An introduction to numerical continuation with AUTO

Jennifer L. Creaser

EPSRC Centre for Predictive Modelling in Healthcare University of Exeter j.creaser@exeter.ac.uk

> Internal Dynamics Seminar 20 October 2017



Engineering and Physical Sciences Research Council



INTRO TO AUTO

AUTO

Software for continuation and bifurcation problems in ordinary differential equations.

- Originally developed by Eusebius Doedel, with contributions from many others.
- For more information and to download AUTO visit http://cmvl.cs.concordia.ca/auto [lecture notes and manual]
- For more info on the theory behind continuation [Krauskopf, Osinga & Galán-Vioque (Eds.) Springer, 2007]



Related software includes: DSTool, PyDSTool, XPPAUT, Content, MatCont, and DDE-BifTool. ODE OVERVIEW

$$u'(t) = f(u(t), \lambda), \quad f, u \in \mathbb{R}^n, \ \lambda \in \mathbb{R}$$

- Compute families of stable and unstable periodic solutions
- Locate and continue folds, branch points, period doubling bifurcations, and bifurcations to tori.
- Do each of the above for rotations
- Follow homoclinic orbits and detect and continue codim-2 bifurcations, using HomCont.
- Compute curves of solutions on [0,1], subject to nonlinear boundary and integral conditions.
- Determine folds and branch points along solution families to the above BVP.





and more ...

[Creaser et al. 2017]

INTRO TO AUTO

PREDATOR PREY MODEL

Consider a predator-prey model with fishing

$$\begin{cases} u_1' = 3u_1(1-u_1) - 2u_1u_2 - \lambda(1-e^{-5u_1}), \\ u_2' = -u_2 + 3u_1u_2. \end{cases}$$

We can think of u_1 as 'fish' and u_2 as 'sharks', while the term

$$\lambda(1-e^{-5u_1}),$$

represents 'fishing' with a 'quota' λ .

For $\lambda = 0$ there are three equilibria

$$(u_1, u_2) = (0, 0), (1, 0), (\frac{1}{3}, 1).$$

INTRO TO AUTO

IMPLICIT FUNCTION THEOREM

Consider $\mathbf{f} : \mathbb{R}^n \times \mathbb{R} \to \mathbb{R}^n$ with $\mathbf{f}(\mathbf{u}_0, \lambda_0) = \mathbf{0}$ for $\mathbf{u}_0 \in \mathbb{R}^n$ and $\lambda_0 \in \mathbb{R}$. Suppose the following holds:

- The Jacobian matrix $\mathbf{f}_{\mathbf{u}}(\mathbf{u}_0, \lambda_0)$ is nonsingular;
- **f** and $\mathbf{f}_{\mathbf{u}}$ are Lipschitz continuous (in both \mathbf{u} and λ)

Then there exists $\delta > 0$ and interval $\Lambda_{\delta} = (\lambda_0 - \delta, \lambda_0 + \delta)$, with a unique function $\mathbf{u}(\lambda)$ continuous on Λ_{δ} , such that

$$\begin{aligned} \mathbf{u}(\lambda_0) &= \mathbf{u}_0 \\ \mathbf{f}(\mathbf{u}(\lambda), \lambda) &= \mathbf{0}, \text{ for all } ||\lambda - \lambda_0|| < \delta. \end{aligned}$$

We call \mathbf{u}_0 an isolated solution of $\mathbf{f}(\mathbf{u}, \lambda_0) = 0$.

INTRO TO AUTO

JACOBIANS

The Jacobian matrix for our example is

$$J(u_1, u_2; \lambda) = \begin{pmatrix} 3 - 6u_1 - 2u_2 - 5\lambda e^{-5u_1} & -2u_1 \\ u_2 & -1 + 3u_1 \end{pmatrix}.$$

Evaluating at the equilibria gives

$$J(0,0;0) = \begin{pmatrix} 3 & 0 \\ 0 & -1 \end{pmatrix}, \ J(1,0;0) = \begin{pmatrix} 3 & -2 \\ 0 & 2 \end{pmatrix},$$
$$J(\frac{1}{3},1;0) = \begin{pmatrix} -1 & -\frac{2}{3} \\ 6 & 0 \end{pmatrix}$$

all three are non-singular for $\lambda=0.$ Therefore, by the IFT all three equilibria persist for (small) $\lambda\neq 0$

INTRO TO AUTO

PHASE PORTRAITS

1.3 $\lambda = \mathbf{0}$ $\lambda = 0.5$ 1.3 6 U_2 U_2 6 0 0 **U**1 *u*₁ n ($\lambda = 0.68$ $\lambda = 0.75$ 1.3 1.3 U₂ U_2 0 0 0 u_1 0 u_1

INTRO TO AUTO

PARAMETER CONTINUATION

• Set $\lambda_1 = \lambda_0 + \Delta \lambda$

• Use Newton's method with initial guess $\textbf{u}_1^{(0)} = \textbf{u}(\lambda) + \Delta\lambda \dot{\textbf{u}}$



PSEUDO-ARCLENGTH CONTINUATION

•
$$\mathbf{f}(\mathbf{u}_1, \lambda_1) = 0$$

• $(\mathbf{u}_1 - \mathbf{u}_0)\dot{\mathbf{u}}_0 + (\lambda_1 - \lambda_0)\dot{\lambda}_0 - \Delta s = 0$



USER SUPPLIED FILES

To run AUTO you will need:

- A source file xxx.{f,f90,c} containing the Fortran routines FUNC, STPNT, BCND, ICND, FOPT, and PVLS.
- A constants-file c.xxx.

See auto/07p/demos for lots of examples.

AUTO is run via the AUTO command line user interface (CLUI) - based on Python

INTRO TO AUTO

AUTO ERRORS

Error MX

• Something in c. file? Problem with parameters, not initialised properly (not good maths!) or doesn't quite match BCs, check PVLS and BCs.

 $\mathrm{Error}~\mathsf{NaN}$

• Something in .f90 file?

ERROR ValueError: invalid literal for int() with base 10: 'x-'

• Missed a comma in the c.file

 Error IndexError: string index out of range

• Some typo in your c. file - go back to an older one and try again.

ERROR write() argument must be str, not bytes

• in c. file if IRS greater than 0 then you get this error if using python3

INTRO TO AUTO