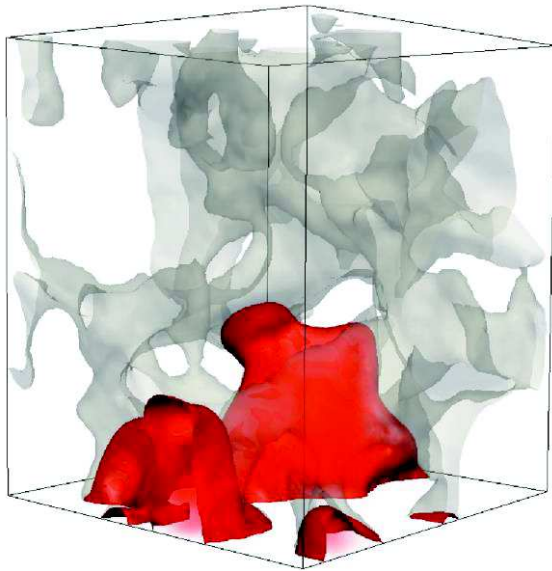


$\theta = 0^\circ$

(standard level set model)

$\theta = 20^\circ$

$\theta = 40^\circ$



$C = 0.50$

— = Non-wetting phase

— = Grains

# Castlegate sandstone - Drainage

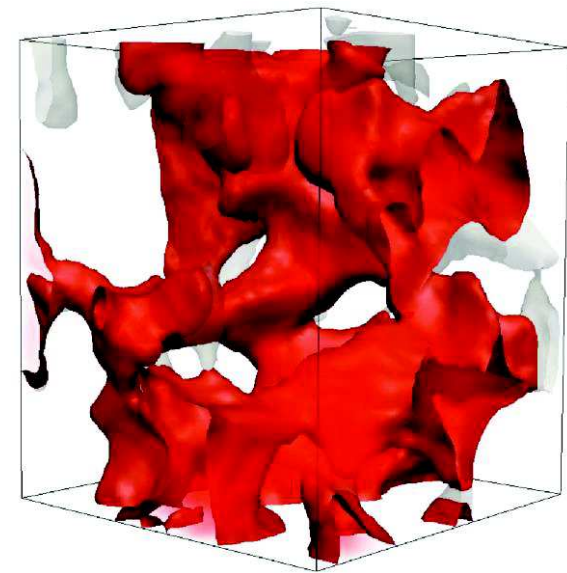
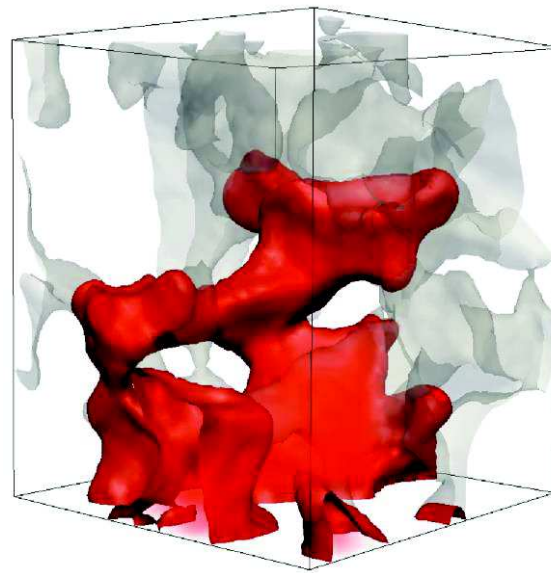
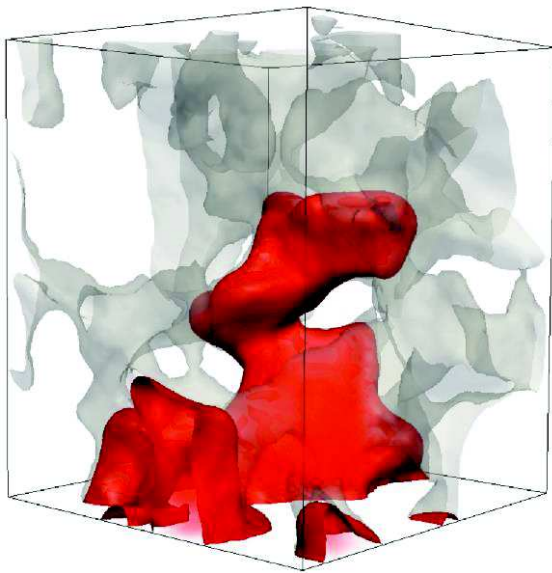


$$\theta = 0^\circ$$

(standard level set model)

$$\theta = 20^\circ$$

$$\theta = 40^\circ$$



$$C = 0.60$$

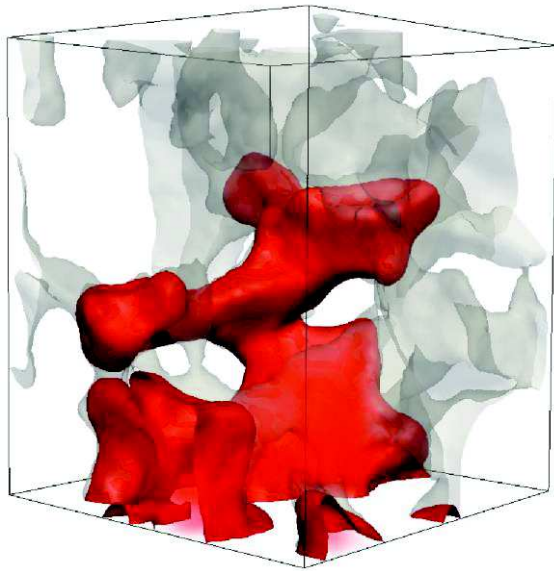
— = Non-wetting phase  
— = Grains

# Castlegate sandstone - Drainage

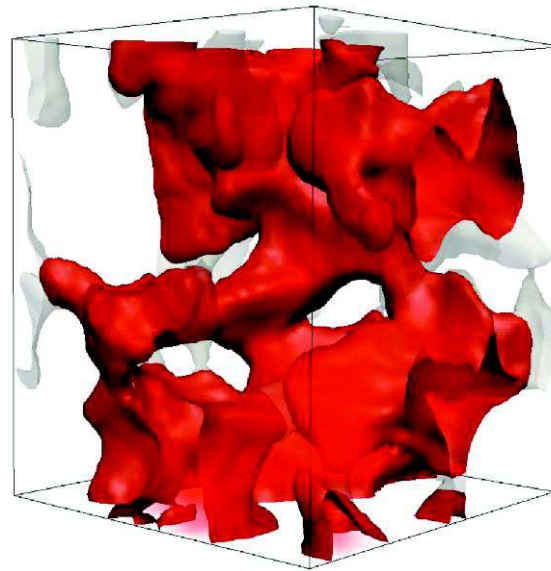


$\theta = 0^\circ$

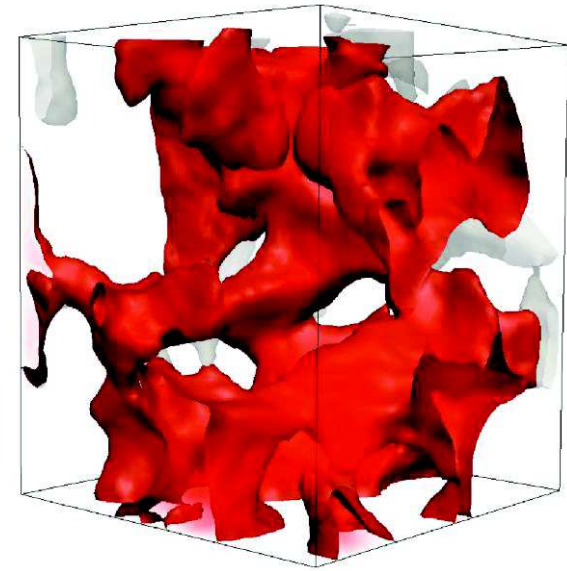
(standard level set model)



$\theta = 20^\circ$



$\theta = 40^\circ$



$C = 0.70$

— = Non-wetting phase

— = Grains

# Castlegate sandstone - Drainage

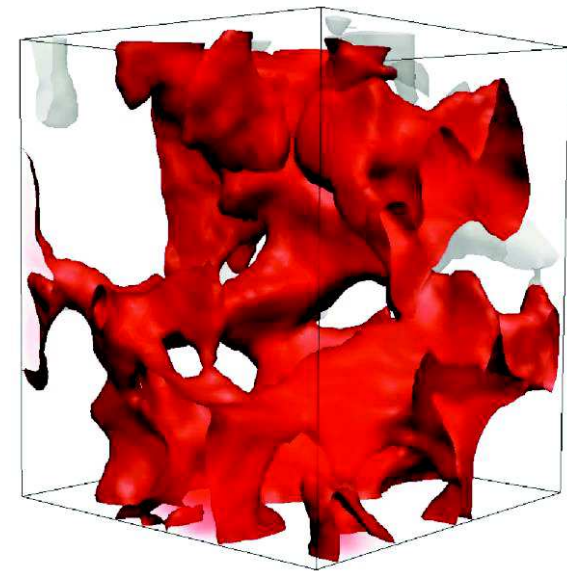
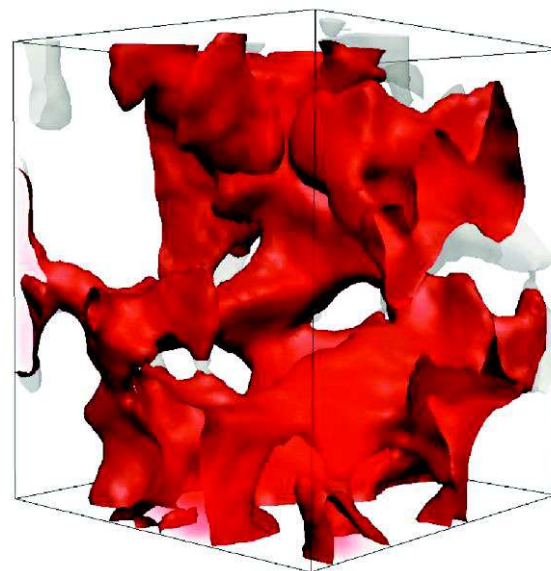
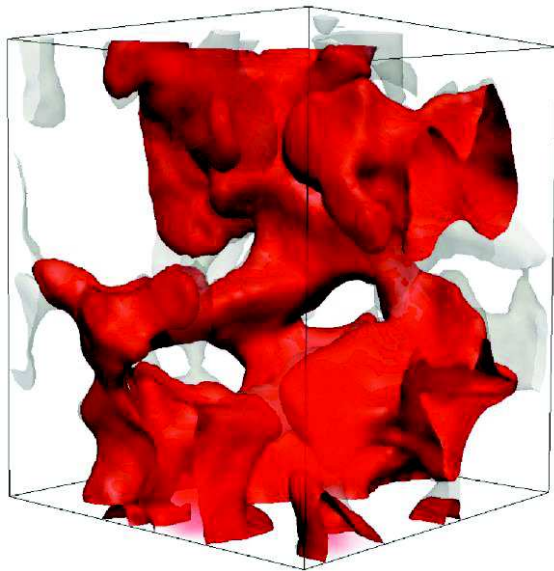


$\theta = 0^\circ$

(standard level set model)

$\theta = 20^\circ$

$\theta = 40^\circ$



$C = 1.0$

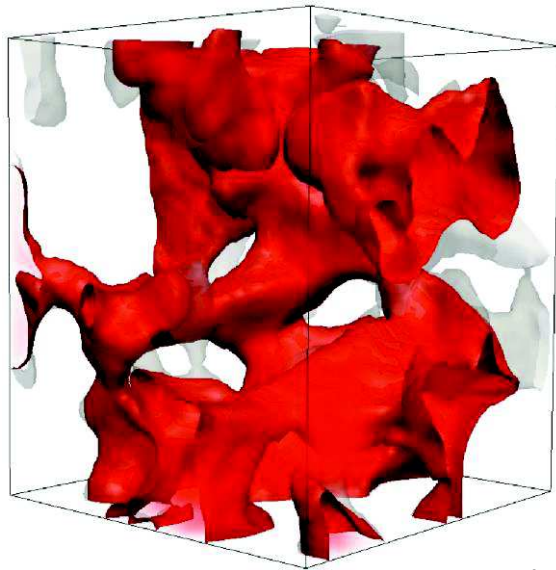
— = Non-wetting phase

— = Grains

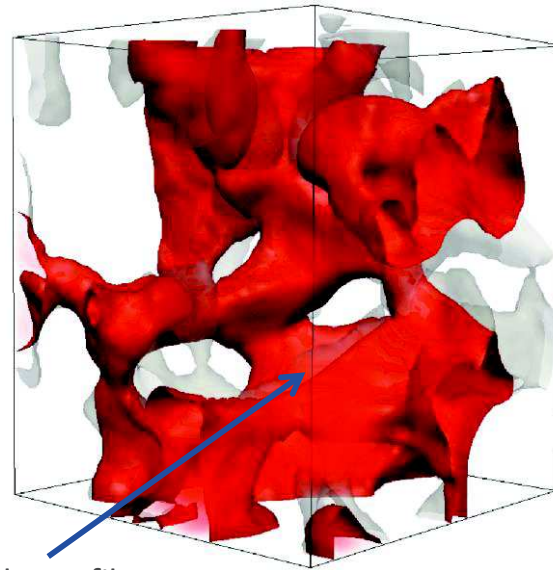
# Castlegate sandstone - Imbibition



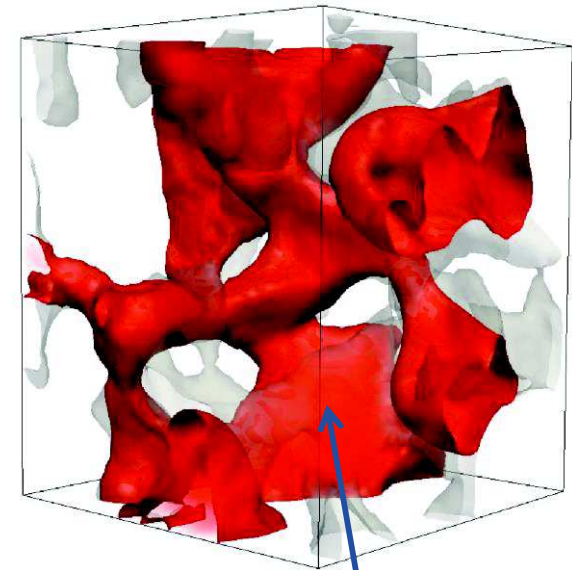
$C = 0.40$



$C = 0.30$



$C = 0.25$



Wetting-phase film

$\theta = 20^\circ$

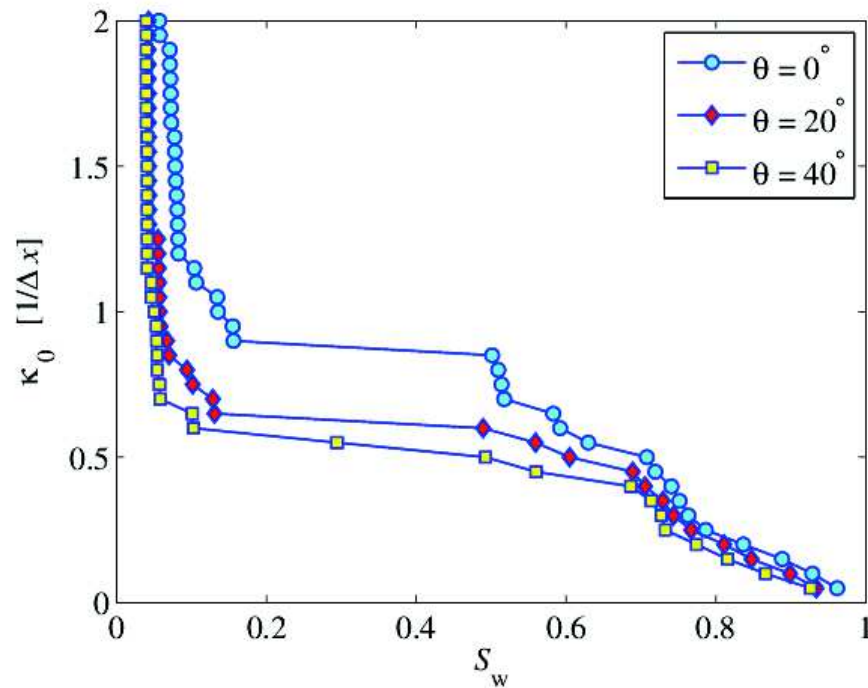
Snap-off has occurred

- › Non-wetting phase retracts to larger pore openings after growth of wetting-phase films has led to snap-off in pore-throat constrictions

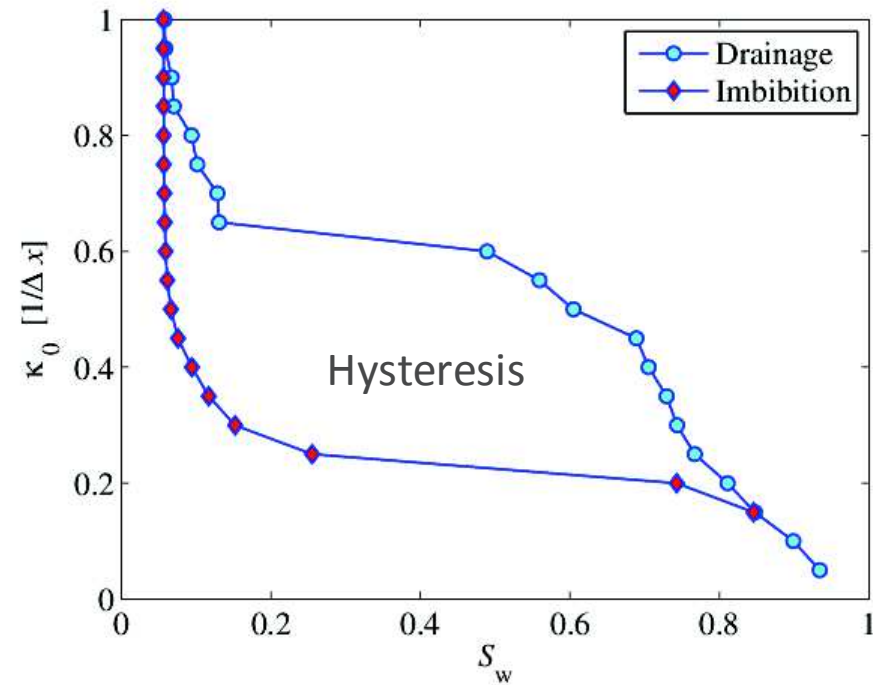
# Castlegate sandstone – Capillary pressure curves



Drainage:



Drainage & imbibition ( $\theta = 20^\circ$ ):



# Summary



A 3D level set based pore-scale model has been developed to simulate capillary-controlled displacements in rock images.

- › A method to include arbitrary contact angles has been developed and implemented.
- › Simulations in 3D pore geometries demonstrate that the model accounts for well-known pore-scale mechanisms:
  - Piston-like invasion
  - Haines jumps (drainage)
  - Wetting-phase film growth and snap-off (imbibition)
  - Interface coalescence and retraction
  - Hysteresis occurs between drainage and imbibition due to different displacement mechanisms

# Variational Level Set (VLS) Method

(Zhao et al, J Comput Phys 127, 1996; Helland & Jettestuen, SCA 2014)



- Developed for motion of triple junctions
- We add solid phase and contact angle to existing method

### For each fluid:

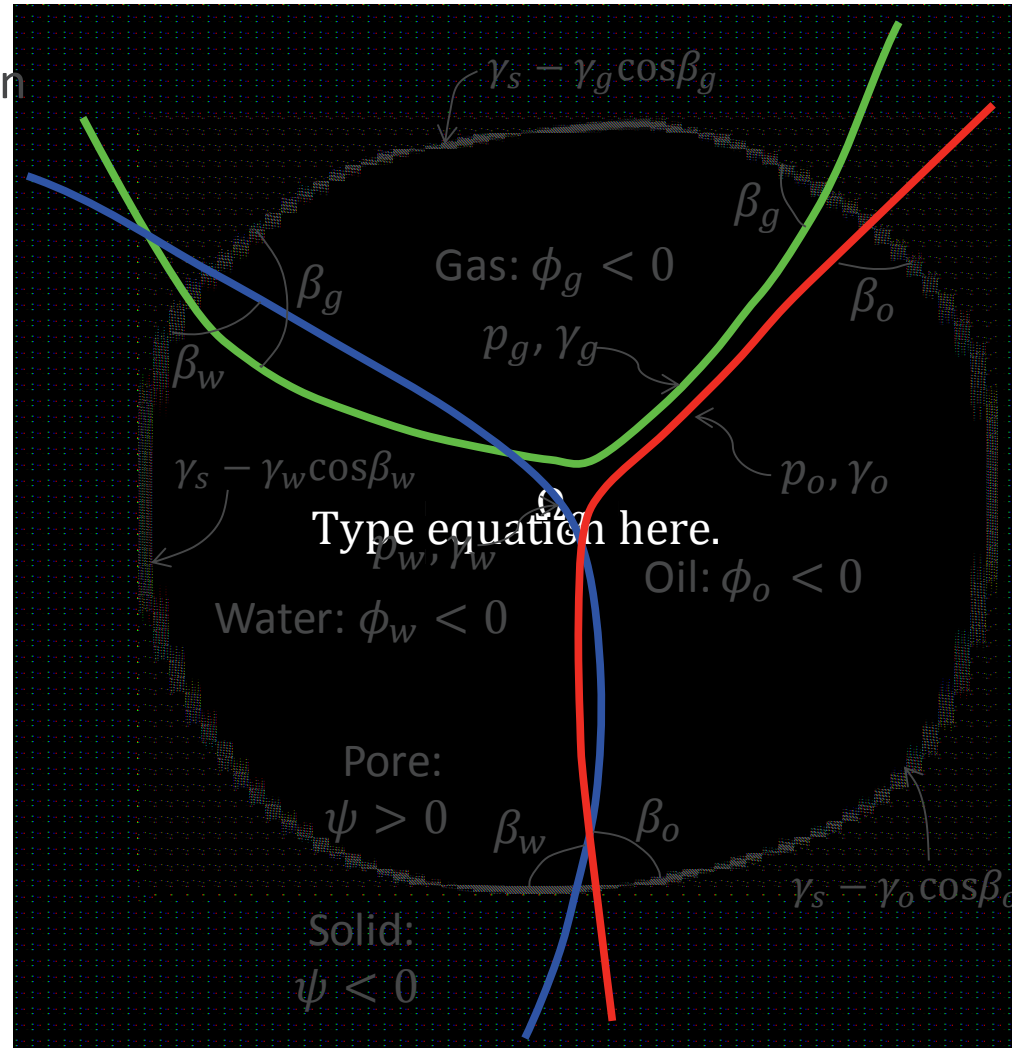
$\phi_i$  (LS function)

$p_i$  (phase pressure)

$\gamma_i$  (surface tension)

$\beta_i$  (solid/pore intersection angle)

$\gamma_s - \gamma_i \cos \beta_i$  (solid/fluid interfacial tension)



- Pore
- Solid
- $\psi = 0$
- $\phi_w = 0$
- $\phi_o = 0$
- $\phi_g = 0$

# Variational Level Set Method



**Total energy:**

$$E = E_1 + E_2 + E_3$$

**Bulk energy:**

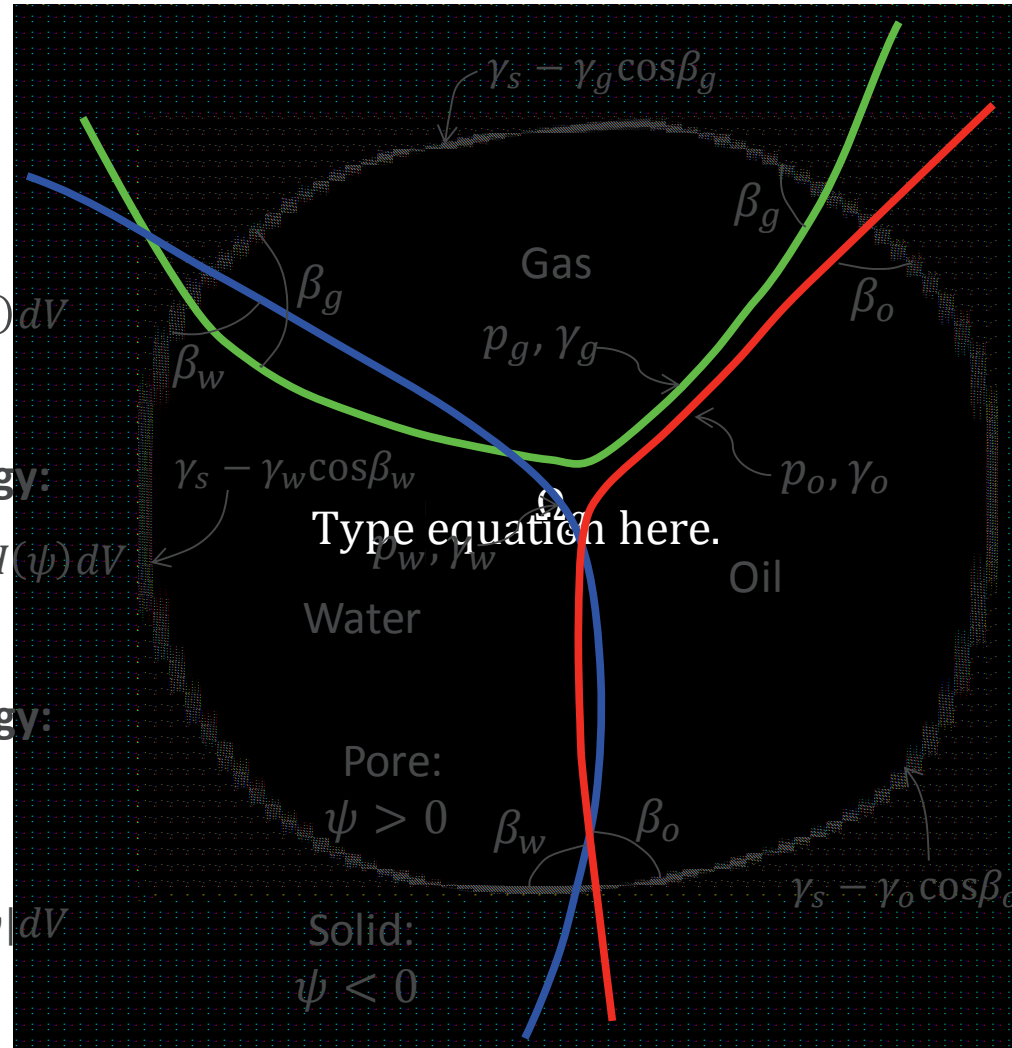
$$E_1 = \sum_{i=g,o,w} p_i \int_{\Omega} H(-\phi_i) H(\psi) dV$$

**Fluid/fluid interfacial energy:**

$$E_2 = \sum_{i=g,o,w} \gamma_i \int_{\Omega} \delta(\phi_i) |\nabla \phi_i| H(\psi) dV$$

**Solid/fluid interfacial energy:**

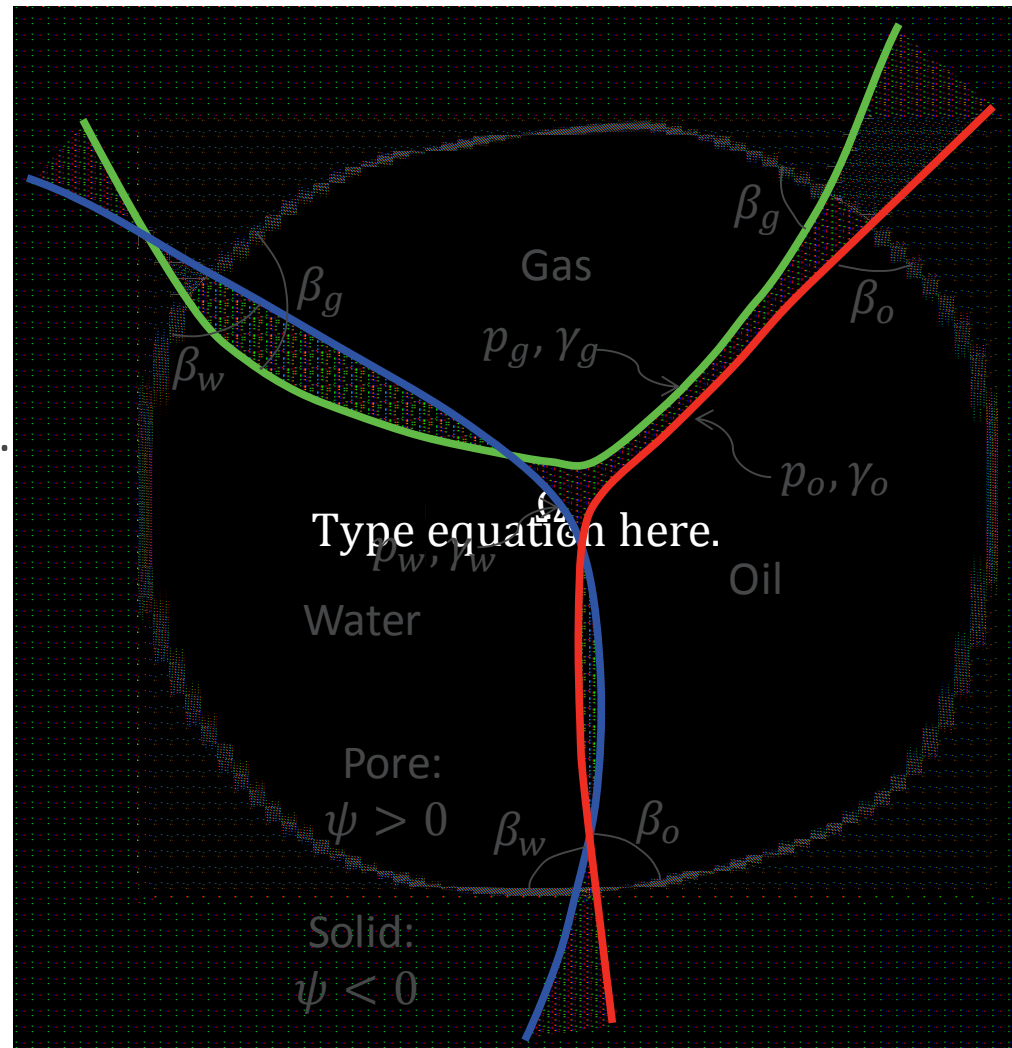
$$E_3 = \sum_{i=g,o,w} (\gamma_s - \gamma_i \cos \beta_i) \times \int_{\Omega} H(-\phi_i) \delta(\psi) |\nabla \psi| dV$$



# Variational Level Set Method



Overlap/vacuum regions occur if  $\phi_i$  moves with independent velocities.



- Pore
- Solid
- $\psi = 0$
- $\phi_w = 0$
- $\phi_o = 0$
- $\phi_g = 0$
- Overlap
- Vacuum

# Variational Level Set Method

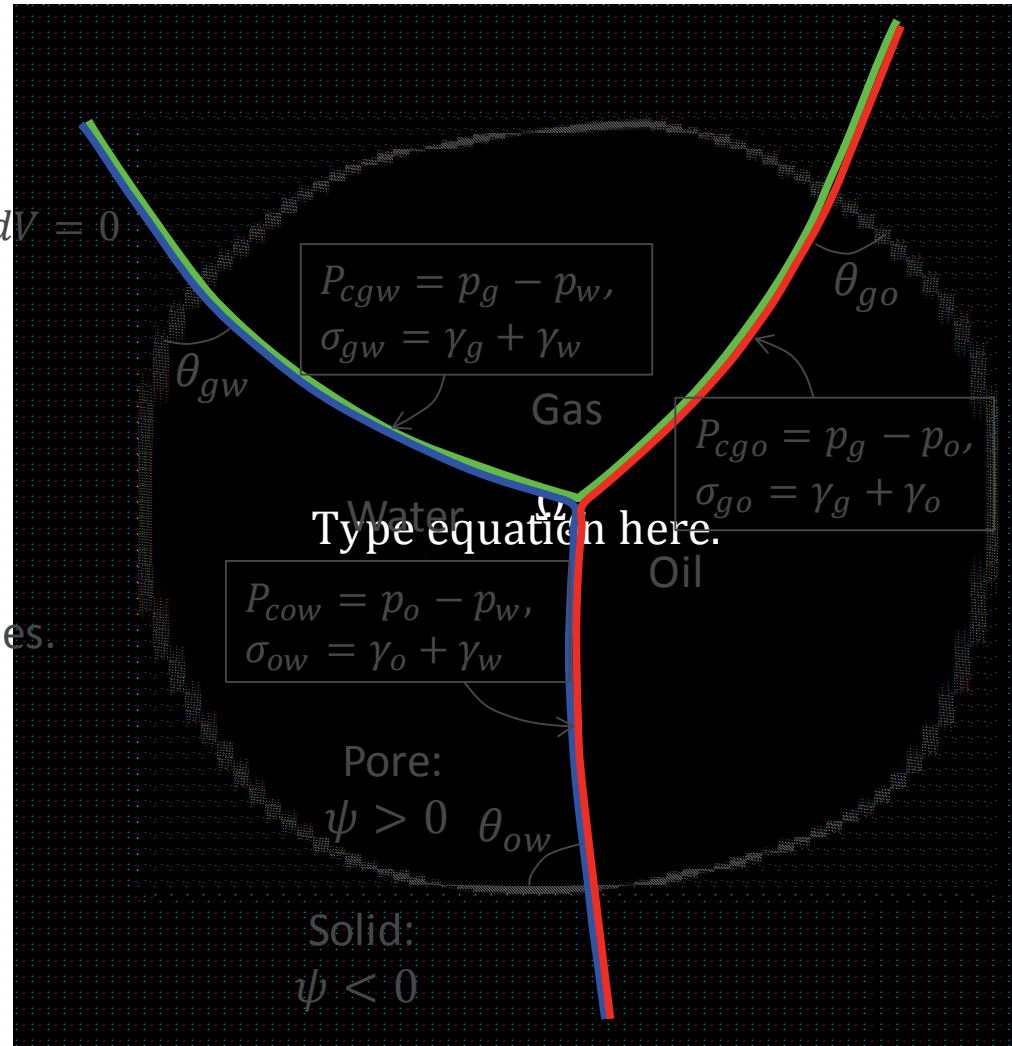


Constraint prevents overlap/vacuum regions:

$$\frac{1}{2} \int_{\Omega} \left( \sum_{i=g,o,w} H(-\phi_i) - 1 \right)^2 dV = 0$$



Interfacial tensions ( $\sigma_{ij}$ ), capillary pressures ( $P_{cij}$ ) and contact angles ( $\theta_{ij}$ ) are defined at the interfaces.



- Pore
- Solid
- $\psi = 0$
- $\phi_w = 0$
- $\phi_o = 0$
- $\phi_g = 0$

# Variational Level Set Method



Stable interface configurations:

Pore space:

$$P_{cij} = (\gamma_i + \gamma_j)\kappa_i$$

(Young-Laplace Equation)

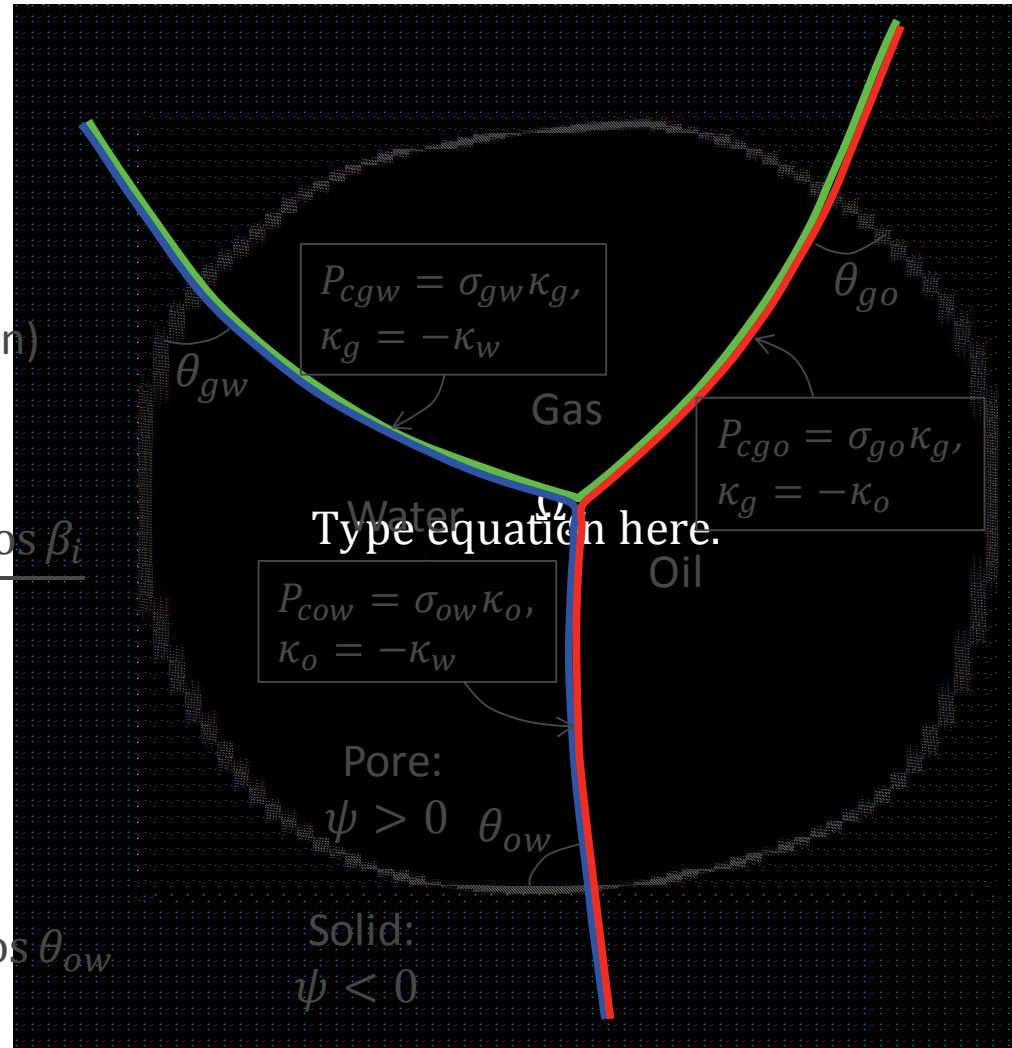
Pore walls (& solid):

$$\cos \theta_{ij} = \frac{\gamma_j \cos \beta_j - \gamma_i \cos \beta_i}{\gamma_i + \gamma_j}$$

(Young Equation)



$$\sigma_{gw} \cos \theta_{gw} = \sigma_{go} \cos \theta_{go} + \sigma_{ow} \cos \theta_{ow}$$



- Pore
- Solid
- $\psi = 0$
- $\phi_w = 0$
- $\phi_o = 0$
- $\phi_g = 0$

# Variational Level Set Method



› Putting it all together:

$$\begin{aligned}
 & f(\phi_g, \phi_o, \phi_w) && \text{(Young-Laplace in pore space)} \\
 & = \int_{\Omega} \left( \sum_{i=g,o,w} p_i H(-\phi_i) H(\psi) + \sum_{i=g,o,w} \gamma_i \delta(\phi_i) |\nabla \phi_i| H(\psi) \right. \\
 & \quad + \frac{\lambda}{2} \left( \sum_{i=g,o,w} H(-\phi_i) - 1 \right)^2 && \text{(No overlap/vacuum constraint)} \\
 & \quad \left. - \sum_{i=g,o,w} \gamma_i \left( \frac{\nabla \phi_i}{|\nabla \phi_i|} \cdot \frac{\nabla \psi}{|\nabla \psi|} - \cos \beta_i \right) \delta(\psi) |\nabla \psi| H(-\phi_i) \right) dV \\
 & && \text{(Formation of contact angle on pore/solid surface)}
 \end{aligned}$$

$\lambda$  = Lagrange multiplier

# Variational Level Set Method



› Minimizing  $f$  with respect to  $\phi_i, i = g, o, w$  gives three evolution equations:

$$(\phi_i)_t + \lambda \left( \sum_{j=g,o,w} H(-\phi_j) - 1 \right) |\nabla \phi_i| + H(\psi)(p_i - \gamma_i \kappa_i) |\nabla \phi_i| + \frac{H(-\psi)}{\Delta x} S(\psi) \gamma_i (\nabla \phi_i \cdot \nabla \psi - \cos \beta_i |\nabla \phi_i| |\nabla \psi|) = 0, \quad i = g, o, w$$

›  $H(-\psi)/\Delta x$  has replaced  $\delta(\psi)$  to extend contact angle into solid, which is more accurate numerically.

› The solution  $\phi_i$  must satisfy the constraint at all times:

$$\frac{d}{dt} \frac{1}{2} \int_{\Omega} \left( \sum_{i=g,o,w} H(-\phi_i) - 1 \right)^2 dV = - \sum_{i=g,o,w} \int_{\Omega} \left( \sum_{j=g,o,w} H(-\phi_j) - 1 \right) \delta(\phi_i) (\phi_i)_t dV = 0$$

› This gives an expression for the Lagrange multiplier  $\lambda$ .

## Relation between $\beta$ , $\gamma$ and $\theta$



- › At equilibrium, the zero contours of  $\phi$  in solid satisfy:

$$\gamma_i(\nabla\psi \cdot \nabla\phi_i - \cos\beta_i|\nabla\psi||\nabla\phi_i|) = \gamma_j(\nabla\psi \cdot \nabla\phi_j - \cos\beta_j|\nabla\psi||\nabla\phi_j|)$$

- › The intersection angles between the zero contours of  $\psi$  and  $\phi$  form the contact angles at the interfaces:

$$\cos\theta_{ij} = \vec{n}_\psi \cdot \vec{n}_{\phi_j} = \frac{\nabla\psi}{|\nabla\psi|} \cdot \frac{\nabla\phi_j}{|\nabla\phi_j|} \quad (\nabla\phi_j = -\nabla\phi_i)$$

- › This yields the following contact angle expressions:

$$\cos\theta_{ij} = \frac{\gamma_j \cos\beta_j - \gamma_i \cos\beta_i}{\gamma_j + \gamma_i}, \quad ij = go, ow, gw.$$

- › These relations satisfy the Bartell-Osterhof equation:

$$\sigma_{gw} \cos\theta_{gw} = \sigma_{go} \cos\theta_{go} + \sigma_{ow} \cos\theta_{ow}$$

## Alternative Approach: Multiphase Level Set Method with «Projection Step»



- › Alternative technique for removing overlap/vacuum regions
- › Uncoupled evolution equations:

$$(\phi_i)_t + H(\psi)(p_i - \gamma_i \kappa_i) |\nabla \phi_i| + \frac{H(-\psi)}{\Delta x} S(\psi) \gamma_i (\nabla \phi_i \cdot \nabla \psi - \cos \beta_i |\nabla \phi_i| |\nabla \psi|) = 0, \quad i = g, o, w$$

- › After each time iteration, perform a projection step:
  - Subtract the average of the two smallest  $\phi_i$  from all  $\phi_i$  in each point

› Example when  $\phi_g > \phi_o, \phi_w$ :

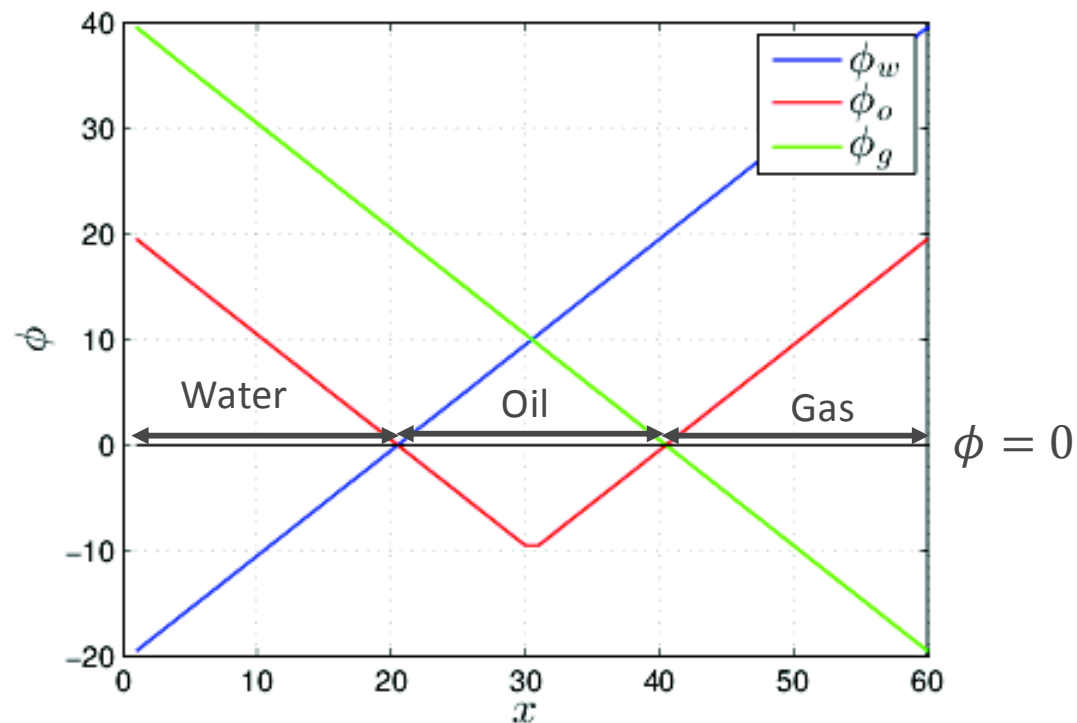
$$\begin{aligned} \phi_g &= \phi_g - (\phi_o + \phi_w)/2, \\ \phi_o &= \phi_o - (\phi_o + \phi_w)/2, \\ \phi_w &= \phi_w - (\phi_o + \phi_w)/2. \end{aligned}$$

(Losasso, Fedkiw et al., 2006)

# Multiphase Level Set Method – «Projection Step»



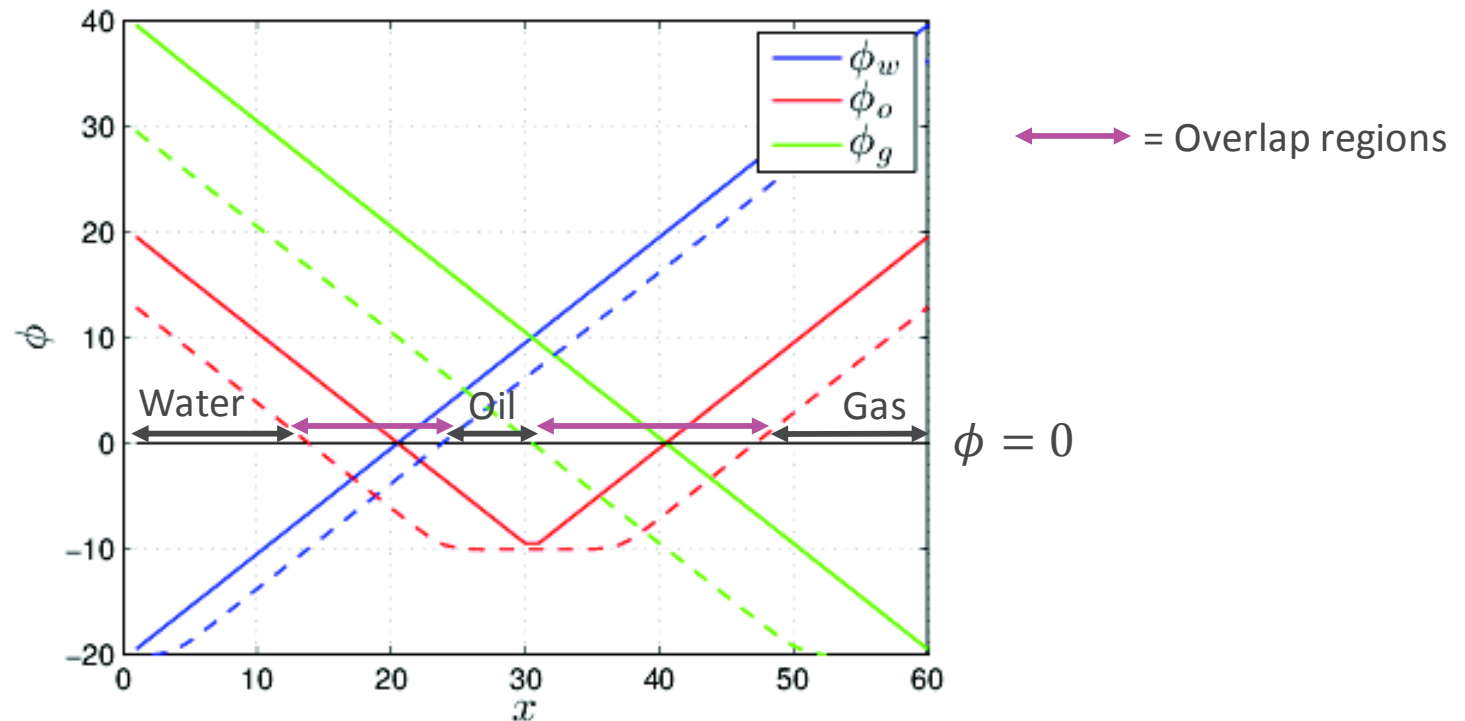
- › So, what is the role of the «projection step»?
- › Illustrating 1D example – Initial configuration:



# Multiphase Level Set Method – «Projection Step»



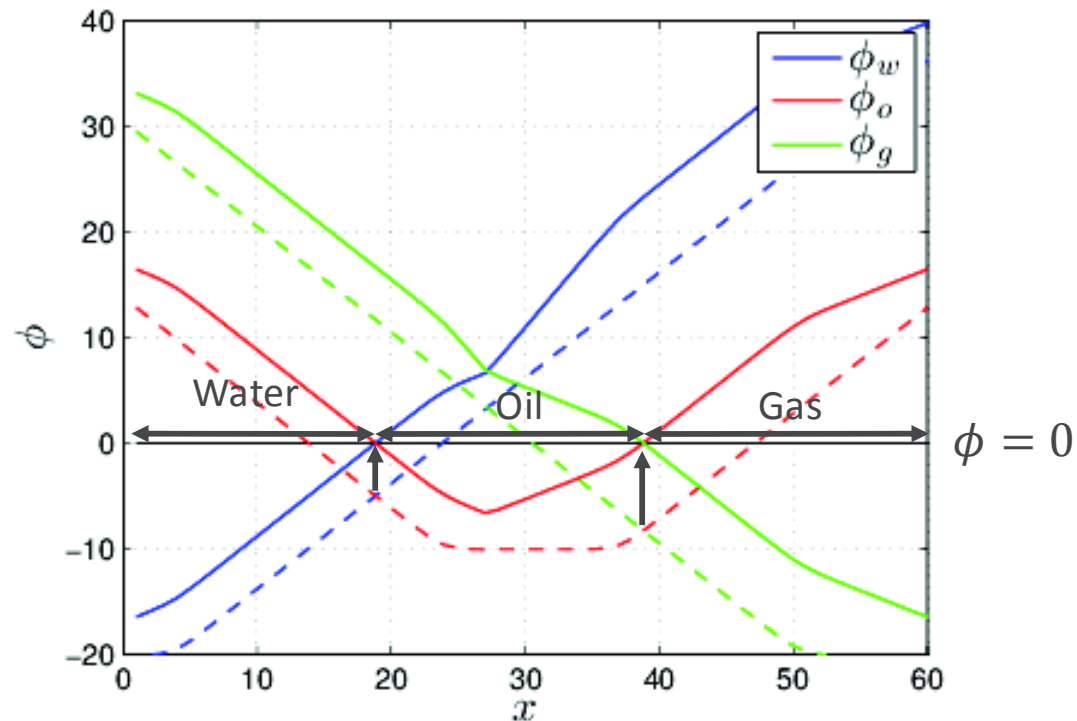
- › Illustrating 1D example:
- › Configuration after some time using uncoupled equations without projection step (dashed curves):



# Multiphase Level Set Method – «Projection Step»



- › Illustrating 1D example:
- › Configuration after projection step:

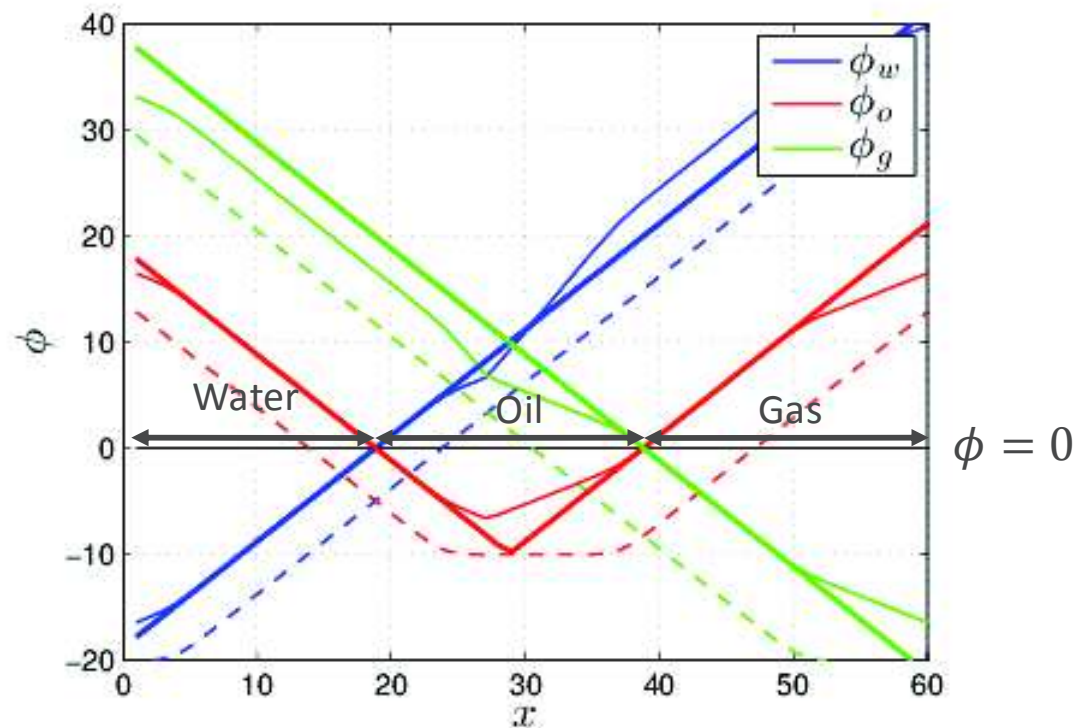


The projection step moves the intersections between  $\phi_i$  to level  $\phi = 0$ .

# Multiphase Level Set Method – «Projection Step»



- › Illustrating 1D example:
- › Configuration after projection step & reinitialization:



## Implementation

- › Input parameters:  $p_i, \gamma_i$  and  $\beta_i, i = g, o, w$ .
- › Quasi-static three-phase VLS simulation by changing phase pressures stepwise
- › In each pressure step, evolve  $\phi_i, i = g, o, w$  until equilibrium is reached (i.e., solve the 3 evolution equations) and calculate fluid saturations
- › Standard explicit numerical techniques for LS methods are used
- › For invasion of non-wetting phase: Add a layer of pore space with invading phase at the inlet
- › For invasion of wetting or intermediate-wetting phase: Add a porous plate wetted and saturated by the invading phase at inlet
- › Boundary conditions:
  - Inlet: Linear extrapolation
  - All other boundaries:  $\vec{n} \cdot \nabla \phi_i = 0, i = g, o, w$
- › We simulate two-phase saturation history with contact-angle LS method (Jettestuen et al., WRR 2013)

# Simulation on sandstone: Simultaneous Water-Alternate-Gas (SWAG) invasion



(Helland & Jettestuen, SCA 2014)

Interfacial tensions:

$$\sigma_{ow} = 0.02, \sigma_{go} = 0.0101, \\ \sigma_{gw} = 0.03 \text{ N/m}$$

Contact angles:

$$\theta_{ow} = 20^\circ, \theta_{go} = 7.9^\circ, \\ \theta_{gw} = 16.3^\circ$$

**Water cusps at  
gas/oil/water  
triple lines**

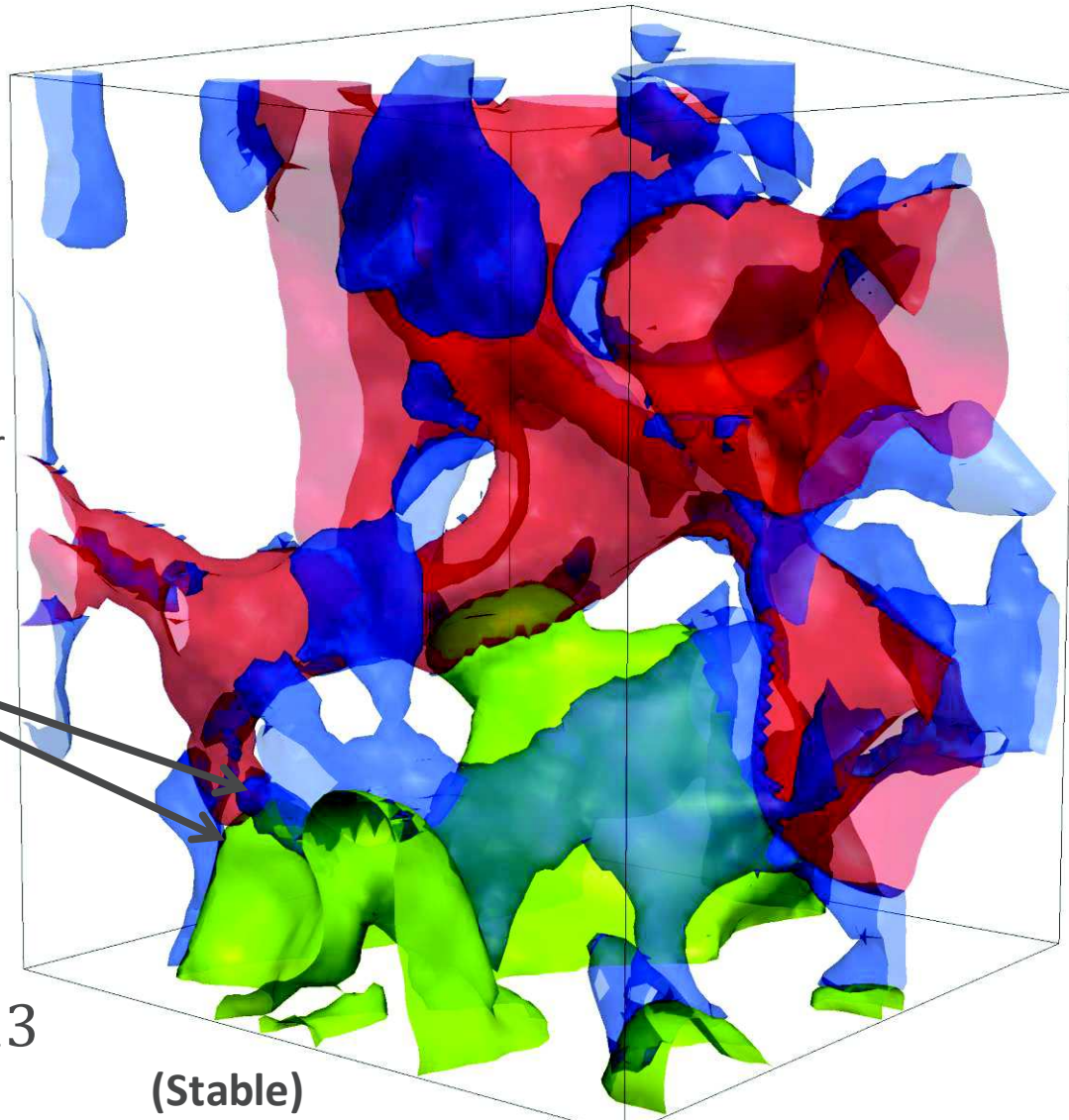
- Water
- Oil
- Gas

$$P_{cow} = 1.25 \text{ kPa}$$

$$P_{cgo} = 0.67 \text{ kPa}$$

$$S_{wi} = 0.13$$

(Stable)



# SWAG invasion



Water snap-off due to water-cusp growth at gas/oil/solid contact lines

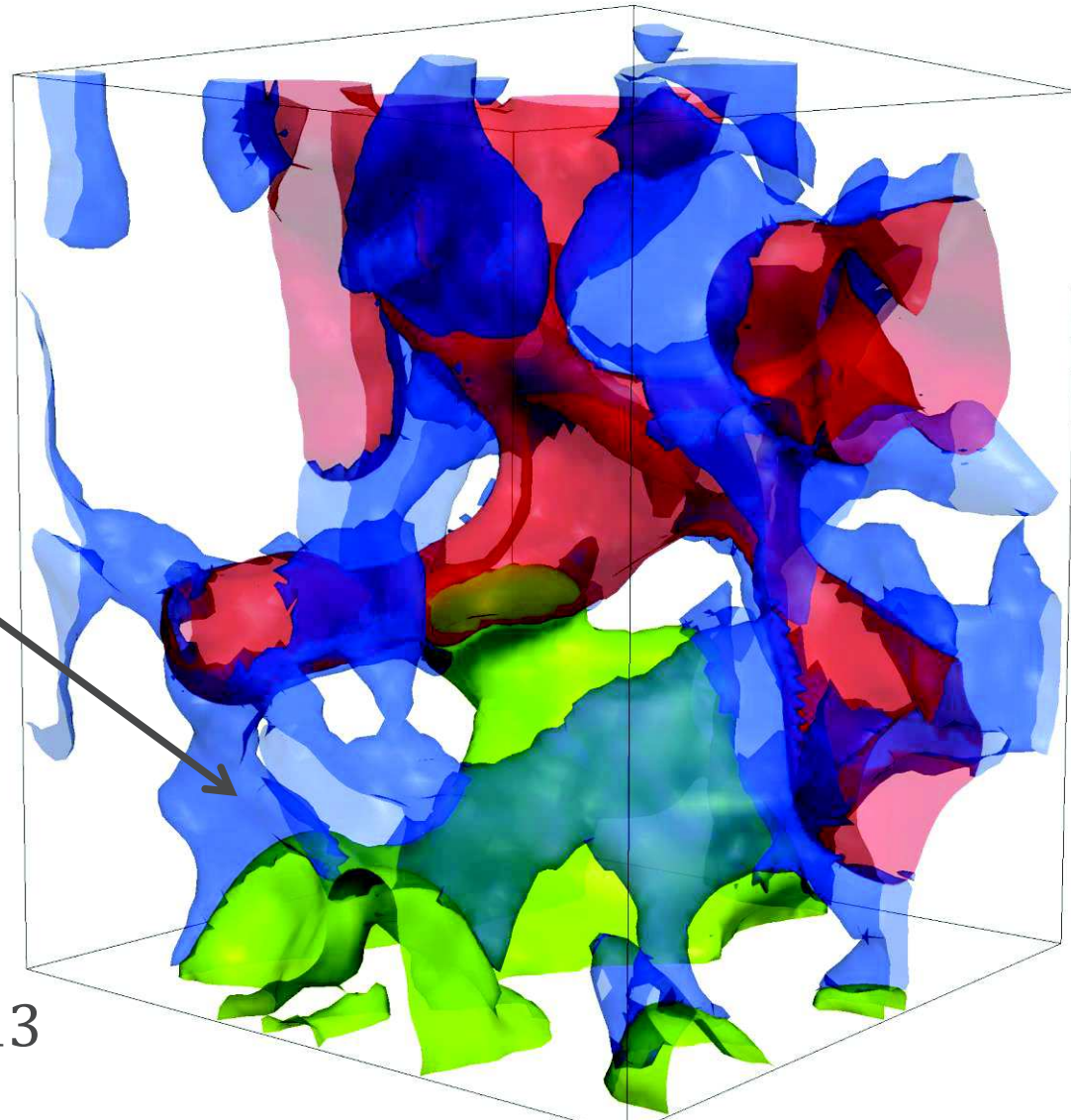
Oil and gas retract to larger Pore openings after water invaded throat

(unstable)

$$P_{cow} = 1.07 \text{ kPa}$$

$$P_{cgo} = 0.76 \text{ kPa}$$

$$S_{wi} = 0.13$$



# SWAG invasion



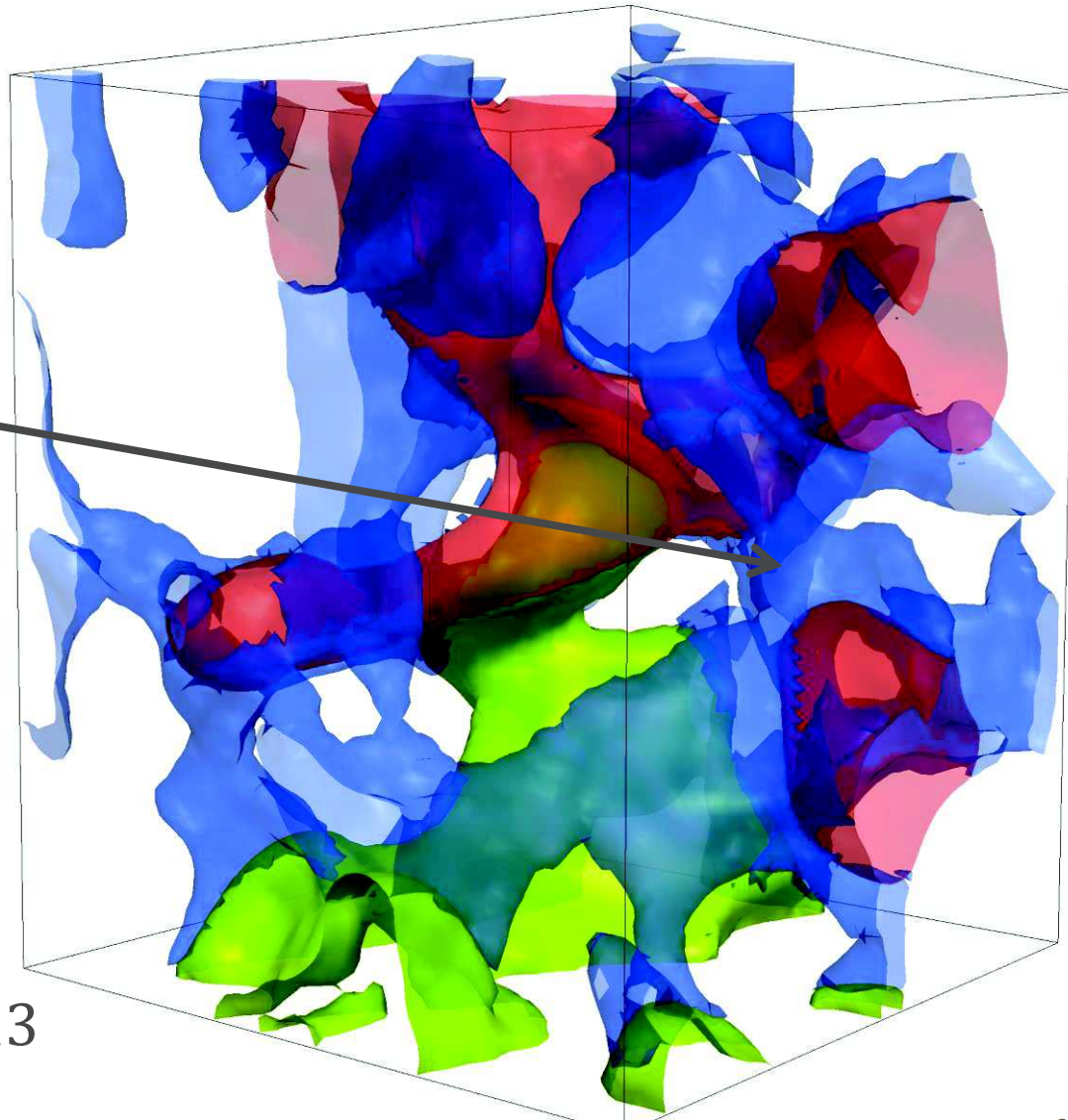
Oil retracts to larger pore openings after water occupied throat due to 2-phase snap-off event

(unstable)

$$P_{cow} = 1.07 \text{ kPa}$$

$$P_{cgo} = 0.76 \text{ kPa}$$

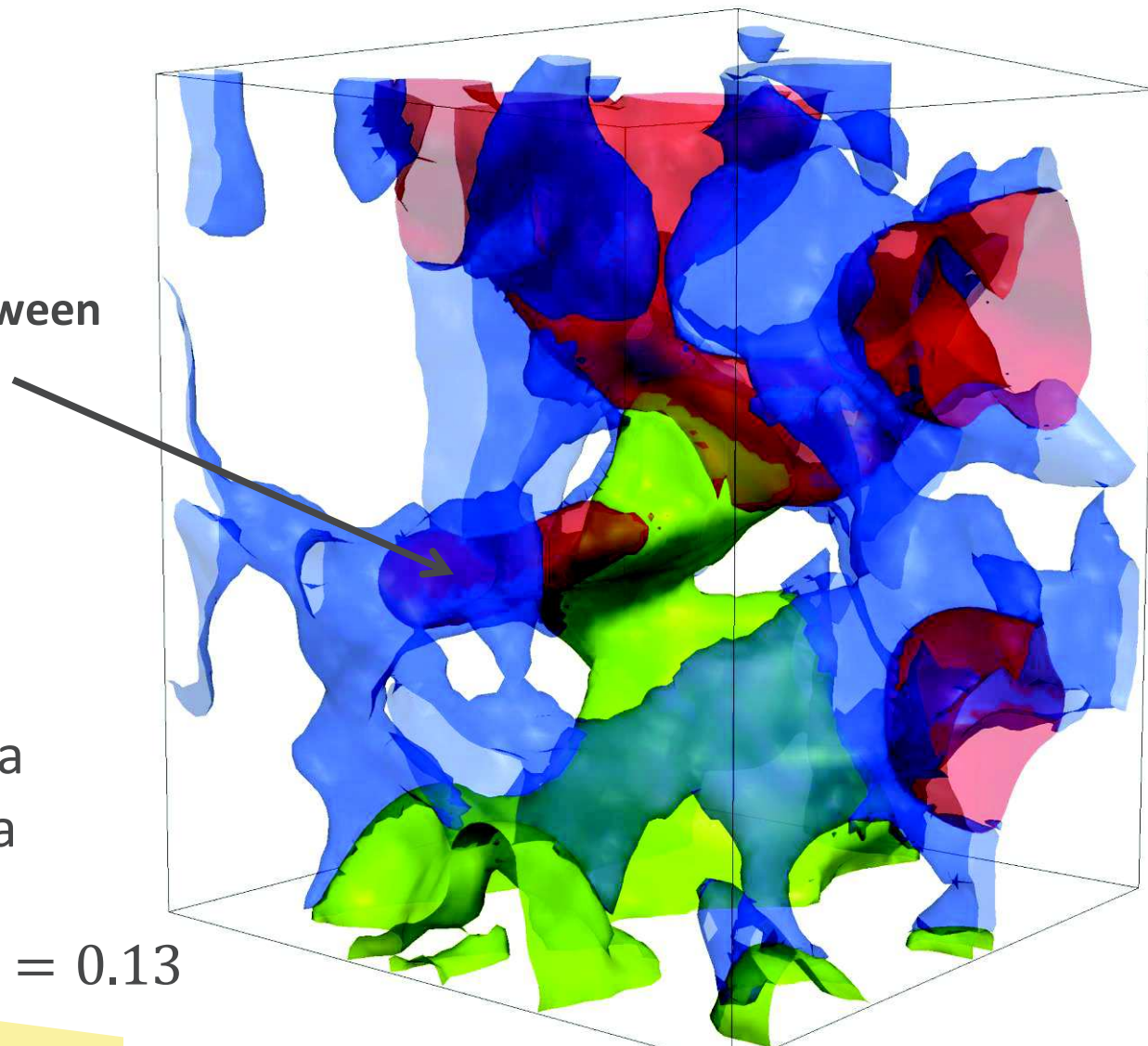
$$S_{wi} = 0.13$$



# SWAG invasion



Oil isolated between  
water and gas



(unstable)

$$P_{cow} = 1.07 \text{ kPa}$$

$$P_{cgo} = 0.76 \text{ kPa}$$

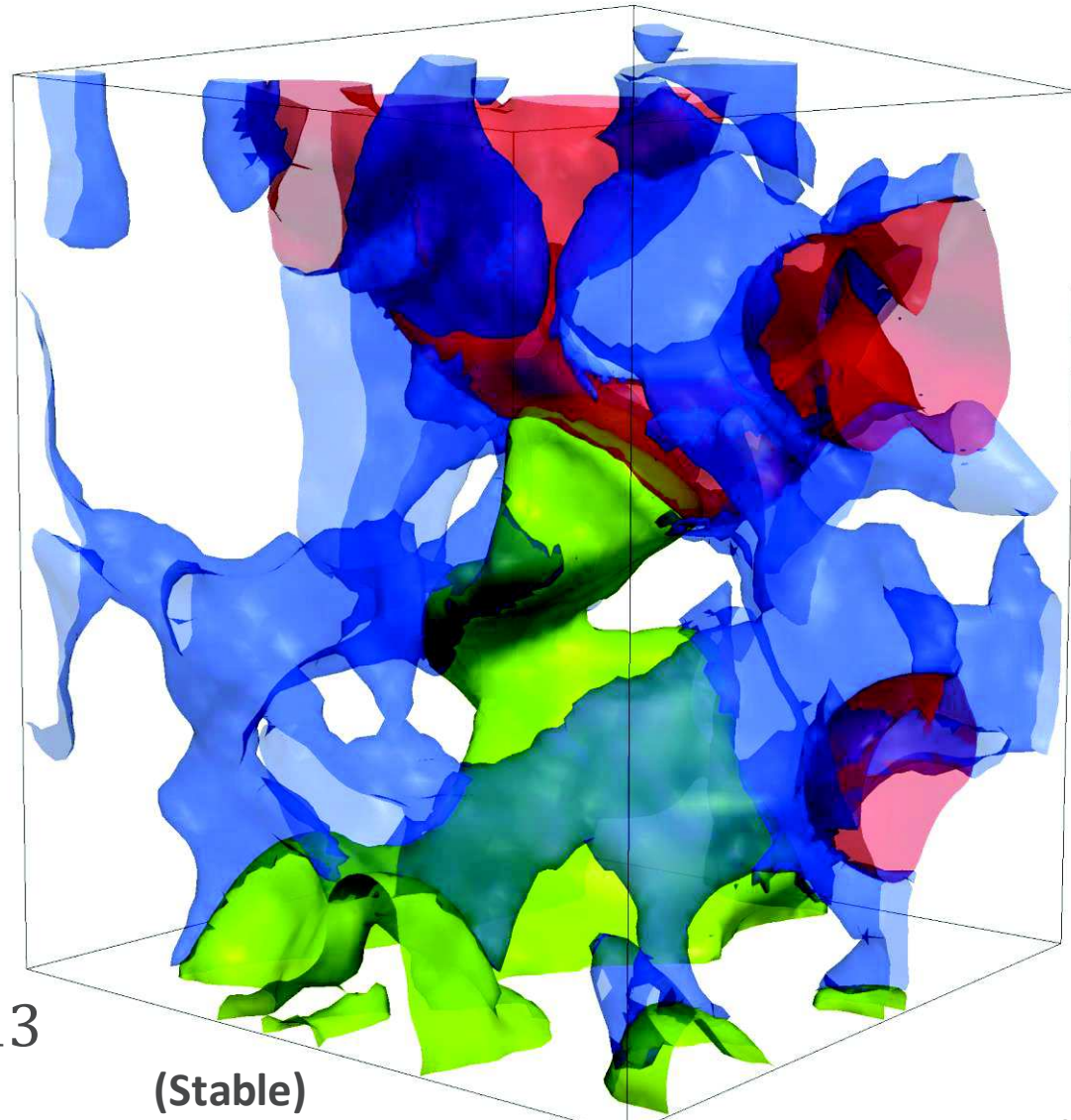
$$S_{wi} = 0.13$$

# SWAG invasion

$$P_{cow} = 1.07 \text{ kPa}$$
$$P_{cgo} = 0.76 \text{ kPa}$$

$$S_{wi} = 0.13$$

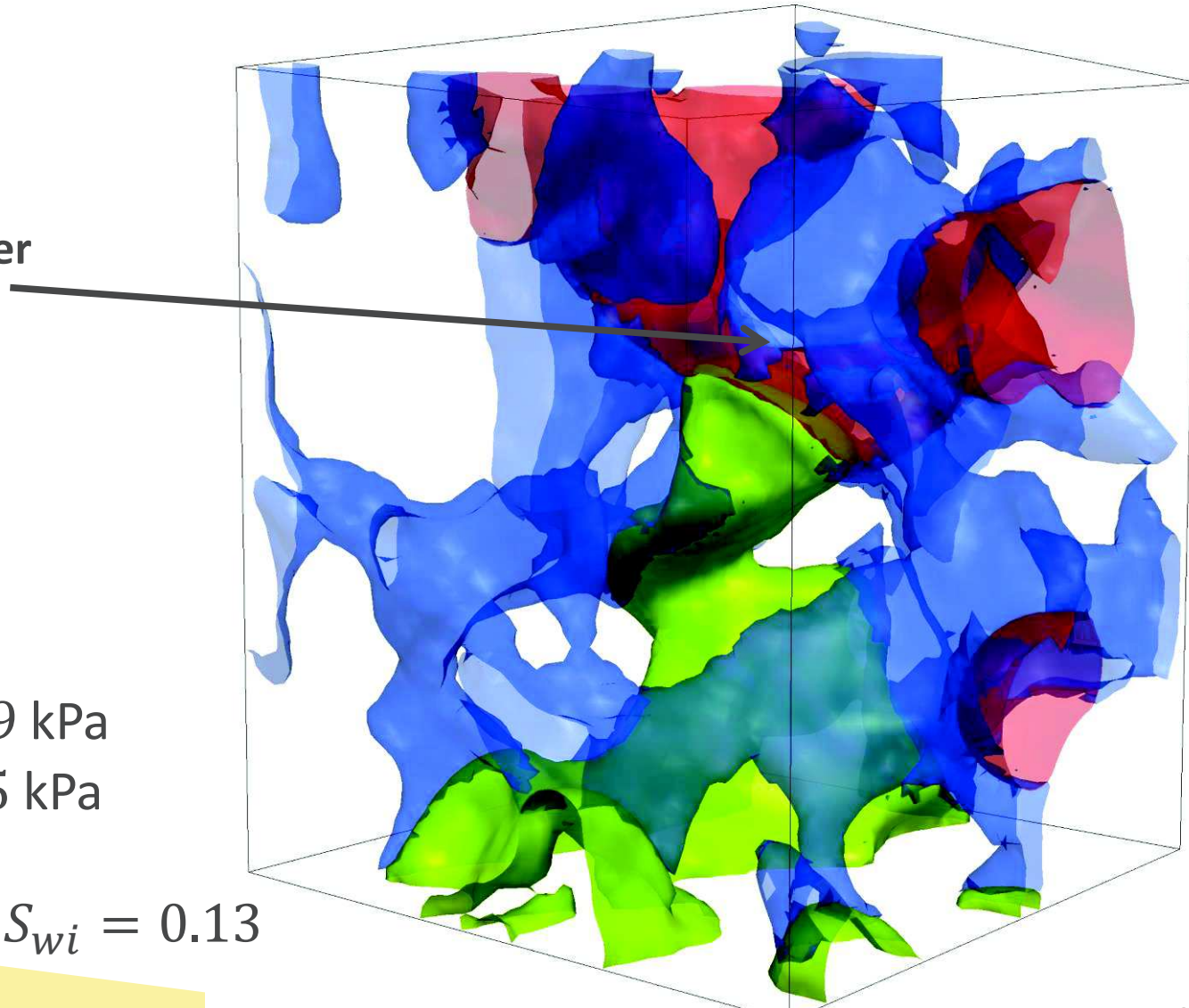
(Stable)



# SWAG invasion



Thickness of water layer increases



(unstable)

$$P_{cow} = 0.89 \text{ kPa}$$

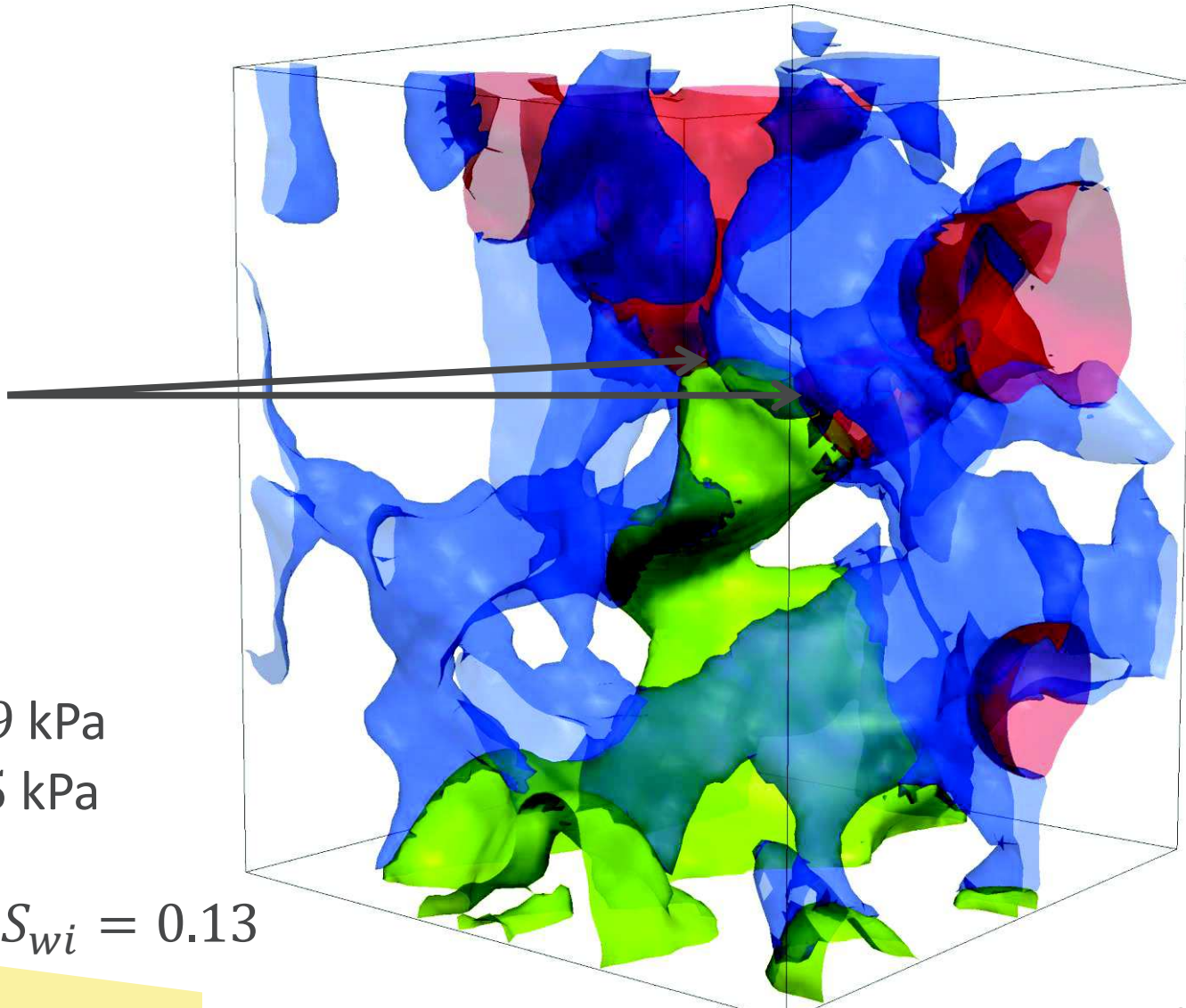
$$P_{cgo} = 0.85 \text{ kPa}$$

$$S_{wi} = 0.13$$

# SWAG invasion



Gas/oil/water  
triple lines form



(unstable)

$$P_{cow} = 0.89 \text{ kPa}$$

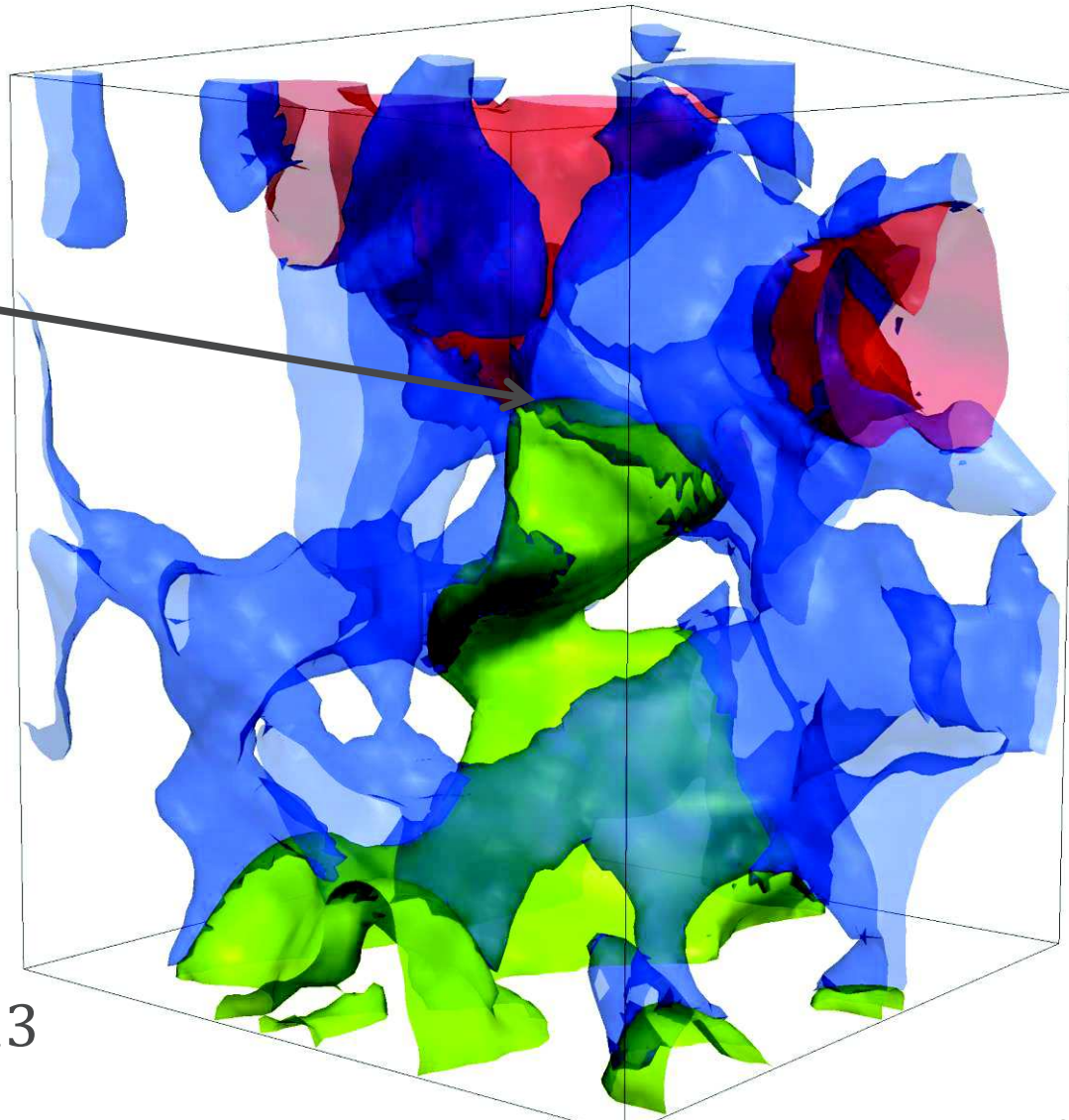
$$P_{cgo} = 0.85 \text{ kPa}$$

$$S_{wi} = 0.13$$

# SWAG invasion



«3-phase snap-off» occurs as a result of water-cusp growth at the gas/oil/water triple lines



(unstable)

$$P_{cow} = 0.89 \text{ kPa}$$

$$P_{cgo} = 0.85 \text{ kPa}$$

$$S_{wi} = 0.13$$

# SWAG invasion

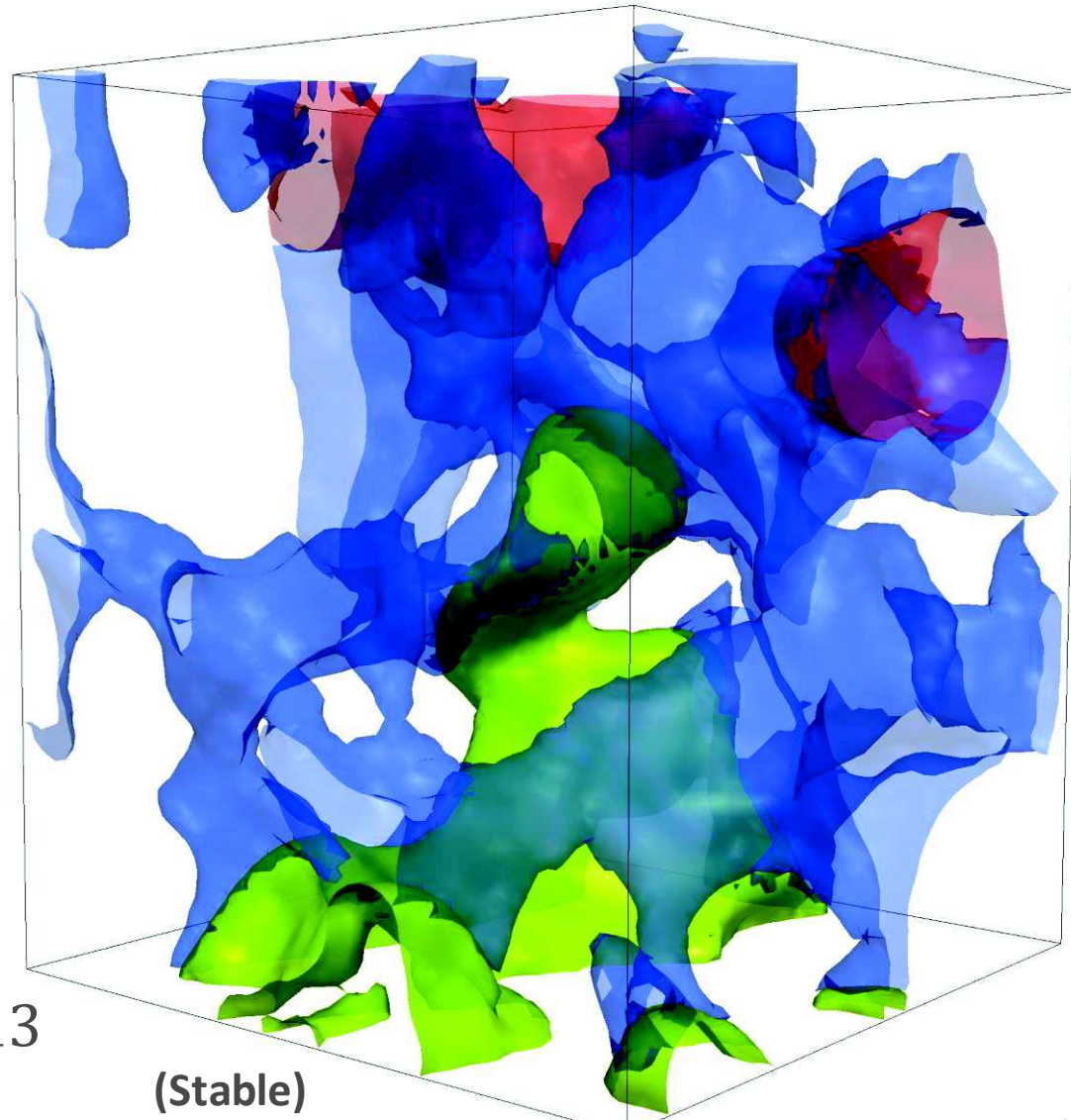


Gas and oil retract to larger pore openings

$$P_{cow} = 0.89 \text{ kPa}$$
$$P_{cgo} = 0.85 \text{ kPa}$$

$$S_{wi} = 0.13$$

(Stable)

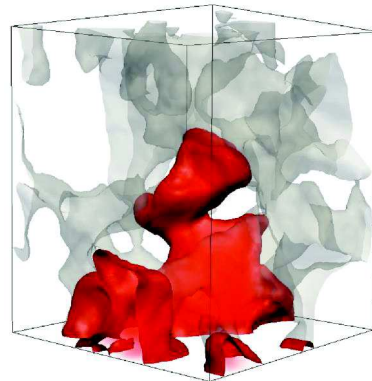


# 2-Phase Drainage and Imbibition

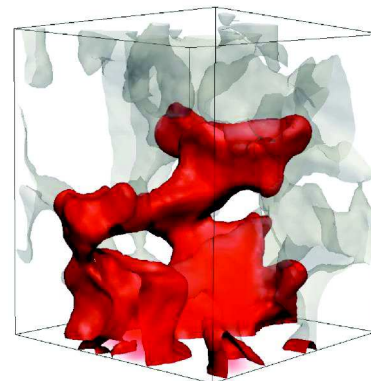
› Two-phase simulations with  $\theta_{ow} = 20^\circ$  (Jettestuen et al., WRR 2013)

Primary drainage:

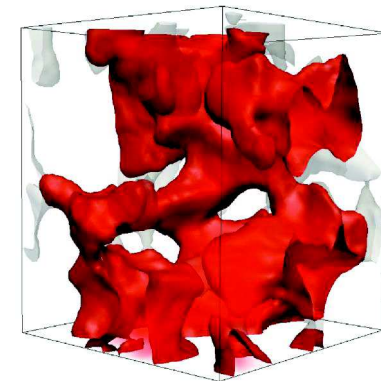
— = Oil  
— = Grains



$C_{ow} = 0.50$

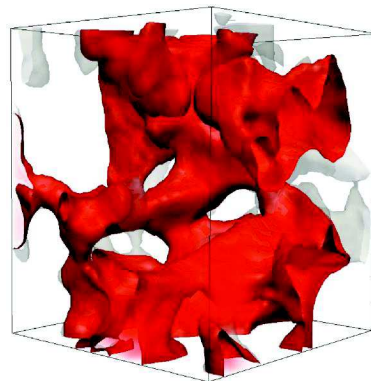


$C_{ow} = 0.60$



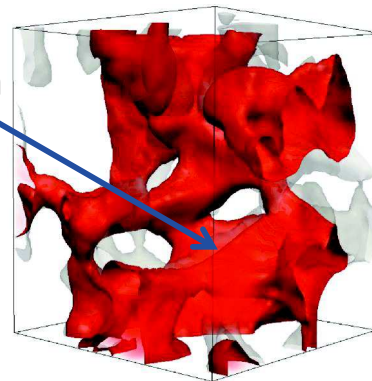
$C_{ow} = 0.70$

Imbibition:



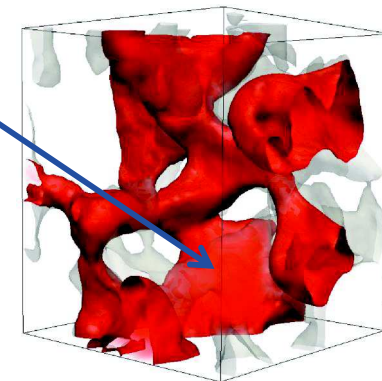
$C_{ow} = 0.40$

Water film



$C_{ow} = 0.30$

Snap-off occurred



$C_{ow} = 0.25$

- Non-wetting phase retracts to larger pore openings after growth of wetting-phase films has led to snap-off in pore-throat constrictions

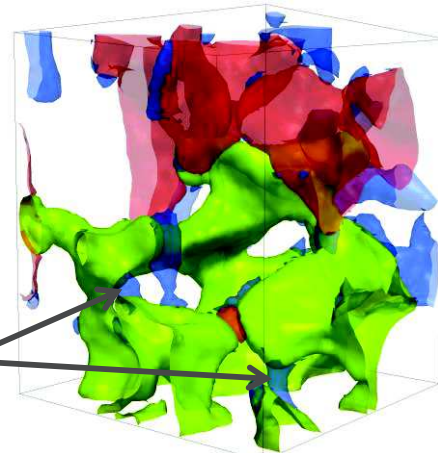
# 3-Phase Gas and Water Invasion



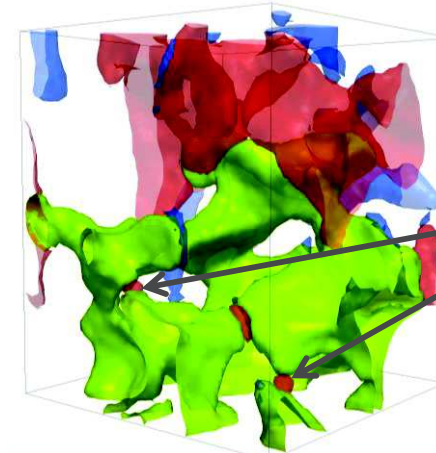
## › Gas invasion:

- Water
- Oil
- Gas

Trapped water



$$S_{wi} = 0.13$$



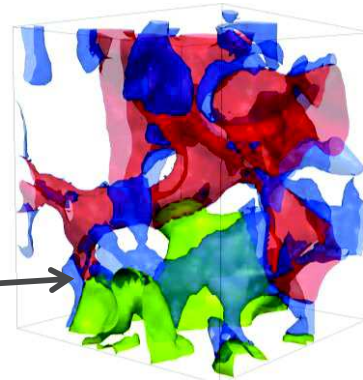
$$S_{wi} = 0.06$$

Trapped oil

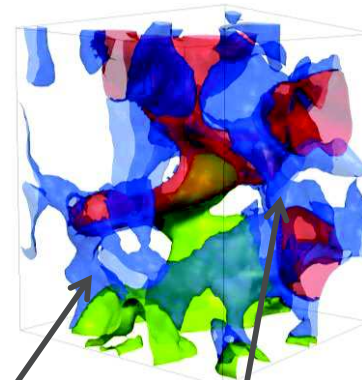
## › Simultaneous Gas & Water (SWAG) invasion:

$$S_{wi} = 0.13$$

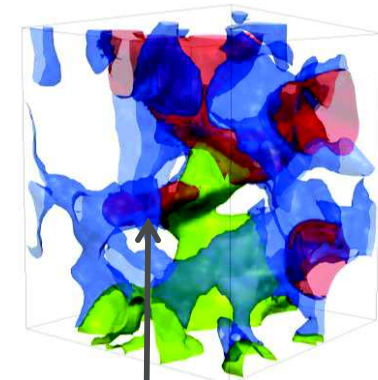
Water cusp growth at gas/oil interface



Water snap-off on gas/oil interface



2-phase snap-off

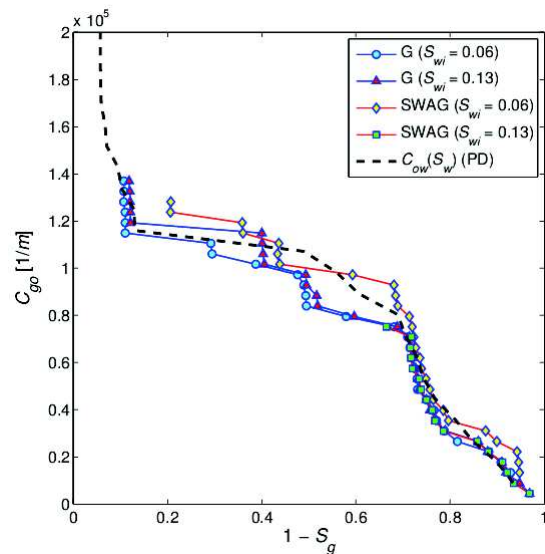


Disconnected oil

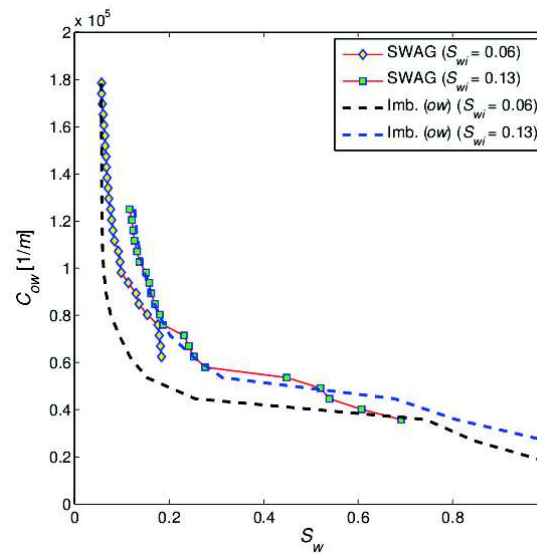
# 3-Phase vs. 2-phase Capillary Pressure Curves (Water-wet case)



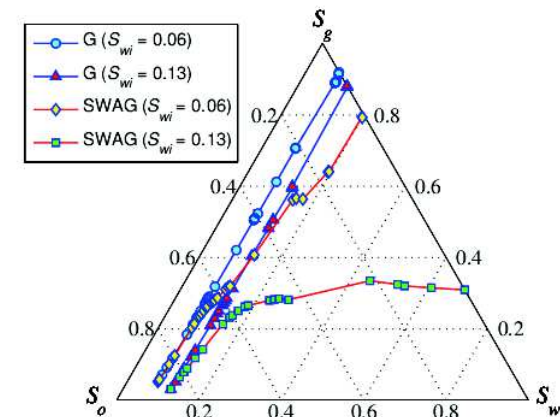
Gas/Oil capillary pressure:



Oil/water capillary pressure:



Saturation paths:



$P_{cgo}$  increases with  $S_{wi}$ :

- › Gas prefer to displace oil
- › Water blocks pathways for gas/oil displacement

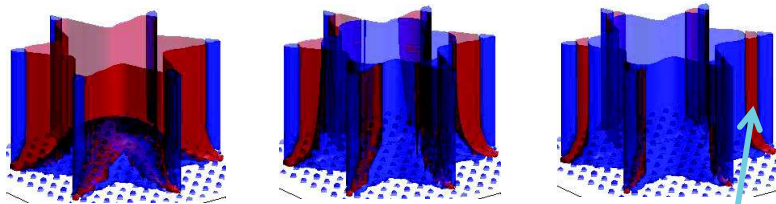
$P_{cow}$  can be higher in presence of gas:

- › Water snap-off on gas/oil interfaces occurs at higher  $P_{cow}$  than water snap-off of oil (2-phase).

# Mixed Wettability

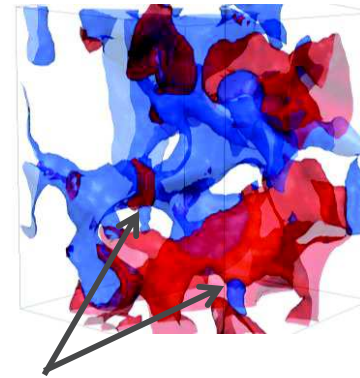


## › 2-phase water invasion:

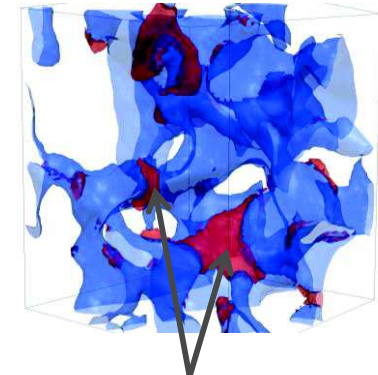


Water-filled, water-wet «porous plate» at water inlet (blue dots).

Oil layers

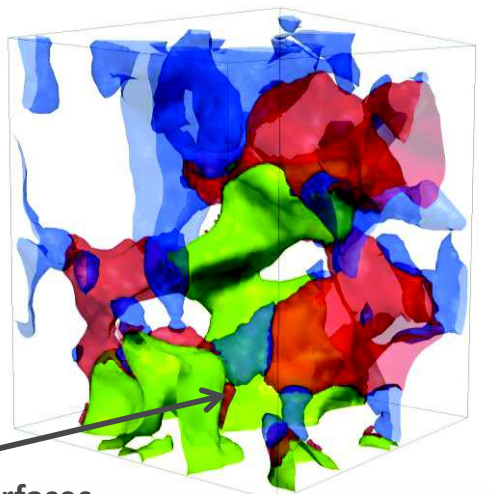


Pinned contact lines

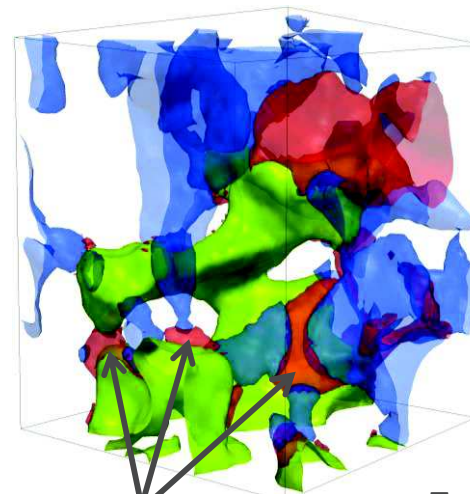


Oil layers

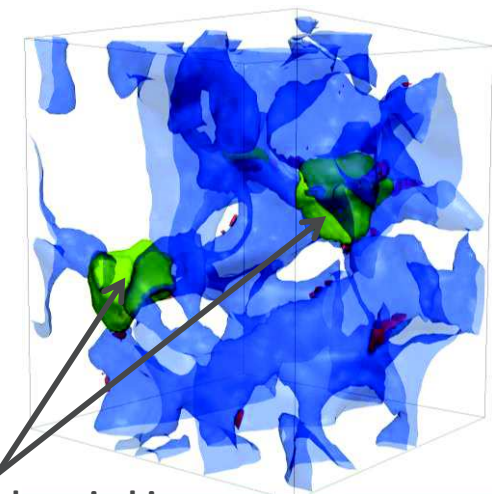
## › 3-phase SWAG invasion:



Oil cusps at gas/water interfaces



Oil layers



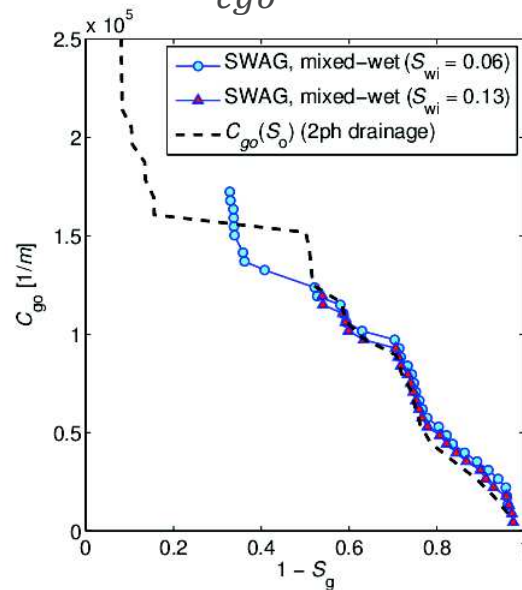
Trapped gas in big pores surrounded by oil cusps & water

# 3-Phase vs. 2-phase Capillary Pressure Curves

(«Mixed- to Oil-wet» case)

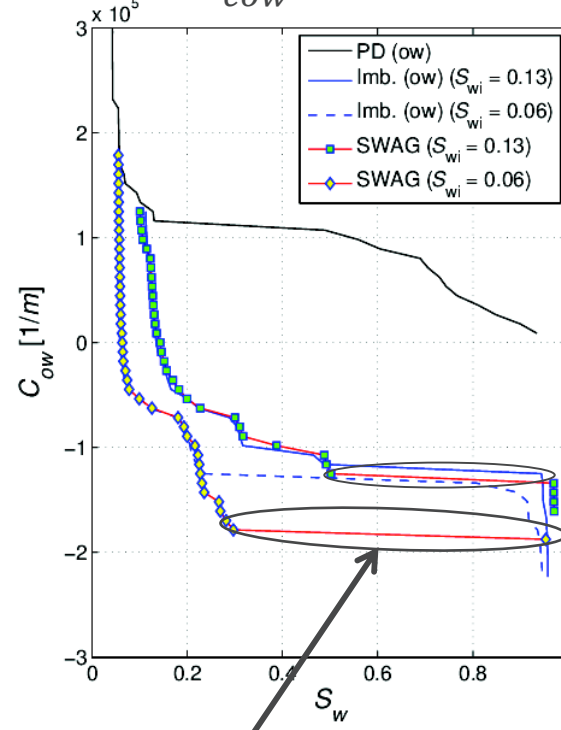


$P_{cgo}$ -curves:



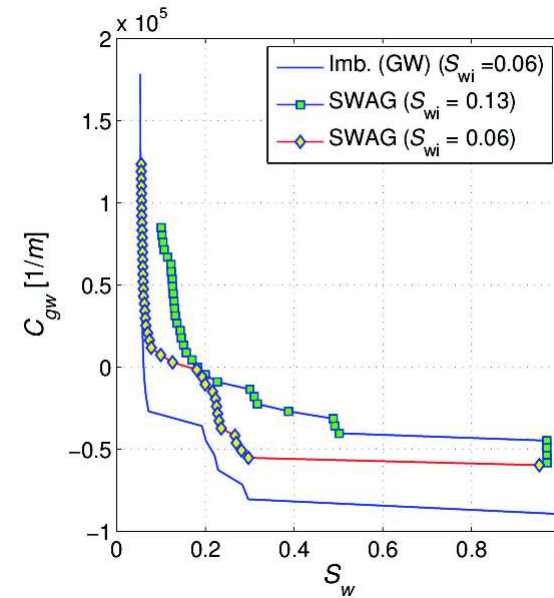
2- and 3-phase curves are similar for high oil saturations.

$P_{cow}$ -curves:



Water displaces gas, with oil cusps/films present.

$P_{cgw}$ -curves:



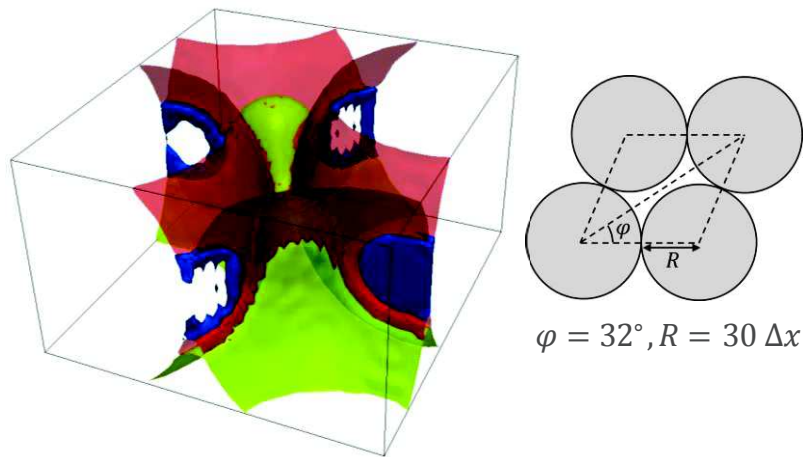
$P_{cgw}$ (3-phase)  $\rightarrow$   $P_{cgw}$ (2-phase) as  $P_{cgo}$  increases and  $P_{cow}$  decreases (oil saturation decreases)

# Validation on idealized geometries



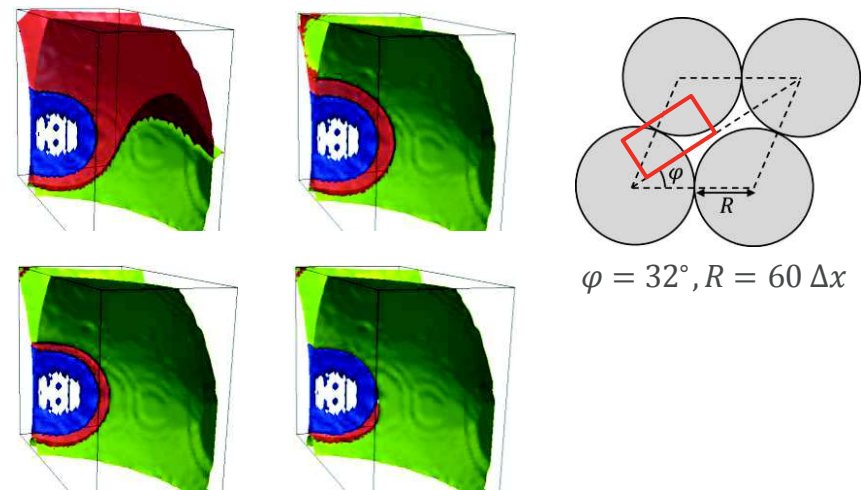
- › Gas invasion into a water-wet sphere-pack pore throat
- › Simulated entry pressure agree with analytic solution (MS-P/Purcell)
- › Need for **Adaptive Grid Refinement**

Coarse grid:



- Oil layers vanish and triple lines form during gas invasion.
- Error (MS-P/Purcell) < 2 %.

Fine grid:



- Oil layers exist after gas invasion
- Error (MS-P/Purcell) < 3.9 %.
- Thickness of water ring depends on which fluid it contacts.

# Volume-preserving motion of isolated ganglia IRIS

- › Capillary trapping (2- and 3-phase flow)
- › Double and multiple displacement events (3-phase flow)
  - Example: Gas → disconnected oil → water
- › The pressure of the preserved phase volume is calculated as

$$p_i = \frac{V_i^{target} - V_i^n}{\Delta t A_i^n}$$

where:

$V_i^{target}$  = Initial or desired volume of phase  $i$

$V_i^n$  = Volume of phase  $i$  in time iteration  $n$

$A_i^n$  = Surface area of phase  $i$  in time iteration  $n$

$\Delta t$  = Time step

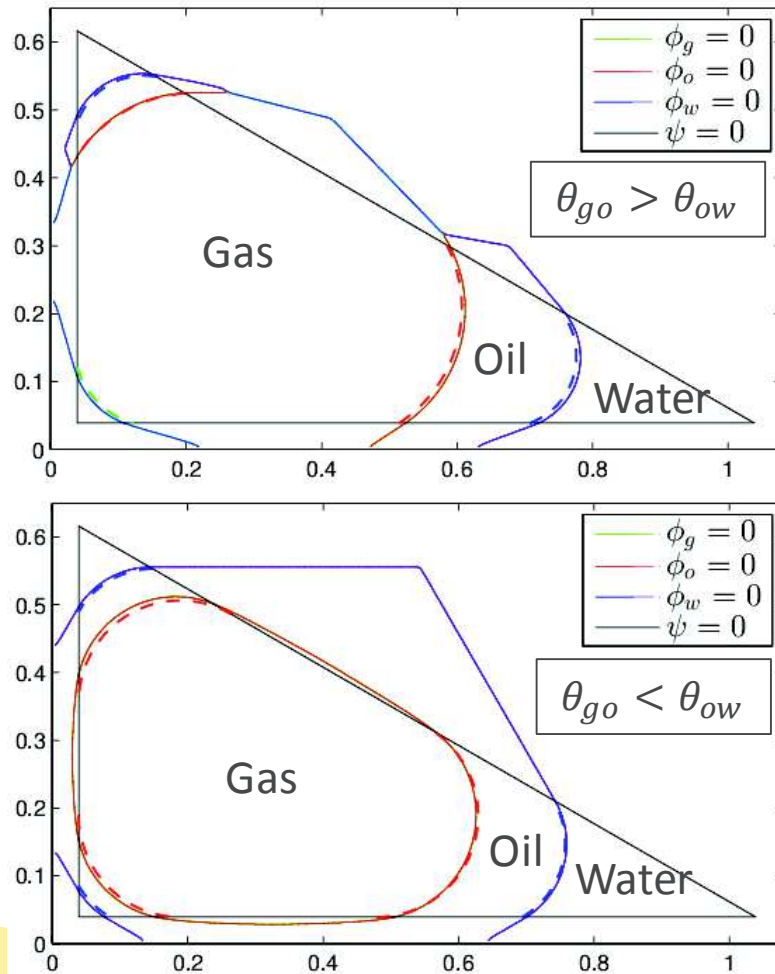
- › The  $p_i$ -term grows or shrinks phase  $i$  equally around its boundary

(Saye & Sethian, PNAS, 2011)

# Volume-preserving motion - Validation

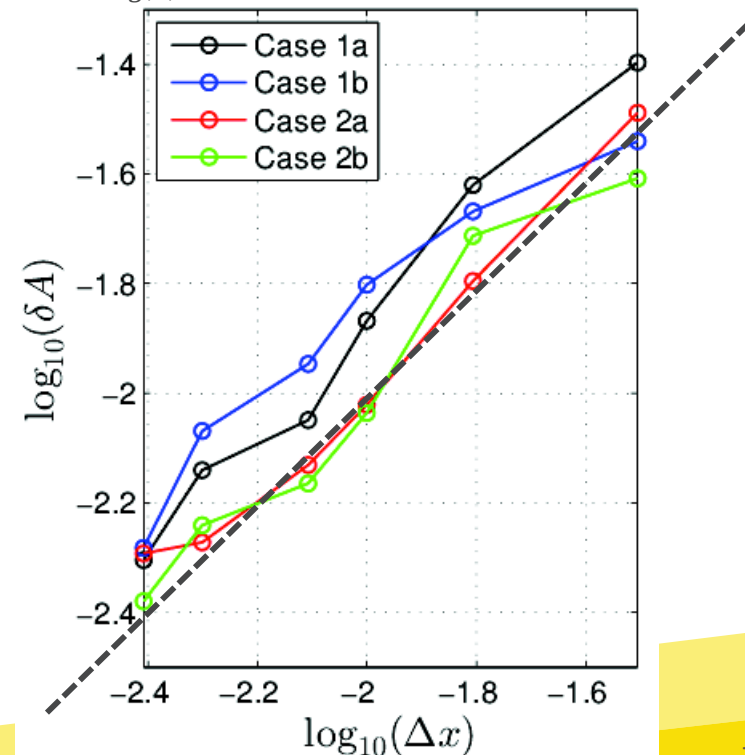


› Tests of «oil-volume targeting» in right-angled triangle



- Analytic solutions (dashed curves)
- Error scales linearly with grid spacing,  $\delta A \sim \Delta x$ :

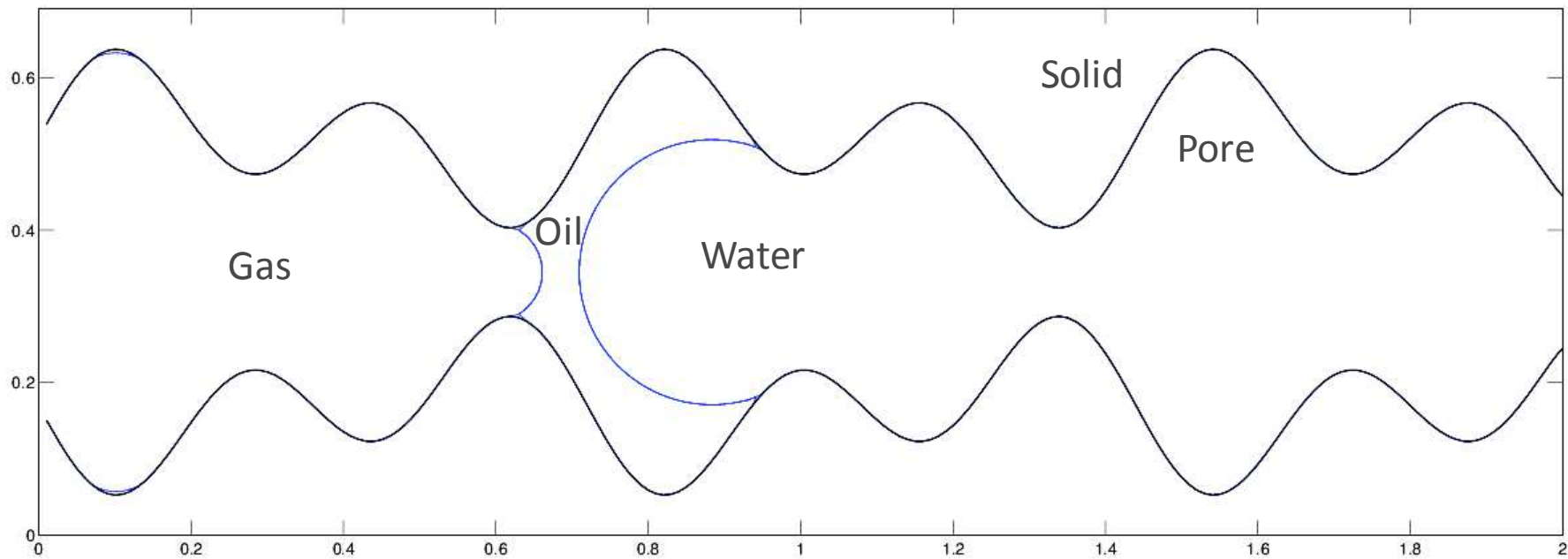
$$\delta A = \frac{1}{2} \sum_{i=g,o,w} \int_{\Omega} \frac{H(\psi) |H(\phi_{i,true}) - H(\phi_i)|}{L_i} dV$$



# Volume-preserving motion – Sinusoidal Pore



- › Double displacement (Gas  $\rightarrow$  isolated oil  $\rightarrow$  water):
- › Oil-wet condition
- › Behavior between 2 stable configurations

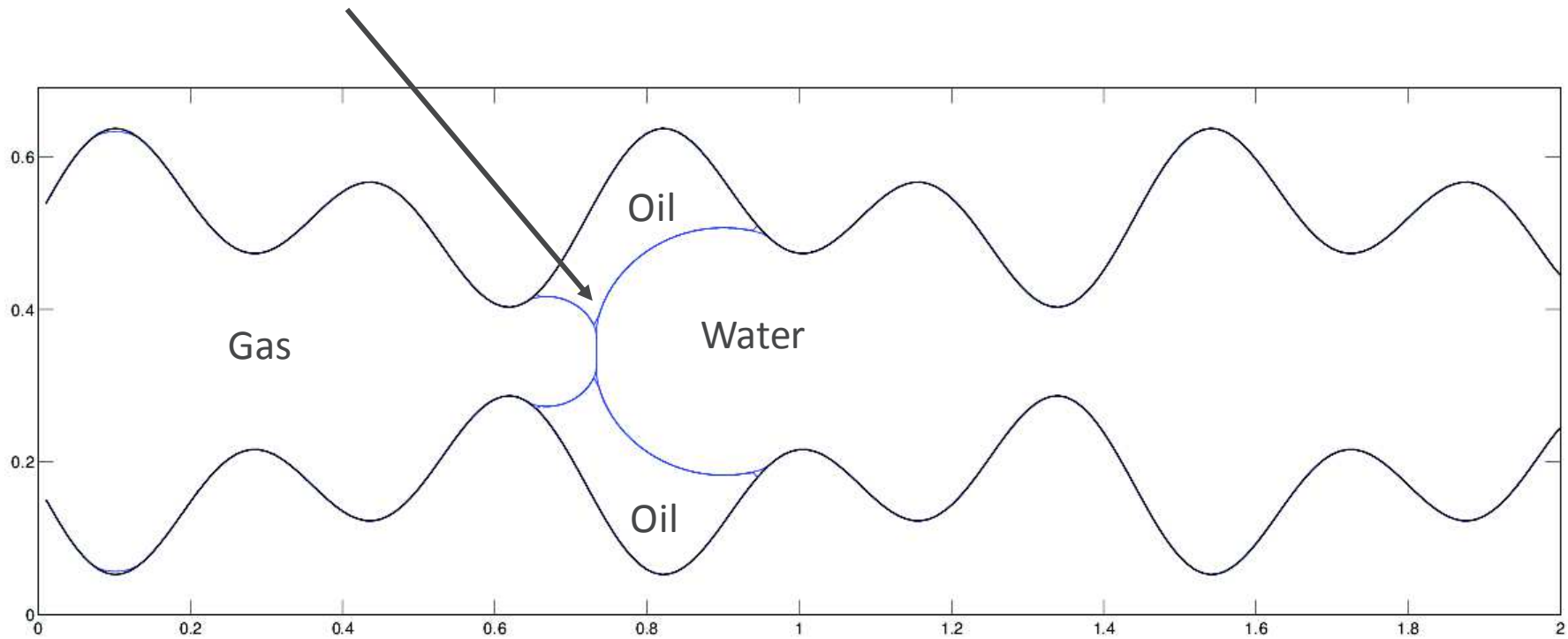


Stable configuration

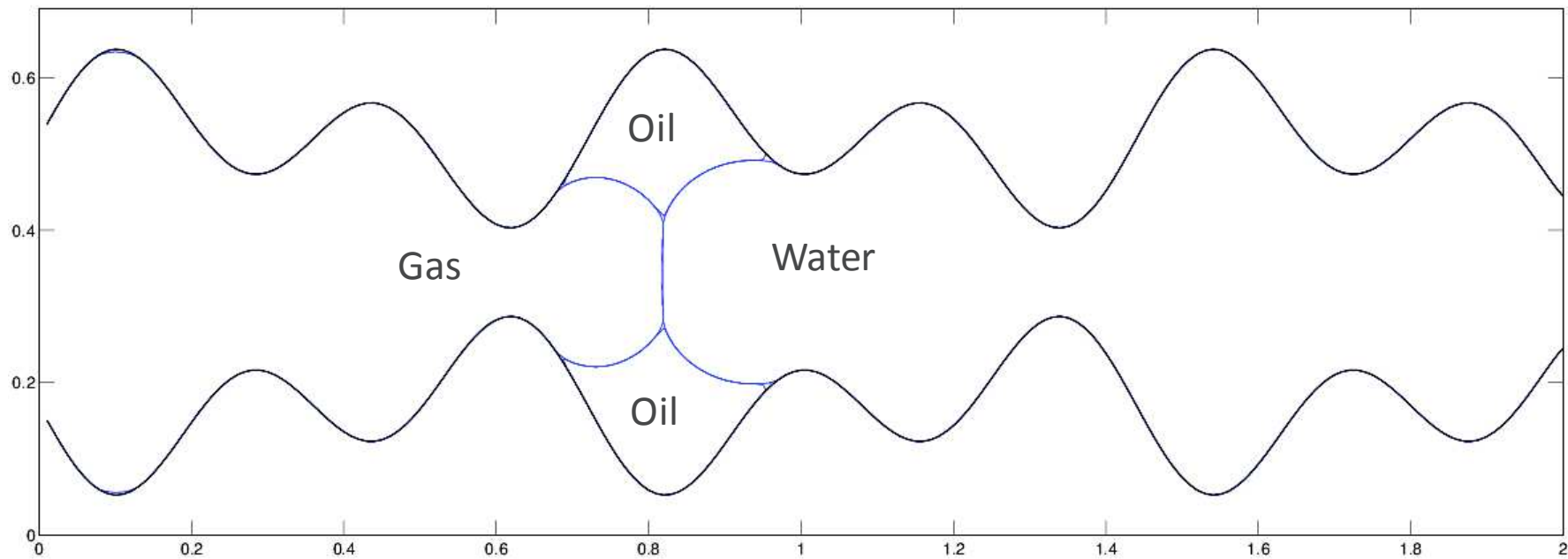
# Volume-preserving motion – Sinusoidal Pore



Triple lines & gas/water interface form



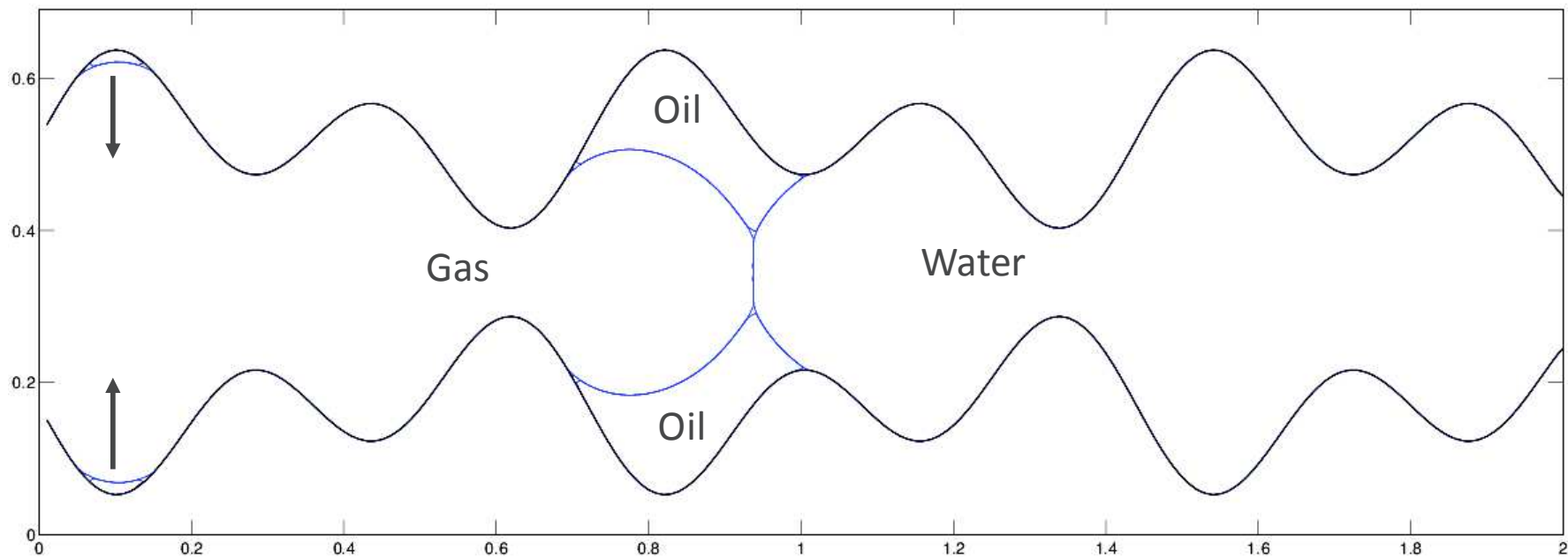
# Volume-preserving motion – Sinusoidal Pore



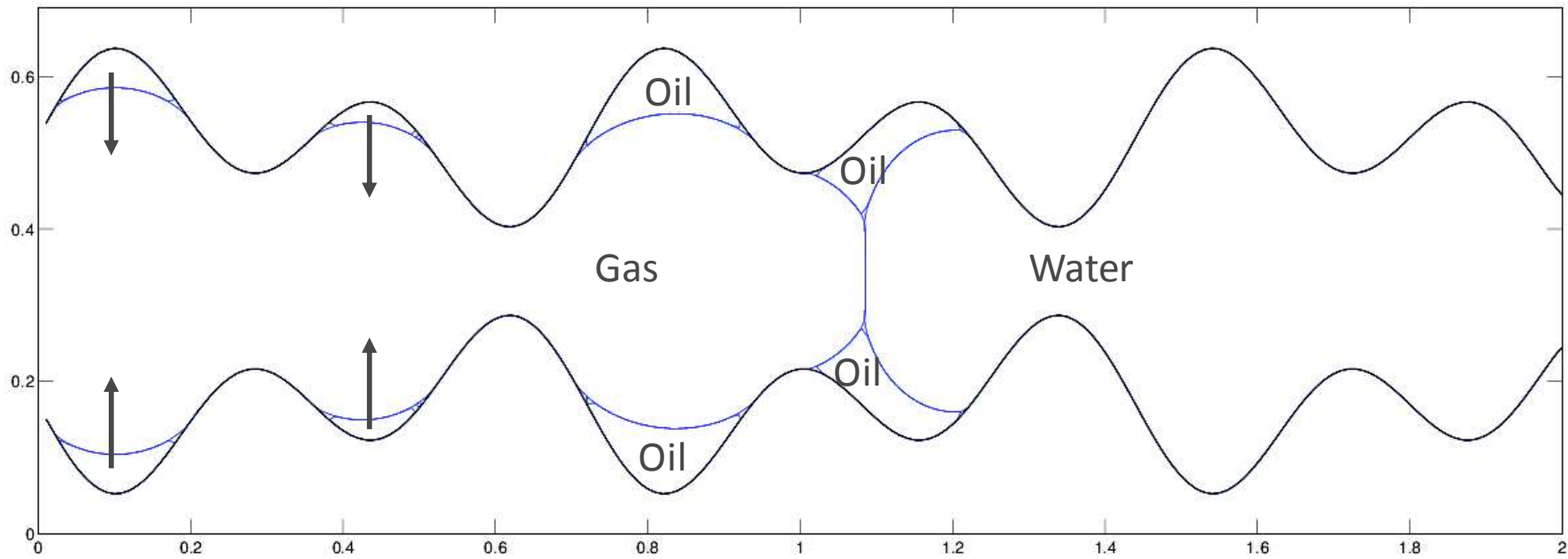
# Volume-preserving motion – Sinusoidal Pore



Gas retracts in corners behind the front.



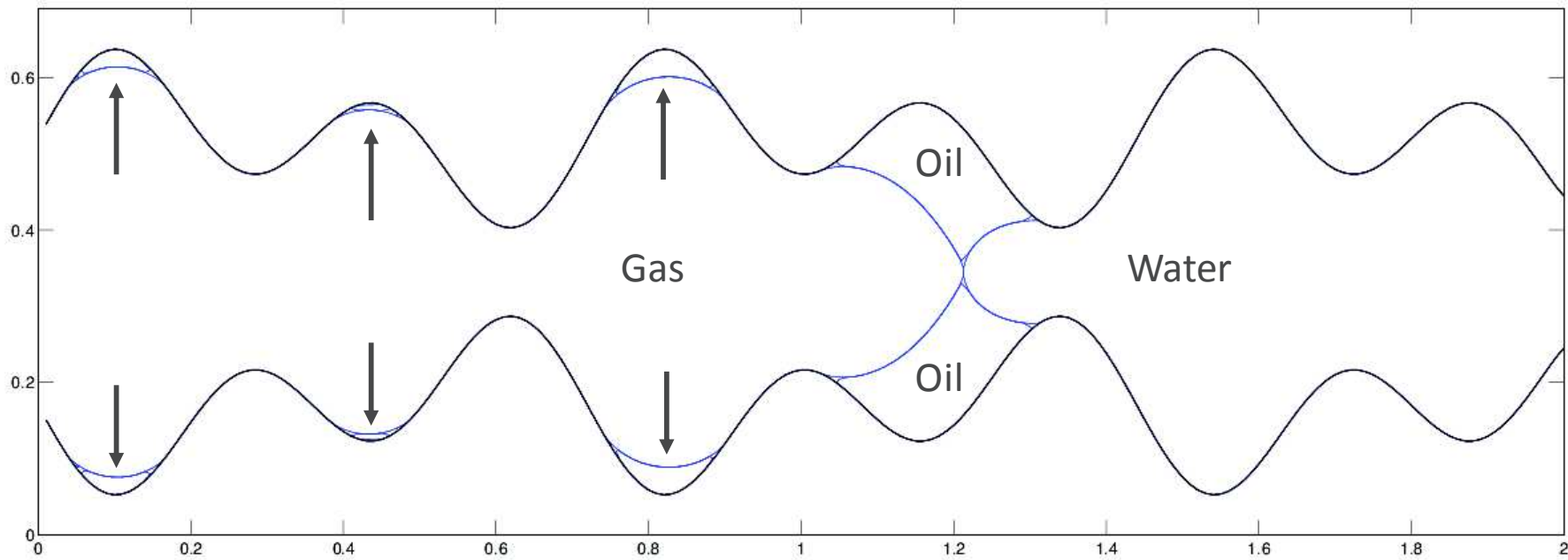
# Volume-preserving motion – Sinusoidal Pore



# Volume-preserving motion – Sinusoidal Pore



Gas invades corners behind the front.

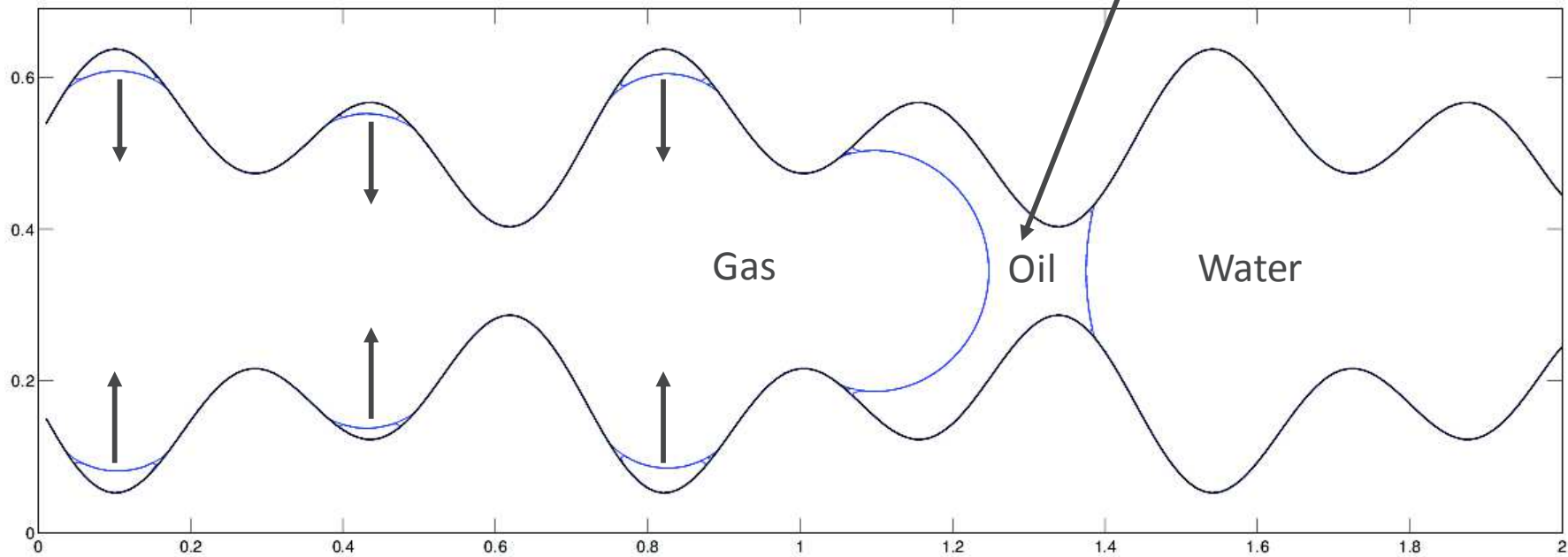


# Volume-preserving motion – Sinusoidal Pore

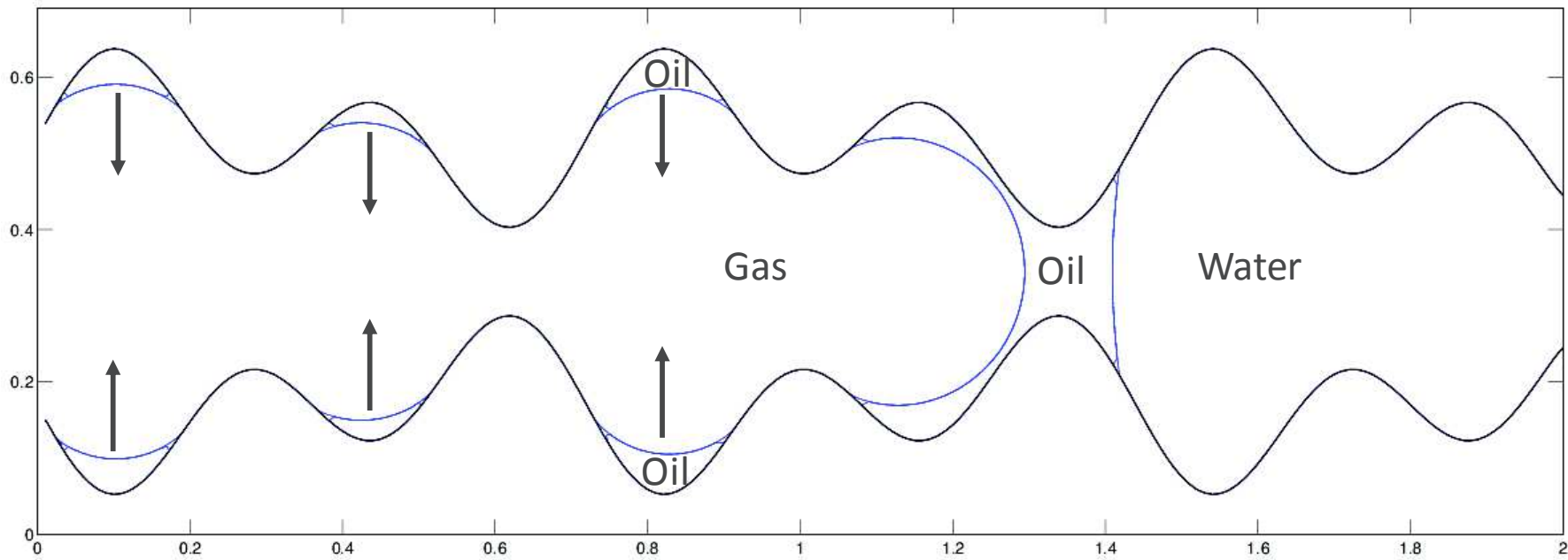


Gas retracts in corners behind the front.

Oil snap-off on gas/water interface



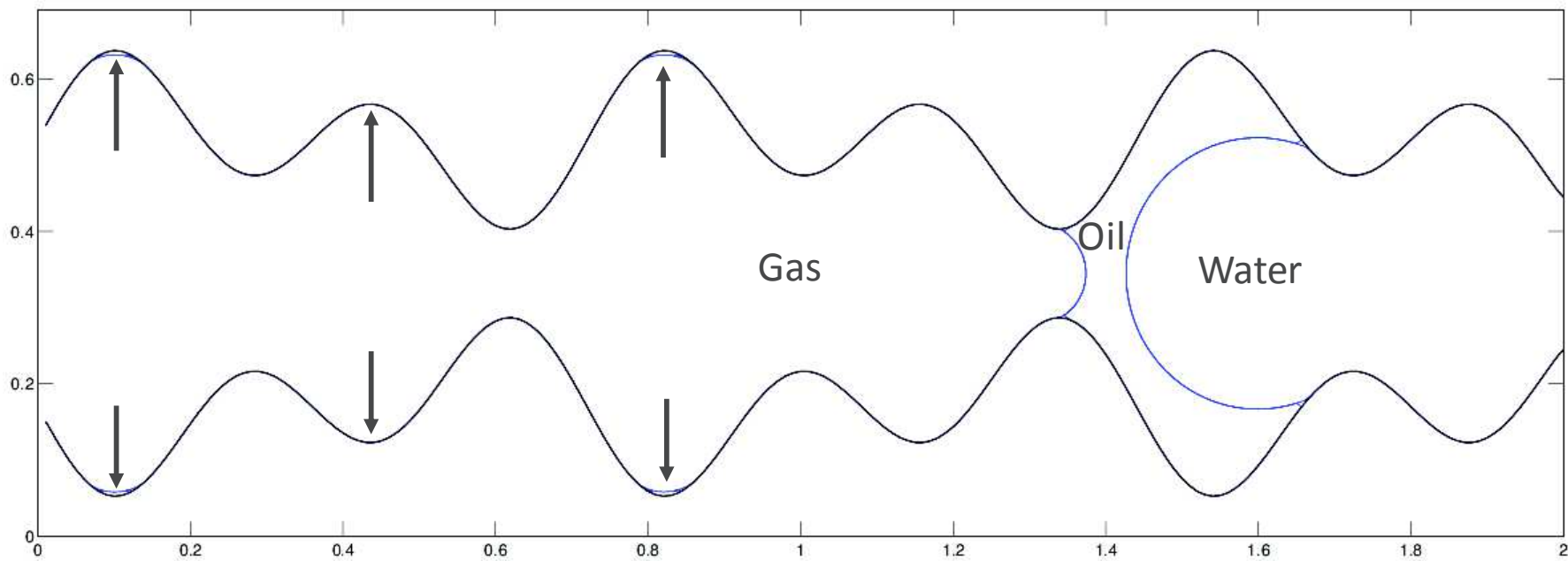
# Volume-preserving motion – Sinusoidal Pore



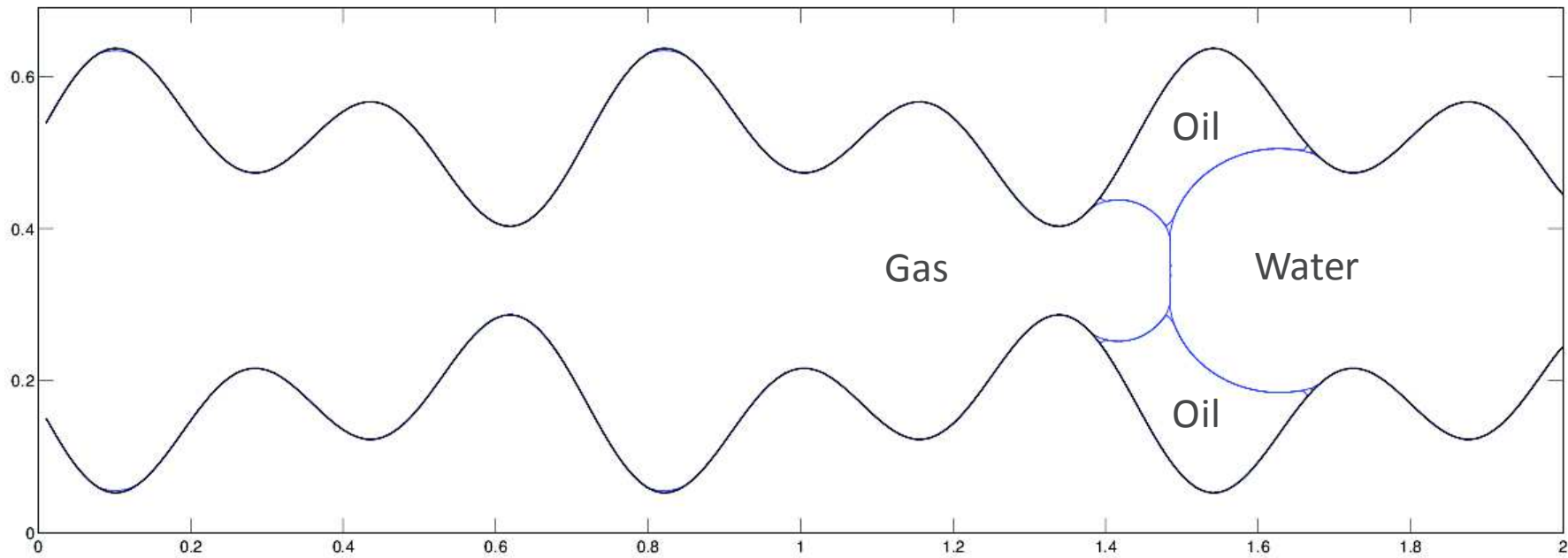
# Volume-preserving motion – Sinusoidal Pore



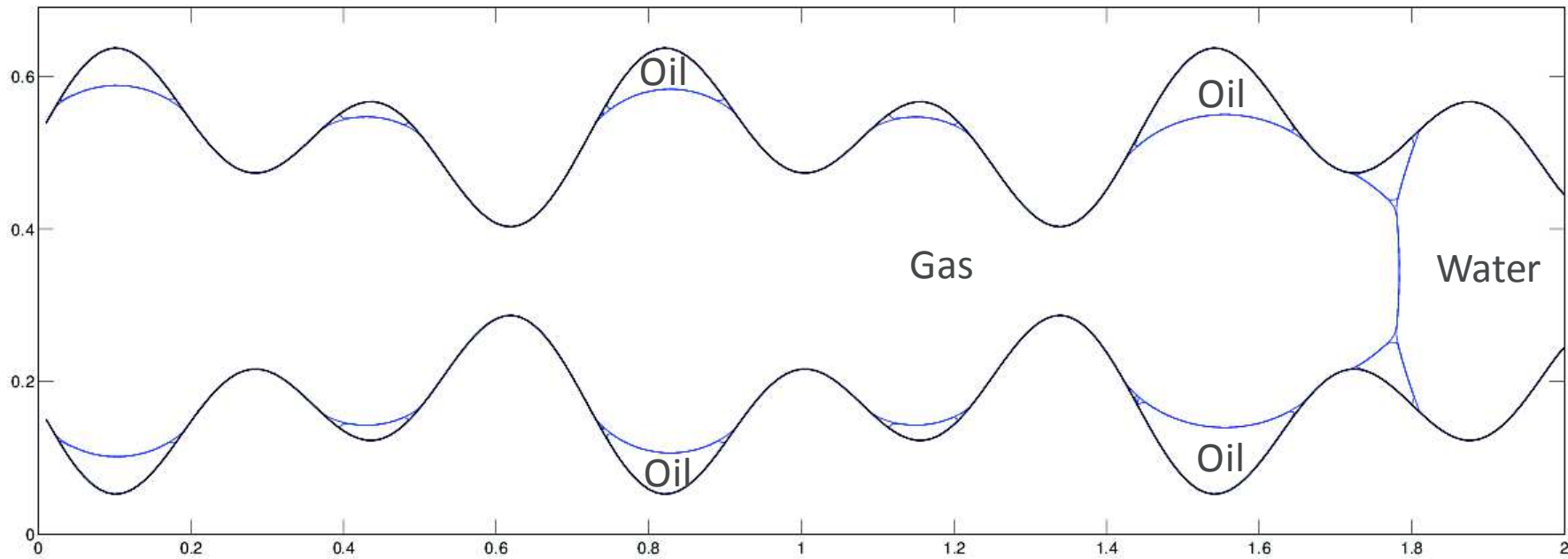
Gas invades the corners when the front is at narrow constriction.



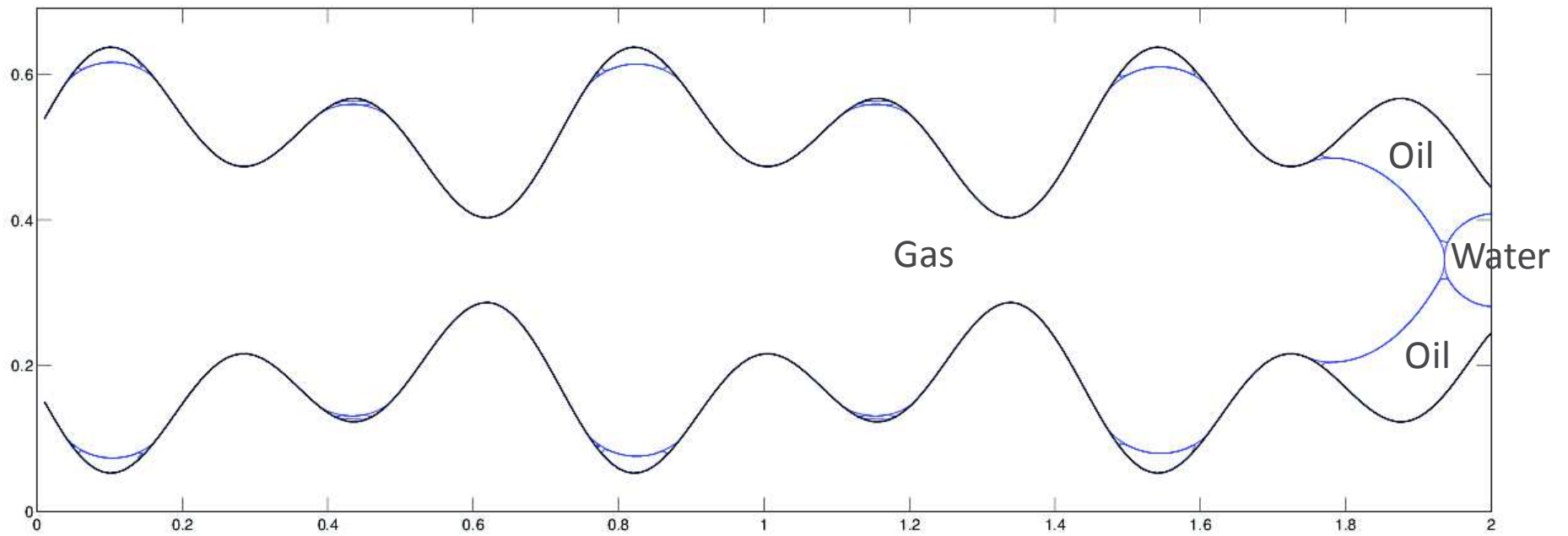
# Volume-preserving motion – Sinusoidal Pore



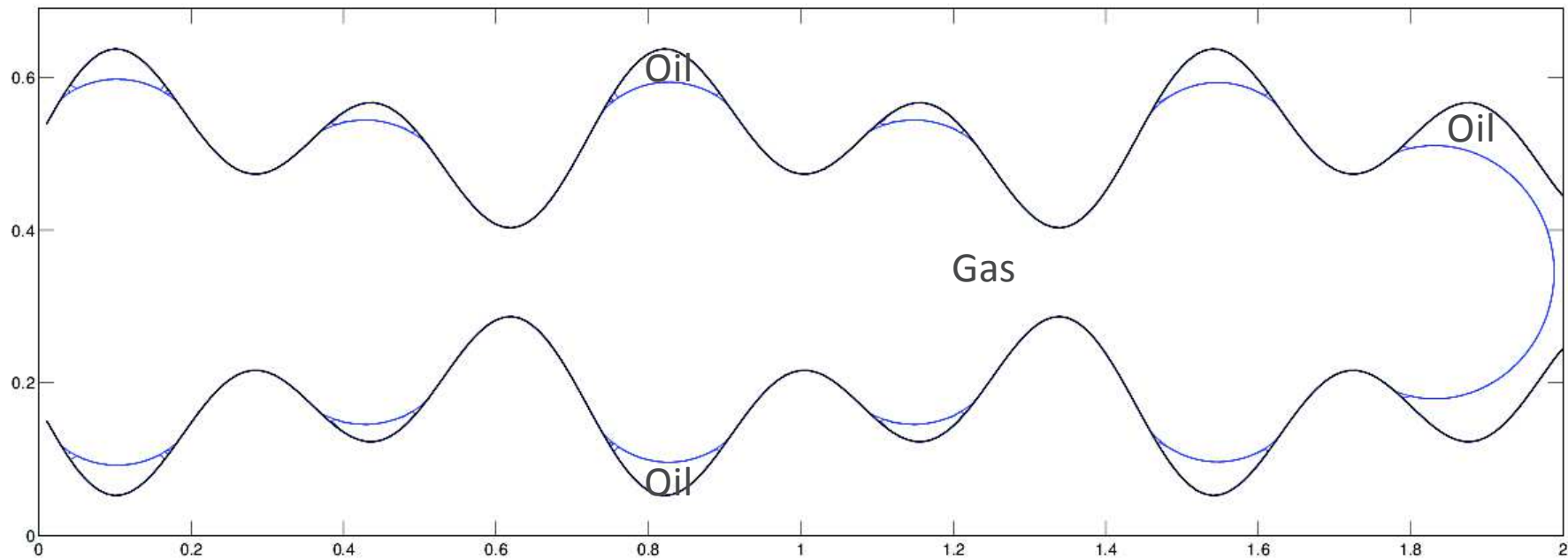
# Volume-preserving motion – Sinusoidal Pore



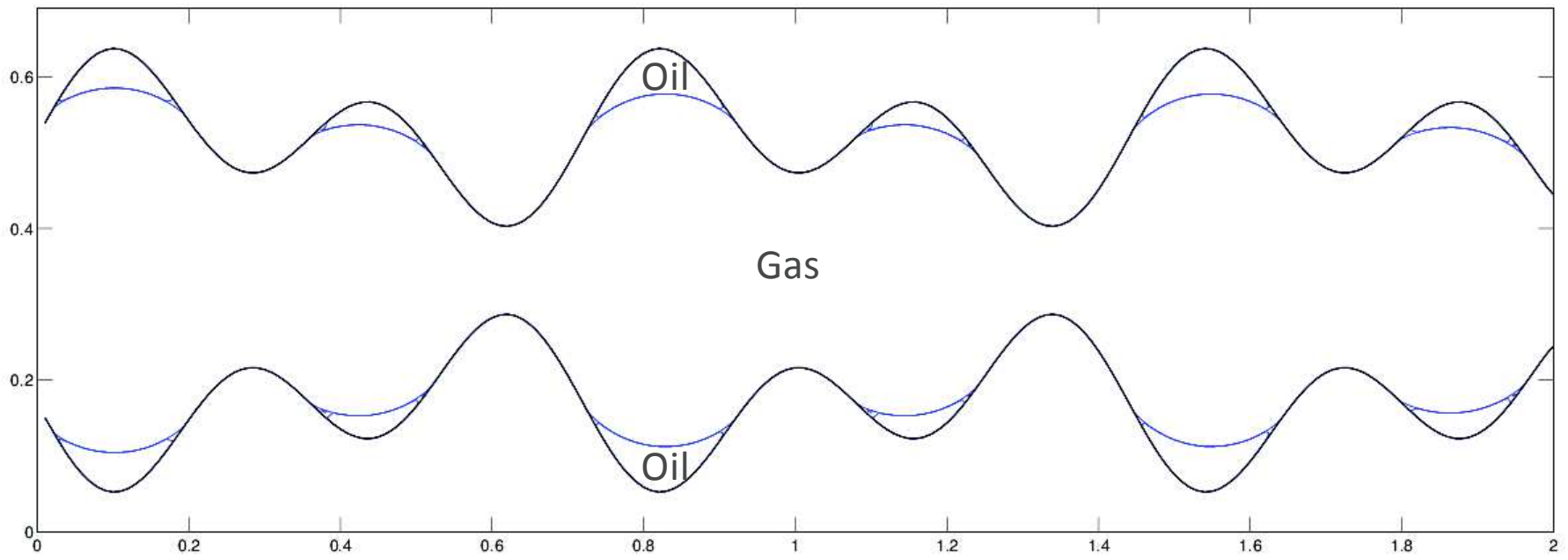
# Volume-preserving motion – Sinusoidal Pore



# Volume-preserving motion – Sinusoidal Pore



# Volume-preserving motion – Sinusoidal Pore

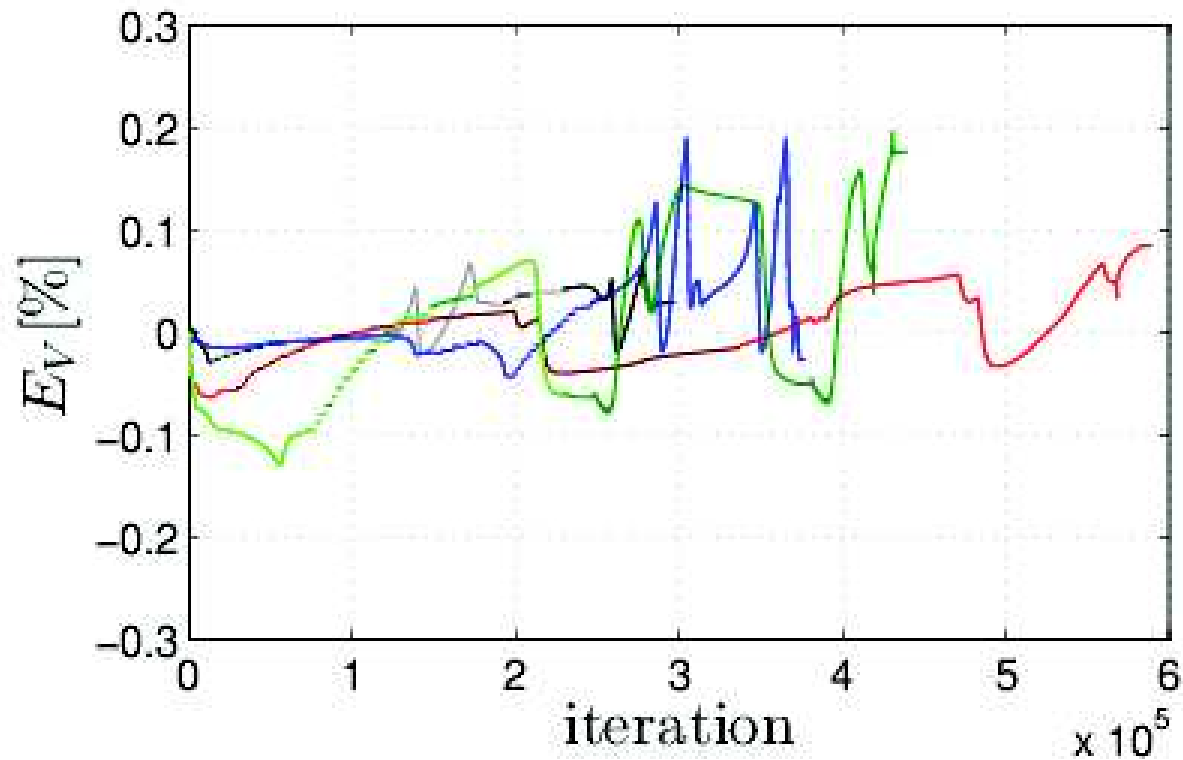


Stable configuration

## Volume-preserving motion – Sinusoidal Pore



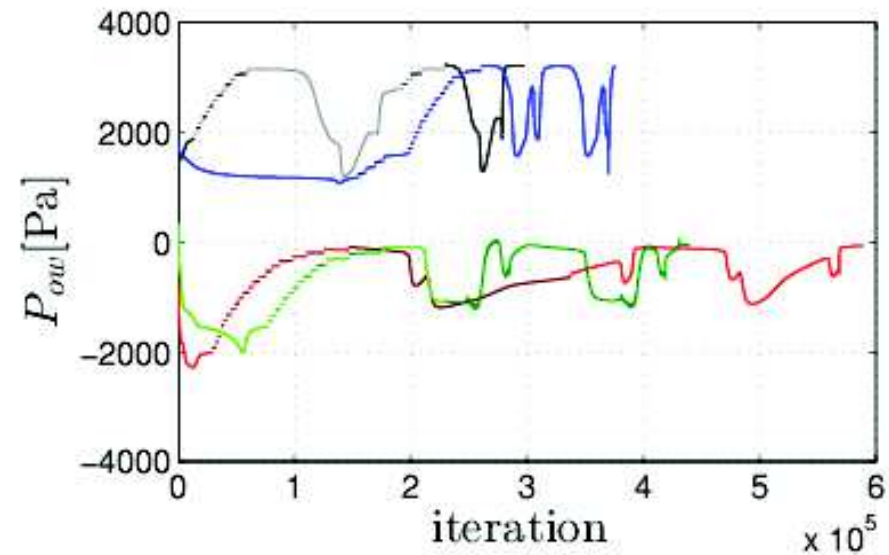
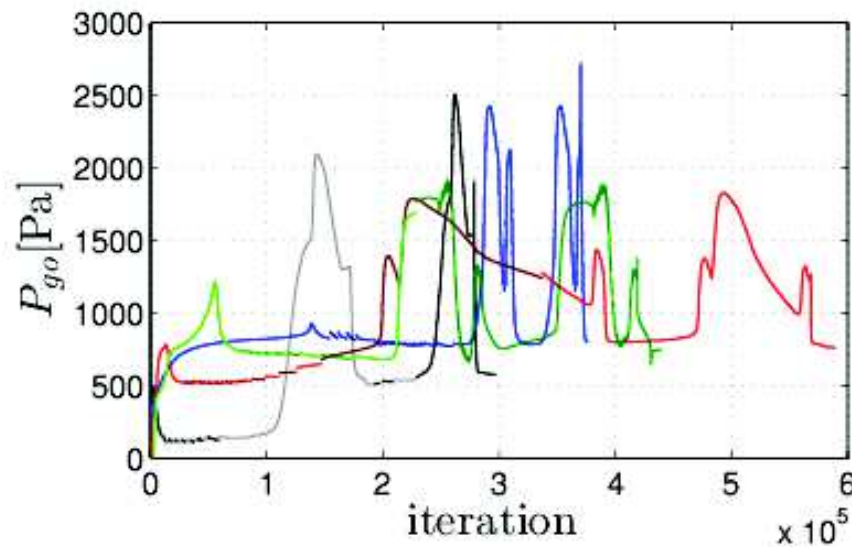
- › 4 simulations (oil-wet and water-wet cases with two different oil volumes)
- › Relative volume error is less than 0.2% during the processes



## Volume-preserving motion – Sinusoidal Pore



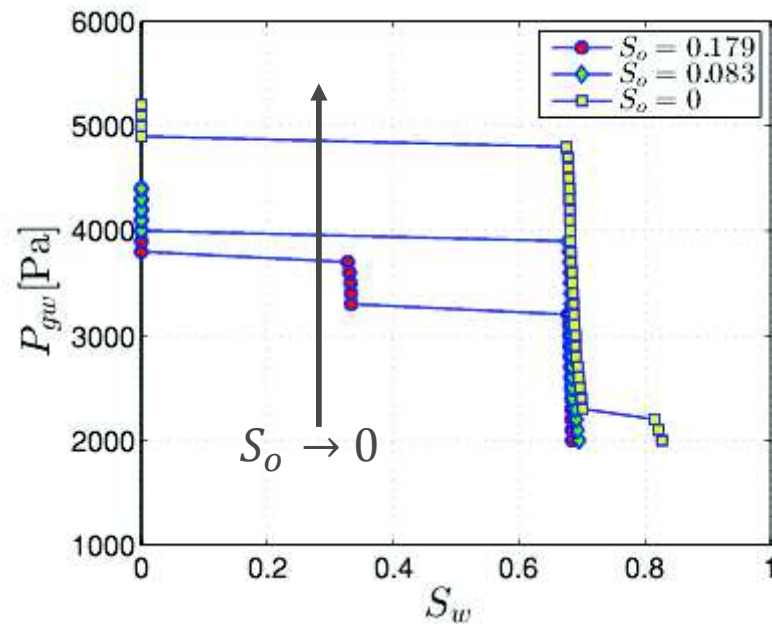
- › Significant oil pressure fluctuations as oil moves through narrow and wide regions
- › Assuming  $\Delta x = 1\mu\text{m}$ ,  $P_{cgo}$  and  $P_{cow}$  varies with up to 2 kPa during displacement for water-wet case, and a little bit less for the oil-wet case.



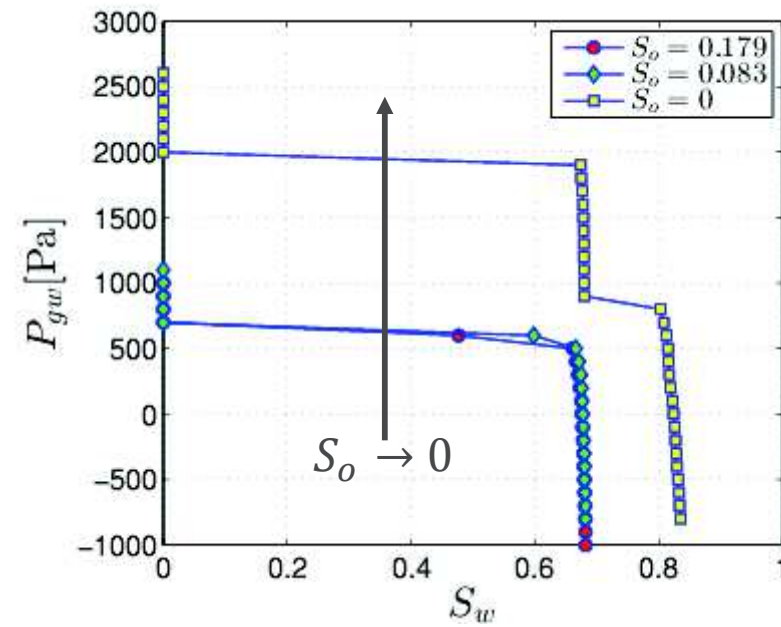
# Volume-preserving motion – Sinusoidal Pore



- › Gas/water capillary pressure is smaller with disconnected oil present between gas and water:



Water-wet case

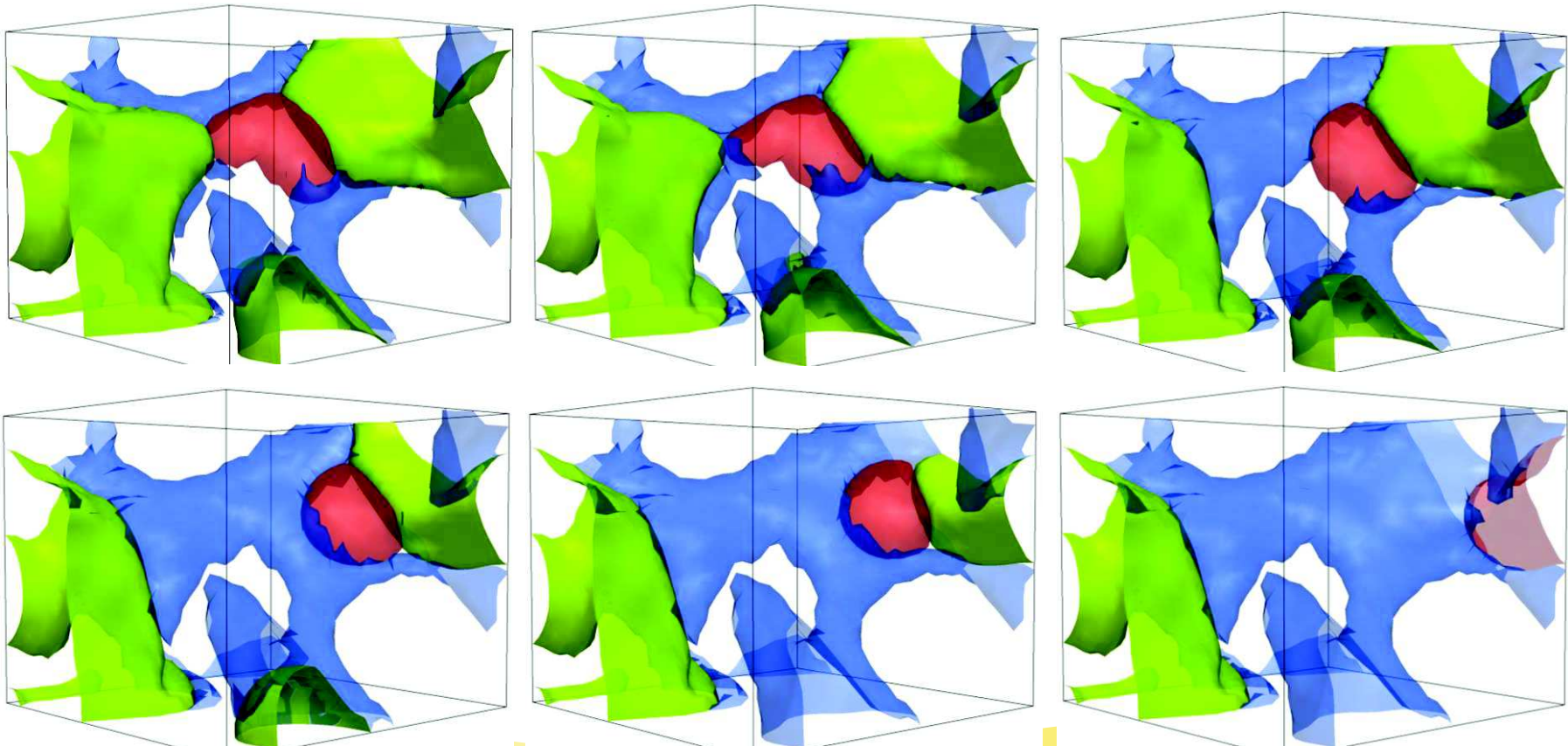


Oil-wet case

## Volume-preserving motion in 3D rocks



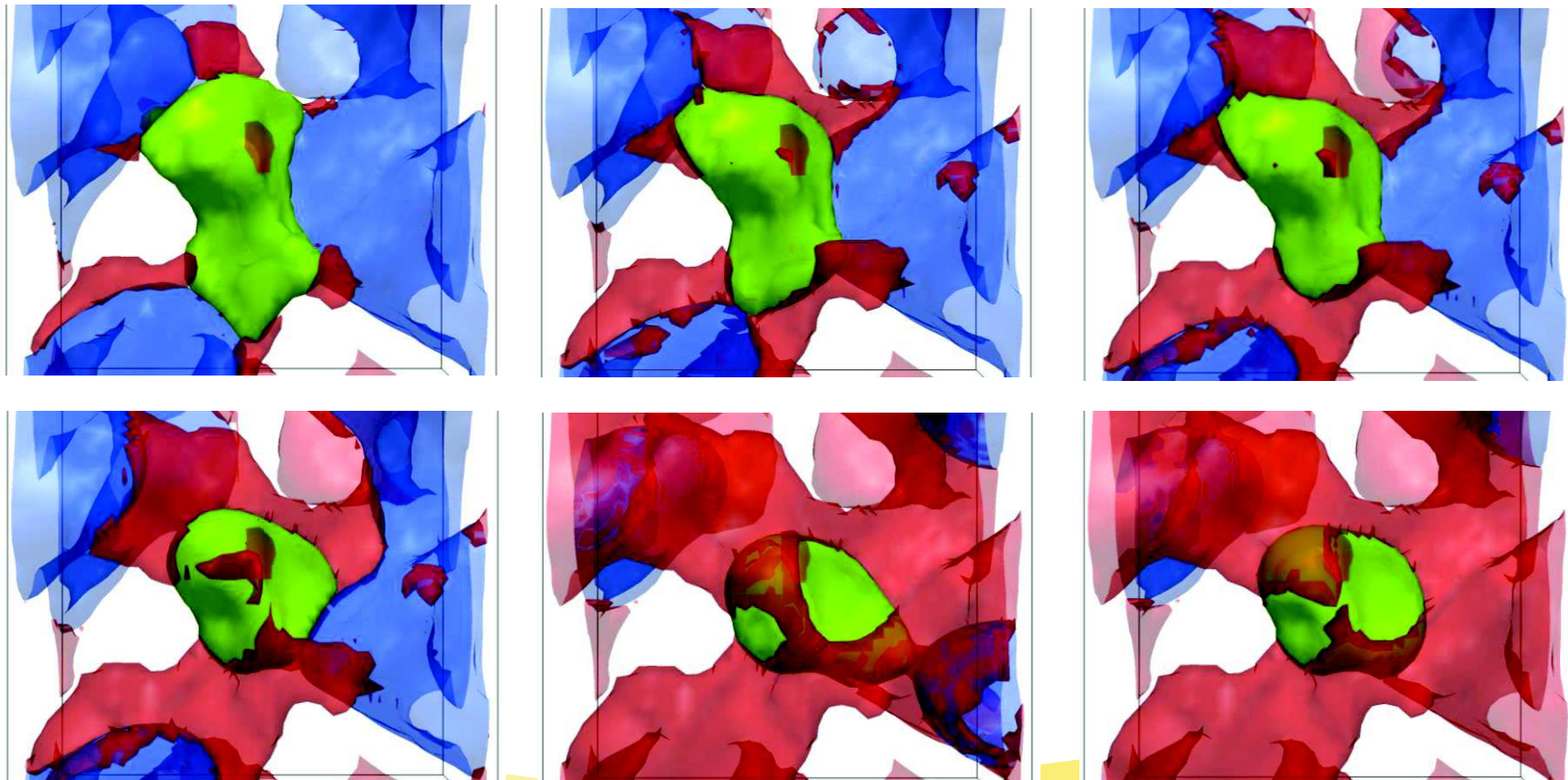
- › Mechanism for mobilizing isolated oil in water-wet rock
- › Onset of double displacement (water  $\rightarrow$  isolated oil  $\rightarrow$  gas) by water snap-off at gas/oil interface. Oil volume error < 2%.



## Volume-preserving motion in 3D rocks



- › Oil invasion in oil-wet rock and preservation of the gas phase
- › Oil surrounds gas due to oil snap-off on gas/water interfaces and gas becomes capillary trapped. Gas volume error < 1.5%.

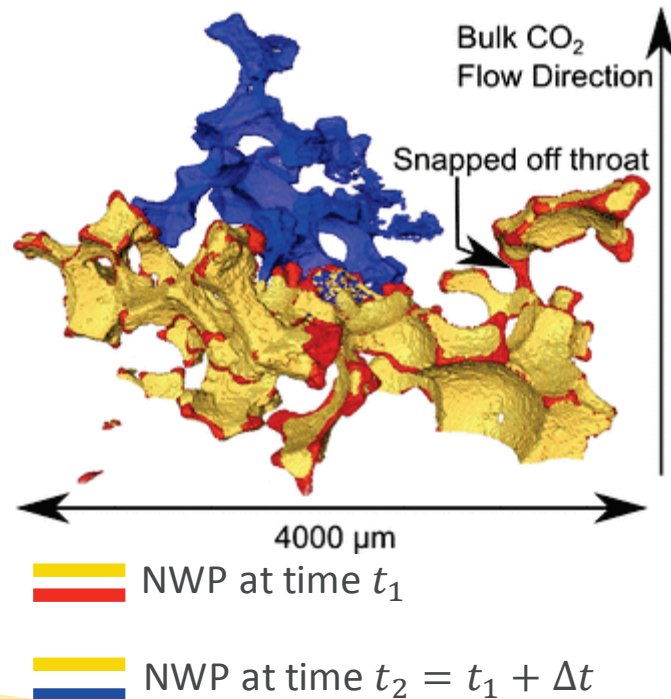


# 2-phase pore-scale experiments in literature



(Andrew, Blunt et al., TIPM 2015)

- › Drainage in Limestone at reservoir conditions (50°C & 10MPa), imaged by x-ray  $\mu$ -CT
- › Water withdrawn at low, constant rate
- › Capillary number  $\sim 10^{-11}$

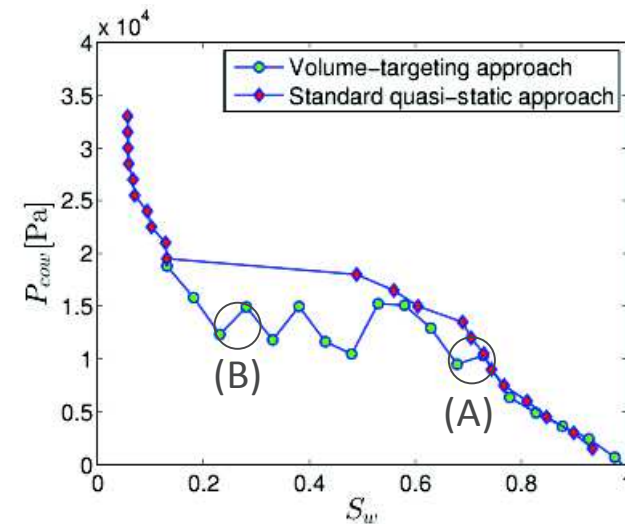
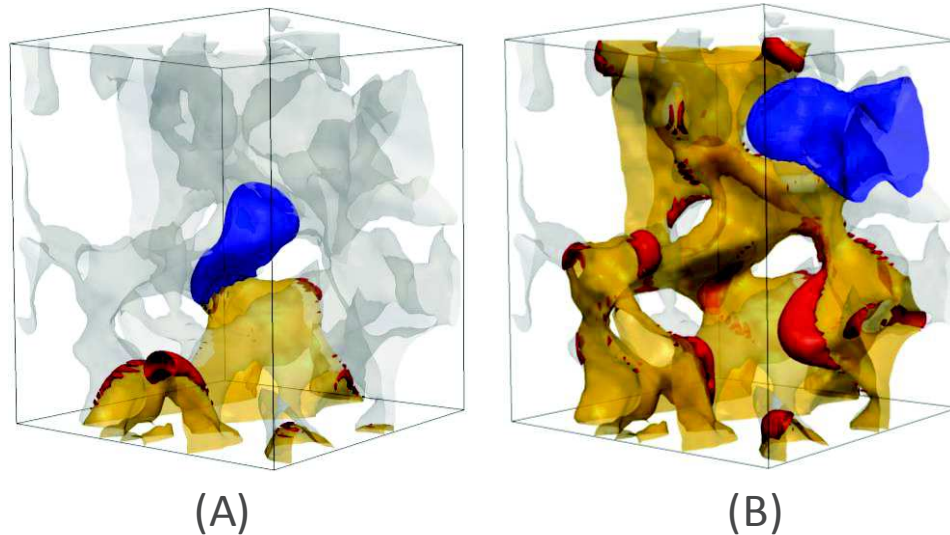


- › Observations in drainage:
  - Haines jumps with co-operative behavior
  - Capillary pressure before Haines jump (time  $t_1$ ) is higher than after (time  $t_2$ )
  - Snap-off events can lead to temporarily isolated NWP droplets
  - Interfaces vibrate when they are close to critical events
- › Imbibition:
  - Ganglion dynamics, etc...
- › Do we need to include viscous forces to describe this multiphase behavior at the pore scale?
- › Are these observations just a consequence of constant rate?

# Can «Volume-Targeting» simulation describe this multiphase behaviour? Yes (at least qualitatively)!



- › Approach: Take saturations as input and calculate phase pressures (instead of specifying pressure and calculate saturation)



We assume  $\Delta S_o = 0.05$

 NWP at  $S_o$

 NWP at  $S_o + \Delta S_o$

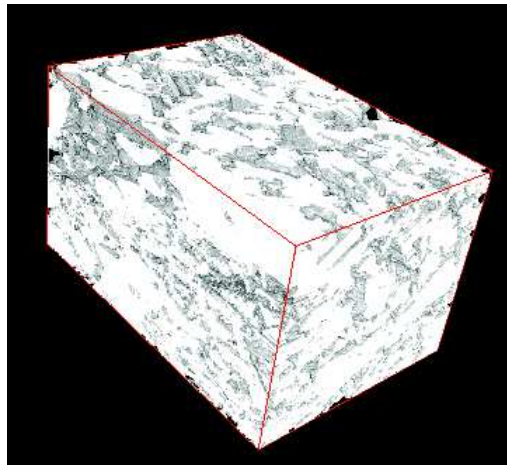
For drainage, we observe:

- Haines jumps with co-operative behavior (local imbibition) that results in temporarily smaller capillary pressure
- Interfaces vibrate until target volume is reached accurately

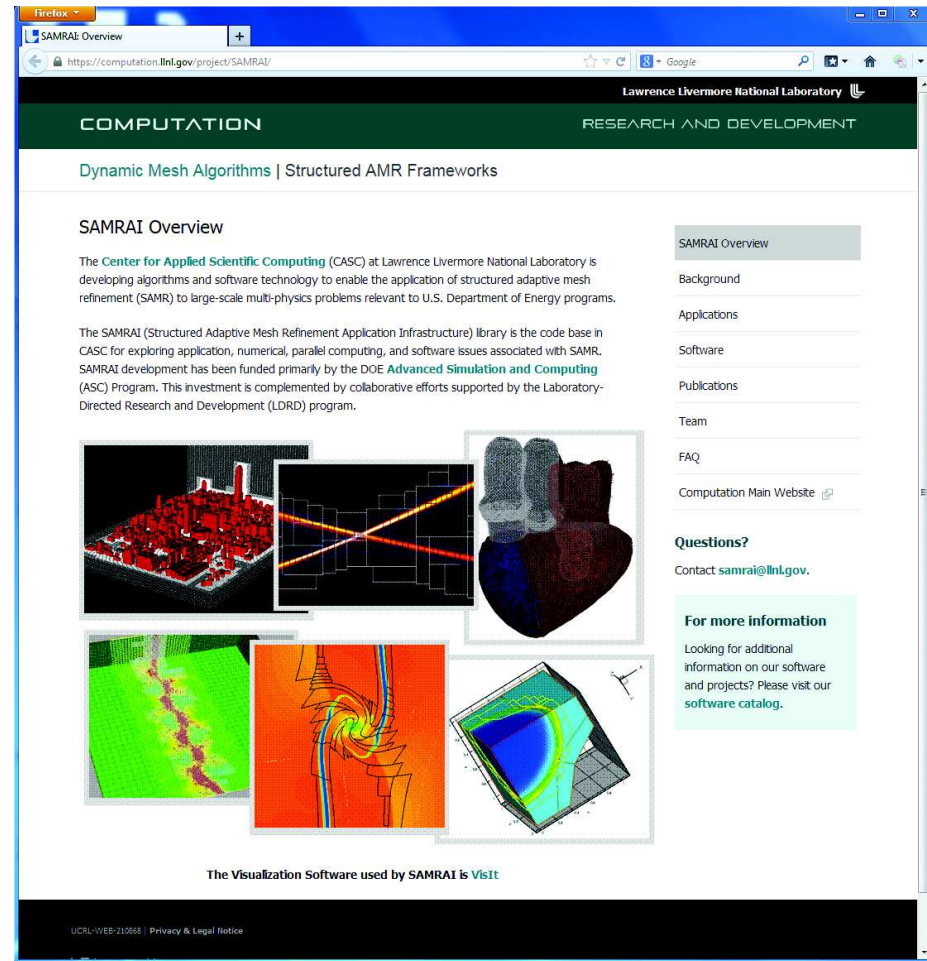
# Adaptive Mesh Refinement (AMR) & Parallelization



- › Needed for accurate calculations on big domains (heterogeneous chalk)



- › We will implement AMR & parallelism by coupling our codes to R&D AMR library SAMRAI (developed at LLNL)
- › Parallel computations on Notur HPC facilities



## Status and Capabilities Multiphase LS Method IRIS

- › Quasi-static capillary-dominated displacement at uniform or mixed wettability (for 2 and 3 phases)
- › Drainage & imbibition processes (invasion of gas, water or oil)
- › Transition from 3- to 2-phase flow
- › Motion of wetting-phase cusps and triple lines are captured very well
- › Oil layers are modelled accurately if grid resolution is sufficiently fine
- › Continuous validation by comparing simulations with analytic solutions on idealized pore geometries.
- › Global phase volume preservation

# The work plans



## First priority:

- › Finish AMR & parallelization
- › Finish implementation of local volume preservation:
  - Volume preservation of individual drops that can merge or break

## Then:

- › Start simulations on big domains
  - Priority: 1. chalk; 2. bead pack; 3. sandstone
  - 2-phase motion first, 3-phase motion afterwards
  - Relative permeability
- › Add compressibility (gas) to volume preservation approach, using EoS
- › Introduce gas by depressurization (model gas bubble nucleation)
- › Relate water chemistry to changes in wettability

## Conclusions



- › Multiphase Level Set simulations give increased insight into the pore-scale mechanisms that explain differences and similarities between 2- and 3-phase capillary pressure curves
- › Water-wet conditions:
  - Gas/oil capillary pressure increases with  $S_{wi}$ , as water blocks gas/oil displacement paths
  - Imbibition oil/water capillary pressure curves differ because «3-phase water snap-off» on gas/oil interfaces occurs at a higher oil/water capillary pressure than standard 2-phase snap-off events
- › «Mixed- to oil-wet» conditions:
  - Similar 2- & 3-phase capillary pressure curves for small gas & water saturations
  - Gas is trapped by oil cusps and water in big pores (not narrow throats), but the amount of trapped gas and its location seems to depend on  $S_{wi}$ .

# Conclusions



- › Multiphase Level Set simulations with volume preservation (3 phases) or «volume targeting» (2 phases) show «dynamic» behavior:
  - Haines jumps with co-operative behavior due to limited phase availability
  - Non-monotonic capillary pressure changes
- › Double displacements must be viewed together with snap-off mechanisms:
  - Snap-off can represent the onset of double displacements (for mobilizing oil)
  - Snap-off can also trap the disconnected fluid permanently
  - Pressure oscillations and temporary snap-off events can occur as the disconnected fluid moves through narrow and wide pore regions
  - Presence of disconnected oil decreases the gas/water capillary pressure during gas invasion

# Acknowledgements



Financial support was provided by the Research Council of Norway (PETROMAKS 2) through grant

## **234131 – Three-Phase Capillary Pressure, Hysteresis and Trapping in Mixed-Wet Rock,**

and ConocoPhillips and the Ekofisk coventurers, including TOTAL, ENI, Statoil and Petoro, through the research center COREC.

