

Lecture 1: Stability and Bifurcations for the Discretised Incompressible Navier-Stokes Equations

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- 1 Introduction
- 2 The Taylor-Couette Problem
- 3 Stability in time-dependent PDEs
- 4 Bordered Matrices
- 5 Numerical Continuation and Bifurcations
- 6 The Taylor problem again: Numerics
- 7 Conclusions

Outline

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The 3 lectures

- **Lecture 1:** Basic ideas of bifurcation/stability in time dependent PDEs; The Taylor-Couette problem - a comparison of experimental results with numerics; Numerical linear algebra of bordered matrices
- **Lecture 2:** Hopf bifurcations and periodic orbits in large systems; some open questions; The Taylor problem again
- **Lecture 3:** Inexact Inverse Iteration and Jacobi-Davidson with preconditioning; numerical results from Navier-Stokes and other problems
- “Cliffe, Spence & Tavener”, review in [Acta Numerica \(2000\)](#)
- “Spence & Graham”, introductory notes from 1998 [Leicester Summer School](#)

Stability and Bifurcation: the basics

- The Taylor-Couette Problem: Benjamin & Mullin experiments (1978,1981,...)
- (Linearised) Stability for time dependent discretised PDEs
- Bordered matrices
- Numerical continuation and bifurcations
- The Taylor problem again: comparison of numerics with experiments
- Conclusions

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The Taylor Problem (Benjamin & Mullin)

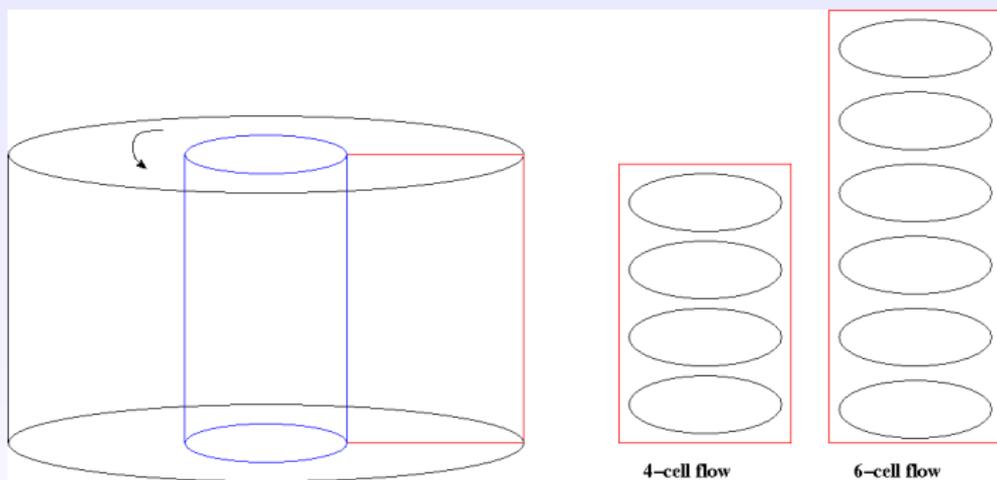
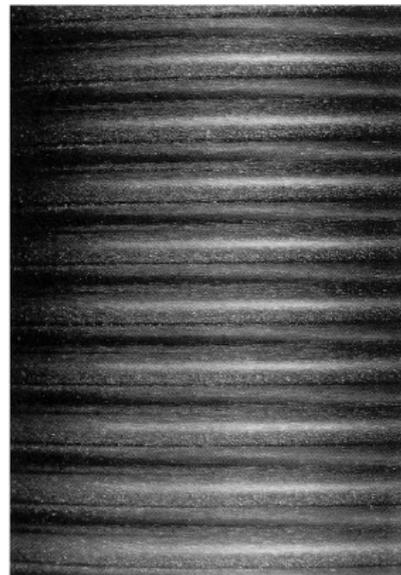
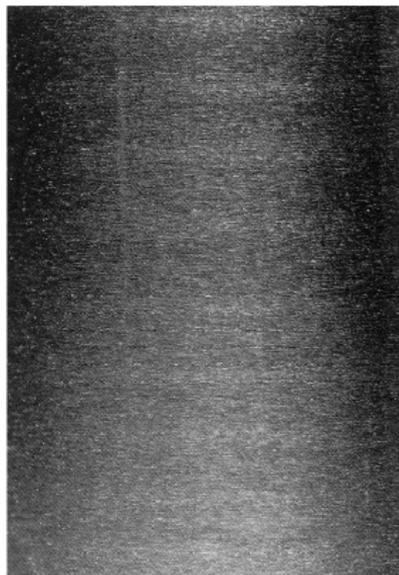


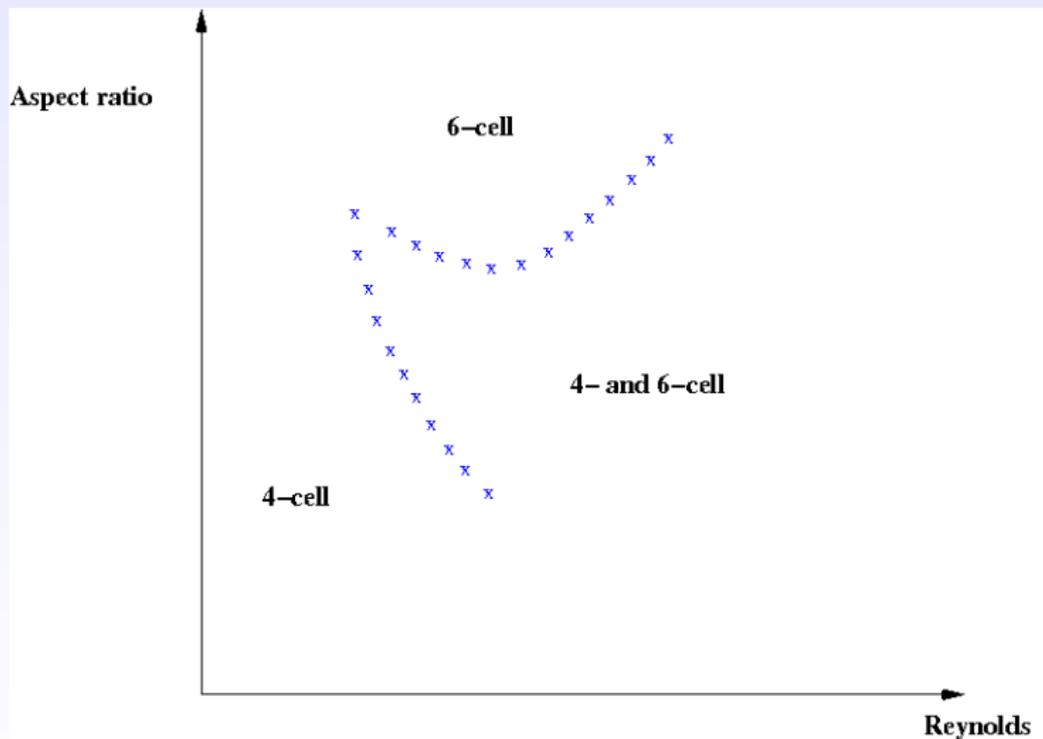
Figure: The Taylor problem showing 4-cell and 6-cell flows

- Two parameters: R , **Reynold's number** (speed of inner cylinder) and α , the **aspect ratio** (height/gap)
- Experiment:
 - ① Fix α
 - ② Increase R slowly from zero, or start up suddenly with large R

Taylor problem: photos



The Taylor Problem: Schematic of experimental results



Reynolds



Figure: Parameter space plot showing loss of stability of 4 and 6 cell flows

The Taylor Problem: Anomalous modes (Benjamin & Mullin)

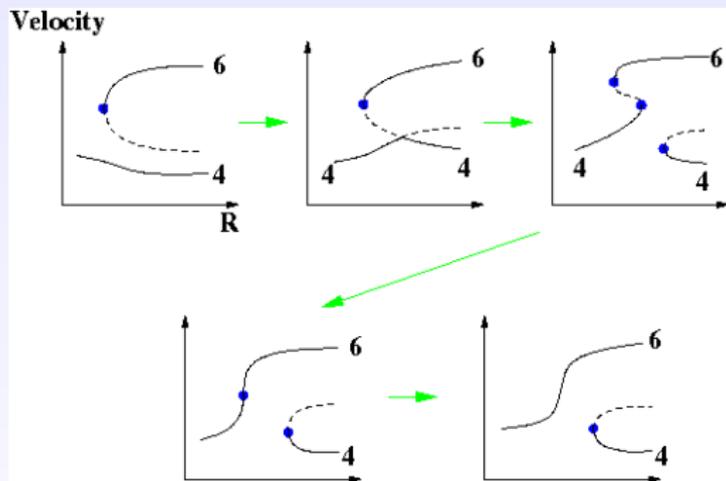


Figure: 4 and 6 cell anomalous modes: sequence of bifurcation diagrams as aspect ratio varies

Question

Can we reproduce these experimental results using numerical methods?

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Linearised Stability

- $\dot{x} = F(x, \lambda)$, $x(t) \in \mathbb{R}^n$
- Bifurcation Theory: change of stability of solutions (steady, periodic, homoclinic,...) as λ varies
- Steady solution: $0 = F(x, \lambda)$

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- **Linearised Stability**
 - 1 Perturbation: $x \rightarrow x + \delta$
 - 2 $\dot{\delta} = A(\lambda)\delta$ $A(\lambda) = F_x(x, \lambda)$, **Jacobian**
 - 3 $\delta = e^{\mu t}\phi$
 - 4 $A(\lambda)\phi = \mu\phi$

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 - ③ $\delta = e^{\mu t}\phi$
 - ④ $A(\lambda)\phi = \mu\phi$
- As λ varies, μ varies in \mathbb{C} . Loss of stability arises:
 - ① μ passes through 0, so F_x is singular
 - ② a complex pair crosses imaginary axis: in this case F_x is non-singular (Lecture 2 on Hopf bifurcation.)
- left-half plane is “stable”; right-half plane is “unstable”
- Pseudo-eigenvalues?

Incompressible Navier-Stokes

Discretisation of linearised equations using **mixed finite elements** leads to the following eigenvalue problem:

- $$\begin{bmatrix} K(\lambda) & C \\ C^T & O \end{bmatrix} \begin{bmatrix} u \\ p \end{bmatrix} = \mu \begin{bmatrix} M & O \\ O & O \end{bmatrix} \begin{bmatrix} u \\ p \end{bmatrix}$$

- $$\boxed{A(\lambda)\phi = \mu B\phi}$$

- “Saddle point” $A(\lambda)$, but $K(\lambda)$ nonsymmetric
- μ could be complex
- B positive semidefinite: $\mu = “\infty”$

- $$\begin{bmatrix} K(\lambda) & \gamma C \\ \gamma C^T & O \end{bmatrix} \begin{bmatrix} u \\ p \end{bmatrix} = \mu \begin{bmatrix} M & C \\ C^T & O \end{bmatrix} \begin{bmatrix} u \\ p \end{bmatrix}$$
 “ ∞ ” mapped to γ

Strategy for Stability Analysis

- Compute steady state diagram: $F(x, \lambda) = 0$ Task 1
- Detect existence of bifurcation points (i.e. where real or complex eigenvalues of $F_x = A(\lambda)$ cross imaginary axis), and then locate them accurately Task 2
- In two parameter problems (e.g. Reynold's number and aspect ratio):
Compute paths of bifurcation points Task 3
- Key tool: [Bordered matrices](#)

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Background on Bordered matrices

- $A \in \mathbb{R}^{n \times n}$, $b, c \in \mathbb{R}^n$
- $M = \begin{bmatrix} A & b \\ c^T & d \end{bmatrix} \in \mathbb{R}^{(n+1) \times (n+1)}$

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- $M = \begin{bmatrix} A & b \\ c^T & d \end{bmatrix} \in \mathbb{R}^{(n+1) \times (n+1)}$
- If $\text{Rank}(A) = n$ and $(d - c^T A^{-1} b) \neq 0$, then M is nonsingular
- If $\text{Rank}(A) < n - 1$ then M is singular
- If $\text{Rank}(A) = n - 1$ with $A\phi = 0$, $\psi^T A = 0^T$ then

$$\psi^T b \neq 0, \quad c^T \phi \neq 0 \iff M \text{ nonsingular}$$

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- **Bordering is important**
- Example: Assume A has singular values $\sigma_1 \geq \dots \geq \sigma_{n-1} > 0$. Then

$$M = \begin{bmatrix} A & \psi \\ \phi^T & 0 \end{bmatrix}$$

has singular values $\sigma_1 \geq \dots \geq \sigma_{n-1}, 1, 1$

Solving bordered systems: A nearly singular

- Assume A has structure
- Consider

$$\begin{bmatrix} A & b \\ c^T & d \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} f \\ g \end{bmatrix}$$

- Doolittle (D)

$$\begin{bmatrix} A & b \\ c^T & d \end{bmatrix} = \begin{bmatrix} I & 0 \\ w^T & 1 \end{bmatrix} \begin{bmatrix} A & b \\ 0 & \delta \end{bmatrix}$$

Forward/back substitutions use 1 solve with A^T , ($A^T w = c$), and 1 solve with A

- Crout (C)

$$\begin{bmatrix} A & b \\ c^T & d \end{bmatrix} = \begin{bmatrix} A & 0 \\ c^T & \delta \end{bmatrix} \begin{bmatrix} I & v \\ 0 & 1 \end{bmatrix}$$

Forward/back substitutions use 2 solves with A

Block Elimination Algorithm for A nearly singular: Govaerts&Pryce

Consider

$$\begin{bmatrix} A & b \\ c^T & d \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} f \\ g \end{bmatrix}$$

- Crout (C) and Doolittle (D) both fail when A is nearly singular
- BUT:
 - 1 (D) computes y well
 - 2 If y is known accurately, (C) computes x well

Block Elimination Algorithm for A nearly singular: Govaerts&Pryce

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- Crout (C) and Doolittle (D) both fail when A is nearly singular
- BUT:
 - 1 (D) computes y well
 - 2 If y is known accurately, (C) computes x well
- Method: Use (D) to get \tilde{y} . Apply **iterative refinement** on (C) with starting guess $(0, \tilde{y})$
- Govaerts&Pryce: Backward stable
- Cost: 1 solve with A^T , 2 solves with A

Bordered matrices and Iterative solvers

- Calvetti&Reichel (2000)
- A symmetric
- monitor eigenvalues of F_x along $F(x, \lambda) = 0$ using Implicitly Restarted Block Lanczos
- solve bordered systems using FOM with basis from Block Lanczos
- No preconditioning?
- Extension to nonsymmetric problems -OK for real eigenvalues but complex eigenvalues?
- LOCA “Library of Continuation Algorithms”, Sandia

Bordered Matrices

We shall see that bordered matrices arise naturally in the following 3 tasks:

- ① **Numerical Continuation** (i.e. computing $F(x, \lambda) = 0$)
- ② (i) **Detecting** when $\text{Det}(F_x)$ changes sign, and
(ii) **accurate calculation** of singular points
- ③ Numerical continuation of **paths of singular points** in 2-parameter problems
- ④ **Requirement: Efficient algorithms for bordered matrices with structure**

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To compute $F(x, \lambda) = 0$; Pseudo-arclength continuation (Keller)

- Implicit Function Theorem (IFT):

$$F(x_0, \lambda_0) = 0, \text{ and } F_x(x_0, \lambda_0) \text{ nonsingular} \Rightarrow,$$

$$F(x(\lambda), \lambda) = 0 \quad \text{near } \lambda = \lambda_0$$

- (x_0, λ_0) is **regular**. IFT $\Rightarrow \exists$ path of regular points near (x_0, λ_0)
- Numerical continuation is merely the computational version of IFT

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- Numerical continuation is merely the computational version of IFT
- To “pass over” singular points add an extra **normalisation**:

$$G(y, t) = \begin{bmatrix} F(x, \lambda) \\ c^T(x - x_0) + d(\lambda - \lambda_0) - t \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \end{bmatrix}, \quad y = \begin{bmatrix} x \\ \lambda \end{bmatrix}$$

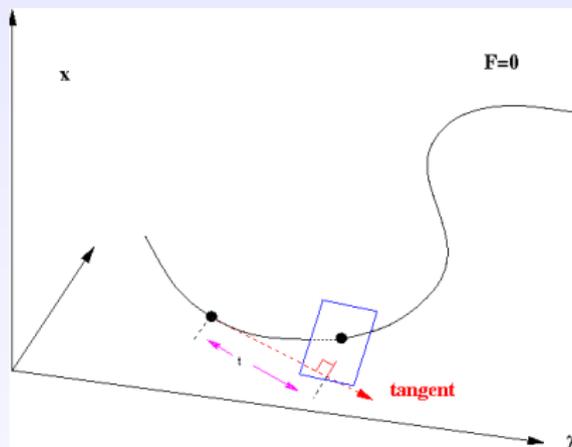
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$$G_y(y, t) = \begin{bmatrix} F_x & F_\lambda \\ c^T & d \end{bmatrix}$$

- c^T, d ?
- Key tool: Efficient treatment of bordered matrices near points where F_x is nearly singular

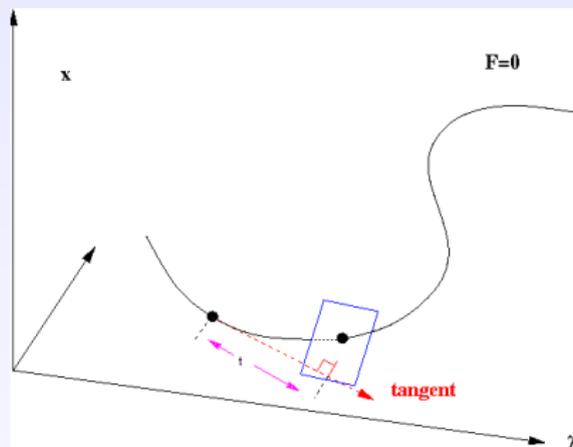


Pseudo-arclength continuation



- The “normalisation” = equation of the **plane** \perp **tangent**
- t is the “length along the tangent” (“**pseudo-arclength**”)
- $G(y, t) = 0$ represents the point where curve intersects the plane
- Method: compute tangent; form $G(y, t) = 0$; solve using Newton

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- Method: compute tangent; form $G(y, t) = 0$; solve using Newton
- Aside: **DAETS** - $F(x, \lambda) = 0, \quad \dot{x}^T \dot{x} + \dot{\lambda}^2 = 1$

Generic bifurcations in 1-parameter problems

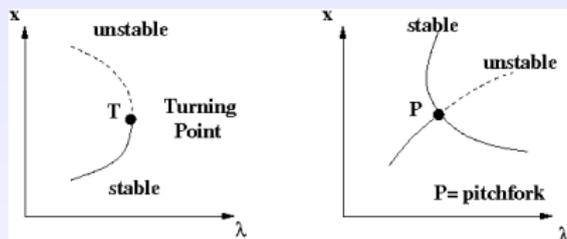


Figure: Generic behaviour for singular points in 1-parameter problems

- **Lecture 2: Complex pair crosses Imaginary axis**
- Two cases: (a) **Turning Point**
(b) If a symmetry is broken (i.e eigenvector ϕ ‘breaks’ the symmetry) then **Symmetric Pitchfork**
- Taylor problem has a reflectional symmetry
- In both cases: $F(x(t), \lambda(t)) = 0$: $\mu(t)$ is eigenvalue of $F_x(x(t), \lambda(t))$
then

$$\mu(t) = 0, \quad \frac{d}{dt}\mu(t) \neq 0 \quad \text{at the singular point}$$

That is, an eigenvalue of F_x passes through zero “smoothly”

- loss of stability at the singular points

Detection then accurate calculation

- Seek (x, λ) such that $F_x(x, \lambda)$ is singular
- Consider

$$\begin{bmatrix} F_x(x, \lambda) & F_\lambda(x, \lambda) \\ c^T & d \end{bmatrix} \begin{bmatrix} * \\ g \end{bmatrix} = \begin{bmatrix} 0 \\ 1 \end{bmatrix}$$

- $g = g(x, \lambda)$
- Cramer's Rule: $\text{Det}(F_x) = 0 \iff g = 0$.

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- $g = g(x, \lambda)$
- Cramer's Rule: $\text{Det}(F_x) = 0 \iff g = 0$.
- Accurate calculation: Consider the pair

$$F(x, \lambda) = 0, \quad g(x, \lambda) = 0$$

- Newton's Method:

$$\begin{bmatrix} F_x(x, \lambda) & F_\lambda(x, \lambda) \\ g_x(x, \lambda)^T & g_\lambda(x, \lambda) \end{bmatrix} \begin{bmatrix} \Delta x \\ \Delta \lambda \end{bmatrix} = - \begin{bmatrix} F \\ g \end{bmatrix}$$

- System nonsingular if $\frac{d}{dt}\mu \neq 0$ at singular point

Detection then accurate calculation

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- System nonsingular if $\frac{d}{dt}\mu \neq 0$ at singular point
- Extended Systems:

$$F(x, \lambda) = 0, \quad F_x(x, \lambda)\phi = 0, \quad c^T\phi = 1$$

Also reduces to solving 1-bordered systems (numerics for Taylor problem)

- Adapt for symmetry-breaking

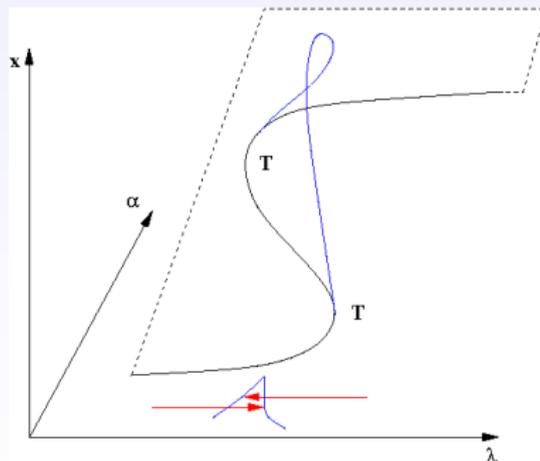
2-parameter problems (e.g. The Taylor Problem)

- Use system that is **nonsingular** at a bifurcation point (F_x singular)
- Use pseudo-arclength to follow paths bifurcation points. For example:

$$F(x, \lambda, \alpha) = 0, \quad g(x, \lambda, \alpha) = 0, \quad n(x, \lambda, \alpha, t) = 0$$

where $n(x, \lambda, \alpha, t) = 0$ is the “normalisation” (2-bordered systems)

- detect singular points on path of bifurcations?



Transcritical bifurcation

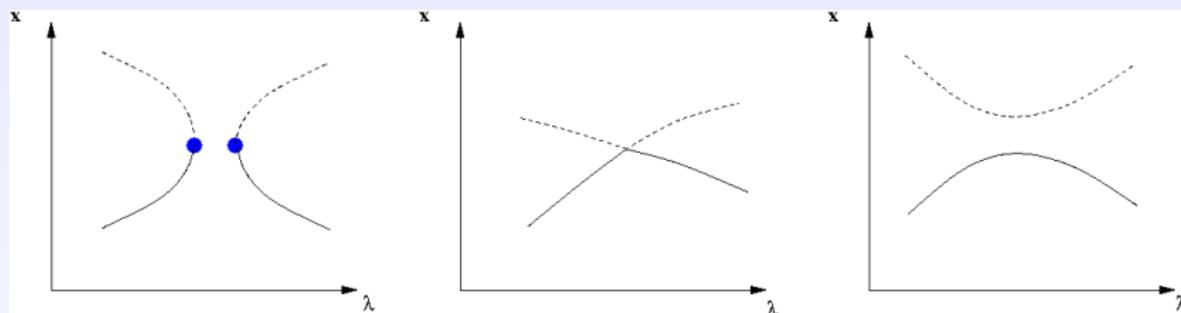


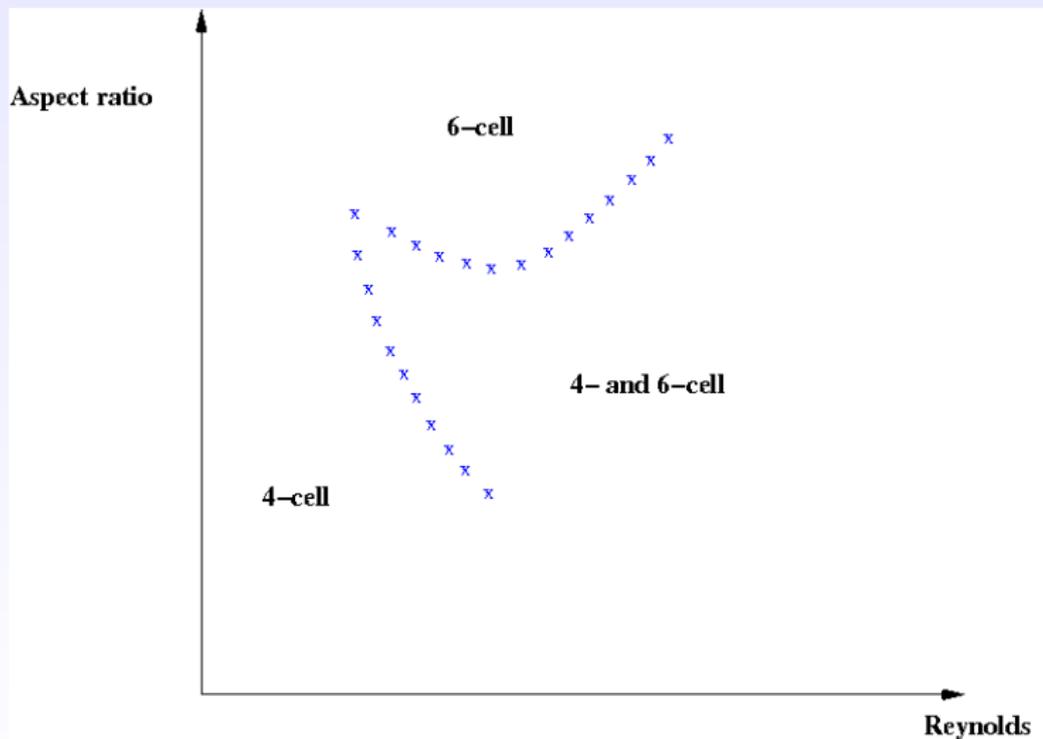
Figure: The sequence to a transcritical bifurcation for $F(x, \lambda, \alpha) = 0$

- solid lines represent **stable** solutions
- Transcritical bifurcations **should not occur** in 1-parameter problems
- A Transcritical bifurcation, and a Cusp are Turning points in a path of Turning points
- Transcritical and Cusp bifurcations are “codimension 1”
- Multi-parameter problems?
- High codimension points are called **Organising Centres**

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Recall the Taylor Problem: Schematic of experimental results



Reynolds



Figure: Parameter space plot showing loss of stability of 4 and 6 cell flows

Recall the Taylor Problem

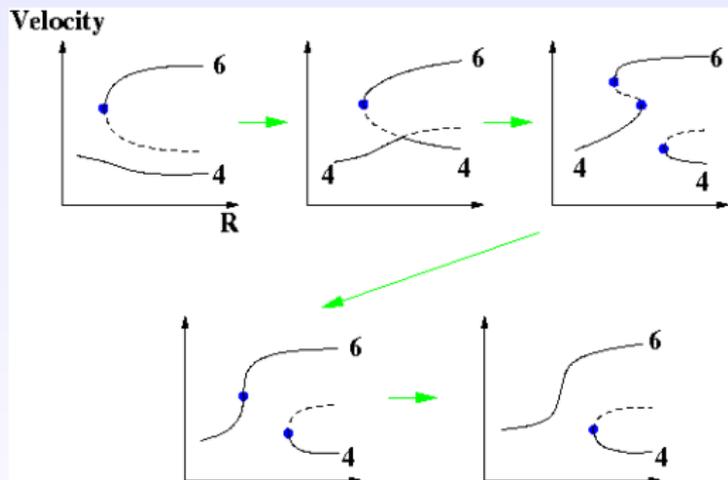
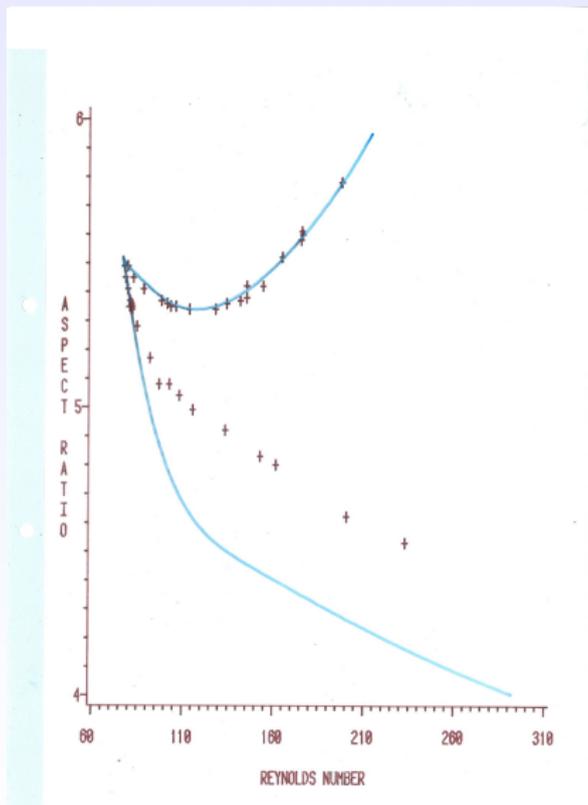
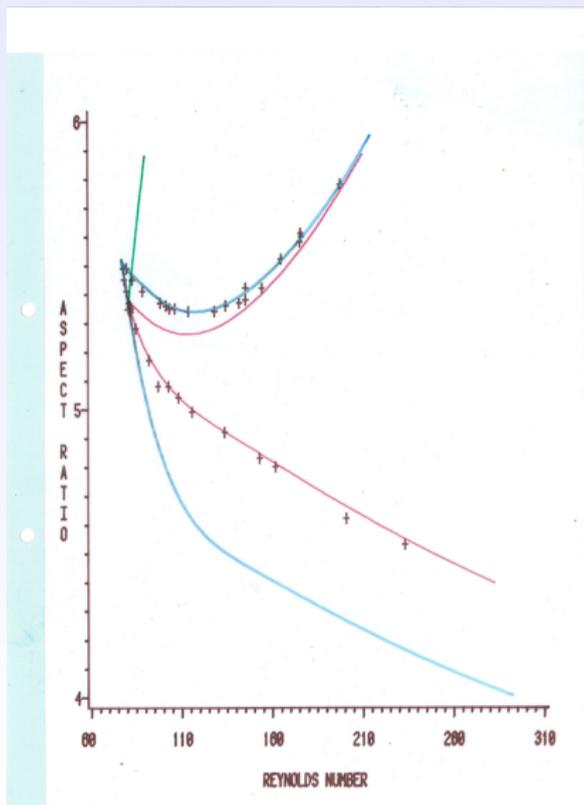


Figure: 4 and 6 cell anomalous modes: sequence of bifurcation diagrams as aspect ratio varies

Numerical results for the 4-6 cell interchange (Cliffe)



The 4-6 cell interchange including symmetry-breaking (Cliffe)



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Conclusions

- Numerical methods work!
- Excellent agreement between numerics and experiment
- Eigenvalues work! (Problem isn't very “non-normal”)
- The numerical methods gave extra insight via symmetry-breaking
- Efficient methods for bordered systems are crucial
- Iterative methods for bordered systems in continuation and bifurcation analysis?
- Lecture 2: Hopf bifurcations and periodic orbits