DNS Modeling and Upscaling

Eckart Meiburg UC Santa Barbara

- Motivation
- Governing equations for Direct Numerical Simulations (DNS)
 - dimensionless parameters
 - computational effort
- Need for turbulence modeling
 - Reynolds-averaged Navier-Stokes (RANS) simulations
 - Large-eddy simulations (LES)
- Other aspects of upscaling
- Summary and outlook



Coastal margin processes



Turbidity current

- Gravity-driven sediment flow down the continental slope
- Important element of global sediment cycle
- Often triggered by storms or earthquakes
- Can transport many km³ of sediment
- Distances ~ O(1,000)km or more
- Front velocity ~ O(10m/s)
- Front height ~ O(100m)



Turbidity current. http://www.clas.ufl.edu/ High-resolution modeling framework: Dilute flows

Assumptions:

- volume fraction of grains $< O(10^{-2} 10^{-3})$
- grain radius « grain separation
- small grains with negligible inertia

Dynamics:

- effects of grains on fluid continuity equation negligible
- coupling of fluid and grain motion primarily through momentum equation
- sediment loading modifies effective fluid density
- sediment follows fluid motion, with superimposed settling velocity

Moderately dilute flows: Two-way coupling (cont'd) Conservation of a) mass: $\nabla \cdot \vec{u}_f = 0$

b) momentum:

$$\frac{\partial \vec{u}_f}{\partial t} + (\vec{u}_f \cdot \nabla) \vec{u}_f = -\nabla p + \frac{1}{Re} \nabla^2 \vec{u}_f + c \vec{e}_g \\ effective \\ density$$
c) sediment:

$$\frac{\partial c}{\partial t} + \left[\left(\vec{u}_f + \vec{U}_s \right) \nabla \right] c = \frac{1}{Sc Re} \nabla^2 c \\ settling \\ velocity$$
Dimensionless parameters:

$$Re = \frac{u_b L}{\nu} , \quad Sc = \frac{\nu}{D} , \quad U_s = \frac{u_s}{u_b} \\ Field scale turbidity current:$$

 $u_b \approx 10m/s$, $L \approx 100m$, $\nu \approx 10^{-6}m^2/s \rightarrow Re_{field} \approx O(10^9)$

Model problem for DNS simulation (with M. Nasr-Azadani)





Dense front propagates along bottom wall

Light front propagates along top wall



Numerical method

- second order central differencing for viscous terms
- third order ENO scheme for convective terms
- third order TVD Runge-Kutta time stepping
- projection method to enforce incompressibility
- domain decomposition, MPI
- *employ PETSc (developed by Argonne Nat'l Labs) package*
- non-uniform grids
- *immersed boundary method for complex bottom topography*

Example: 3D turbidity current over bottom topography Direct Numerical Simulation (DNS): all scales are resolved



Nasr-Azadani, Callies and Meiburg (2011)

- turbidity current develops lobe-and-cleft instability of the front
- current dynamics and depositional behavior are strongly affected by bottom topography

 $Re_{sim} = 2,000: u_b \approx 2cm/s, L \approx 10cm, \nu \approx 10^{-6}m^2/s$

 \rightarrow simulation corresponds to a laboratory scale current, not field scale!

Turbidity current/sediment bed interaction

'Flow stripping' in channel turns: lateral overflows



DNS simulations

Advantages:

- accurately reproduce physics
- provide very detailed information
- require a minimum of empirical modeling assumptions

Disadvantages:

- computationally very expensive
- limited to small Reynolds numbers

Why can we not do a DNS simulation at $Re=10^9$?

- Re is a measure of the ratio of the largest ("integral") length scale L of the flow to the smallest ("Kolmogorov") length scale η, at which kinetic energy is dissipated into heat
- turbulence theory shows that $\frac{L}{\eta} = Re^{3/4}$
- DNS, which resolves all scales, needs to have grid spacing $\Delta x \sim \eta$, and computational domain size $\sim L \rightarrow$ number of grid points in each direction $N \sim Re^{3/4}$. For 3D simulation $N_x \cdot N_y \cdot N_z \sim Re^{9/4}$. Time step $\Delta t \sim \Delta x \rightarrow$

Computational effort $E \sim N_x \cdot N_y \cdot N_z \cdot \Delta t^{-1} \sim Re^3 !!$

• *field scale simulation would require 10¹⁸ times effort of lab scale simulation*

How can we perform simulations at field scale?

Key idea:

- While the large scale flow features are unique for every flow, the smallest scale flow features are similar for all turbulent flows → we may not have to resolve them, but instead may be able to model their main effect (energy extraction from large scales) by means of a turbulence model
- *Two different approaches:*
 - temporal averaging of governing equations →
 Reynolds-averaged Navier-Stokes (RANS) simulations
 - spatial averaging of governing equations →
 Large-eddy simulations (LES)

Reynolds-averaged Navier-Stokes (RANS) simulations

Split all variables (velocity, pressure, sediment concentration...) into time-averaged value and fluctuation

$$\phi(x, y, z, t) = \bar{\phi}(x, y, z, t) + \phi'(x, y, z, t)$$

time-averaged value, can still depend on time fluctuation

Take time average of the governing equations

$$\overline{c}_t + \overline{(uc)}_x + \overline{(vc)}_y + \overline{(wc)}_z = \dots$$

Problem: nonlinear terms

$$\overline{(uc)} = \overline{(\bar{u} + u')(\bar{c} + c')} = \bar{u}\,\bar{c} + \overline{u'c'}$$

 $u'c' \neq 0$ cannot be calculated from time-averaged quantities (closure problem)

 \rightarrow need for RANS turbulence models!

Many such models have been developed, e.g. mixing length models, k,ε-models, Reynolds stress models etc.

Problems:

- each model involves several empirical constants
- these constants depend on flow geometry, flow physics etc.
- especially difficult to determine these empirical constants for complex multiphase flows, e.g. sediment-laden flows with erosion and deposition
- → large amount of uncertainty associated with RANS simulations of complex multiphase flows

Alternative approach: Large-eddy simulations (LES)

Employ spatial filtering, resolve only the large scales, model the effects of the small scales

$$\bar{u}(x,t) = \int G(x,x') u(x',t) dx'$$
filtered
filter kernel, has length
velocity
scale Δ associated with it

Problem: nonlinear terms still lead to closure problem

$$\overline{uc} \neq \overline{u} \, \overline{c}$$

 \rightarrow have to model 'subgrid scale' stresses and transport

 \rightarrow need for LES turbulence models!

Several models have been developed, e.g. Smagorinsky model

Problems:

- each model involves several empirical constants
- 'dynamic' models have been developed that determine these constants automatically during the simulation by applying two filters of different sizes
- LES generally more accurate than RANS, but also more expensive computationally
- still, there is some uncertainty associated with these models for complex multiphase flows
- \rightarrow more research needed on turbulence modeling

LES example: Lock-exchange gravity currents (with S. Radhakrishnan)

• Re=1,000 (DNS)

•*Re*=200,000 (*LES*)



High-Re LES shows much more fine-scale structure than low-Re DNS

LES example: Lock-exchange gravity currents (cont'd)



•*Re*=200,000 (*LES*)



Other aspects of upscaling (with Z. Borden)

Employ particle-based, microscopic approach to develop accurate macroscopic continuum models:

 e.g., erosion models to date are mainly phenomenological, not based on first principles → research at the microscopic level is needed to develop improved macroscopic erosion models



Borden and Meiburg (2011)

• Goal: Development of more accurate continuum erosion models

Erosion, resuspension of particle bed by turbidity current

$$ho_p = 1.5g/cm^3$$
, $r_p = 50\mu m$, $\nu = 10^{-6}m^2/s$
current height = 1.6m
initial concentration = 0.5%
Re = 2,200 :

0





erosion outweighs deposition: growing turbidity current

Erosion, resuspension of particle bed by turbidity current

- multiple, polydisperse flows
- feedback of deposit on subsequent flows
- formation of ripples, dunes etc.



Upscaling: Embedding high-resolution simulation within coarser resolution model (w. Arango, Harris, Syvitski)



Summary

- Computational effort for DNS ~ $Re^3 \rightarrow$ for high-Re flows at field scales we can't perform DNS simulations that resolve all scales
- Need turbulence models that capture the effects of the small scales
- *Two main approaches:*
 - RANS simulations: based on temporal averaging
 - LES simulations: based on spatial filtering
- Both of these approaches require closure models involving empirical constants \rightarrow difficult to determine \rightarrow uncertainties
- Upscaling from microscopic, particle models to continuum models