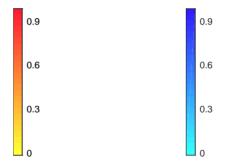
#### Calibration

#### This is a colourful sentence. $\Box \times \Delta$



#### Isochrons for Saddle-Type Periodic Orbits in Three-Dimensional Space

James Hannam Supervisors: Hinke Osinga Bernd Krauskopf

> Department of Mathematics The University of Auckland

> > 21/05/2017





#### Background ★▲▲▲▲▲ Isochrons

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Complex Invariant Manifol



For any system of ordinary differential equations (ODE's), e.g.,

$$\dot{x} = \mu a x - y - b x (x^2 + y^2),$$
  
$$\dot{y} = x + \mu (a + c) y - (b + d) y (x^2 + y^2),$$

$$a = 0.1, \quad b = -0.05, \quad c = 0.9, \quad d = 0.45, \quad \mu = 2.0,$$

which contains an attracting periodic orbit, we can assign an asymptotic phase to all initial conditions which tend towards that orbit. An 'isochron' is a unique object that connects all initial conditions that have identical asymptotic phase.

- Isochrons were introduced by Winfree in 1974. A.T. Winfree, Patterns of phase compromise in biological cycles, J. Math. Biol., 1 (1974) pp73-93.
- □ Guckenheimer formalised the isochron definition as the stable manifold of the time- $T_{\Gamma}$ map of the point  $\gamma_{\theta}$  on the periodic orbit  $\Gamma$ . J. Guckenheimer, Isochrons and Phaseless Sets, J. Math. Biol., 1 (1975) pp259-273.
- **D** The isochrons of a periodic orbit  $\Gamma$  define a set of (n-1)-dimensional smooth manifolds that foliate its *n*-dimensional basin of attraction.



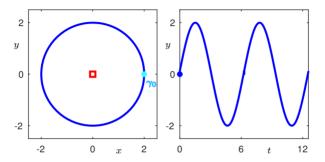
Isochrons have been applied in the study a variety of phenomena including,

- Phase resetting in cardiac cells
- Neuronal bursting
- Models of chemical reactions
- Electronics.

They are particularly useful when considering phase resetting experiments often encountered in biology, and phase reductions of models.

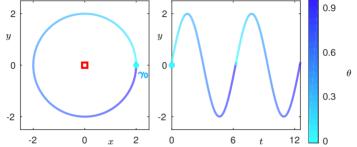
## Background Phase out of the plane AA×AAA AAA A notion of phase





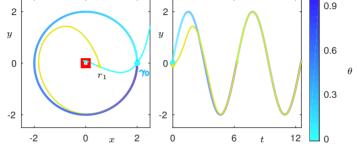
- **D** For an attracting periodic orbit, the convention is to choose the zero-phase point  $\gamma_0$  as the maximum in x.
- □ Phase is defined on [0,1), such that a phase  $\theta = 0$  corresponds to a time of  $nT_{\Gamma}$ ,  $n \in \mathbb{Z}$ .
- $\square$   $\Gamma$  is defined such that it begins and ends at  $\gamma_0$ ; it lies on the zero-phase isochron.





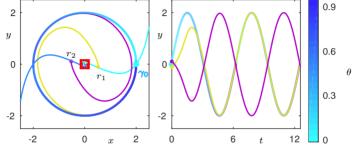
- **•** For an attracting periodic orbit, the convention is to choose the zero-phase point  $\gamma_0$  as the maximum in x.
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- $\square$   $\Gamma$  is defined such that it begins and ends at  $\gamma_0$ ; it lies on the zero-phase isochron.





- Γ is defined such that it begins and ends at γ<sub>0</sub>; it lies on the zero-phase isochron.
   The zero-phase isochron intersects the periodic orbit at γ<sub>0</sub>.
- $\square$   $r_1$  also starts on the zero-phase isochron;  $r_1$  must syncrhonise with  $\Gamma$ .
- Any trajectory that starts on the **zero-phase** isochron will synchronise with the periodic orbit with phase  $\theta = 0$ .





 $\square$   $\Gamma$  is defined such that it begins and ends at  $\gamma_0$ ; it lies on the zero-phase isochron.

- Any trajectory that starts on the **zero-phase** isochron will synchronise with the periodic orbit with phase  $\theta = 0$ .
- $\square$   $r_2$  starts on the half-phase isochron, and so remains identically out of phase with  $\Gamma$  and  $r_1$  in asymptotic time.

### Background Phase out of the plane Complex Invariant Manifolds THE UNIVERSITY AAA×AA AAA AAA AAAA FACULY OF SCIENCE Isochron computation by Numerical Continuation FACULY OF SCIENCE Department of Mathematics

We use the numerical continuation of a two-point boundary value problem as an effective and accurate method for computing isochrons.<sup>1</sup> <sup>2</sup> This boundary value problem is a direct result of the definition of isochrons as the stable manifold of the associated time- $T_{\Gamma}$  map for a phase point  $\gamma_{\theta} \in \Gamma$ . The eigenvector associated with this stable manifold is the linear approximation  $\vec{w}$  of the associated isochron. The two point boundary value problem that we will continue requires that the end point  $\vec{u}(T_{\Gamma})$  lies on the linear approximation.

 $(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{w}} = \eta$  $(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{w}}^{\perp} = 0$ 

4/16

<sup>&</sup>lt;sup>1</sup>H.M. Osinga, J. Moehlis, *Continuation-based computation of global isochrons,* SIAM Journal on Applied Dynamical Systems, 9(4) (2010)

<sup>&</sup>lt;sup>2</sup>P. Langfield, B. Krauskopf, H.M. Osinga, *Solving Winfree's puzzle: the isochrons in the FitzHugh-Nagumo model,* Chaos: An Interdisciplinary Journal of Nonlinear Science, 24 (2014)

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 $(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{w}} = \eta$  $(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{w}}^{\perp} = 0$  $(\vec{u}(0) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{w}}^{\perp} = \boldsymbol{\delta}$ 

4/16

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## Background Phase out of the plane Complex Invariant Manifolds Phase out of the plane Complex Invariant Manifolds OF AUCKLAND Isochron computation by Numerical Continuation

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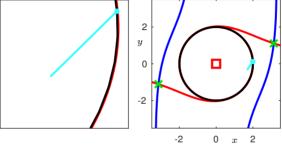
 $(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{s} = \tau$  $(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{s}^{\perp} = 0$ 

4/16

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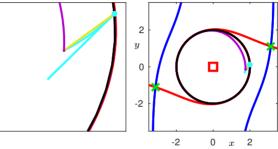
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- **u** We start with an attracting periodic orbit  $\Gamma$ , and the linear approximation of the isochron at  $\gamma_0$ .
- The Periodic orbit is a trajectory that satisfies the two-point boundary value problem.
  - $\pmb{\times}\ \Gamma$  begins on the **linear approximation** of the isochron.
  - ×  $\Gamma$  has an integration time  $T_{\Gamma}$ .



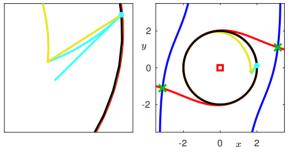


 $\blacksquare$  By moving the end point of  $\Gamma$  along the linear approximation, a new trajectory is created.

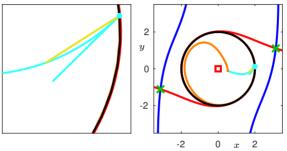
× This new trajectory returns to the linear approximation at time  $T_{\Gamma}$ .

- × The trajectory's start point must lie on the isochron.
- We monitor the distance of the start point from the linear approximation until it reaches  $\delta_{max}$ .

# Background Phase out of the plane Complex Invariant Manifolds 222 THE UNIVERSITY AAAA AAAA AAAA AAAA AAAA Isochrons by numerical continuation FACULY of SciENCE Department of Mathematics

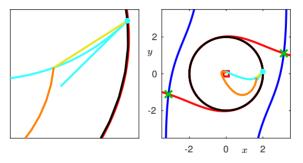


- We monitor the distance of the start point from the linear approximation until it reaches  $\delta_{max}$ .
- This trajectory defines the **fundamental domain**, a closer approximation to the isochron than the **linear approximation**.
- The start point of the trajectory has swept out the zero phase isochron as it was continued.



- The start point of the trajectory has swept out the zero phase isochron as it was continued.
- We continue the trajectory such that it's end point lies on the **fundamental domain**.

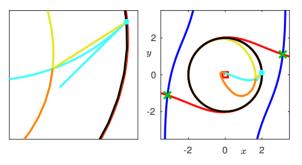
## Background Phase out of the plane Complex Invariant Manifolds 2222 THE UNIVERSITY A A A A A A A A A A A A A Isochrons by numerical continuation Department of Mathematics Department of Mathematics



■ When the trajectory's end point reaches the **fundamental domain's** length:

× Stop continuation.

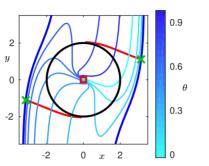
## Background Phase out of the plane Complex Invariant Manifolds OF AUCKLAND CONTROL AUCK



**u** When the trajectory's end point reaches the **fundamental domain's** length:

- **×** Stop continuation.
- × Append the trajectory that defines the **fundamental domain**.
- × Increase the time interval for the trajectory to  $2T_{\Gamma}$ .
- × Continue the new trajectory over the **fundamental domain**.

## Background Phase out of the plane Complex Invariant Ma AAAA×A AAA AAAA Isochrons by numerical continuation

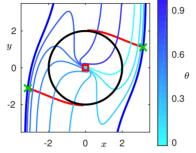


**D** Repeat for different phases.

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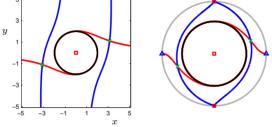
Department of Mathematics





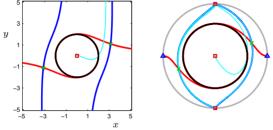
- Isocrhons must accumulate on the basin boundary.
- The unstable invariant manifolds of the saddle points must intersect each isochron infinitely many times.





- $\blacksquare$  We can compactify  $\mathbb{R}^2$  onto  $\mathbb D$  in order to apply our method effectively far away from  $\Gamma.$
- This compactification preserves geometry, invariant dynamics, and introduces equilibria at infinity.

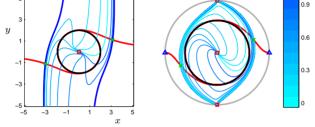




- We can compute global isochrons effectively and accurately, and visualise their geometries near infinity.<sup>a</sup>
- For this example, the isochrons must be computed to very large arclengths in order to confirm phase sensitivity at the basin boundary.

<sup>a</sup>J. Hannam, B. Krauskopf, H.M. Osinga, *Global isochrons of a planar system near a phaseless set with saddle equilibria*, The European Physical Journal Special Topics, 225(13-14) (2016)





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Background Phase out of the plane Complex Invariant Manifolds Phase out of the plane Complex Invariant Phase out of the plane Complex Inv

We can compute the isochrons of a saddle-type periodic orbit in a three-dimensional system by modifying the method used in the plane to account for the extra degrees of freedom.

#### **Fundamental Domain**

#### Isochron

 $(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{w}} = \eta \qquad (\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{s}} = \tau$  $(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{w}}^{\perp} = 0 \qquad (\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{s}}^{\perp} = 0$  $(\vec{u}(0) - \vec{\gamma}_{\theta}) \cdot \vec{\boldsymbol{w}}^{\perp} = \boldsymbol{\delta}$  We can compute the isochrons of a saddle-type periodic orbit in a three-dimensional system by modifying the method used in the plane to account for the extra degrees of freedom.

#### **Fundamental Domain**

#### Isochron

$$(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{w} = \eta$$

$$(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{w}^{\perp} = 0$$

$$(\vec{u}(0) - \vec{\gamma}_{\theta}) \cdot \vec{w}^{\perp} = \delta_{\theta}$$

$$(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{w}^{n} = 0$$

$$(\vec{u}(0) - \vec{\gamma}_{\theta}) \cdot \vec{w}^{\times} = \delta_{n}$$

$$\delta_{\theta}^{2} + \delta_{n}^{2} = \delta_{n}^{2}$$

XAA

Adaptation of method for saddle-type periodic orbits

$$(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{s} = \tau$$
$$(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{s}^{\perp} = 0$$
$$(\vec{u}(T_{\Gamma}) - \vec{\gamma}_{\theta}) \cdot \vec{s}^{n} = 0$$

. . . . . . . . .



. . . . . . . . .

The phase  $\theta$  of an initial condition  $\vec{u}_0$  is given by the asymptotic phase function  $\Theta(\vec{u}_0) \in [0,1)$  assigned by the condition,

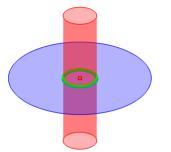
$$\lim_{t \to \infty} \| \Phi(t, \vec{u}_0) - \Phi(t + \Theta(\vec{u}_0) T_{\Gamma}, \gamma_0) \| = 0.$$

For the unstable manifolds of periodic orbits, we can define backward-time isochrons – objects equivalent to the forward-time isochrons of that periodic orbit under the transformation t = -t. Thus the asymptotic phase of an 'initial condition'  $\vec{u}_0$  on a backwards-time isochron governed by the condition,

$$\lim_{t \to \infty} \| \Phi(-t, \vec{u}_0) - \Phi(\Theta(\vec{u}_0)T_{\Gamma} - t, \gamma_0) \| = 0.$$

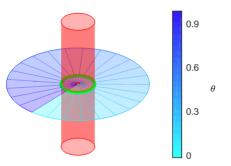
#### Background AAAAAA Simple isochrons on orientable manifolds





$$\dot{x} = \beta x - \omega y - x(x^2 + y^2)$$
$$\dot{y} = \omega x + \beta y - y(x^2 + y^2)$$
$$\dot{z} = \alpha z$$

- $\blacksquare$  The stable and unstable invariant manifolds or  $\Gamma$  are known analytically, and serve as a good test case.
- **\square** The basin of attraction of  $\Gamma$  is its stable invariant manifold.

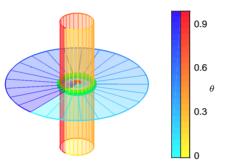


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- $\blacksquare$  The stable and unstable invariant manifolds or  $\Gamma$  are known analytically, and serve as a good test case.
- **\square** The forward-time isochrons of  $\Gamma$  foliate its stable maniold.

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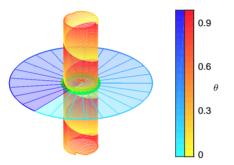
$$\dot{x} = \beta x - \omega y - x(x^2 + y^2)$$
$$\dot{y} = \omega x + \beta y - y(x^2 + y^2)$$
$$\dot{z} = \alpha z$$

- $\blacksquare$  The stable and unstable invariant manifolds or  $\Gamma$  are known analytically, and serve as a good test case.
- **\square** In reverse time the unstable invariant manifold forms the basin of attraction of  $\Gamma$ .
- $\blacksquare$  The Backward-time isochrons of  $\Gamma$  foliate its unstable invariant manifold.
- **\square** Since  $\omega$  has no dependence on x, y, z, the isochrons are straight lines.

James Hannam (The University of Auckland)

Department of Mathematics



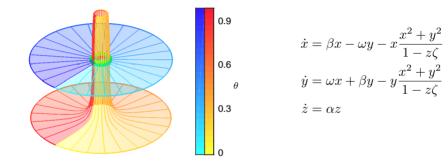


$$\dot{x} = \beta x - (1 - \kappa z)\omega y - x(x^2 + y^2)$$
$$\dot{y} = (1 - \kappa z)\omega x + \beta y - y(x^2 + y^2)$$
$$\dot{z} = \alpha z$$

- **D** By changing  $\omega$  to depend on z, the isochrons on the unstable invariant manifold are no longer straight lines.
- The geometry of the unstable invariant manifold is the same, but the geometry of its isochrons change due to the new dynamics.

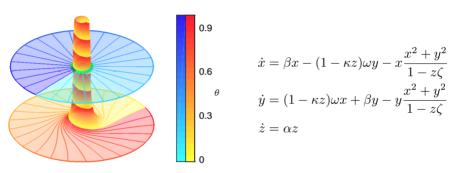
#### Background AAAAAA Simple isochrons on orientable manifolds





- We can change the geometry of the unstable invariant manifold so that it is no linger a cylinder.
- The geometry of the isochrons also change to account for the new geometry of the unstable invariant manifold.

#### Background Phase out of the plane AAAAAA Simple isochrons on orientable manifolds



- We can change the geometry of the unstable invariant manifold so that it is no linger a cylinder.
- The geometry of the isochrons also change to account for the new geometry of the unstable invariant manifold.

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Complex Invariant Manifolds



For parameter values,

 $a = 0.22, \quad b = 1.0, \quad c = -2.0, \quad \alpha = 0.3, \quad \beta = 1.0, \quad \gamma = 2.0, \quad \mu = 0.004, \widetilde{\mu} = 0.004, \quad \mu = 0.004, \quad$ 

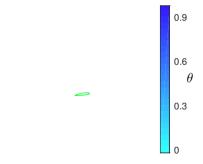
this system<sup>3</sup> contains a saddle-type periodic orbit.

$$\dot{x} = ax + by - ax^2 + x(2 - 3x)(\tilde{\mu} - \alpha z)$$
  
$$\dot{y} = bx + ay - 1.5bx^2 - 1.5axy - 2y(\tilde{\mu} - \alpha z)$$
  
$$\dot{z} = cz + \mu x + \gamma xz + \alpha \beta (x^2(1 - x) - y^2)$$

<sup>3</sup>B. Sandstede, *Constructing dynamical systems having homoclinic bifurcation points of codimension two*, Journal of Dynamics and Differential Equations, 9 (1997)

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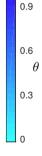
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# Background Phase out of the plane Complex Invariant Manifolds AAAAAA Seeing complicated geometry with isochrons Complex Invariant Manifolds Department of Mathematics

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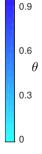
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### Background Phase out of the plane Complex Invariant Material Addada Addada Addada Addada Addada Addada Seeing complicated geometry with isochrons



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Background Phase o AAAAAA AAA Arneodo's System Complex Invariant Manifolds



For parameter values,

$$\alpha = 3.2, \quad \beta = 2.0,$$

this system<sup>4</sup> contains a non-orientable saddle-type periodic orbit.

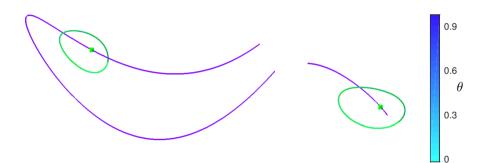
$$egin{array}{lll} \dot{x} = y, \ \dot{y} = z, \ \dot{z} = (lpha - x)x - eta y - z \end{array}$$

<sup>4</sup>A. Arneodo, P.H. Coullet, E.A.Spiegel, C. Tresser, *Asymptotic chaos*, Physica, D14 (1985)

#### Background Phase out of the plane AAAAAA AAA How does a Mobiüs strip grow?

Complex Invariant Manifolds

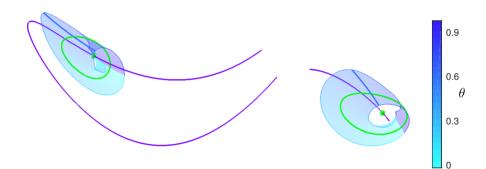




#### Background Phase out of the plane AAAAAA AAA How does a Mobiüs strip grow?

Complex Invariant Manifolds





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Complex Invariant Manifolds



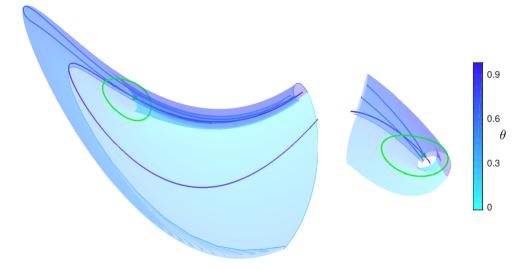
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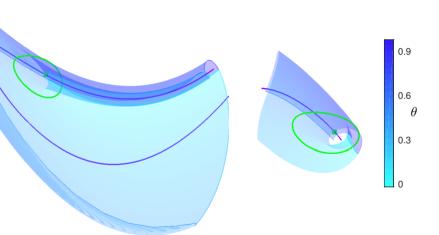


#### Background Phase out of the plane AAAAAA AAA How does a Mobiüs strip grow?

Complex Invariant Manifolds







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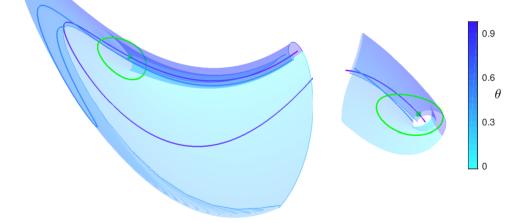
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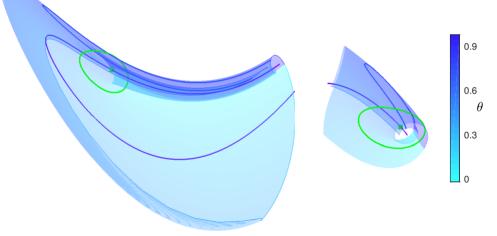
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Phase out of the plane

Complex Invariant Manifolds





### Work so far

- Compactification is a useful tool in the realisation of global isochron geometry.
- **u** We can compute isochrons on the invariant manifolds of saddle type periodic orbits.
- □ Visualising manifolds in terms of their isochrons is useful in determining their geometry and embedded dynamics.

#### **Future endeavours**

- □ Investigate the interactions of forward and backward time isochrons in 3D.
- **Compute the isochrons of purely attracting periodic orbits in 3D.**



Phase out of the plane

Complex Invariant Manifolds

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Isochron theory

Motivation

A notion of phase

Numerical continuation method Illustrated numerical method

Non-compact basin boundaries

#### Phase out of the plane

BVP for saddle-type periodic Orbits Backward-time isochrons Simple isochrons on invariant manifolds

### Complex Invariant Manifolds

Sunstede's equations Growing an orientable manifold Seeing the phase in Sunstede Arneodo's system Growing an non-orientable manifold Seeing the phase The end Table of Contents