Reduced System Computing

for

Singularly Perturbed Differential Equations

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Acknowledgments

NSF Grant DMS-0514468: RUI: Reduced System Computing for Singularly Perturbed Differential Equations

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- NSF Grant DMS-0514468: RUI: Reduced System Computing for Singularly Perturbed Differential Equations
- Undergraduate students:
 - Brian Kinney
 - 🖵 Tomas Gruszka
 - Dimitar Simeonov

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$$\downarrow \epsilon = 0$$

Slow Subsystem (DAE) 0 = f(x, y) $\dot{y} = g(x, y)$

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$$\begin{array}{c}
Fast Subsystem \\
\dot{x} = f(x,y) \\
\dot{y} = 0
\end{array}$$

$$\frac{\text{Critical Manifold}}{0 = f(x, y)}$$

Example: The Periodically Forced van der Pol System

 $x'' + d(x^2 - 1)x' + x = a\sin(v\tau)$

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New parameters: $\varepsilon = 1/d^2$, $\omega = \frac{vd}{2\pi}$ New variables: $t = \sqrt{\varepsilon}\tau$, $\theta = \omega t$, $y = \varepsilon \dot{x} + x^3/3 - x$

Then

$$\varepsilon \dot{x} = x - \frac{1}{3}x^3 + y$$
$$\dot{y} = -x + a\sin(2\pi\theta)$$
$$\dot{\theta} = \omega$$

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Symmetry: $x \rightarrow -x$, $y \rightarrow -y$, $\theta \rightarrow \theta + 1/2$

$$\begin{vmatrix} \varepsilon \dot{x} = x - \frac{1}{3}x^3 + y \\ \dot{y} = -x + a\sin(2\pi\theta) \\ \dot{\theta} = \omega \end{vmatrix}$$

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Slow Subsystem (DAE) $y = \frac{1}{3}x^{3} - x$ $\dot{y} = -x + a\sin(2\pi\theta)$ $\dot{\theta} = \omega$

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$$\begin{aligned} \hline \frac{\text{Slow Subsystem (DAE)}}{y &= \frac{1}{3}x^3 - x} \\ \dot{y} &= -x + a\sin(2\pi\theta) \\ \dot{\theta} &= \omega \end{aligned}$$

Eliminate *y* and desingularize

 $\dot{\theta} = \omega(x^2 - 1)$ $\dot{x} = -x + a\sin(\theta)$ (Time reversed for |x| < 1.)

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$$\begin{array}{c} \underline{t \rightarrow \varepsilon t} \\ \hline \dot{x} = x - \frac{1}{3}x^3 + y \\ \dot{y} = \varepsilon(-x + a\sin(2\pi\theta)) \\ \dot{\theta} = \varepsilon \omega \end{array}$$

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(Time reversed for $|x| < 1$.)

Critical Manifold
$$y = \frac{1}{3}x^3 - x$$



х







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Representative System (one fast, two slow variables):

$$\varepsilon \dot{x} = y + x^{2}$$
$$\dot{y} = az + bx$$
$$\dot{z} = 1$$

Critical manifold is $y = -x^2$. The origin is a folded equilibrium.

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 $a < 0 \implies$ folded saddle



Z






















Canards at a Folded Saddle



































Horseshoe in the Forced van der Pol System



Horseshoe in the Forced van der Pol System



Numerical Computation





Based on the fast and slow subsystems only.



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- Singular limit of canard trajectories results in nonuniqueness.



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- Singular limit of canard trajectories results in nonuniqueness.
- □ The "reduced" system provides useful information.
- Many programs were written... can we automate this?

Goal:

Create computational tools for the study of the reduced system of a singularly perturbed differential equation.

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- Concatenate solutions to fast and slow subsystems.
- Create "zeroth order" approximations.

Complications:

- Canards
- □ Fast periodic orbits (and more general ω limit sets of the fast subsystem)

Slow Subsystem - A Few More Details

$$0 = f(x, y)$$
$$\dot{y} = g(x, y)$$

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Differentiate 0 = f(x,y), solve for \dot{x} to obtain $\dot{x} = -(Df)^{-1}(D_y f)g(x,y)$. Multiply by $\det(D_x f)$.

Desingularized slow equations:

$$\dot{x} = -(\operatorname{adj} D_x f)(D_y f)g(x, y)$$
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Fold points:

$$f(x,y) = 0, \quad \det(D_x f) = 0$$

Fold points are saddle-node equilibria of the fast subsystem.

Example: Two Coupled Neurons

$$\dot{v_1} = -v_1 + \tanh(\sigma_1 v_1) - q_1 - \omega f(v_2)(v_1 + 4)$$

$$\dot{v_2} = -v_2 + \tanh(\sigma_2 v_2) - q_2 - \omega f(v_1)(v_2 + 4)$$

$$\dot{q_1} = \varepsilon(-q_1 + v_1)$$

$$\dot{q_2} = \varepsilon(-q_2 + v_2)$$

$$f(v) = \frac{1}{1 + e^{-40(v - 1/75)}}$$

- **□** Each (v_i, q_i) is a relaxation oscillator.
- When one is firing, the other's v nullcline is depressed ("reciprocal inhibition").
- This system has two fast variables and a two dimensional critical manifold.

```
# Definitions for the coupled oscillator fast/slow system.
cpldosc
# Fast variables: v1, v2
2
v1
v2
# Slow variables: q1, q2
2
q1
q2
# Parameters:
3
omega
sigma1
sigma2
# Vector field for the fast variables
-v1+tanh(sigma1*v1) - q1 - omega*(v1+4)/(1+exp(-40*(v2-1/75)))
-v_2+tanh(sigma_2*v_2) - q_2 - omega*(v_2+4)/(1+exp(-40*(v_1-1/75)))
# Vector field for the slow variables
-q1 + v1
-q2 + v2
```

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-a^{2} + v^{2}
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Input file: cpldosc.fs

Output files:

fs_cpldosc.c	General C functions
fs_cpldosc_cvode.c	C functions for CVODE
fs_cpldosc_ida.c	C functions for IDA
fs_cpldosc.m	MATLAB functions

The generated code includes:

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□ Fast vector field and IVP solver

Solve the fast subsystem IVP

The generated code includes:

□ Slow subsystem DAE, configured for IDA

```
Compute residuals for the IDA DAE solver
int cpldosc_idares(realtype t, N_Vector Zvec, N_Vector Zdotvec,
N_Vector rvec, void *params)
```

Solve the slow subsystem DAE IVP

The generated code includes:

Desingularized slow subsystem (for CVODE)

Desingularized slow subsystem IVP solver

The generated code includes:

□ Fold function and Jacobian

Fold function

realtype cpldosc_foldfunc_nv(N_Vector Zvec, void *params)

Fold function gradient (with respect to all variables)

void cpldosc_foldfunc_grad_nv(double *grad, N_Vector Zvec,

void *params)

Example: Initial Value Problem for the Coupled Oscillator System











 $\sigma_1 = 1.5925$







Bifurcation Diagram: Stable Periodic Orbits

("Poor man's" continuation; not a complete diagram)



 σ_1

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 Mixed Mode Oscillations Due to the Generalized Canard Phenomenon,
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- Singular variational equations.
- Fast periodic orbits and the averaged fast subsystem.