

1. (a) By definition, $\vec{\varphi}(t)$ is a flow for (W^t, \mathbb{R}^2) if $\frac{d}{dt}\vec{\varphi}(t) = \vec{F}(\vec{\varphi}(t))$, so let's check that:
- i. $\vec{\varphi}(t) = (-e^{-2t}, \sqrt{3}e^{-t})$, then

$$\frac{d}{dt}\vec{\varphi}(t) = (2e^{-2t}, -\sqrt{3}e^{-t})$$

and

$$\vec{F}(\vec{\varphi}(t)) = (-e^{-2t} + (\sqrt{3}e^{-t})^2, -\sqrt{3}e^{-t}) = (-e^{-2t} + 3e^{-2t}, -\sqrt{3}e^{-t}) = (2e^{-2t}, -\sqrt{3}e^{-t})$$

Thus, $\frac{d}{dt}\vec{\varphi}(t) = \vec{F}(\vec{\varphi}(t))$. It is a flow.

- ii. $\vec{\varphi}(t) = (-e^{-4t}, \sqrt{3}e^{-2t})$, then

$$\frac{d}{dt}\vec{\varphi}(t) = (4e^{-4t}, -2\sqrt{3}e^{-2t})$$

and

$$\vec{F}(\vec{\varphi}(t)) = (-e^{-4t} + (\sqrt{3}e^{-2t})^2, -\sqrt{3}e^{-2t}) = (-e^{-4t} + 3e^{-4t}, -\sqrt{3}e^{-2t}) = (2e^{-4t}, -\sqrt{3}e^{-2t})$$

Thus, $\frac{d}{dt}\vec{\varphi}(t) \neq \vec{F}(\vec{\varphi}(t))$. It is not a flow.

- iii. $\vec{\varphi}(t) = (\frac{4}{3}e^t - \frac{1}{3}e^{-2t}, e^{-t})$, then

$$\frac{d}{dt}\vec{\varphi}(t) = (\frac{4}{3}e^t + \frac{2}{3}e^{-2t}, -e^{-t})$$

and

$$\vec{F}(\vec{\varphi}(t)) = (\frac{4}{3}e^t - \frac{1}{3}e^{-2t} + (e^{-t})^2, -e^{-t}) = (\frac{4}{3}e^t - \frac{1}{3}e^{-2t} + e^{-2t}, -e^{-t}) = (\frac{4}{3}e^t + \frac{2}{3}e^{-2t}, -e^{-t})$$

Thus, $\frac{d}{dt}\vec{\varphi}(t) = \vec{F}(\vec{\varphi}(t))$. It is a flow.

- iv. $\vec{\varphi}(t) = (e^t - e^{-2t}, e^{-t})$, then

$$\frac{d}{dt}\vec{\varphi}(t) = (e^t + 2e^{-2t}, -e^{-t})$$

and

$$\vec{F}(\vec{\varphi}(t)) = (e^t - e^{-2t} + (e^{-t})^2, -e^{-t}) = (e^t - e^{-2t} + e^{-2t}, -e^{-t}) = (e^t, -e^{-t})$$

Thus, $\frac{d}{dt}\vec{\varphi}(t) \neq \vec{F}(\vec{\varphi}(t))$. It is not a flow.

- (b) We want to find constant flows $\vec{\varphi}$ of \vec{F} such that $\vec{\varphi}(t_1) = \vec{\varphi}(t_2)$ for all $t_1, t_2 \in \mathbb{R}$. This is equivalent as $\vec{\varphi}'(t) = \vec{0}$ for all $t \in \mathbb{R}$. Suppose $\vec{\varphi}(t) = (t_1, t_2)$. Then,

$$\vec{\varphi}'(t) = \vec{F}(\vec{\varphi}(t)) = (t_1 + t_2^2, -t_1) = (0, 0)$$

since $\vec{\varphi}(t)$ is a flow if $\vec{\varphi}'(t) = \vec{F}(\vec{\varphi}(t))$, which means

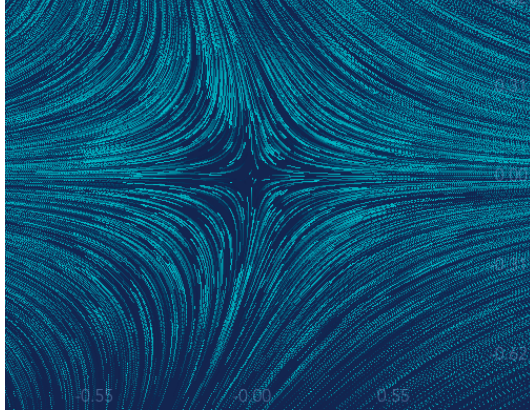
$$t_1 + t_2^2 = 0, -t_1 = 0 \implies t_2^2 = 0 \implies t_1, t_2 = 0$$

Then, all the constant flows for \vec{F} is the trivial flow $\vec{\varphi}(t) = \vec{0}$

- (c) The fixed points of (W^t, \mathbb{R}^2) are $\vec{x} \in \mathbb{R}^2$ such that $W^t(\vec{x}) = \vec{x}$ for all $t \in \mathbb{R}$, and $W^t(\vec{x}) = \vec{\varphi}(t)$ by definition. Then, we want to find such \vec{x} such that $\vec{\varphi}(t) = \vec{x}$ for all $t \in \mathbb{R}$. These means the constant flows are the fixed points. From 1b), we know the constant flow is $\vec{0}$, and we know from in class exercise, it is unstable.

Below is a visual representation of the vector field \vec{F} . One can clearly see that for any

$\delta > 0, B_\delta(\vec{0})$ expands outward overtime.



- (d) We want to find $\vec{\varphi}(t)$ such that $\frac{d}{dt}\vec{\varphi}(t) = \vec{F}(\vec{\varphi}(t))$ and $\vec{\varphi}(t) = (1, 0)$ for some $t \in \mathbb{R}$. With computer program's help, we find the general solution for $\vec{\varphi}(t) = (c_2 e^t - \frac{1}{3}c_1^2 e^{-2t}, c_1 e^{-t})$ for some $c_1, c_2 \in \mathbb{R}$. Next, want to see for what c_1, c_2 that $\vec{\varphi}(t) = (c_2 e^t - \frac{1}{3}c_1^2 e^{-2t}, c_1 e^{-t}) = (1, 0)$ for some $t \in \mathbb{R}$, and we get

$$c_2 e^t - \frac{1}{3}c_1^2 e^{-2t} = 1$$

and

$$c_1 e^{-t} = 0 \implies c_1 = 0$$

so

$$c_2 e^t = 1 \implies t = \ln \frac{1}{c_2} \implies c_2 > 0$$

Then, $\vec{\varphi}(t) = (c e^t, 0)$ for some $c > 0 \in \mathbb{R}$ such that it is a flow that passes through $(1, 0)$ at $t = \ln \frac{1}{c}$.

- (e) Fix flows $\vec{\varphi}_1$ and $\vec{\varphi}_2$ from part (d) such that $\vec{\varphi}_1 = (c_1 e^t, 0)$ and $\vec{\varphi}_2 = (c_2 e^t, 0)$ for some $c_1, c_2 > 0 \in \mathbb{R}$. We want to show that they are time shifts of each other, i.e., $\vec{\varphi}_1(t) = \vec{\varphi}_2(t + t_0)$ for some t_0 .

Pick $t_0 = \ln \frac{c_1}{c_2}$, t_0 is defined as $\frac{c_1}{c_2} > 0$. Then $\vec{\varphi}_2(t + t_0) = (c_2 e^{t+t_0}, 0) = (c_2 e^t e_0^t, 0) = (c_2 e^t e^{\ln \frac{c_1}{c_2}}, 0) = (c_2 e^t \frac{c_1}{c_2}, 0) = (c_1 e^t, 0) = \vec{\varphi}_1(t)$, as needed.

2. (a) Suppose $x \in X$ is a periodic point for (T, X) , so there exists an $i \neq 0$ so that $T^i x = x$. We want to show that x is a periodic point for (W^t, X) , i.e., there exists a $t \neq 0$ so that $W^t(x) = x$. Pick $t = i \neq 0$. Then, $W^t(x) = W^i(x) = W^1(W^1(\dots(W^1(x))))$ for i times of W^1 by definition of (W^t, X) being a continuous dynamical system, and $W^1(W^1(\dots(W^1(x)))) = T(T(\dots(T(x))))$ for i times of T as well. Thus, $W^t(x) = W^i(x) = W^1(W^1(\dots(W^1(x)))) = T(T(\dots(T(x)))) = T^i(x) = x$, as needed.
- (b) Suppose $x \in X$ is a periodic point for (W^t, X) , i.e., there exists a $t \neq 0$ so that $W^t(x) = x$. x might not be a periodic point for (T, X) if $t \not\equiv 0 \pmod{1}$, as composition of $i \neq 0 \in \mathbb{Z}$ times of x under T will not give us $T^i(x) = x$, since T is defined as a time-1 map of W^t .
- (c) Assume x is a point of period at least 2 for (T, X) , so $T^i(x) = x$ where $i \geq 2$. Notice that $i \in \mathbb{N}$ as it is the number of times for composition of T . We want to show that there are infinitely many periodic points for (T, X) of the same period i . From 2a), we know that x is also a periodic point for W^t where $W^i(x) = x$. We also know $W^q(x) = y \neq x$ for $0 < q < 2, q \in \mathbb{R}$ by $i \geq 2$ being the period of x (the minimum value such that $T^i(x) = x$).
Claim: There are infinitely many $W^q(x) = y$ for $0 < q < 2, q \in \mathbb{R}$, and they are periodic points for T and has a period of i . We know there are infinite many y for $q \in (0, 2)$. Check if any of such y is a periodic point for T with period i . $T^i(y) = T^i(W^q(x)) = W^i(W^q(x)) = W^q(W^i(x)) = W^q(x) = y$ by definition of (W^t, X) being a continuous dynamical system, $T^i(x) = W^i(x) = x$, and $W^q(x) = y$. This completes our proof of the claim.
- (d) We want to show that the logistic map $T : [0, 1] \rightarrow [0, 1]$ defined by $x \mapsto \frac{19}{6}x(1-x)$ has exactly two points of period 2. Using computer algebra system, we find $x = \frac{10}{19}, \frac{15}{19}$ to be the solutions to $T^2(x) = \frac{19}{6}(\frac{19}{6}x(1-x))(1 - \frac{19}{6}x(1-x)) = x$, and $T(\frac{10}{19}) = \frac{15}{19}, T(\frac{15}{19}) = \frac{10}{19} \neq x$ respectively.
- (e) No, 2d)'s logistic map T with $r = \frac{19}{6}$ is a such discrete dynamical systems that is not a time-1 maps to continuous dynamical systems. Suppose for the sake of contradiction that it is. We know from 2d) it only has exactly two points of period 2, but from 2c) we know it should have infinitely many points of period 2. This is a contradiction.

3. The function $G : \mathbb{R}^n \rightarrow \mathbb{R}^m$ is called *affine* if there exists a matrix A and a vector \vec{p} so that $G(\vec{x}) = A\vec{x} + \vec{p}$ for all \vec{x} .

Let $F : \mathbb{R}^n \rightarrow \mathbb{R}^m$. A *first-order approximation* to F at the point $\vec{w} \in \mathbb{R}^n$ is an affine function $L : \mathbb{R}^n \rightarrow \mathbb{R}^m$ satisfying

$$\lim_{\|\vec{x}\| \rightarrow 0} \frac{F(\vec{w} + \vec{x}) - L(\vec{w} + \vec{x})}{\|\vec{x}\|} = 0.$$

- (a) Let $F : \mathbb{R} \rightarrow \mathbb{R}$ be defined by $x \mapsto x^2$. We want to find a first-order approximation, $L_0 : \mathbb{R} \rightarrow \mathbb{R}$ to F at 0, where $L_0(x) = Ax + p$ for some 1 by 1 matrix $A = [a]$ and $a, p \in \mathbb{R}$ such that $\lim_{x \rightarrow 0} \frac{F(0+x) - L_0(0+x)}{x} = 0$, then

$$\begin{aligned} \lim_{x \rightarrow 0} \frac{F(0+x) - L_0(0+x)}{x} &= \lim_{x \rightarrow 0} \frac{x^2 - Ax - p}{x} = \lim_{x \rightarrow 0} \frac{x^2 - ax - p}{x} \\ &= \lim_{x \rightarrow 0} \left(x - a - \frac{p}{x} \right) = -a - \lim_{x \rightarrow 0} \frac{p}{x} = 0 \\ \implies a &= -\lim_{x \rightarrow 0} \frac{p}{x} \implies p = -ax \end{aligned}$$

Pick $a = 0$, we get $L_0(x) = Ax + p = [a]x + p = 0$.

Similarly, we want to find a first-order approximation, $L_2 : \mathbb{R} \rightarrow \mathbb{R}$ to F at 2, where $L_2(x) = Ax + p$ for some 1 by 1 matrix $A = [a]$ and $a, p \in \mathbb{R}$ s.t. $\lim_{x \rightarrow 0} \frac{F(2+x) - L_2(2+x)}{x} = 0$, then

$$\begin{aligned} \lim_{x \rightarrow 0} \frac{F(2+x) - L_2(2+x)}{x} &= \lim_{x \rightarrow 0} \frac{(2+x)^2 - A(2+x) - p}{x} \\ &= \lim_{x \rightarrow 0} \frac{4 + 4x + x^2 - 2a - ax - p}{x} = \lim_{x \rightarrow 0} \left(4 + x - a + \frac{4 - 2a - p}{x} \right) \\ &= 4 - a + \lim_{x \rightarrow 0} \frac{4 - 2a - p}{x} = 0 \\ \implies 4 - a &= -\lim_{x \rightarrow 0} \frac{4 - 2a - p}{x} \implies -(4 - a)x = (4 - 2a - p) \end{aligned}$$

Pick $a = 4$, then $p = -4$ and we get $L_0(x) = Ax + p = [a]x + p = 4x - 4$.

- (b) Let $F : \mathbb{R}^2 \rightarrow \mathbb{R}^2$ be defined by $\begin{bmatrix} x \\ y \end{bmatrix} \mapsto T \left(\begin{bmatrix} x \\ y \end{bmatrix} \right)$ where $T = \begin{bmatrix} a & b \\ c & d \end{bmatrix}$. Define $L_{\vec{w}}$ to be the first-order approximation of F at the point \vec{w} . We want to find $L_{\vec{w}}(\vec{x}) = A\vec{x} + \vec{p}$ for some 2 by 2 matrix A and $\vec{p} \in \mathbb{R}^2$ s.t. $\lim_{\|\vec{x}\| \rightarrow 0} \frac{F(\vec{w} + \vec{x}) - L_{\vec{w}}(\vec{w} + \vec{x})}{\|\vec{x}\|} = 0$. Then,

$$\begin{aligned} \lim_{\|\vec{x}\| \rightarrow 0} \frac{F(\vec{w} + \vec{x}) - L_{\vec{w}}(\vec{w} + \vec{x})}{\|\vec{x}\|} &= \lim_{\|\vec{x}\| \rightarrow 0} \frac{T(\vec{w} + \vec{x}) - A(\vec{w} + \vec{x}) - \vec{p}}{\|\vec{x}\|} \\ &= \lim_{\|\vec{x}\| \rightarrow 0} \frac{T(\vec{w}) + T(\vec{x}) - A(\vec{w}) - A(\vec{x}) - \vec{p}}{\|\vec{x}\|} = 0 \\ \implies T(\vec{w}) + T(\vec{x}) - A(\vec{w}) - A(\vec{x}) - \vec{p} &= 0 \implies T(\vec{w}) - A(\vec{w}) + (T(\vec{x}) - A(\vec{x})) = \vec{p} \end{aligned}$$

If we pick $\vec{p} = \vec{0}$, then $T(\vec{x}) = A(\vec{x})$ for all $\vec{x} \in \mathbb{R}^2 \implies T(\vec{w}) = A(\vec{w})$, so $T = A$ works.

Thus, $L_{\vec{w}}(\vec{x}) = A\vec{x} + \vec{p} = T(\vec{x}) = \begin{bmatrix} a & b \\ c & d \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$.

- (c) Let $L : \mathbb{R}^n \rightarrow \mathbb{R}^m$ be an affine function, so there exists a matrix A and a vector \vec{p} so that $L(\vec{x}) = A\vec{x} + \vec{p}$ for all \vec{x} . Let $L_{\vec{w}}$ be the first-order approximation to L at \vec{w} , so it is also an affine function $L_{\vec{w}} : \mathbb{R}^n \rightarrow \mathbb{R}^m$ satisfying

$$\lim_{\|\vec{x}\| \rightarrow 0} \frac{L(\vec{w} + \vec{x}) - L_{\vec{w}}(\vec{w} + \vec{x})}{\|\vec{x}\|} = 0.$$

We want to show that $L = L_{\vec{w}}$ regardless of \vec{w} .

Fix \vec{w} . Suppose $L_{\vec{w}}(\vec{x}) = B\vec{x} + \vec{q}$ for some matrix B and a vector $\vec{q} \in \mathbb{R}^m$ for all \vec{x} , then

$$\begin{aligned} \lim_{\|\vec{x}\| \rightarrow 0} \frac{L(\vec{w} + \vec{x}) - L_{\vec{w}}(\vec{w} + \vec{x})}{\|\vec{x}\|} &= 0 \\ \implies \lim_{\|\vec{x}\| \rightarrow 0} L(\vec{w} + \vec{x}) &= \lim_{\|\vec{x}\| \rightarrow 0} L_{\vec{w}}(\vec{w} + \vec{x}) \\ \implies \lim_{\|\vec{x}\| \rightarrow 0} (A(\vec{w} + \vec{x}) + \vec{p}) &= \lim_{\|\vec{x}\| \rightarrow 0} (B(\vec{w} + \vec{x}) + \vec{q}) \\ \implies L(\vec{w} + \vec{x}) &= L_{\vec{w}}(\vec{w} + \vec{x}) \quad \forall \vec{x} \implies L = L_{\vec{w}} \end{aligned}$$

as needed.

- (d) Assume (W^t, \mathbb{R}^n) is a continuous dynamical system with velocities given by $V(\vec{x}) = A\vec{x}$ for some matrix A . We want to show that the point $\vec{x} \in \mathbb{R}^n$ is stable under W^t if and only if the point $\vec{0}$ is stable under W^t . From 3c), we know that a first order approximation of V at any point \vec{x} is the same as V since V is given by the matrix A . Then, calculating the eigenvalues λ of the first order approximation matrix tells us the stability at any \vec{x} by solving $\det(A - \lambda I)$, so \vec{x} is stable under W^t if and only if point $\vec{0}$ is stable under W^t as they have same first order approximation with the same eigenvalues.

- (e) Let $F(x, y) = (f_x(x, y), f_y(x, y)) = (x + y^2, -y)$

$$\text{We know } F'(x, y) = \begin{bmatrix} \frac{\partial f_x}{\partial x}(x, y) & \frac{\partial f_x}{\partial y}(x, y) \\ \frac{\partial f_y}{\partial x}(x, y) & \frac{\partial f_y}{\partial y}(x, y) \end{bmatrix} = \begin{bmatrix} 1 & 2y \\ 0 & -1 \end{bmatrix}$$

Then, a first order approximation of F at $\vec{w}_1 = (1, 1)$ is

$$L_1(\vec{w}_1 + \vec{x}) = F'(\vec{w}_1)(\vec{x}) + F(\vec{w}_1) = \begin{bmatrix} 1 & 2 \\ 0 & -1 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} 2 \\ -1 \end{bmatrix}$$

Similarly, a first order approximation of F at $\vec{w}_2 = (0, 0)$ is

$$L_2(\vec{w}_2 + \vec{x}) = F'(\vec{w}_2)(\vec{x}) + F(\vec{w}_2) = \begin{bmatrix} 1 & 0 \\ 0 & -1 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} 0 \\ 0 \end{bmatrix}$$

- (f) Let (W^t, \mathbb{R}^2) be the continuous dynamical system that flows along $F(x, y) = (x + y^2, -y)$. We know the eigenvalues of the first order linear approximation of F at $(1, 1)$ and $(1, 0)$ (computed in 3e)) are $\lambda_1 = 1, \lambda_2 = -1$ for $(1, 1)$ and $(0, 0)$. Since both have a positive real eigenvalue, we know they are both unstable as the pull force that makes them unstable increases in the direction of eigenvectors for eigenvalue 1 within the ϵ neighborhood of $(1, 1)$ and $(0, 0)$ while flowing along with F .

4. Stability/instability describes how points behave under a dynamical system. Let's take a moment to think about how *volumes/areas* behave.

For this problem, you may use any facts you know about the determinant without justification (so long as they're true...).

(a) Let $A = [\vec{a}_1 | \cdots | \vec{a}_n]$ be a matrix with columns $\vec{a}_1, \dots, \vec{a}_n$, i.e. $A = \begin{bmatrix} a_{11} & a_{21} & \cdots & a_{n1} \\ a_{12} & a_{22} & \cdots & a_{n2} \\ \cdots & \cdots & \cdots & \cdots \\ a_{1n} & a_{2n} & \cdots & a_{nn} \end{bmatrix}$

where $\vec{a}_i = \begin{bmatrix} a_{i1} \\ a_{i2} \\ \cdots \\ a_{in} \end{bmatrix}$.

Let E_i be the identity matrix with the i th column replaced with \vec{a}_i . We want to show that

$$\text{Tr}(A) = \sum \det(E_i).$$

We know $\text{Tr}(A) = a_{11} + a_{22} + \cdots + a_{nn}$.

On the other hand, $\det(E_i) = \det\left(\begin{bmatrix} 1 & \cdots & a_{i1} & \cdots & 0 \\ 0 & \cdots & a_{i2} & \cdots & 0 \\ \cdots & \cdots & \cdots & \cdots & \cdots \\ 0 & \cdots & a_{in} & \cdots & 1 \end{bmatrix}\right) = a_{ii}$, so $\sum_{i=1}^n \det(E_i) =$

$$\sum_{i=1}^n a_{ii} = a_{11} + a_{22} + \cdots + a_{nn}.$$

Thus, $\text{Tr}(A) = \sum \det(E_i)$.

- (b) Let (W^t, \mathbb{R}^2) be the continuous dynamical system which flows vectors along the vector field given by $A = \begin{bmatrix} a & b \\ c & d \end{bmatrix}$.

The limit definition of the derivative $\frac{\partial W^t}{\partial t}$ at time $t = 0$ is

$$\frac{\partial W^t}{\partial t}|_{t=0}(\vec{x}) = \lim_{t \rightarrow 0} \frac{W^t(\vec{x}) - W^0(\vec{x})}{t} = A\vec{x}$$

as the derivative of W^t at $t = 0$ is the tangent vector to the flow of starting at \vec{x} after $t = 0$ seconds.

- (c) The first-order approximation to W^t with respect to time at $t = 0$ is

$$L_t(\vec{x}) = \frac{\partial W^t}{\partial t}|_{t=0}(\vec{x}) * t + W^0(\vec{x}) = (A\vec{x}) * t + \vec{x}$$

by 4b).

- (d) We want estimate the volume of the image of the unit cube after flowing for ε seconds. We know the first order approximation of W^t w.r.t. $t = 0$ for $t = \varepsilon$ seconds from 4c) is

$$L_\varepsilon(\vec{x}) = \frac{\partial W^t}{\partial t}|_{t=0}(\vec{x}) * \varepsilon + W^0(\vec{x}) = (A\vec{x}) * \varepsilon + \vec{x}$$

Since the unit cube volume is the same as $\det(I)$ where I is the identity matrix, we know that the image of the unit cube volume using the first order approximation of W^t w.r.t. $t = 0$ will be $\det(\varepsilon * A + I)$ as $\varepsilon * A$ is the change in velocities of area after ε seconds and we start with I .

- (e) Building up from 4d), we know $\det(t * A + I)$ is the area of the image of unit cube after flowing for t seconds, and

$$\begin{aligned} \det(t * A + I) &= \det\left(\begin{bmatrix} at + 1 & bt \\ ct & dt + 1 \end{bmatrix}\right) \\ &= (at + 1)(dt + 1) - (bt)(ct) = (ad - bc)t^2 + (a + d)t \end{aligned} \tag{1}$$

Then, the instantaneous rate of change of volume (area) with respect to time for W^t is

$$\frac{\partial}{\partial t}((ad - bc)t^2 + (a + d)t) = 2t(ad - bc) + (a + d) = 2t * \det(A) + (a + d)$$

by taking derivative of (1) w.r.t time.

Thus, at time $t = 0$, we get the instantaneous rate of change of area w.r.t time for W^t is $a + d$.

- (f) We want to show that if we drop a dab of ink of area α near the origin and let it flow for via W^t for ε seconds, the area of the resulting blob of ink will be approximately $\alpha(1 + \varepsilon \text{Tr}(A))$.

We know that the area of the resulting blob of ink, $S = \text{initial area of the blob of ink} + (\text{rate of change of volume at time} = 0) * \text{time} * \text{initial area of the blob of ink} = \alpha + (\text{rate of change of volume at time} = 0) * \varepsilon * \alpha$.

From 4e), we know that the instantaneous rate of change of volume at $t = 0$ is $(a + d)$.

Thus,

$$S = \alpha + (a + d) * \varepsilon * \alpha = \alpha(1 + \varepsilon \text{Tr}(A))$$

as needed.

- (g) The term incompressible is warranted.

If we have an incompressible vector field, where its divergence is zero, from 4a) – e), we know $\text{Tr}(J(F)|_{(x_0, y_0)}) = 0$ where $J(F)|_{(x_0, y_0)}$ is used in the first-order approximation to F at (x_0, y_0) for all (x_0, y_0) , just like how the matrix A is used in previous questions.

Then, by 4f), we know if we drop a blob of ink with area α at any (x_0, y_0) , its resulting area after flowing with N^t for ε seconds is $\alpha(1 + \varepsilon \text{Tr}(A)) = \alpha$. This means every area at any point after flowing with the continuous dynamical system which follows with an incompressible vector field does not change the initial area; N^t does not compress the area at all. This gives the name “incompressible vector field” as N^t flows points along the vector field, and it flows points to itself, which are incompressible.

Homework 3

Do the programming part of Homework 3 in this notebook. Predefined are function *stubs*. That is, the name of the function and a basic body is predefined. You need to modify the code to fulfil the requirements of the homework.

```
In [6]: # import numpy and matplotlib
import numpy as np
import matplotlib.pyplot as plt
from collections import Counter
# We give the matplotlib instruction twice, because firefox sometimes gets upset if we don't.
# note these `%`-commands are not actually Python commands. They are Jupyter-notebook-specific commands
%matplotlib notebook
%matplotlib notebook
```

```
In [7]: def plot_vectorfield(ax, F, extents=[0,1,0,1], N=20):
    """Plot the vector field determined by the function F(x,y) on the
    matplotlib "axis" `ax`.
    """
    xs,ys = np.linspace(extents[0], extents[1], N), np.linspace(extents[2], extents[3], N)
    X, Y = np.meshgrid(xs, ys)
    ax.quiver(X, Y, *F(X, Y), color="gray")
    return ax

def plot_streams(ax, F, extents=[0,1,0,1], N=20):
    """Plot the vector field determined by the function F(x,y) on the
    matplotlib "axis" `ax`.
    """
    xs,ys = np.linspace(extents[0], extents[1], N), np.linspace(extents[2], extents[3], N)
    X, Y = np.meshgrid(xs, ys)
    ax.streamplot(X, Y, *F(X, Y), color="gray")
    return ax
```

```
In [8]: def V1(X, Y):
    return -Y, X

def V2(X, Y):
    return X + Y*Y, -Y

def V3(X, Y):
    return -Y, X + Y*Y

def V4(X, Y):
    return -X + Y*Y, -Y
```



```

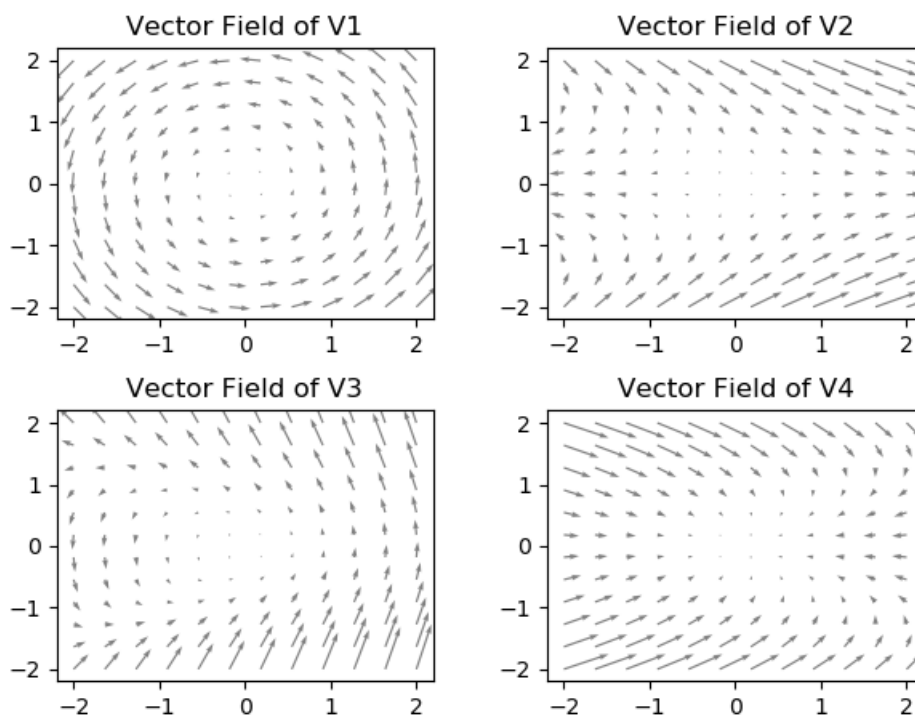
In [9]: #
# Make a single plot with the vector fields for V1,...,V4 as separate subplots
#

# (2,2) returns a figure and a 2x2 array of "axes"
fig, ((ax1,ax2),(ax3,ax4)) = plt.subplots(2, 2)
# pad=2.0 makes our plots more spaced out so that the titles will fit
fig.tight_layout(pad=2.0)

#
# Plot your vectorfields here
#
plot_vectorfield(ax1, V1, [-2,2,-2,2], 12)
ax1.set_title("Vector Field of V1")
plot_vectorfield(ax2, V2, [-2,2,-2,2], 12)
ax2.set_title("Vector Field of V2")
plot_vectorfield(ax3, V3, [-2,2,-2,2], 12)
ax3.set_title("Vector Field of V3")
plot_vectorfield(ax4, V4, [-2,2,-2,2], 12)
ax4.set_title("Vector Field of V4")

```

Figure 1



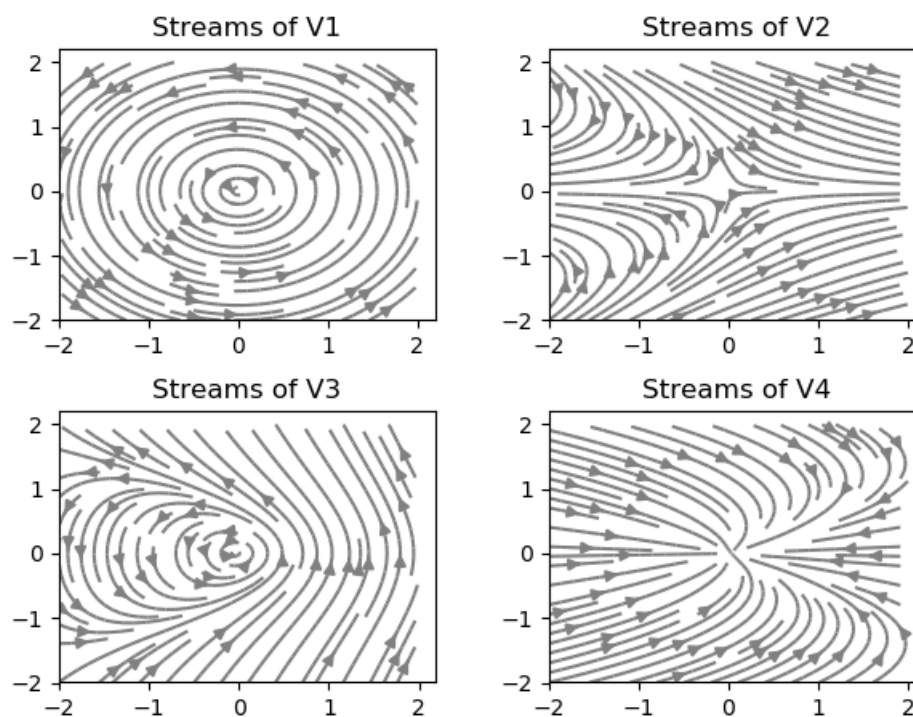
Out[9]: Text(0.5, 1.0, 'Vector Field of V4')

```
In [10]: # Bouns: Make a single plot with the streams for V1,...,V4 as separate subplots

# (2,2) returns a figure and a 2x2 array of "axes"
fig, ((ax1,ax2),(ax3,ax4)) = plt.subplots(2, 2)
# pad=2.0 makes our plots more spaced out so that the titles will fit
fig.tight_layout(pad=2.0)

#
# Plot streams here
#
plot_streams(ax1, V1, [-2,2,-2,2], 12)
ax1.set_title("Streams of V1")
plot_streams(ax2, V2, [-2,2,-2,2], 12)
ax2.set_title("Streams of V2")
plot_streams(ax3, V3, [-2,2,-2,2], 12)
ax3.set_title("Streams of V3")
plot_streams(ax4, V4, [-2,2,-2,2], 12)
ax4.set_title("Streams of V4")
```

Figure 2



Out[10]: Text(0.5, 1.0, 'Streams of V4')

```
In [11]: def euler(v_x, v_y, steps=10, eps=0.1):
    """Apply Euler's method `steps` number of times with a step-size of `eps` for V1"""
    for i in range(steps):
        x, y = V1(v_x, v_y)
        v_x = v_x + eps*x
        v_y = v_y + eps*y
    return v_x, v_y #approximate result of flowing along F for n*eps seconds

print("Starting at (1,0) with 1 steps, Euler's method gives", euler(1, 0, 1),
      "\nWith two steps", euler(1, 0, 2),
      "\nWith three steps", euler(1, 0, 3))
```

Starting at (1,0) with 1 steps, Euler's method gives (1.0, 0.1)
 With two steps (0.99, 0.2)
 With three steps (0.97, 0.299000000000000004)

```
In [12]: def flow(v_x, v_y, F, t, eps=1/100):
    steps = int(t/eps)
    for i in range(steps):
        x, y = F(v_x, v_y)
        v_x = v_x + eps*x
        v_y = v_y + eps*y
    return v_x, v_y #approximate result of flowing along F for t seconds

def orbit(v_x, v_y, F, t_max=1, eps=1/100):
    vx_list = []
    vy_list = []
    steps = int(t_max/eps)
    for i in range(steps):
        new_xs, new_ys = flow(v_x, v_y, F, i*eps, eps)
        vx_list.append(new_xs)
        vy_list.append(new_ys)
    return np.array(vx_list), np.array(vy_list)

print("Starting at (1,0) and flowing for 3.14 second, Euler's method gives", flow(1, 0, V1, 3.14)
      "and a 4 step approximate orbit is", orbit(1, 0, V1, 3.14, eps=3.14/4))
```

Starting at (1,0) and flowing for 3.14 second, Euler's method gives (-1.0158216319242126, 0.001724169909617117) and a 4 step approximate orbit is (array([1. , 1. , 0.383775, -0.848675]), array([0. , 0.785 , 1.57 , 1.87126338]))

```

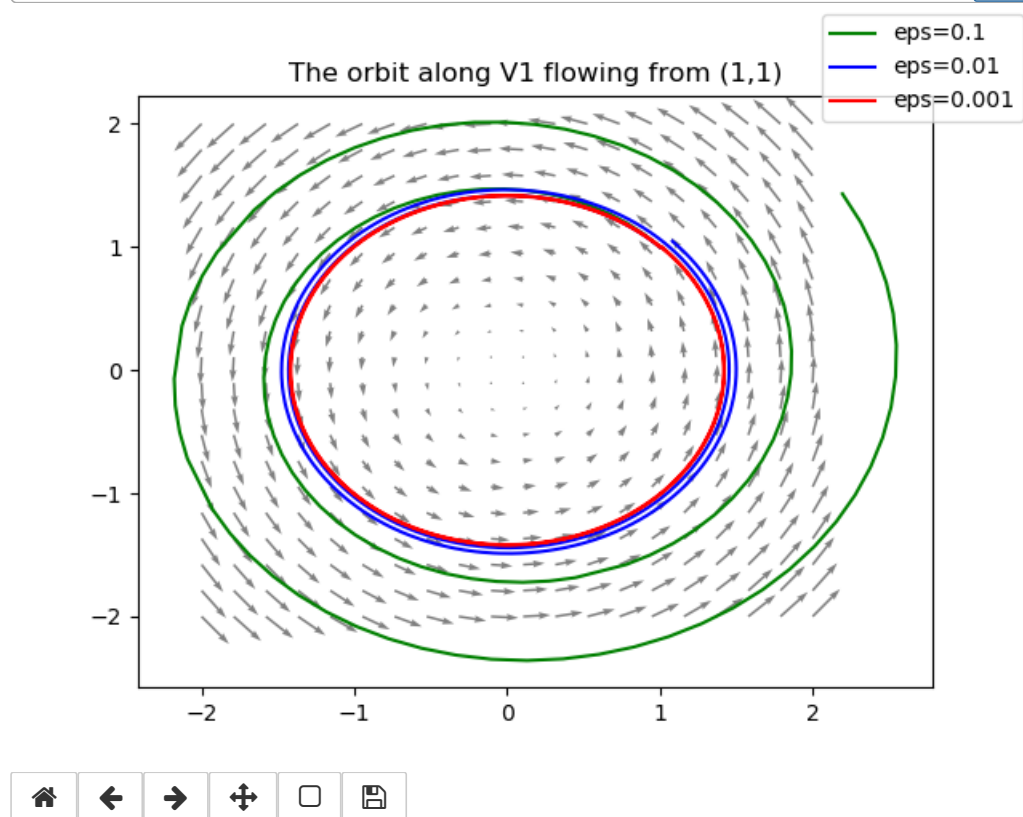
In [13]: #
# Plot V1
#
extents = [-2, 2, -2, 2]
fig, ax = plt.subplots()
plot_vectorfield(ax, V1, extents=extents)

xs, ys = orbit(1, 1, V1, t_max=2*6.28, eps=0.1)
ax.plot(xs, ys, color="green", label="eps=0.1")
xs, ys = orbit(1, 1, V1, t_max=2*6.28, eps=0.01)
ax.plot(xs, ys, color="blue", label="eps=0.01")
xs, ys = orbit(1, 1, V1, t_max=2*6.28, eps=0.001)
ax.plot(xs, ys, color="red", label="eps=0.001")

ax.set_title("The orbit along V1 flowing from (1,1)")
fig.legend()

```

Figure 3



Out[13]: <matplotlib.legend.Legend at 0x7fedcd203048>

The simulated orbits are all periodic, while larger steps $\epsilon = 0.1$ (large epsilon) spirals out more since they are simulations, and infinitely small epsilons produce more accurate approximations.

```
In [14]: def split_runs(seq):
    """Input a sequence `seq` and return a list of maximal runs contained in `seq`
    where a run is defined as a sequence that increases by exactly 1 each index."""
    result = []
    i = 1
    while i < len(seq):
        list = [seq[i-1]]
        while i < len(seq) and seq[i]-1 == seq[i-1]:
            list.append(seq[i])
            i+=1
        result.append(list)
        if i == len(seq)-1:
            result.append([seq[i]])
            i+=1
    return result

seq = [1,2,3,6,7,9,15,16,17,18,20]
print("Splitting the sequence", seq, "into runs gives is expected to give\n"
      "[[1, 2, 3], [6, 7], [9], [15, 16, 17, 18], [20]]\n"
      "and actually gives\n", split_runs(seq))
seq2= [1, 3, 6, 7, 8] # another test
print("Splitting the sequence", seq2, "into runs gives is expected to give\n"
      "[[1], [3], [6, 7, 8]]\n"
      "and actually gives\n", split_runs(seq2))
```

Splitting the sequence [1, 2, 3, 6, 7, 9, 15, 16, 17, 18, 20] into runs gives is expected to give
 [[1, 2, 3], [6, 7], [9], [15, 16, 17, 18], [20]]
 and actually gives
 [[1, 2, 3], [6, 7], [9], [15, 16, 17, 18], [20]]
 Splitting the sequence [1, 3, 6, 7, 8] into runs gives is expected to give
 [[1], [3], [6, 7, 8]]
 and actually gives
 [[1], [3], [6, 7, 8]]

```
In [15]: def indices_close_to_min(seq, tol=0.01):
    """returns the indices of values in `seq` that are within `tol`
    of the minimum value in `seq`"""
    result = []
    min_value = np.amin(seq)
    for i in range(len(seq)):
        if abs(seq[i] - min_value) <= tol:
            result.append(i)
    return result

seq = np.array([1, .8, .7, .701, .702, .73, .77])
print("The sequence", seq, "is close to its minimum at the indices", indices_close_to_min(seq))
```

The sequence [1. 0.8 0.7 0.701 0.702 0.73 0.77] is close to its minimum at the indices
 [2, 3, 4]

```

In [16]: def guess_minimums(seq, eps=0.01, tol=0.01):
    """Given a list `seq` where each value is a step along the dynamical
    system with increment `eps`, estimate where the sequence attains a minimum"""
    indices = indices_close_to_min(seq, tol)
    run_list = split_runs(indices)

    result = []
    for run in run_list:
        for i in range(len(indices)):
            if indices[i] in run and len(run) > 1:
                poss_min = run[1]*eps
                if poss_min not in result:
                    result.append(poss_min)
            else:
                result.append(indices[i]*eps)
    return result

#
# Estimate the period of a (-1,0) flowing along V1
#
t = 3*np.pi #3pi, enough time for it to cross the period 2pi
eps1 = 0.01
xs_1, ys_1 = orbit(-1, 0, V1, t, eps1)
guess1_x = guess_minimums(xs_1, eps1)

eps2 = 0.001
xs_2, ys_2 = orbit(-1, 0, V1, t, eps2)
guess2_x = guess_minimums(xs_2, eps2, 0.001)

print("The period approximated by eps = 0.01 is\n", guess1_x)
print("The period approximated by eps = 0.001 is\n", guess2_x)

```

The period approximated by eps = 0.01 is

[6.16]

The period approximated by eps = 0.001 is

[6.2410000000000005]

The approximation of period (2π) is decent, with an increase in precision as the steps become smaller.

```

In [17]: #
# Plot V3
#

extents = [-2, 2, -2, 2]
fig, ax = plt.subplots()
plot_vectorfield(ax, V3, extents=extents)

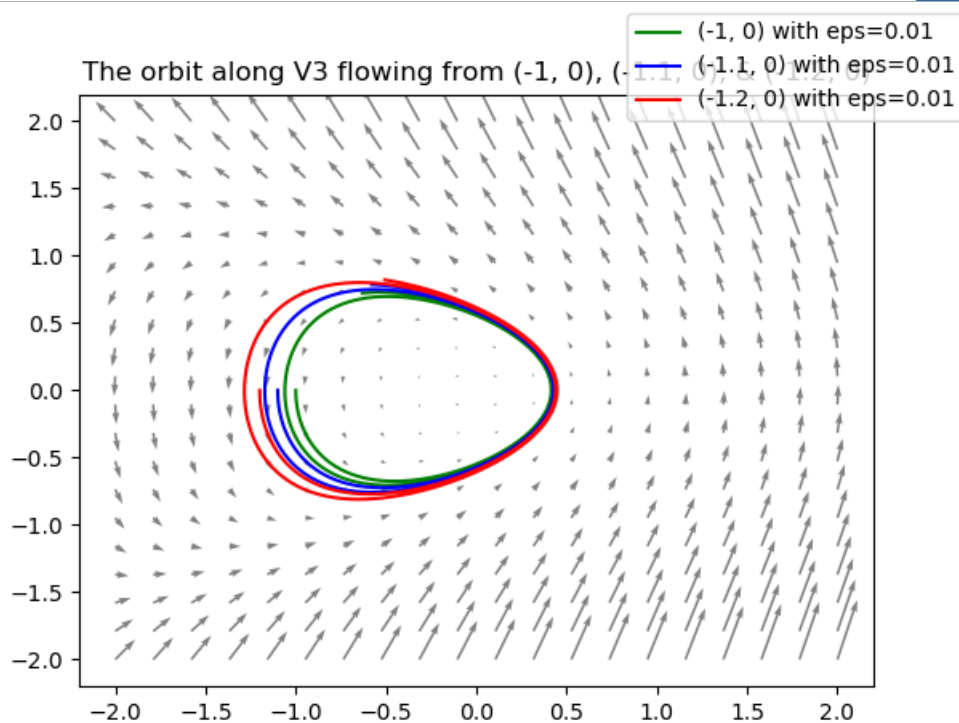
xs, ys = orbit(-1, 0, V3, t_max=2*6.28, eps=0.01)
ax.plot(xs, ys, color="green", label="(-1, 0) with eps=0.01")
xs, ys = orbit(-1.1, 0, V3, t_max=2*6.28, eps=0.01)
ax.plot(xs, ys, color="blue", label="(-1.1, 0) with eps=0.01")
xs, ys = orbit(-1.2, 0, V3, t_max=2*6.28, eps=0.01)
ax.plot(xs, ys, color="red", label="(-1.2, 0) with eps=0.01")

ax.set_title("The orbit along V3 flowing from (-1, 0), (-1.1, 0), & (-1.2, 0)")

fig.legend()

```

Figure 4



Out[17]: <matplotlib.legend.Legend at 0x7fedcd18da20>

```
In [18]: #
# Estimate the period of the flow along V3 starting at (-1,0), (-1.1, 0), and (-1.2,0)
#

#
# Estimate the period of a (-1,0) flowing along V3
#
t = 10
eps = 0.001
xs_1, ys_1 = orbit(-1, 0, V3, t, eps)
guess1_x = guess_minimums(xs_1, eps, eps)

print("The period of the flow along V3 starting at (-1, 0) approximated by eps = 0.001 is\n", gue

#
# Estimate the period of a (-1.1,0) flowing along V3
#

xs_2, ys_2 = orbit(-1.1, 0, V3, t, eps)
guess2_x = guess_minimums(xs_2, eps, eps)

print("The period of the flow along V3 starting at (-1.1, 0) approximated by eps = 0.001 is\n", g

#
# Estimate the period of a (-1.2,0) flowing along V3
#

xs_3, ys_3 = orbit(-1.2, 0, V3, t, eps)
guess3_x = guess_minimums(xs_3, eps, eps)

print("The period of the flow along V3 starting at (-1.2, 0) approximated by eps = 0.001 is\n", g
```

```
The period of the flow along V3 starting at (-1, 0) approximated by eps = 0.001 is
[6.721]
The period of the flow along V3 starting at (-1.1, 0) approximated by eps = 0.001 is
[6.797]
The period of the flow along V3 starting at (-1.2, 0) approximated by eps = 0.001 is
[6.8740000000000006]
```

The flows starting near $(-1, 0)$ (like $(-1.1, 0)$, $(-1.2, 0)$) have similar period, however, is unstable, as the higher order terms y^2 dominate over time as the points flow along the vector field $V3$. Only the origin is stable.

Flowing Areas


```
In [19]: #
# Helper functions
#
def zip_coords(coords, arg2=None):
    """Give lists [(x1,x2,...), (y1,y2,...)] turn it into [(x1,y1), (x2,y2), ...]"""
    if arg2 is None:
        return list(zip(*coords))
    # if arg2 was specified, we called `zip_coords(xs, ys)` instead of `zip_coords( (xs, ys) )`
    return list(zip(coords, arg2))
```

```
In [20]: def make_perimeter_circle(center, rad, N=10):
    """Returns points along the perimeter of a circle centered at `center` with radius `rad`"""
    c1, c2 = center
    xs = []
    xy = []
    for i in range(N):
        x, y = rad*np.cos(2*np.pi/N*i)+c1, rad*np.sin(2*np.pi/N*i)+c2
        xs.append(x)
        xy.append(y)
    return xs, xy

print("The circle centered at (1,1) with radius (1/2) has points along the perimeter:",
      make_perimeter_circle((1,1), 1/2, 4))
```

The circle centered at (1,1) with radius (1/2) has points along the perimeter: ([1.5, 1.0, 0.5, 0.9999999999999999], [1.0, 1.5, 1.0, 0.5])

```
In [21]: def make_perimeter_square(ll_corner, width, N=12):
    """Returns points along the perimeter of a square with lower-left corner `ll_corner`
    and width `width`"""
    lx, ly = ll_corner
    xs = []
    xy = []
    num_per_side = int(N/4)
    side_dis = width / num_per_side

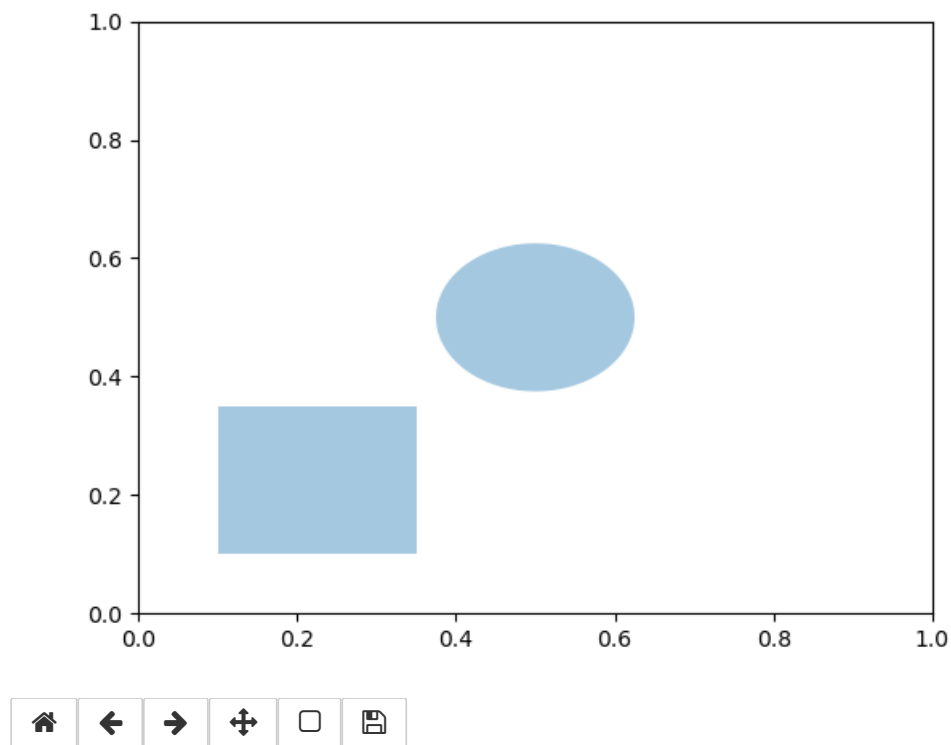
    #bottom side
    for i in range(num_per_side+1):
        x, y = lx + i*side_dis, ly
        xs.append(x)
        xy.append(y)
    #right side
    for i in range(num_per_side+1):
        x, y = lx + width, ly + i*side_dis
        xs.append(x)
        xy.append(y)
    #top side
    for _ in range(num_per_side+1):
        x, y = lx + width - i*side_dis, ly + width
        xs.append(x)
        xy.append(y)
    #left side
    for _ in range(num_per_side+1):
        x, y = lx, ly + width - i*side_dis
        xs.append(x)
        xy.append(y)
    return xs, xy
# return np.linspace(0, 2*np.pi, N), np.linspace(0, 2*np.pi, N)

print("The circle centered at (1,1) with radius (1/2) has points along the perimeter:",
      make_perimeter_square((1,1), 1/2, 12))
```

The circle centered at (1,1) with radius (1/2) has points along the perimeter: ([1.0, 1.1666666666666667, 1.3333333333333333, 1.5, 1.5, 1.5, 1.5, 1.5, 1.0, 1.0, 1.0, 1.0, 1, 1, 1, 1], [1, 1, 1, 1, 1.0, 1.1666666666666667, 1.3333333333333333, 1.5, 1.5, 1.5, 1.5, 1.5, 1.0, 1.0, 1.0, 1.0])

```
In [22]: #  
# Graph a circle and a square  
#  
  
from matplotlib.patches import Polygon  
from matplotlib.collections import PatchCollection  
  
fig, ax = plt.subplots()  
  
# Matplotlib graphs "patches" consisting of polygons. Make a patch for both the circle and the square  
# and graph them.  
circle = Polygon(zip_coords(make_perimeter_circle((.5,.5), .125, 100)))  
square = Polygon(zip_coords(make_perimeter_square((0.1,0.1), .25, 100)))  
  
patches = PatchCollection([circle, square], alpha=0.4)  
ax.add_collection(patches)
```

Figure 5

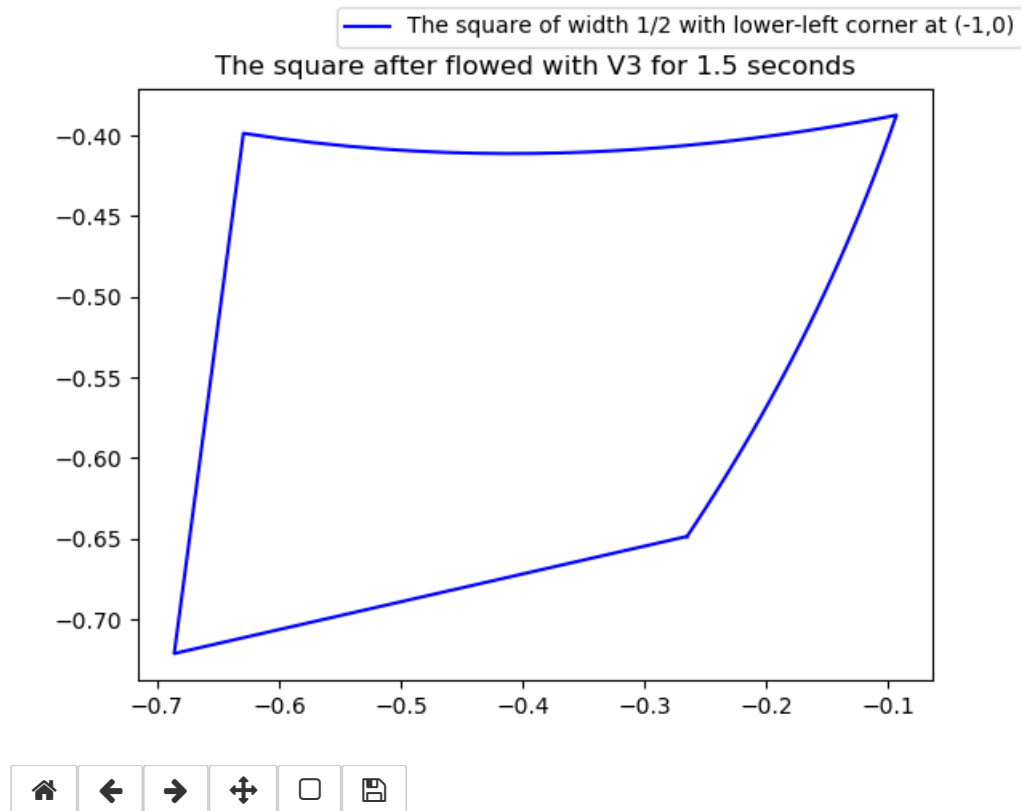


```
Out[22]: <matplotlib.collections.PatchCollection at 0x7fedcd1106a0>
```

```
In [23]: #  
# Create a vectorized version of the `flow` function so it can work on lists of coordinates  
#  
vec_flow = np.vectorize(flow)
```

```
In [24]: #  
# Plot V3, the square, and the flow of a square for 1.5 seconds  
#  
xs, ys = make_perimeter_square((-1,0), .50, 100)  
extents = [-2, 2, -2, 2]  
fig, ax = plt.subplots()  
  
xs, ys = vec_flow(xs, ys, V3, 1.5, eps=0.001)  
ax.plot(xs, ys, color="blue", label="The square of width 1/2 with lower-left corner at (-1,0)")  
ax.set_title("The square after flowed with V3 for 1.5 seconds")  
  
fig.legend()
```

Figure 6



Out[24]: <matplotlib.legend.Legend at 0x7fedcd12dc18>

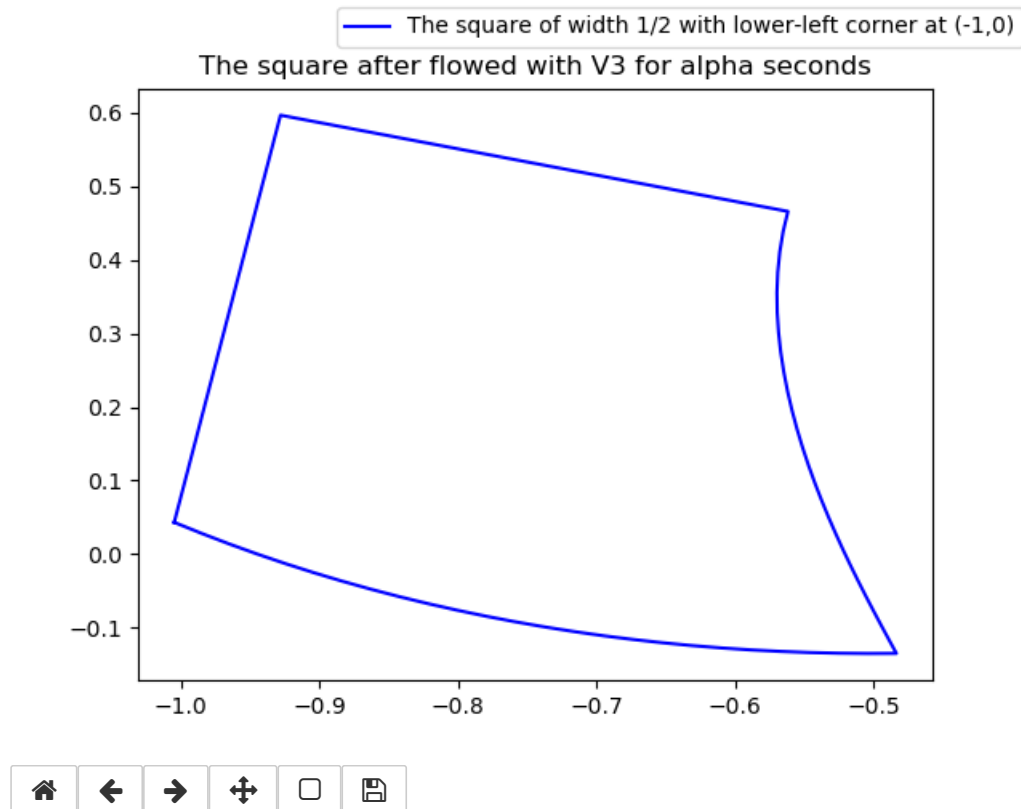
```
In [25]: #
# Plot V3, the square, and the flow of a square for alpha seconds
#
alpha = 6.721 #from 6b

xs, ys = make_perimeter_square((-1,0), .50, 100)
extents = [-2, 2, -2, 2]
fig, ax = plt.subplots()

xs, ys = vec_flow(xs, ys, V3, alpha, eps=0.001)
ax.plot(xs, ys, color="blue", label="The square of width 1/2 with lower-left corner at (-1,0)")
ax.set_title("The square after flowed with V3 for alpha seconds")

fig.legend()
```

Figure 7



Out[25]: <matplotlib.legend.Legend at 0x7fedcd0e29e8>

```

In [26]: #
# Animate the flow!
#

# these imports allow us to do animations
from matplotlib import animation, rc
from IPython.display import HTML

# duration of the flow and the framerate
FLOW_TIME = 10
FPS = 10
FLOW_PER_FRAME = 1/FPS

extents = [-2, 2, -2, 2]
fig, ax = plt.subplots()
plot_vectorfield(ax, V3, extents=extents)

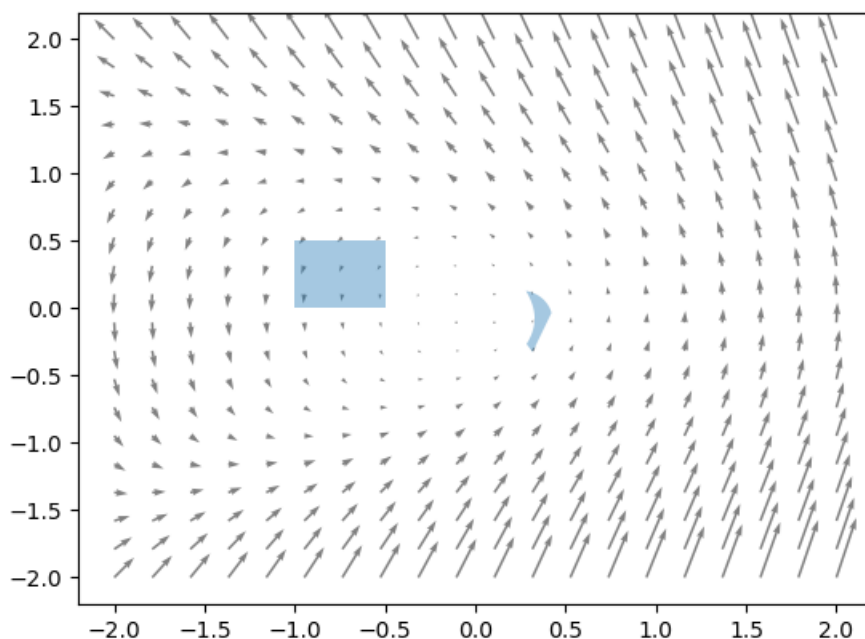
xs, ys = make_perimeter_square((-1,0), .5, 100)
preflow = Polygon(zip_coords((xs, ys)))
patches = PatchCollection([preflow], alpha=0.4)
ax.add_collection(patches)

# the flowed coordinates
fxs, fys = xs, ys
def animate(i):
    # the flowed coordinates are global variables. We need this declaration to use them
    global fxs, fys
    # flow the coordinates a little bit
    fxs, fys = vec_flow(fxs, fys, V3, FLOW_PER_FRAME, 0.01)
    # draw the patches
    postflow = Polygon(zip_coords((fxs, fys)))
    patches.set_paths([preflow, postflow])
    return (patches,)

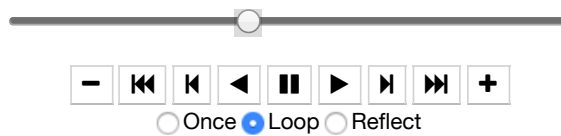
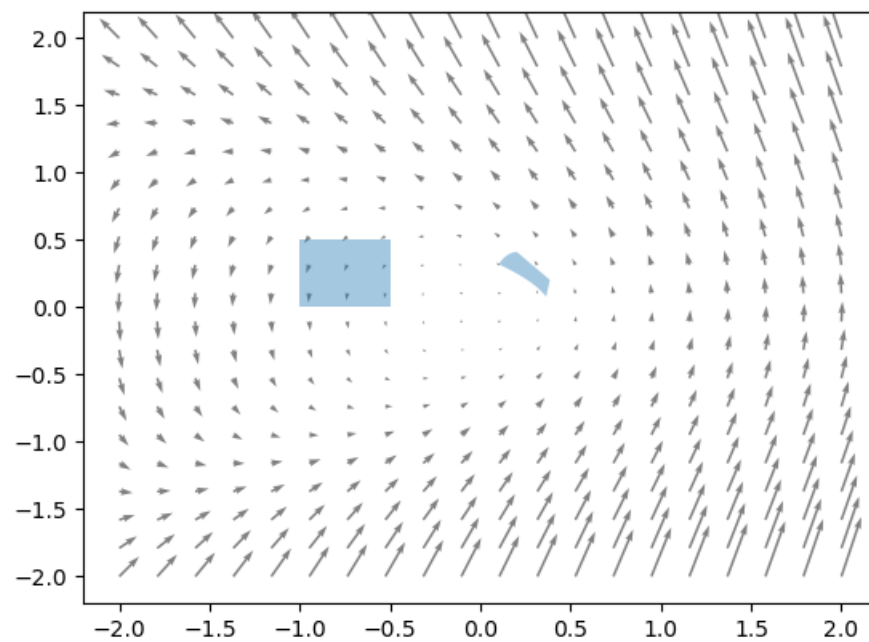
anim = animation.FuncAnimation(fig, animate, frames=FLOW_TIME*FPS, blit=True, interval=1000/FPS)
HTML(anim.to_jshtml())

```

Figure 8



Out[26]:



```

In [27]: #
# Animate the flow of a circle of radius 1/4 at the origin
#

# duration of the flow and the framerate
FLOW_TIME = 20
FPS = 10
FLOW_PER_FRAME = 1/FPS

extents = [-2, 2, -2, 2]
fig, ax = plt.subplots()
plot_vectorfield(ax, V3, extents=extents)

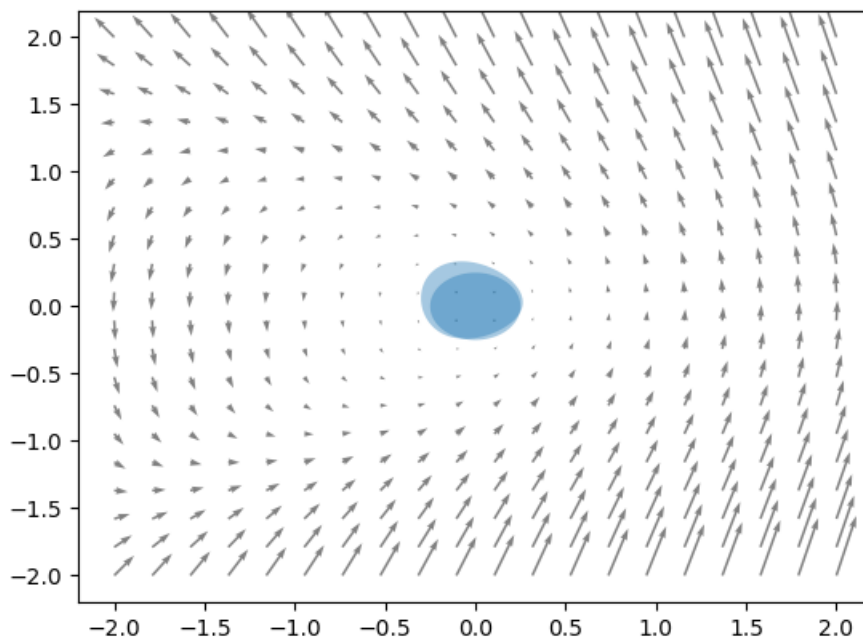
xs, ys = make_perimeter_circle((0,0), .25, 100)
preflow = Polygon(zip_coords((xs, ys)))
patches = PatchCollection([preflow], alpha=0.4)
ax.add_collection(patches)

# the flowed coordinates
fxs, fys = xs, ys
def animate(i):
    # the flowed coordinates are global variables. We need this declaration to use them
    global fxs, fys
    # flow the coordinates a little bit
    fxs, fys = vec_flow(fxs, fys, V3, FLOW_PER_FRAME, 0.01)
    # draw the patches
    postflow = Polygon(zip_coords((fxs, fys)))
    patches.set_paths([preflow, postflow])
    return (patches,)

anim = animation.FuncAnimation(fig, animate, frames=FLOW_TIME*FPS, blit=True, interval=1000/FPS)
HTML(anim.to_jshtml())

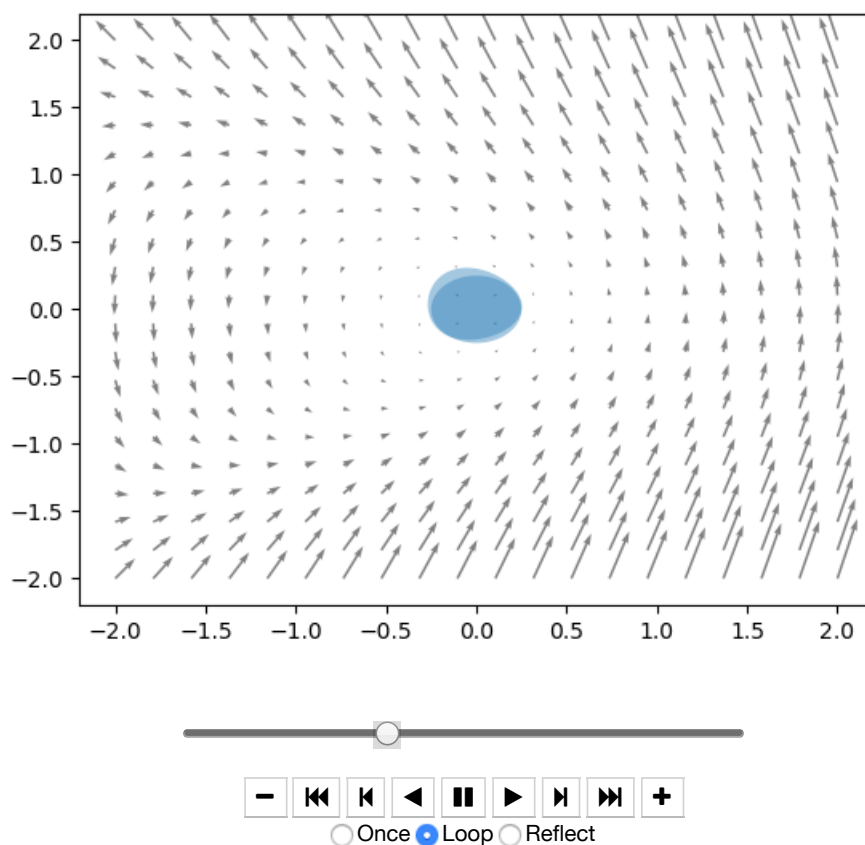
```

Figure 9



Animation size has reached 21054291 bytes, exceeding the limit of 20971520.0. If you're sure you want a larger animation embedded, set the animation.embed_limit rc parameter to a larger value (in MB). This and further frames will be dropped.

Out[27]:



The origin is stable for this dynamical system that flow points along V_3 , as the circle goes back to the original circle while flowing for 20 seconds. This satisfies the $\epsilon - \delta$ definition of stable points.

The Rings of Saturn

```
In [28]: #  
# Create a vector field that simulates orbital velocity  
#  
def V5(X,Y):  
    r = (X**2+Y**2)**(1/2)  
    return 1/(r**(1/2))*1/r*(-Y), 1/(r**(1/2))*1/r*X
```

```

In [29]: #
# Make an animation of an orbiting gas cloud
#

# duration of the flow and the framerate
FLOW_TIME = 20
FPS = 10
FLOW_PER_FRAME = 1/FPS

extents = [-2, 2, -2, 2]
fig, ax = plt.subplots()
plot_vectorfield(ax, V3, extents=extents)

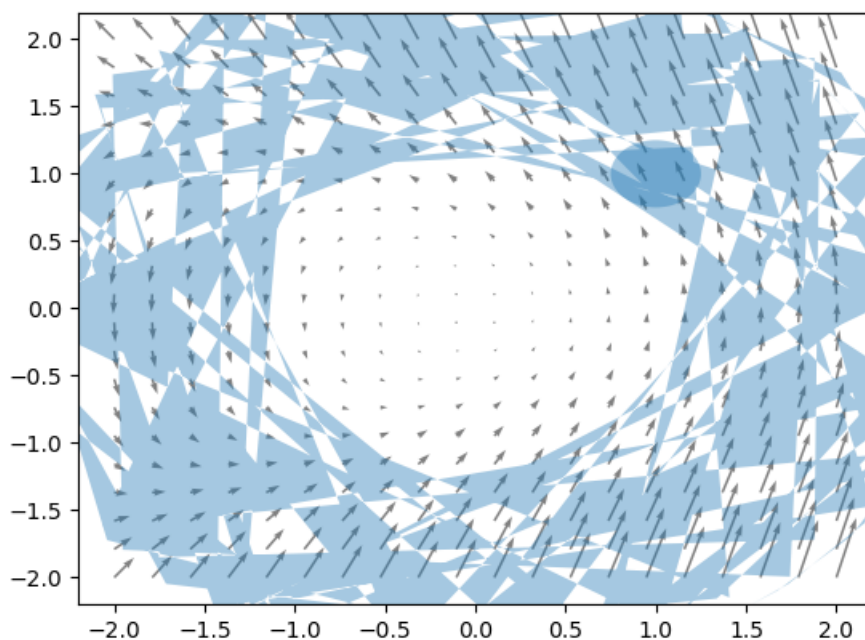
xs, ys = make_perimeter_circle((1,1), .25, 100)
preflow = Polygon(zip_coords((xs, ys)))
patches = PatchCollection([preflow], alpha=0.4)
ax.add_collection(patches)

# the flowed coordinates
fxs, fys = xs, ys
def animate(i):
    # the flowed coordinates are global variables. We need this declaration to use them
    global fxs, fys
    # flow the coordinates a little bit
    fxs, fys = vec_flow(fxs, fys, V5, FLOW_PER_FRAME, 0.01)
    # draw the patches
    postflow = Polygon(zip_coords((fxs, fys)))
    patches.set_paths([preflow, postflow])
    return (patches,)

anim = animation.FuncAnimation(fig, animate, frames=FLOW_TIME*FPS, blit=True, interval=1000/FPS)
HTML(anim.to_jshtml())

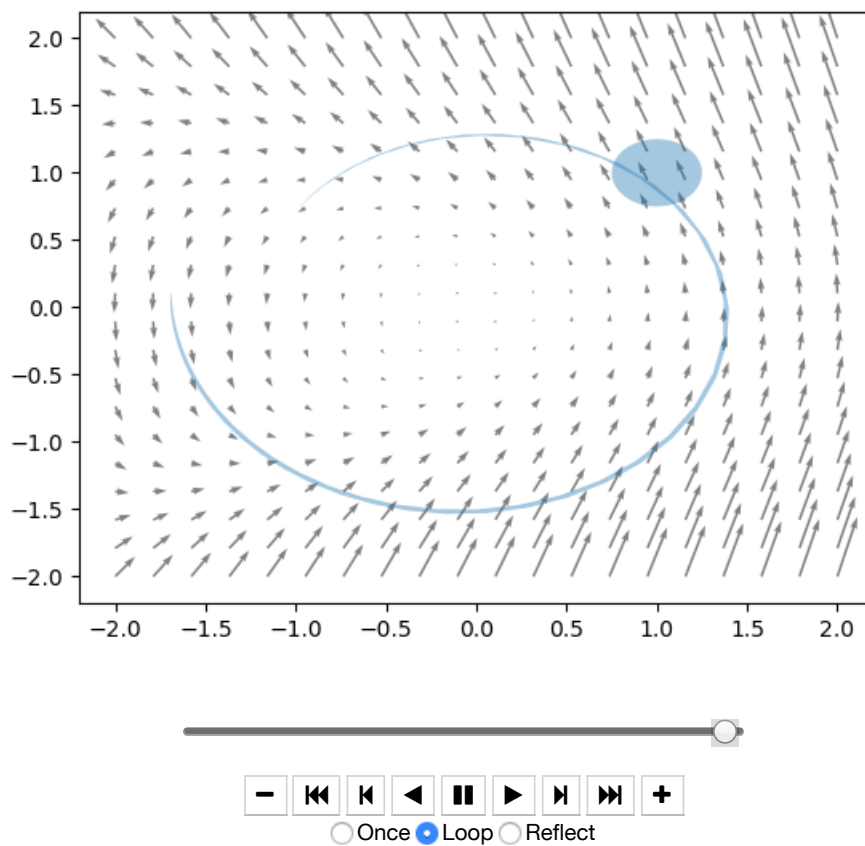
```

Figure 10



Animation size has reached 21077349 bytes, exceeding the limit of 20971520.0. If you're sure you want a larger animation embedded, set the animation.embed_limit rc parameter to a larger value (in MB). This and further frames will be dropped.

Out[29]:



By the above animation, we can clearly tell any circle/cluster/cloud of dust which started orbiting a planet becomes a ring over time. Same applies to Saturn who has many rings formed by dust near it.

In []: