#### <u>Construction of low–order dynamical</u> <u>models for problems involving non-</u> <u>selfadjoint operators</u>

applied to the salt lake problem

Henk Schuttelaars<sup>1</sup> and Gert-Jan Pieters

1: Delft Institute of Applied Mathematics, Delft University of Technology

#### Introduction

 Observations in many natural systems suggest that the dynamics is only governed by a few (interacting) patterns.





 Patterns often resulting from strongly nonlinear interactions (i.e., not close to the onset of linear instability)



Can we construct a dynamical model to <u>reproduce</u>, <u>understand</u> and <u>predict</u> the observed dynamical behaviour in an efficient way?

#### <u>Approach</u>

- Construction of a low-dimensional dynamical model
- Based on a few physically relevant patterns physically interpretable patterns
- Can be analysed with well-known mathematical techniques

Choice of patterns is essential!!

#### Construction of low-dimensional model (1)

Define: state vector  $\Phi = (...)$ , i.e. velocity field, saturation, pressure,...

parameter vector  $\lambda = (...)$ , i.e. evaporation rate, geometry

Dynamics of Φ: •coupled system of nonlinear ordinary and partial differential equations •usually <u>NOT SELF-ADJOINT</u>



$$\mathcal{M} \frac{\partial \Phi}{\partial t} + \mathcal{L}(\lambda) \Phi + \mathcal{N}(\lambda, \Phi) = \mathbf{F}$$

Where  $\bullet \mathcal{M}$ : mass matrix, a linear operator.

In many problems  $\mathcal{M}$  is singular

- *L* : linear operator
- •: nonlinear operator
- F : forcing vector

#### Construction of low-dimensional model (2)

<u>Step 1</u>: identify a steady state solution  $\Phi_{eq}$  for a certain  $\lambda$ .

$$\mathcal{L}(\lambda) \Phi_{eq} + \mathcal{N}(\lambda, \Phi_{eq}) = \mathbf{F}$$

<u>Step 2</u>: investigate the linear stability of  $\Phi_{eq}$ .

Write  $\Phi = \Phi_{eq} + \phi$  and linearize the eqn's:

$$\mathcal{M} \; \frac{\partial \boldsymbol{\phi}}{\partial t} + \mathcal{J}(\boldsymbol{\lambda}) \; \boldsymbol{\phi} = \boldsymbol{0}$$

with the total jacobian  $\mathcal{J} = \mathcal{L}(\lambda) + \mathcal{N}(\lambda,\phi,\Phi_{eq})$ with  $\mathcal{N}$  linearized around  $\Phi_{eq}$ 

This generalized eigenvalue-problem (usually solved numerically) gives: • Eigenvectors r<sub>k</sub>

Adjoint eigenvectors l<sub>k</sub>

#### Construction of low-dimensional model (3)

<u>Step 3</u>: model reduction by Galerkin projection on eigenfunctions.
 •Expand \u03c6 in a FINITE number of eigenfunctions:

$$\boldsymbol{\phi} = \sum_{j=1}^{N} r_j a_j(t)$$

•Insert  $\Phi = \Phi_{eq} + \phi$  in the equations. •Project on the adjoint eigenfunctions  $\implies$  evolution equations for the amplitudes  $a_{ij}(t)$ :

$$a_{j,t} - \sum_{k=1}^{N} \beta_{jk} a_k + \sum_{k=1}^{N} \sum_{l=1}^{N} c_{jkl} a_k a_l = 0, \text{ for } j = 1...N$$
  
Example of nonlinearity



system of nonlinear PDE's reduced to a system of coupled ODE's.

#### Critical points and choices

- How `good' is the low-dimensional model?
- Which eigenfunctions should be used to construct the low-dimensional model?
- How many eigenfunctions should be used in the expansion?
- How to keep the low-dimensional



How persisten

forcing by noise.

### salt lake problem

#### Salt lake problem



#### Lab Experiments (Wooding, 1997) (1)

Initially many fingers





When fingers hit the bottom: complex behaviour

#### Salt lake problem: model equations

#### Governing Equations (after scaling):

- $\nabla \cdot \mathbf{U} = 0$  (mass conservation)
- $\mathbf{U} = -(\nabla p S \mathbf{e}_z)$  (Darcy's law)
- $S_t + R \nabla (U S) = Pe^{-1}\Delta S$  (salt mass balance)

#### **Boundary conditions:**

- •U· $e_z = -1/R$ at z=0,1•S = 1at z=0•S = 0at z=1
- •No-flow b.c. in the vertical plane

#### Salt lake problem: construction of r.m.(1)

#### **<u>Step 1</u>**: Basic state is given by $\Phi_{eq} = (S,U,p)_{eq} = \Phi_{eq}(z,R)$

Uniform upflow

•Control parameters R, Pe



**Step 2:** Linear Stability of  $\Phi_{eq}$ :

Write 
$$\Phi = \Phi_{eq} + \varphi$$

•Linearize the equations and solve eigenvalue problem

$$\rightarrow$$
 (a<sub>crit</sub>, R<sub>crit</sub>)



Salt lake problem: construction of r.m.(2)

- Step 3: model reduction by Galerkin projection on eigenfunctions.
- Eigenfunctions calculated at R=R<sub>crit</sub>, patterns kept fixed
- R<sub>crit</sub> and most unstable pattern depend on Peclet number



#### Model results

- Bifurcation Structure (Steady States only)
  - Solve the steady state amplitude equations, varying R:

$$\bigotimes_{j,t} -\sum_{k=1}^{N} \beta_{jk} A_k + \sum_{k=1}^{N} \sum_{l=1}^{N} c_{jkl} A_k A_l = 0, \text{ for } j = 1...N$$

- Dynamics Behaviour:
  - Use the low-order dimensional model to study the dynamic behaviour in time, starting from an arbitrary initial condition. Compare with fullmodel results.

#### Bifurcation diagram close to critical R (1)

# Dependence on 'projection method' Dependence on 'number of patterns'

#### Landau Coefficient



#### Bifurcation diagram for moderate R (1)



#### Bifurcation diagram for moderate R (2)

#### Most unstable mode





Slaved mode

#### Bifurcation diagram for large R (1)

#### Most unstable mode



#### Bifurcation diagram for large R (2)

- Convergence: increase # of modes
  - z-modes: variedx-modes: 100
- Sensitivity of bifurcation points to number of modes



#### Time evolution (1)

- Pe = 10, Ra = 20
- Initial condition: one-finger solution (lineaire most unstable mode)





#### Time evolution (2)

- Pe = 10, Ra = 20
- Initial condition: one-finger solution (lineaire most unstable mode)





#### Time evolution (3)

- Pe = 10, Ra = 15.35
- Initial condition: close to a Hopf





#### Mechanism (1)

## Why gets the uniform solution unstable?



convection





diffusion

1,-

11.

1 5



#### Mechanism (2)

#### Why a periodic solution?

Still stable....



#### Mechanism (2)

#### Why a periodic solution?

#### Now unstable....



#### Comparison with observations (large Pe)

Pe = 40, Ra varied
n=30, m = 35







#### Conclusions

- Reduced model approach efficient in finding bifurcation structure in Salt Lake problem.
  - Convergence up to R~70 for Pe < 10, solutions recovered using FE simulations
  - •Linearly most unstable mode does not necessarily predict observed length scales correctly (see Pe=10, Pe=40)
  - •Multiple equilibria
  - Periodic solutions exist
- The low-dimensional dynamical model captures the dynamics of the full system of equations
- For larger Rayleigh numbers the basis obtained for R ~ 15 is not optimal anymore.

#### Conclusions (2)

Method can be extended to 3 dimensions:

