# Topics

- Full-systems MEMS modeling
- Flow Solver-NEKTAR
- Chaotic Advection
- Stochastic Modeling

(Mikuchenko & Mayaram, 2000)

# **Coupled Circuit/Device Simulator**



### Micro Device Concepts and Simulation Based Verification: Micro-Pump



## H/P Finite Element Method with Arbitrary Lagrangian Eulerian Formulation



## Conceptual Design and Simulation of a Micro-Pump



## Conceptual Design and Simulation of a Micro-Pump (3-D Simulation)



# SPICE-NEKTAR Coupling Direct Coupling: Simulator Interaction



# **Microfluidic System Model**



# **Time Stepping Scheme**

- Fluid solver is called from SPICE
- The time step for SPICE < time step for fluid solver
- Fluid solver specifies the next synchronization time point
- Results: the number of fluid solver calls is the same as that of standalone fluid solver

## **Simulation Results**



## **Simulation Results**

Statistics SPICE / Nektar **Total iterations** 7234 / 800 **Transient timepoints** 3567 / 800 **Accepted** timepoints 3562 / 800 **Total Analysis Time** 0.43s / 5min (PII - 300MHz)

# Nεκταr Capabilities



\* The only high-order code for complex geometries

# Spectral/hp Elements

- Efficient discretization complex geometries
- Standard finite element meshes used
- Global spectral accuracy
- Resolution increased by increasing P or element number



Karniadakis & Sherwin, Spectral/hp Element Methods for CFD, Oxford University Press, 1999.

# Method/Expansion Bases



Spectral/hp Element Methods for CFD Karniadakis & Sherwin, Oxford University Press, 1999

## Variable Polynomial Order on Hybrid Elements



## **MPI/OpenMP NEKTAR**



•Exponential accuracy at sublinear cost using Threads

# **NEKTAR-ALE** Formulation

- ALE = Arbitrary Lagrangian-Eulerian
- Introduces an "arbitrary" vertex velocity into the variational formulation
- Lagrangian at the structure boundary
- Eulerian on the domain boundary
- Seek a mesh velocity algorithm which
  - produces a smoothly varying mesh velocity
  - computationally efficient

## Graph Theory Algorithm

#### The ALE Grid Velocity Algorithm



Graph Theory: Force Directed Method in Velocity Space Fast Analog of  $\nabla \bullet (\kappa \nabla Ug) = 0$  Using Incomplete Iteration

## Convergence with Skewed Elements



#### Traditional Mesh Movement Algorithm

#### Graph Theory Based Algorithm









## **NEKTAR-ALE CODE**

- Non-Newtonian Micro-Fluids in Deforming Geometries
- Graph Theory Approach





G-S Karamanos, R.M. Kirby and G.E. Karniadakis, Brown University





G-S Karamanos, R.M. Kirby and G.E. Kamiadakis





#### Micro Device Concepts and Simulation Based Verification: The Micro Heat Spreader



- h : channel height
- l : channel length
- a : membrane oscillation amplitude
- L : membrane length
- $\boldsymbol{\omega}$  : membrane oscillation frequency

#### **CFD Based Design & Validation: Micro Heat Spreader**





Micro Heat Spreaders: Reciprocating Flow Forced Convection

### Micro Heat Spreaders, a Concept Verification

- Very high heat flux removal  $(68 W/cm^2)$
- Transient Control



#### **Dimensional Analysis**



- Re & Pr are the only parameters.
- Simulations are done for
  - Re =  $2\pi$
  - Pr = 1 (~ air) & Pr = 10 (~ water)
- $\Delta T$  is a floating parameter.

#### Nondimensional Temperature Distribution on the Surface of the MHS



#### **Pure Conduction**





#### **Re** = $2\pi$ , **Pr** = **1 Snapshots**



 $Re = 2\pi$ , Pr = 10 Snapshots



#### **Micro Heat-Spreaders**

- <u>Closed-loop single-phase</u> micro-fluidic systems.
- Actuated electrostatically.
- Based on <u>unsteady</u> forced convection in micro-channels.
- Achieve very high heat flux removal rates.
- Enable <u>active closed loop control</u> strategies.
- Are <u>MEMS</u> devices.
- Can be integrated to microchip design & fabrication.

•Heat dissipation to surrounding via the side walls with larger surface area enables conventional cooling strategies.

#### **Chaotic Advection in a Peristaltic Micro-Mixer**



Peristaltic Micro Mixer, Kinetic Energy



Peristaltic Micro Mixer, tracing an initially horizontal interface

# Modeling Uncertainty

- Stochastically-excited structures
- Boundary conditions, geometry, properties
- Sensitivity/failure analysis
- Gaussian and non-Gaussian processes
- Polynomial Chaos vs. Monte Carlo
- Stochastic spectral/hp element methods



## Uncertainties in MEMS

- Anisotropy in mechanical properties
- Polycrystalline silicon random orientation/shapes of crystal grains
- First PhD (Mirfendereski, Berkeley'95) shows COV of 3% in response of microbeams and 6% in frequency of lateral micro-resonators



*\*Wiener, 1938; Ghanem & Spanos, 1991)* 

## **Representation of a Random Process**

$$T(\mathbf{x}, t; \theta) = \sum_{i=0}^{\infty} T_i(\mathbf{x}, t) \Psi_i(\xi(\theta))$$

• 
$$T(\mathbf{x}, t; \theta)$$
 - Random process

- (**x**, t) Spatial/temporal dimension
- $\theta$  Random dimension
- $T_i(\mathbf{x}, t)$  Deterministic coefficients
- $\Psi_i(\xi(\theta))$  *Generalized* Polynomial Chaos



## **Generalized Polynomial Chaos**

$$T(\mathbf{x},t;\theta) = \sum_{j=0}^{\infty} T_j(\mathbf{x},t) \Psi_j(\boldsymbol{\xi}(\theta))$$

- Polynomials of random variable  $\xi(\theta)$
- Orthogonality :  $\langle \Psi_{i}\Psi_{j}\rangle = \langle \Psi_{i}^{2}\rangle\delta_{ij}$  $\langle f(\xi)g(\xi)\rangle = \int f(\xi)g(\xi)W(\xi)d\xi \text{ or } \langle f(\xi)g(\xi)\rangle = \sum_{i}f(\xi_{i})g(\xi_{i})w(\xi_{i})$
- Weight function determines underlying random variable (*not necessarily Gaussian*)
- Complete basis from *Askey scheme*
- Each set of basis converges in L<sup>2</sup> sense



#### **Orthogonal Polynomials and Probability Distributions**

- Continuous Cases:
  - *Hermite* Polynomials  $\longleftrightarrow$  *Gaussian* Distribution

(special case: exponential distribution)

- Jacobi Polynomials
- *Legendre* Polynomials ← → *Uniform* Distribution
- ←→ *Beta* Distribution





### **Orthogonal Polynomials and Probability Distributions**

- Discrete Cases :
  - *Charlier* Polynomials *Poisson* Distribution

  - *Meixner* Polynomials  $\leftarrow \rightarrow$  *Pascal* Distribution





Hypergeometric distribution



#### Applications : ODE with Uncertain Coefficients

• Equation : 
$$\frac{dy}{dt} = -ky, \quad y\Big|_{t=0} = \hat{y}.$$

k is the decaying coefficient with given probability distribution.

• Chaos expansion :

$$y(x,t;\theta) = \sum_{i=0}^{P} y_i(x,t) \Psi_i(\xi(\theta)), \quad k(\theta) = \sum_{i=0}^{P} k_i \Psi_i(\xi(\theta))$$

• Galerkin projection :

$$\frac{\mathrm{d}\mathbf{y}_{i}}{\mathrm{d}t} = -\frac{1}{\left\langle \Psi_{k}^{2} \right\rangle} \sum_{i=0}^{P} \sum_{j=0}^{P} \left\langle \Psi_{i} \Psi_{j} \Psi_{k} \right\rangle \mathbf{k}_{i} \mathbf{y}_{j}, \quad \mathbf{k} = 0, 1, 2, \dots, P$$

- The Chaos will be chosen according to the distribution of *k*.
- $L^{inf}$  error :

$$\frac{\left|\overline{y}_{chaos}(t) - \overline{y}_{exact}(t)\right|}{\overline{y}_{exact}(t)}$$



#### **Discrete Distribution :** <u>Poisson</u> (Charlier-Chaos)



Solution of expansion modes :  $\lambda = 1$ 



Convergence w.r.t. expansion terms

- 4<sup>th</sup>-order Charlier-Chaos expansion
- Exponential convergence rate



#### **Channel flow with Random Boundary Conditions**



Exact solution (uniform BCs):

$$u(y) = (1 - y^{2}) + \frac{1 - y}{2}\sigma_{1}\xi_{1} + \frac{1 + y}{2}\sigma_{2}\xi_{2}$$

- Two-dimensional PC expansion
- Gaussian inputs :

$$\sigma_1 = 2\%, \sigma_2 = 1\%$$



Solution profile across the channel



## Non-uniform <a>Exponential</a> Random BC

• Exponential correlation

 $C(x_1, x_2) = \sigma^2 e^{-|x_1 - x_2|/b}$ 

• Stochastic input:  $\sigma = 0.1$ 

- 2D K-L expansion
- 4th-order Laguerre-Chaos expansion
- 15-term expansion



## **Non-Uniform Uncertainty at Wall**





#### Heat Transfer in a Microcavity: Noisy B.C. versus Noisy Conductivity

