

CS 247 – Scientific Visualization

Lecture 23: Vector / Flow Visualization, Pt. 2 [preview]

Markus Hadwiger, KAUST

Reading Assignment #12 (until Apr 18)



Read (required):

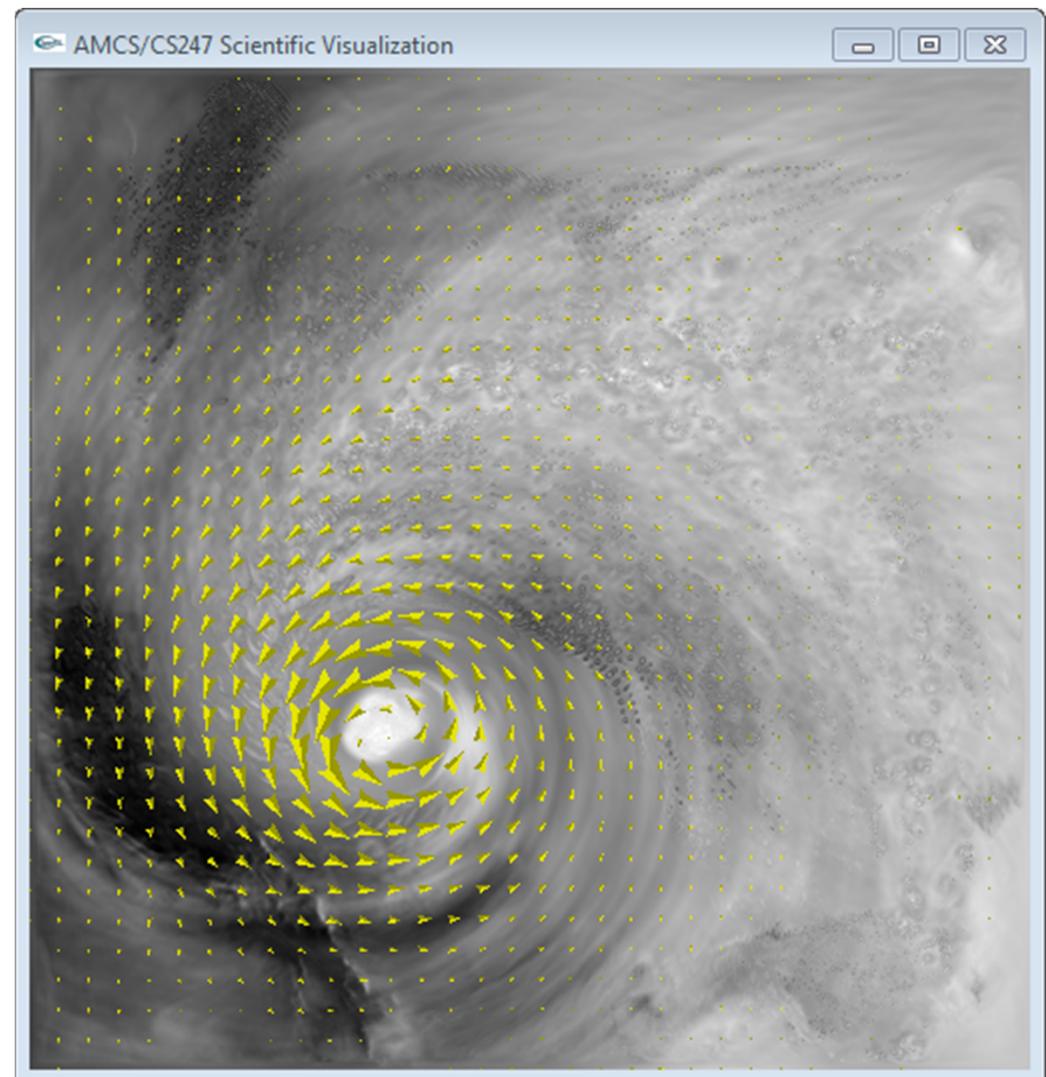
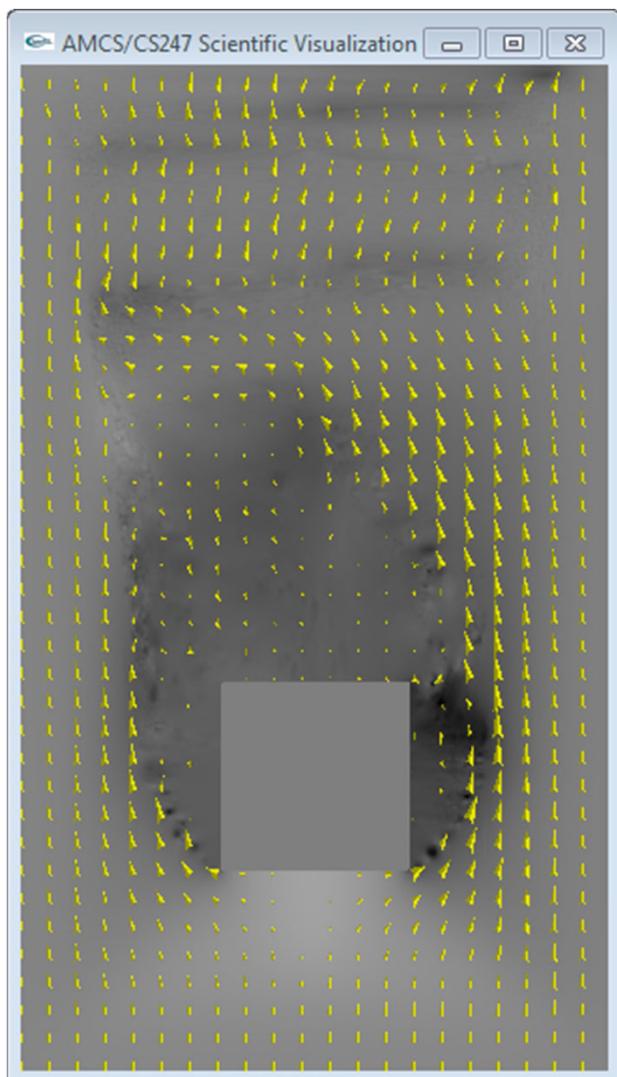
- Data Visualization book
 - Chapter 6 (Vector Visualization)
 - Beginning (before 6.1)
 - Chapters 6.2, 6.3, 6.5
- More general vector field basics (the book is not very precise on the basics)
https://en.wikipedia.org/wiki/Vector_field

Read (optional):

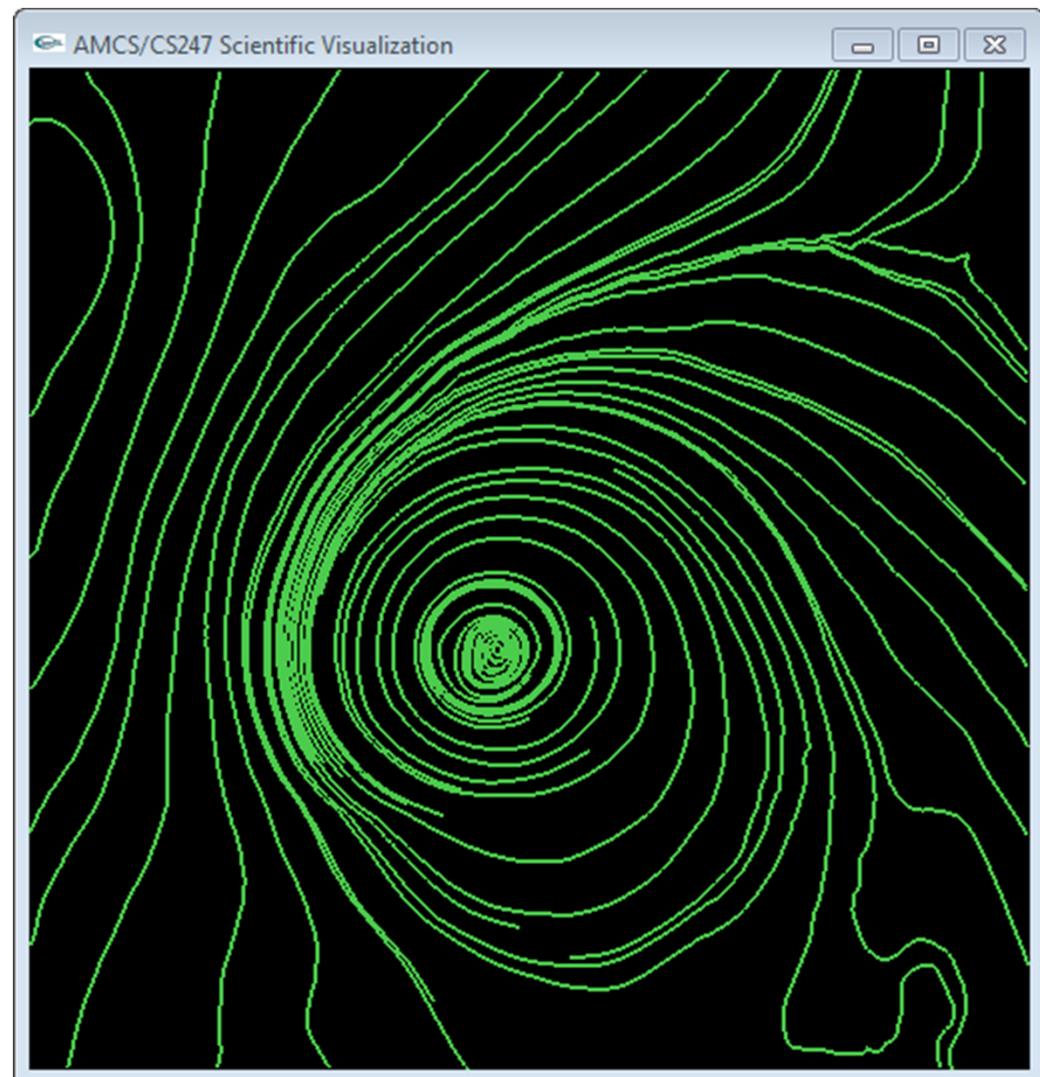
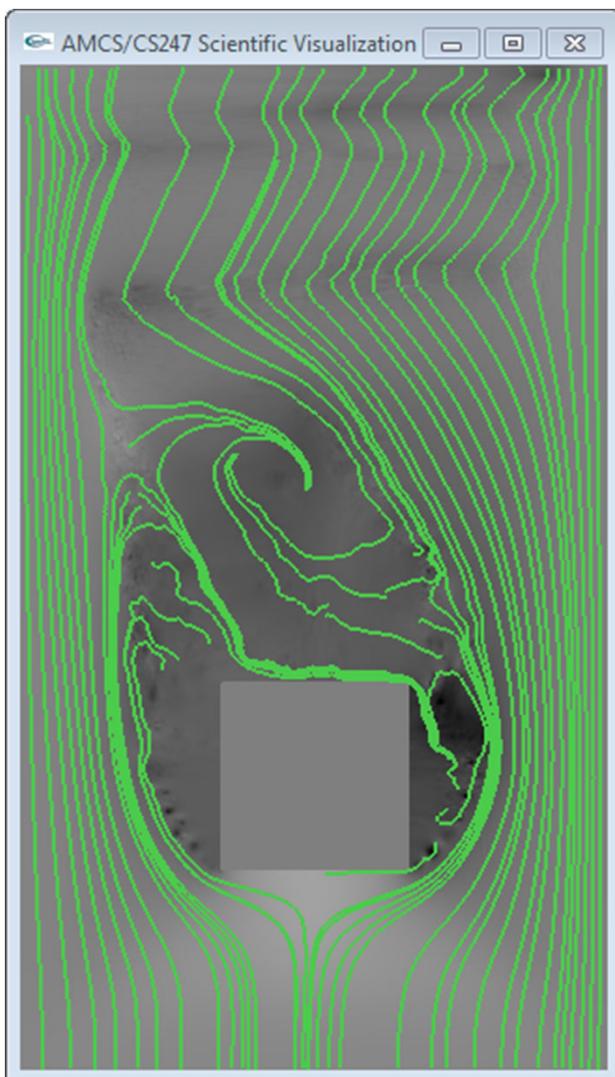
- Paper:
Bruno Jobard and Wilfrid Lefer
Creating Evenly-Spaced Streamlines of Arbitrary Density,

<http://citeseerx.ist.psu.edu/viewdoc/summary?doi=10.1.1.29.9498>

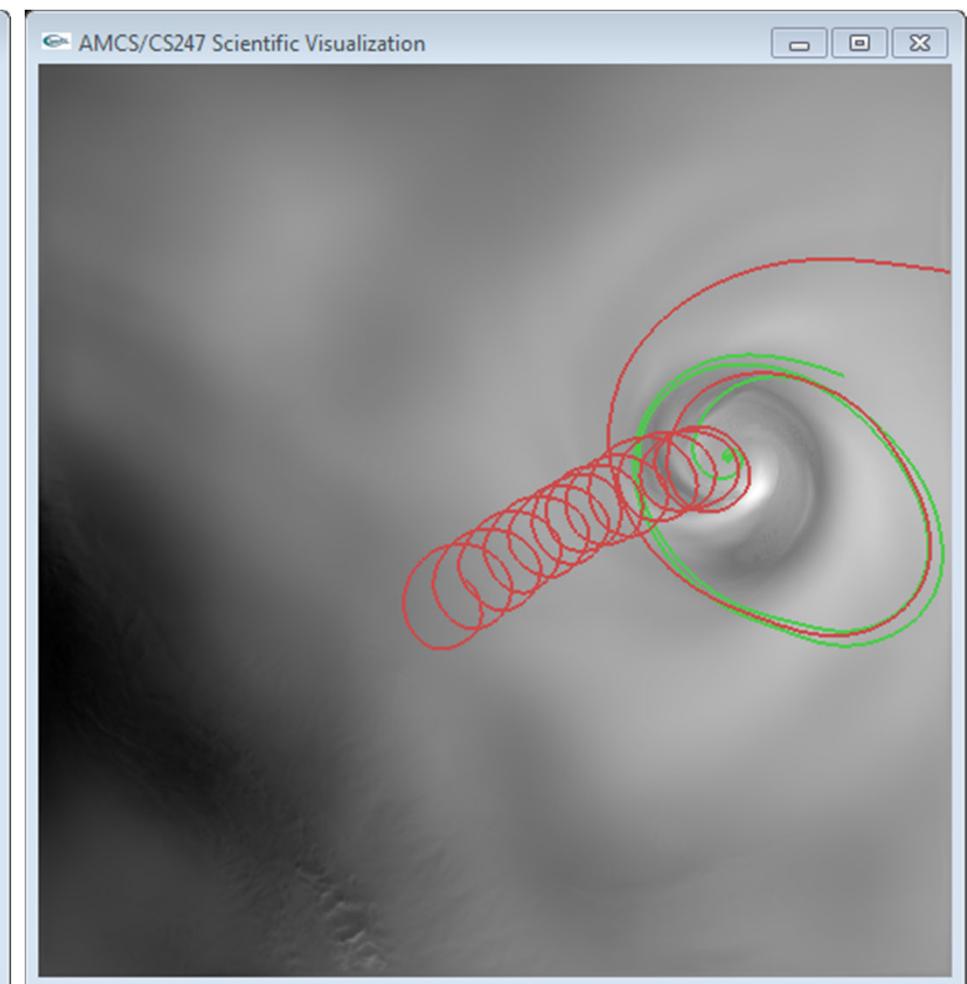
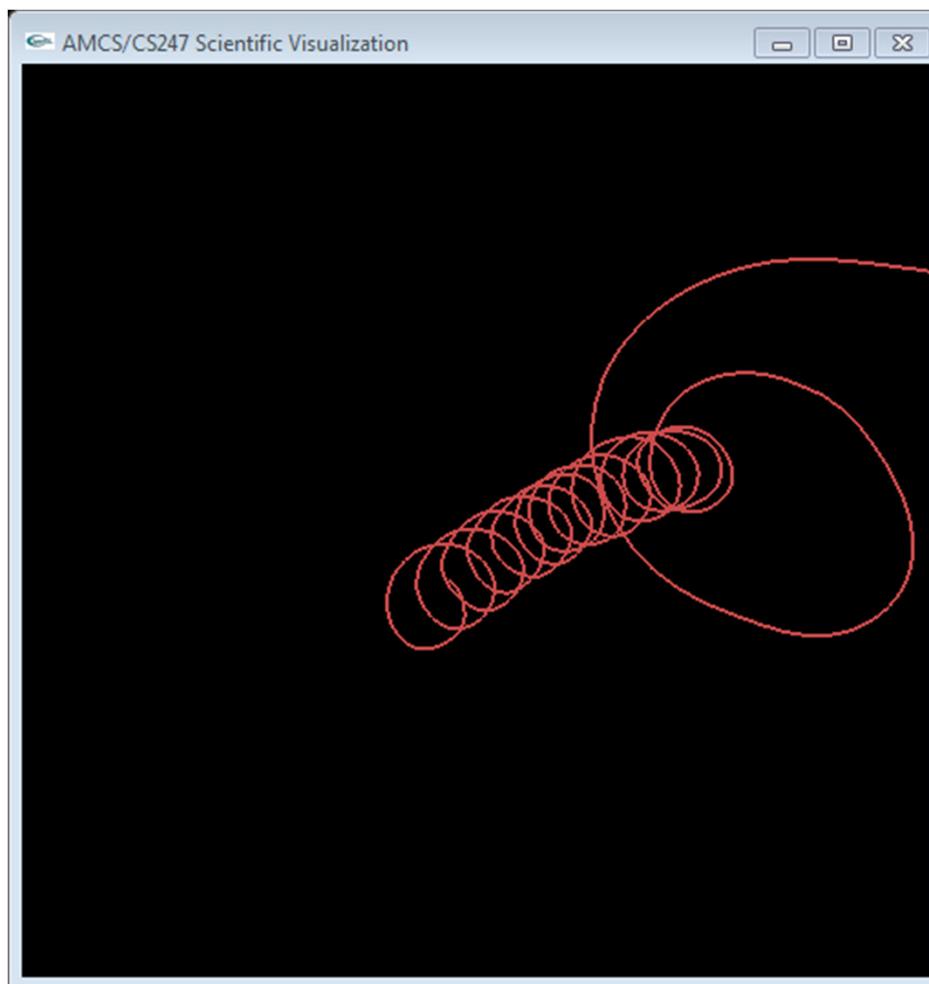
Programming Assignment #5: Flow Vis 1



Programming Assignment #5: Flow Vis 1



Programming Assignment #5: Flow Vis 1





Online Demos and Info

Numerical ODE integration methods (Euler vs. Runge Kutta, etc.)

[https://demonstrations.wolfram.com/
NumericalMethodsForDifferentialEquations/](https://demonstrations.wolfram.com/NumericalMethodsForDifferentialEquations/)

Flow visualization concepts

<https://www3.nd.edu/~cwang11/flowvis.html>

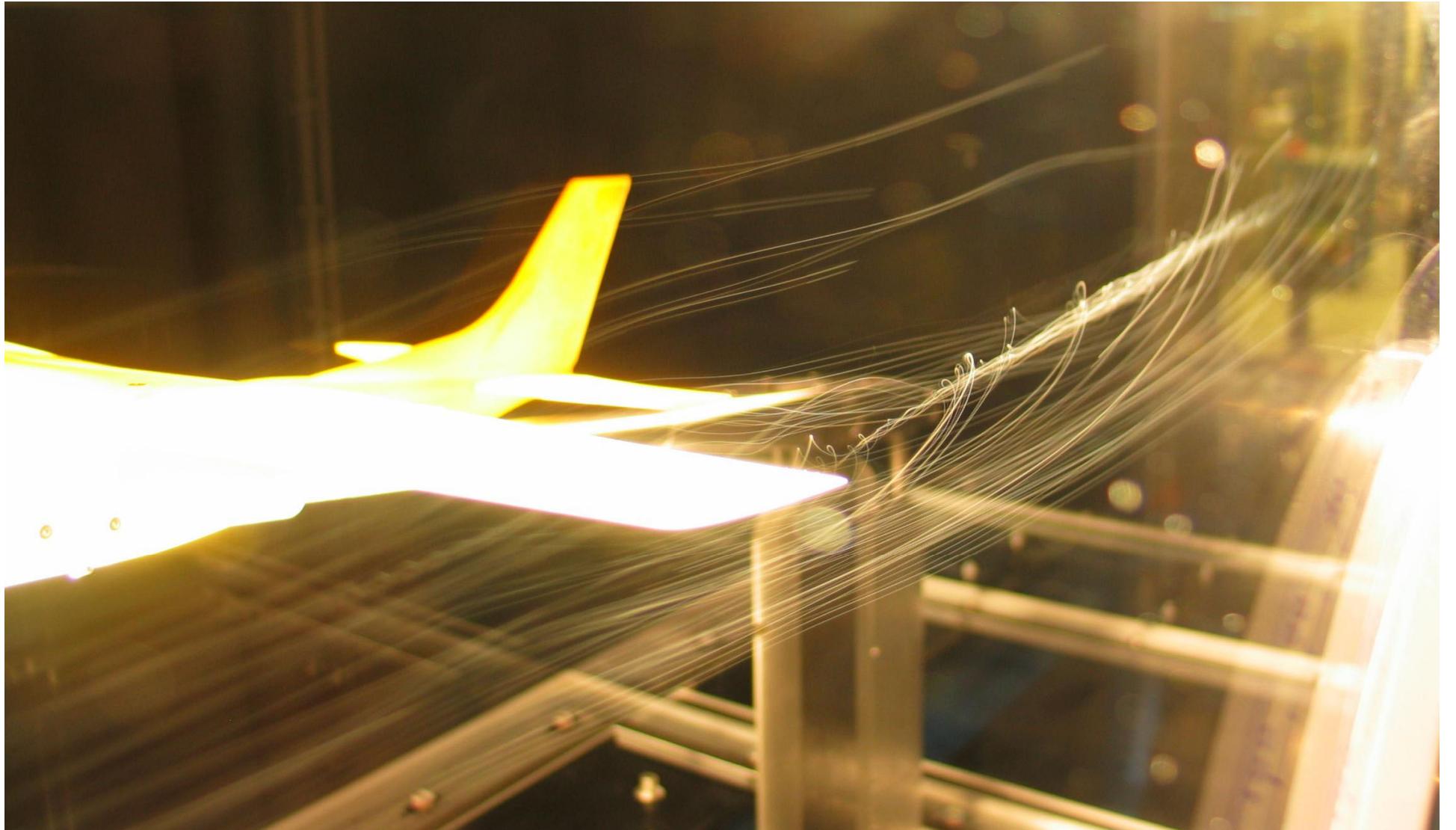
Vector Fields: Motivation



Smoke angel

A C-17 Globemaster III from the 14th Airlift Squadron, Charleston Air Force Base, S.C. flies off after releasing flares over the Atlantic Ocean near Charleston, S.C., during a training mission on Tuesday, May 16, 2006. The "smoke angel" is caused by the vortex from the engines.

(U.S. Air Force photo/Tech. Sgt. Russell E. Cooley IV)



A wind tunnel model of a Cessna 182 showing a wingtip vortex.
Tested in the RPI (Rensselaer Polytechnic Institute) Subsonic Wind Tunnel.

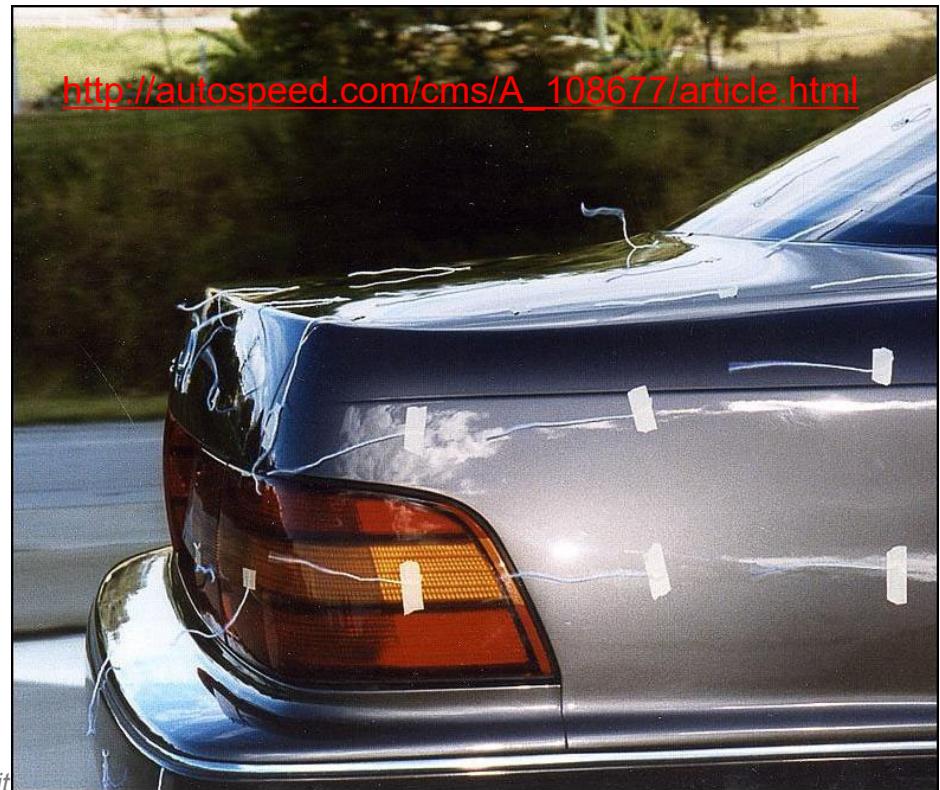
By Ben FrantzDale (2007).

Flow Visualization: Problems and Concepts



http://autospeed.com/cms/A_108677/article.html

wool tufts



http://autospeed.com/cms/A_108677/article.html



smoke injection



http://autospeed.com/cms/A_108677/article.html

smoke nozzles



[NASA, J. Exp. Biol.]

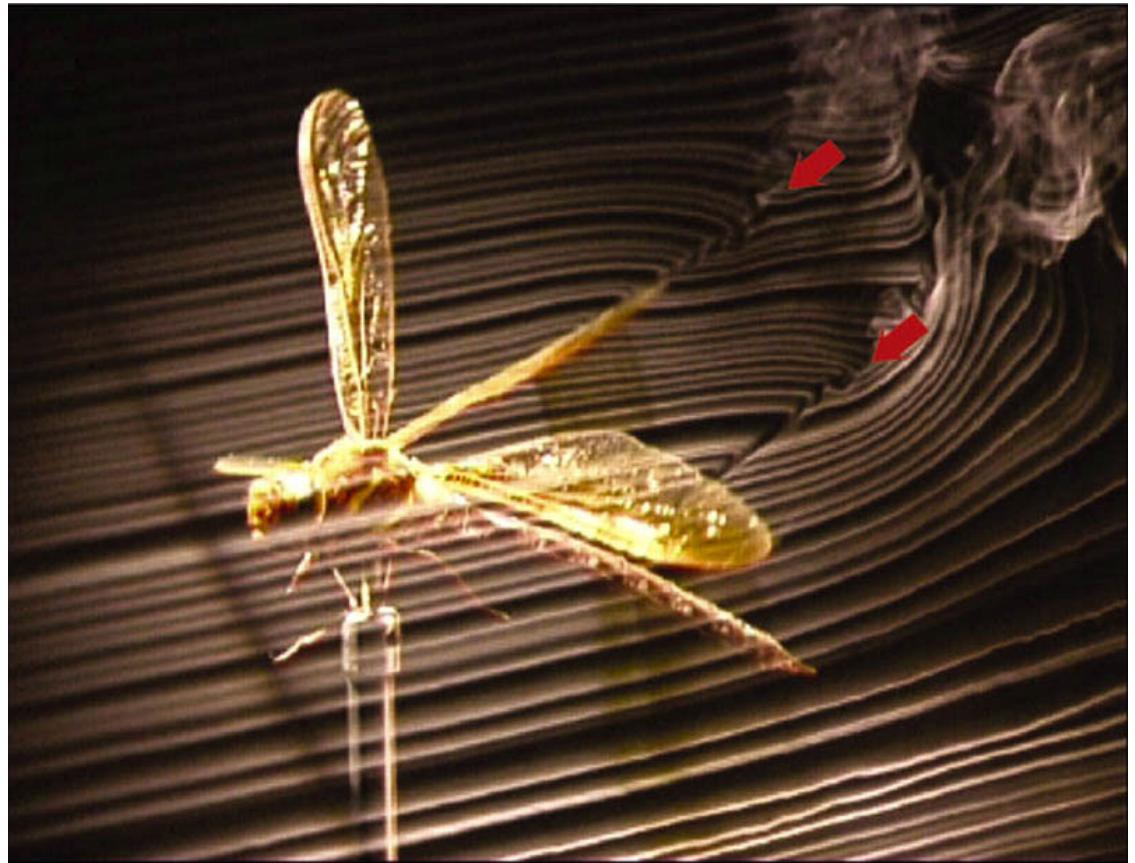


http://autospeed.com/cms/A_108677/article.html

smoke nozzles

Smoke injection

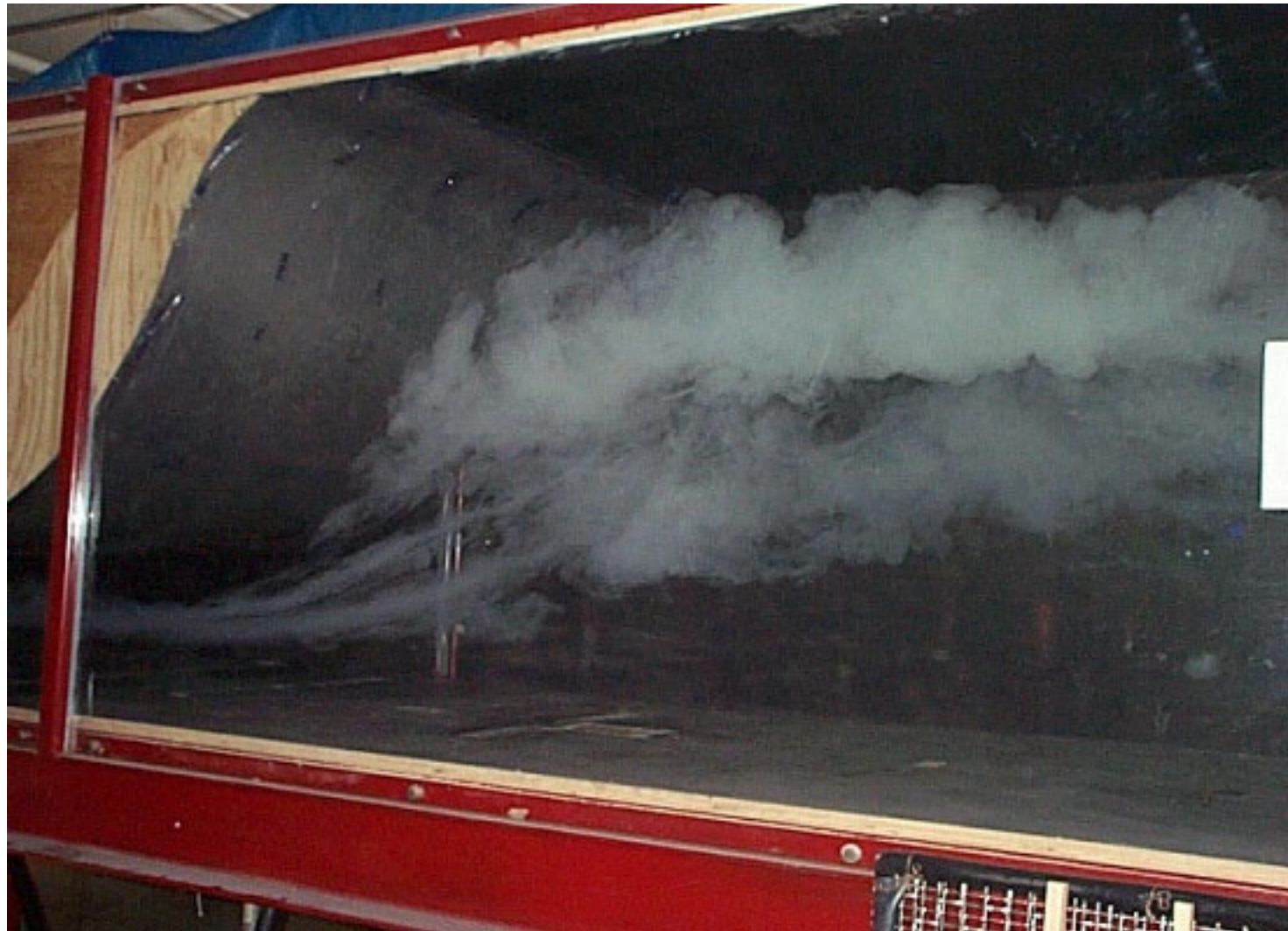
A. L. R. Thomas, G. K. Taylor, R. B. Srygley, R. L. Nudds, and R. J. Bomphrey. Dragonfly flight: free-flight and tethered flow visualizations reveal a diverse array of unsteady lift-generating mechanisms, controlled primarily via angle of attack. *J Exp Biol*, 207(24):4299–4323, 2004.



http://de.wikipedia.org/wiki/Bild:Airplane_vortex_edit.jpg

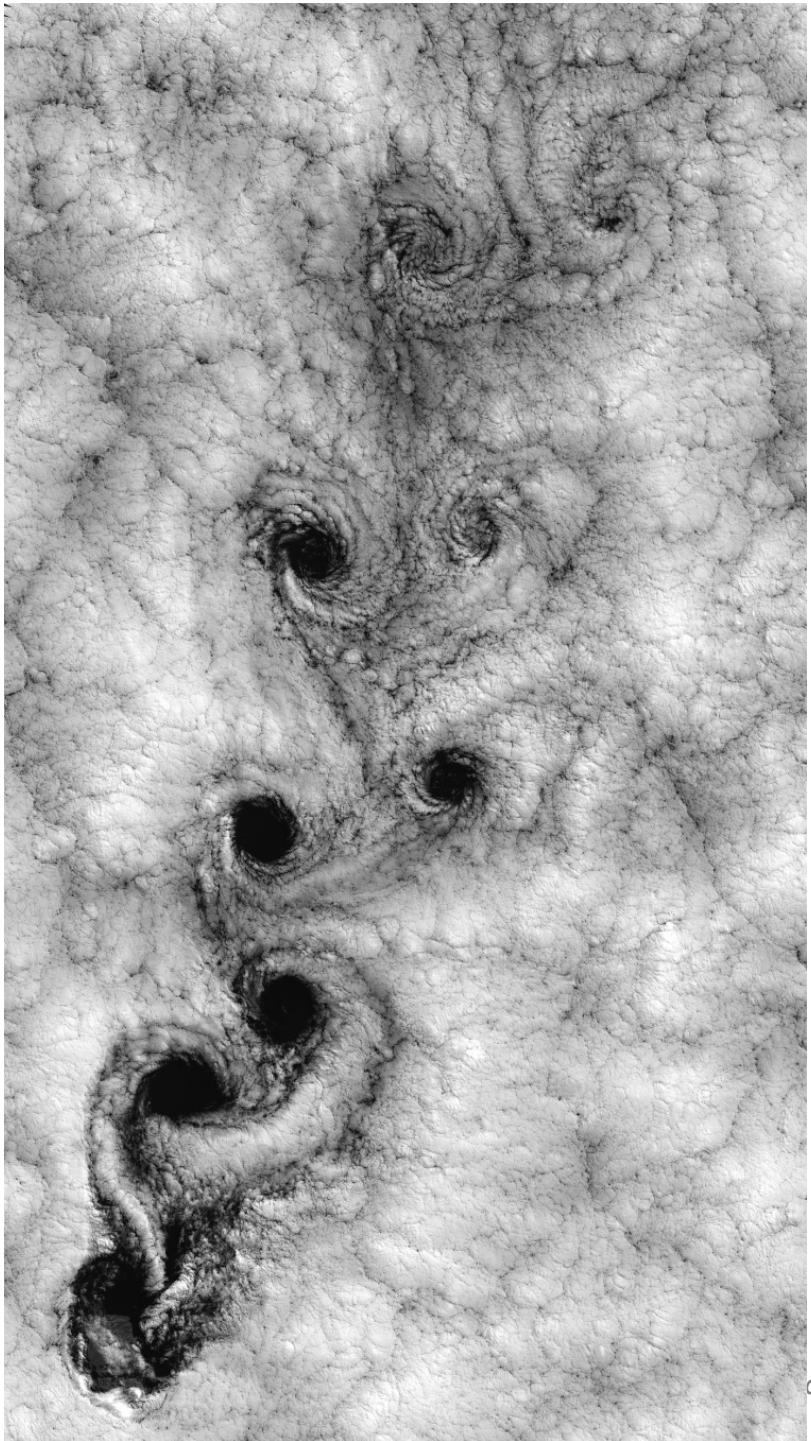
Flow Visualization: Problems and Concepts





Smoke injection

<http://www-me.ccny.cuny.edu/research/aerolab/facilities/images/wt2.jpg>

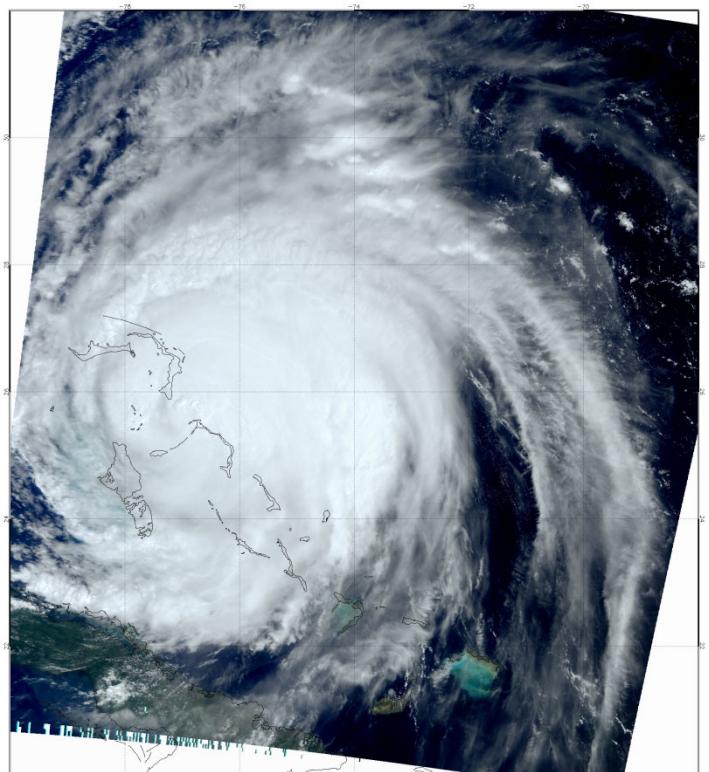


Clouds (satellite image)

Juan Fernandez Islands

Clouds (satellite image)

<http://daac.gsfc.nasa.gov/gallery/frances/>



- **Vortex/ Vortex core lines**

- There is no exact definition of vortices
- capturing some swirling behavior

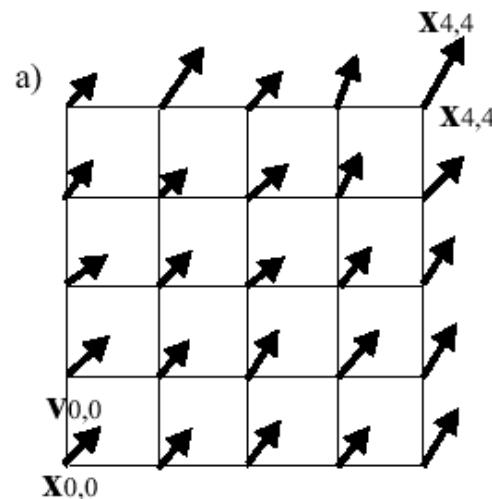


Vector Fields

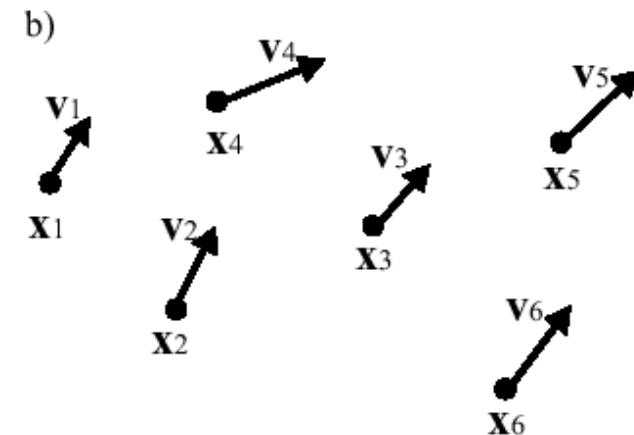


Each vector is usually thought of as a velocity vector

- Example for actual velocity: fluid flow
- But also force fields, etc. (e.g., electrostatic field)



vectors given at grid points



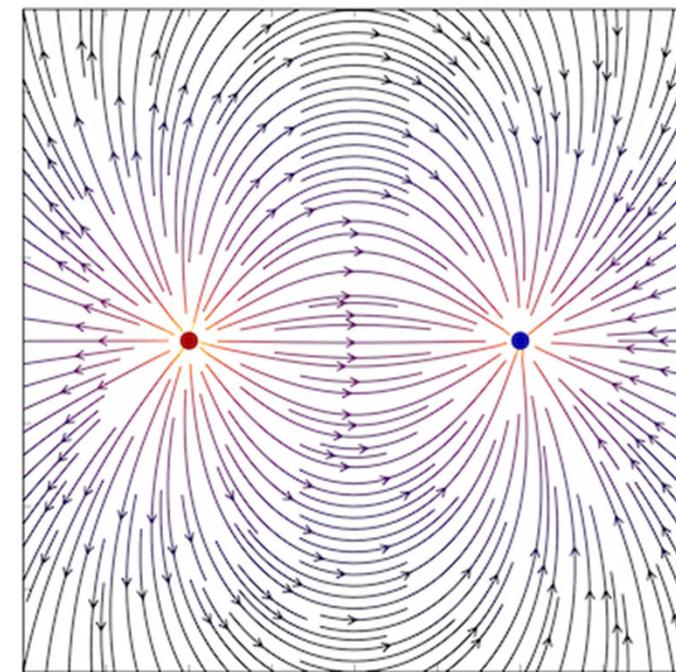
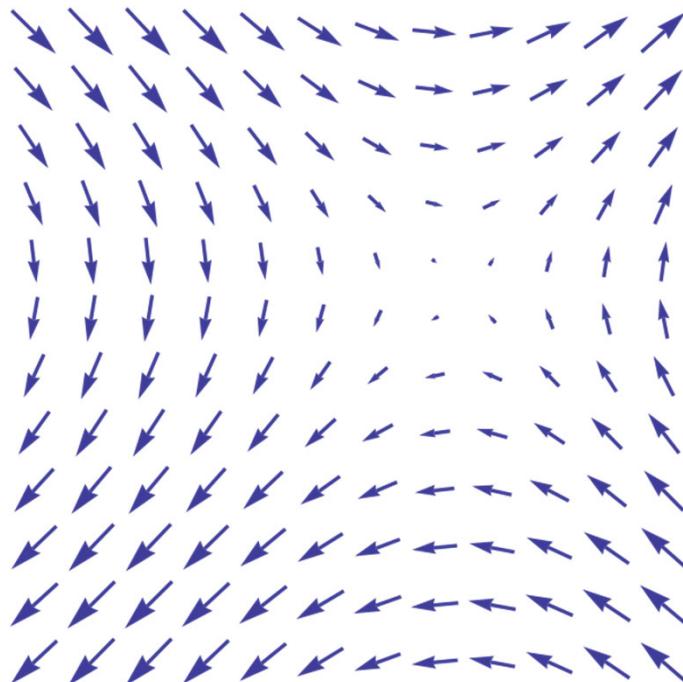
vectors given at particle positions

Vector Fields



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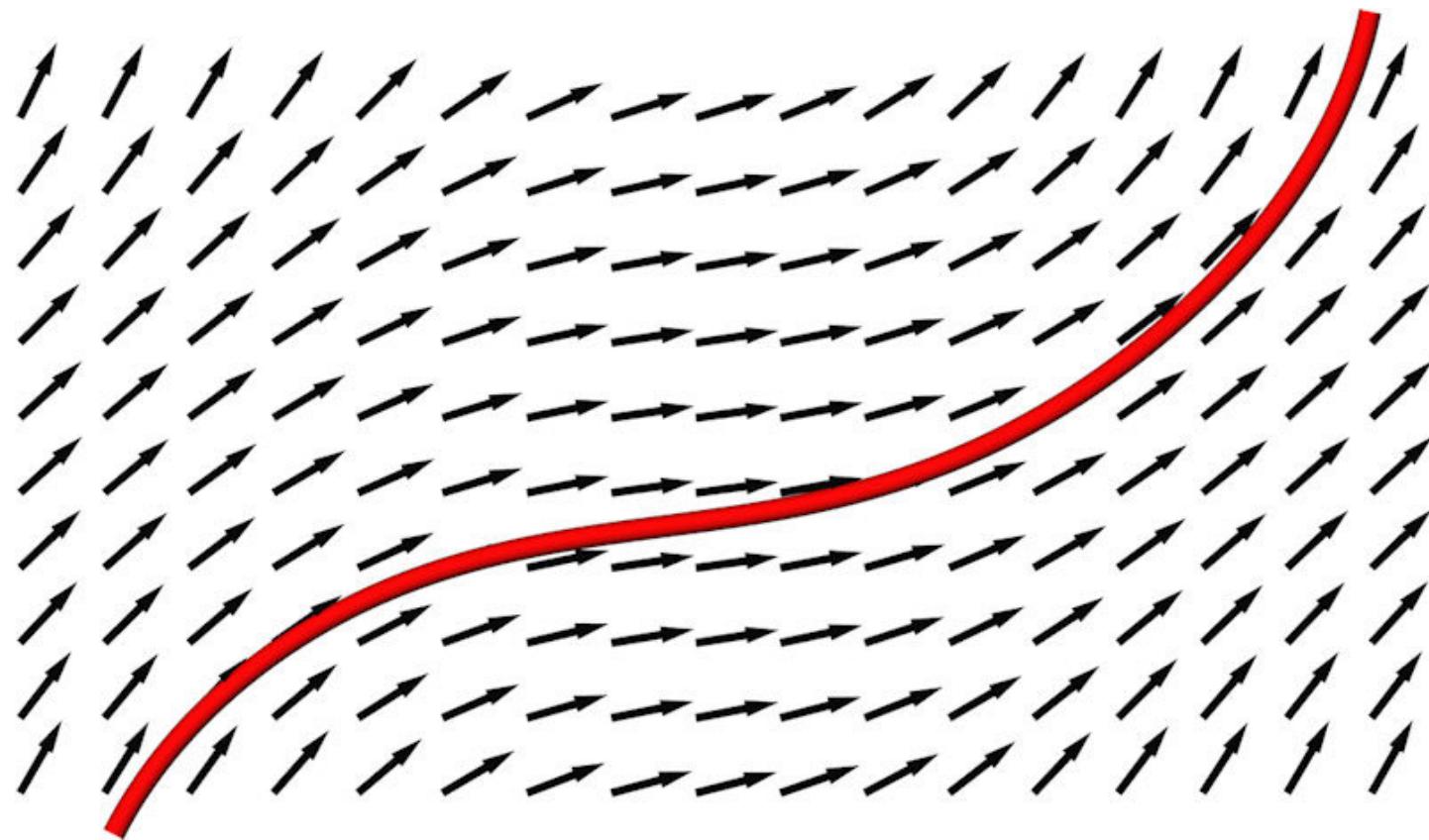


images from wikipedia

Integral Curves / Stream Objects



Integrating velocity over time yields spatial motion





Vector Fields

Each vector is usually thought of as a velocity vector

- Example for actual velocity: fluid flow
- But also force fields, etc. (e.g., electrostatic field)

Each vector in a vector field
lives in the **tangent space**
of the manifold at that point:

Each vector is a **tangent vector**

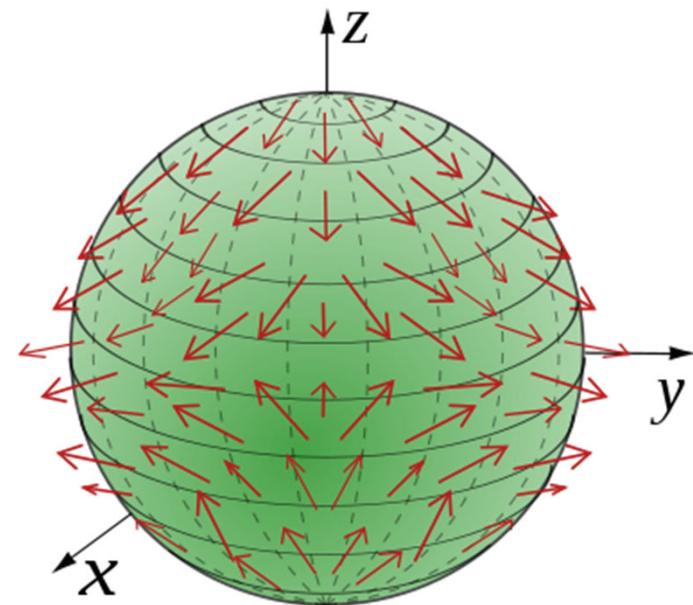
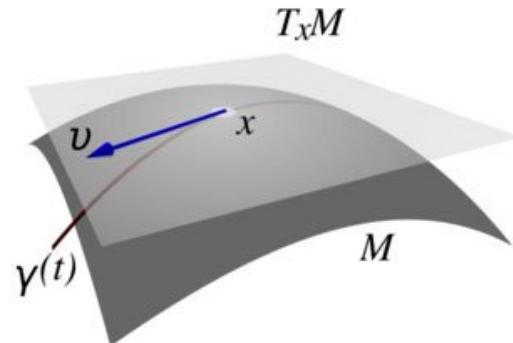


image from wikipedia

Vector Fields



Vector fields on general manifolds M (not just Euclidean space)

Tangent space at a point $x \in M$:

$$T_x M$$

Tangent bundle: Manifold of all tangent spaces over base manifold

$$\pi: TM \rightarrow M$$

Vector field: *Section of tangent bundle*

$$s: M \rightarrow TM,$$

$$x \mapsto s(x). \quad \pi(s(x)) = x$$

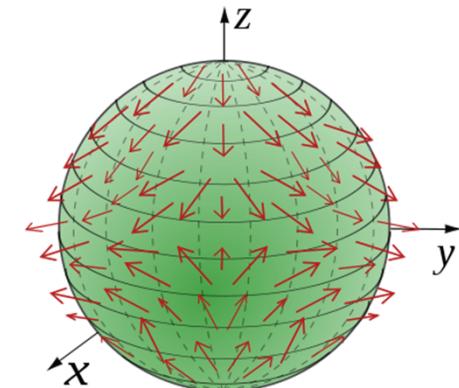
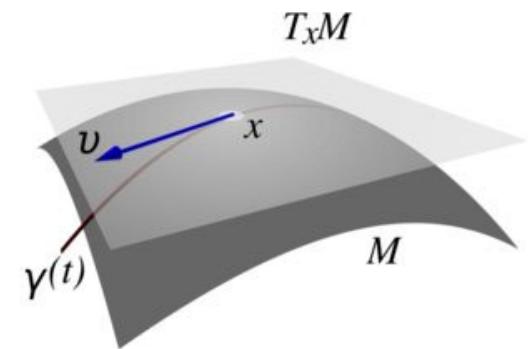


image from wikipedia

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$$\mathbf{v}: M \rightarrow TM,$$

$$x \mapsto \mathbf{v}(x).$$

$$\mathbf{v}(x) \in T_x M$$

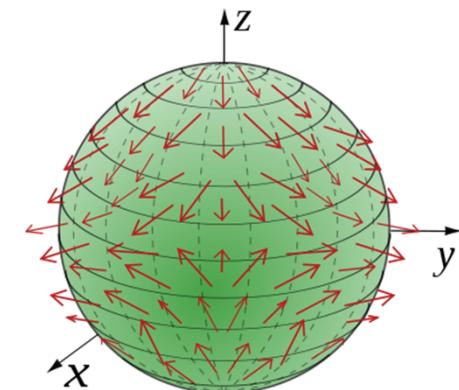
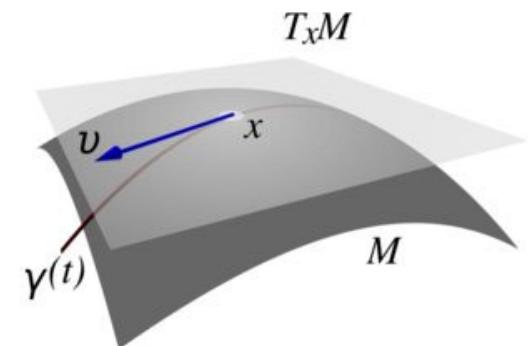


image from wikipedia

Interlude: Coordinate Charts

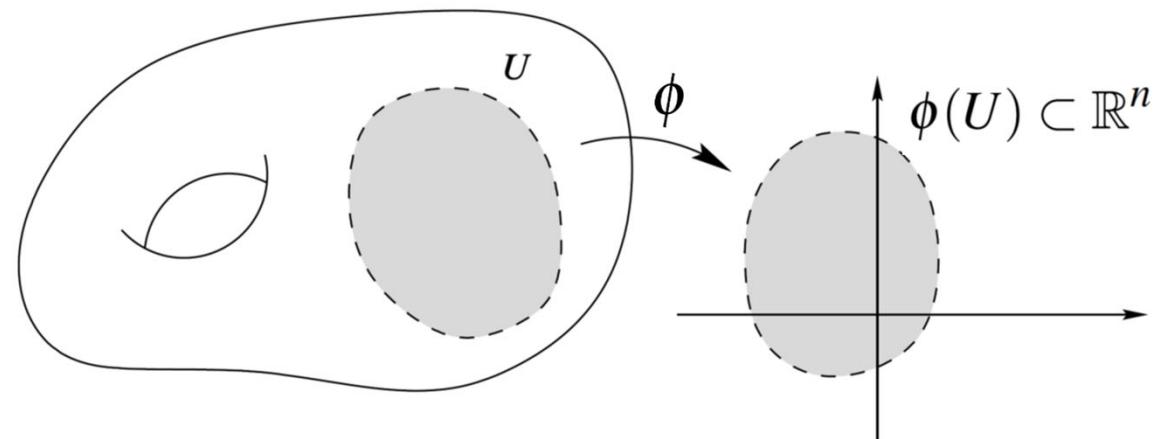


Interlude: Coordinate Charts

Coordinate chart

$$\phi: U \subset M \rightarrow \mathbb{R}^n,$$

$$x \mapsto (x^1, x^2, \dots, x^n).$$





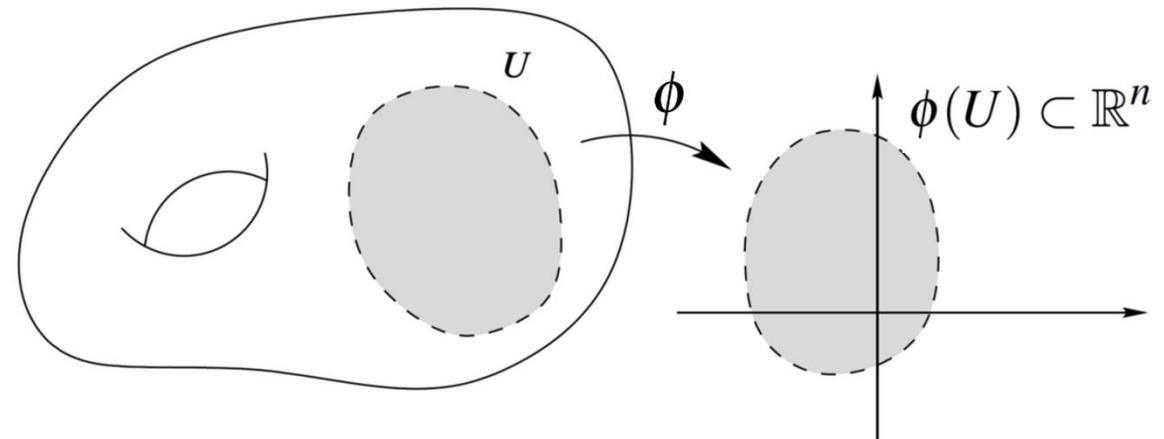
Interlude: Coordinate Charts

Coordinate chart

$$\begin{aligned}\phi: U \subset M &\rightarrow \mathbb{R}^n, \\ x &\mapsto (x^1, x^2, \dots, x^n).\end{aligned}$$

Coordinate functions

$$\begin{aligned}x^i: U \subset M &\rightarrow \mathbb{R}, \\ x &\mapsto x^i(x).\end{aligned}$$





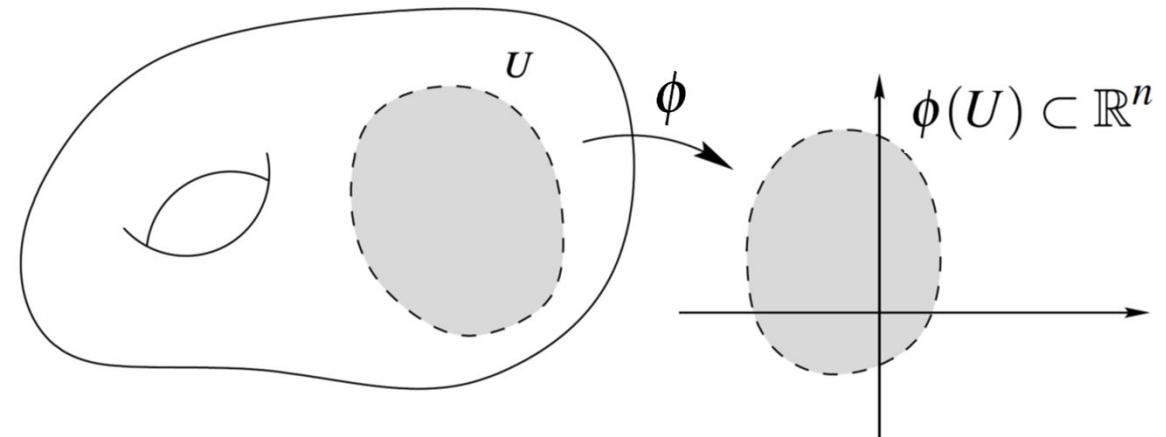
Interlude: Coordinate Charts

Coordinate charts

$$\begin{aligned}\phi_\alpha: U_\alpha \subset M &\rightarrow \mathbb{R}^n, \\ x &\mapsto (x^1, x^2, \dots, x^n).\end{aligned}$$

Atlas

$$\{(U_\alpha, \phi_\alpha)\}_{\alpha \in I}$$





Interlude: Coordinate Charts

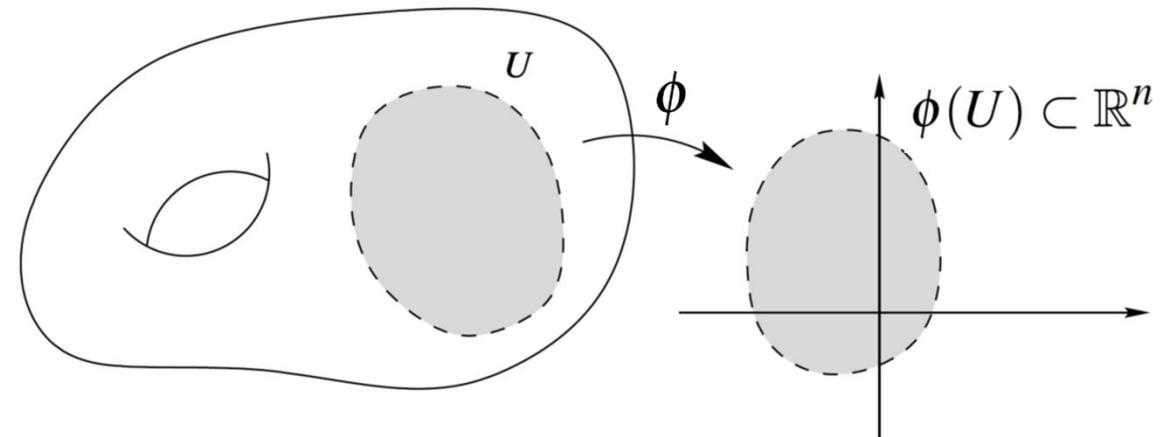
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Atlas

$$\{(U_\alpha, \phi_\alpha)\}_{\alpha \in I}$$

$$\begin{aligned}\phi_\alpha: U_\alpha \subset M &\rightarrow \mathbb{R}^n, \\ x &\mapsto (x^1(x), x^2(x), \dots, x^n(x)).\end{aligned}$$





Vector Fields vs. Vectors in Components

Because Euclidean space is most common, often slightly sloppy notation

$$\mathbf{v}: U \subset \mathbb{R}^2 \rightarrow \mathbb{R}^2,$$

$$(x, y) \mapsto \begin{bmatrix} u \\ v \end{bmatrix}.$$



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$$\mathbf{v}: U \subset \mathbb{R}^3 \rightarrow \mathbb{R}^3,$$

$$(x, y, z) \mapsto \begin{bmatrix} u \\ v \\ w \end{bmatrix}.$$

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Vector Fields vs. Vectors in Components

$\mathbf{v}: U \subset \mathbb{R}^n \rightarrow \mathbb{R}^n,$

$$(x^1, x^2, \dots, x^n) \mapsto \begin{bmatrix} v^1 \\ v^2 \\ \vdots \\ v^n \end{bmatrix}.$$

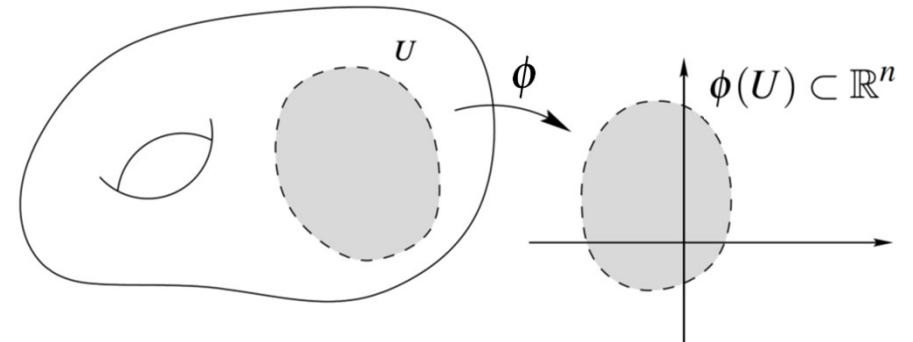
$\mathbf{v}: U \subset \mathbb{R}^n \rightarrow \mathbb{R}^n,$

$$(x^1, x^2, \dots, x^n) \mapsto \begin{pmatrix} v^1(x^1, x^2, \dots, x^n) \\ v^2(x^1, x^2, \dots, x^n) \\ \vdots \\ v^n(x^1, x^2, \dots, x^n) \end{pmatrix}.$$



Vector Fields vs. Vectors in Components

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$$\mathbf{v}|_U: \phi(U) \subset \mathbb{R}^n \rightarrow \mathbb{R}^n,$$
$$(x^1, x^2, \dots, x^n) \mapsto \begin{bmatrix} v^1 \\ v^2 \\ \vdots \\ v^n \end{bmatrix}.$$



Vector Fields vs. Vectors in Components

Need basis vector fields

$$\begin{aligned}\mathbf{e}_i : U \subset M &\rightarrow TM, \\ x &\mapsto \mathbf{e}_i(x)\end{aligned}\quad \left\{\mathbf{e}_i(x)\right\}_{i=1}^n \text{ basis for } T_x M$$



Vector Fields vs. Vectors in Components

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$$\begin{aligned}\mathbf{v}: U \subset M &\rightarrow TM, \\ x &\mapsto v^1 \mathbf{e}_1 + v^2 \mathbf{e}_2 + \dots + v^n \mathbf{e}_n.\end{aligned}$$

$$\begin{aligned}\mathbf{v}: U \subset M &\rightarrow TM, \\ x &\mapsto v^1(x) \mathbf{e}_1(x) + v^2(x) \mathbf{e}_2(x) + \dots + v^n(x) \mathbf{e}_n(x).\end{aligned}$$



Vector Fields vs. Vectors in Components

Need basis vector fields

$$\mathbf{e}_i : U \subset M \rightarrow TM, \quad x \mapsto \mathbf{e}_i(x) \quad \{\mathbf{e}_i(x)\}_{i=1}^n \text{ basis for } T_x M$$

Coordinate basis:

$$\mathbf{e}_i := \frac{\partial}{\partial x^i}$$

$$\mathbf{v} : U \subset M \rightarrow TM, \quad x \mapsto v^1 \mathbf{e}_1 + v^2 \mathbf{e}_2 + \dots + v^n \mathbf{e}_n.$$

$$\mathbf{v} : U \subset M \rightarrow TM, \quad x \mapsto v^1(x) \mathbf{e}_1(x) + v^2(x) \mathbf{e}_2(x) + \dots + v^n(x) \mathbf{e}_n(x).$$

Examples of Coordinate Curves and Bases



Coordinate functions, coordinate curves, bases

- Coordinate functions are real-valued (“scalar”) functions on the domain
- On each coordinate curve, *one* coordinate changes, *all others stay constant*
- Basis: n linearly independent vectors at each point of domain

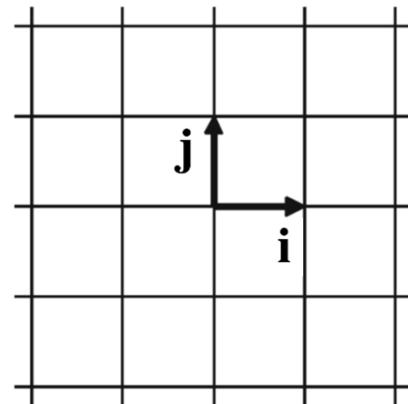
Cartesian coordinates

$$x^1 = x$$

$$x^2 = y$$

$$\mathbf{e}_1 = \frac{\partial}{\partial x} = \mathbf{i}$$

$$\mathbf{e}_2 = \frac{\partial}{\partial y} = \mathbf{j}$$



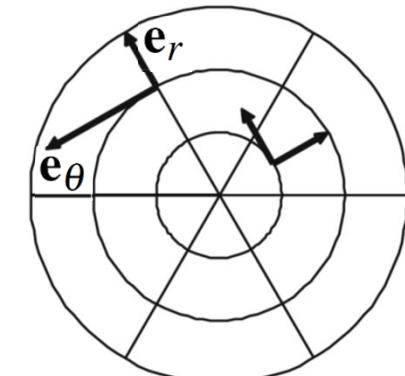
polar coordinates

$$x^1 = r$$

$$x^2 = \theta$$

$$\mathbf{e}_1 = \frac{\partial}{\partial r} = \mathbf{e}_r$$

$$\mathbf{e}_2 = \frac{\partial}{\partial \theta} = \mathbf{e}_\theta$$



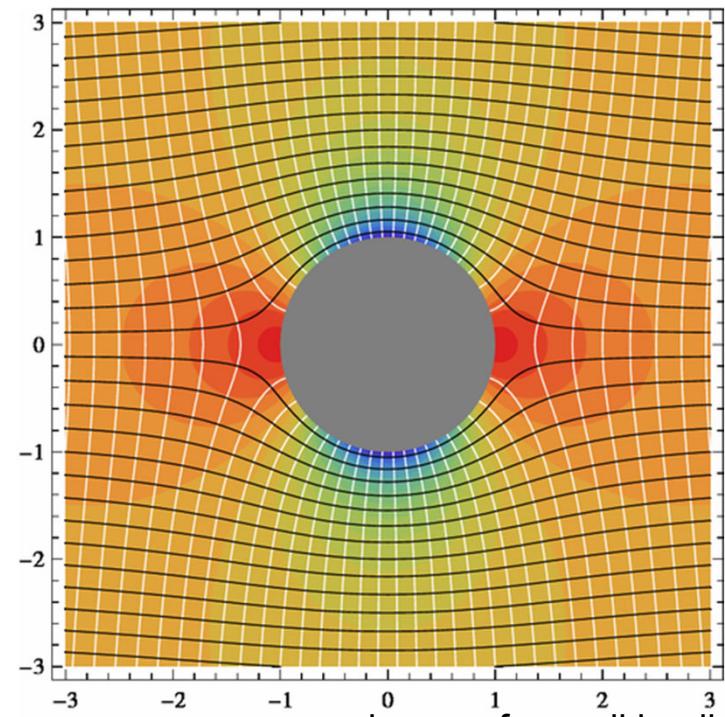
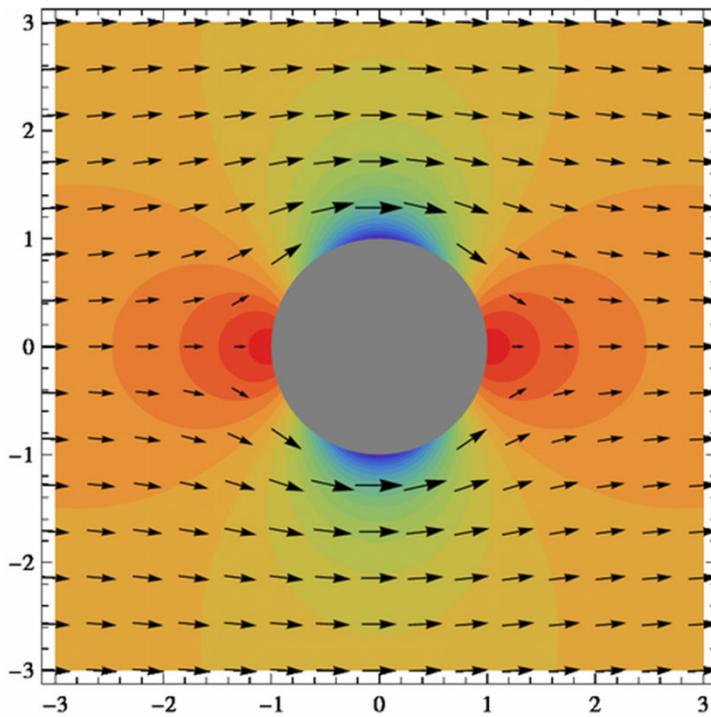


Flow Field Example (1)

Potential flow around a circular cylinder

https://en.wikipedia.org/wiki/Potential_flow_around_a_circular_cylinder

Inviscid, incompressible flow that is irrotational (curl-free) and can be modeled as the gradient of a scalar function called the (scalar) velocity potential



images from wikipedia

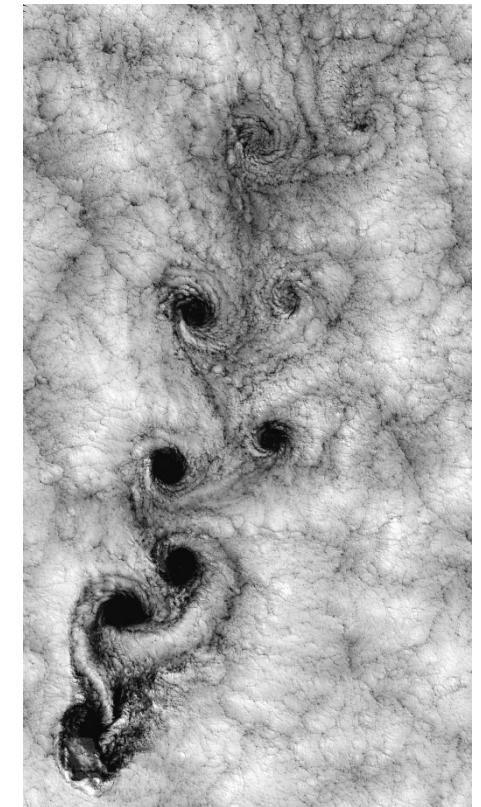
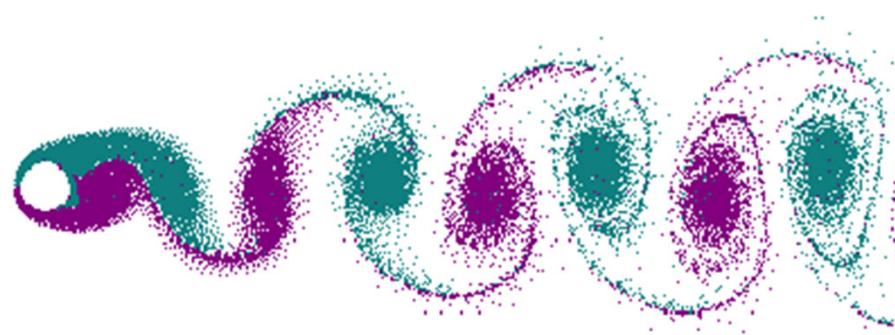


Flow Field Example (2)

Depending on Reynolds number, turbulence will develop

Example: von Kármán vortex street: vortex shedding

https://en.wikipedia.org/wiki/Karman_vortex_street



images from wikipedia



Steady vs. Unsteady Flow

- Steady flow: time-independent
 - Flow itself is static over time: $\mathbf{v}(\mathbf{x})$ $\mathbf{v}: \mathbb{R}^n \rightarrow \mathbb{R}^n,$
 - Example: laminar flows $x \mapsto \mathbf{v}(x).$
- Unsteady flow: time-dependent
 - Flow itself changes over time: $\mathbf{v}(\mathbf{x}, t)$ $\mathbf{v}: \mathbb{R}^n \times \mathbb{R} \rightarrow \mathbb{R}^n,$
 - Example: turbulent flows $x \mapsto \mathbf{v}(x, t).$

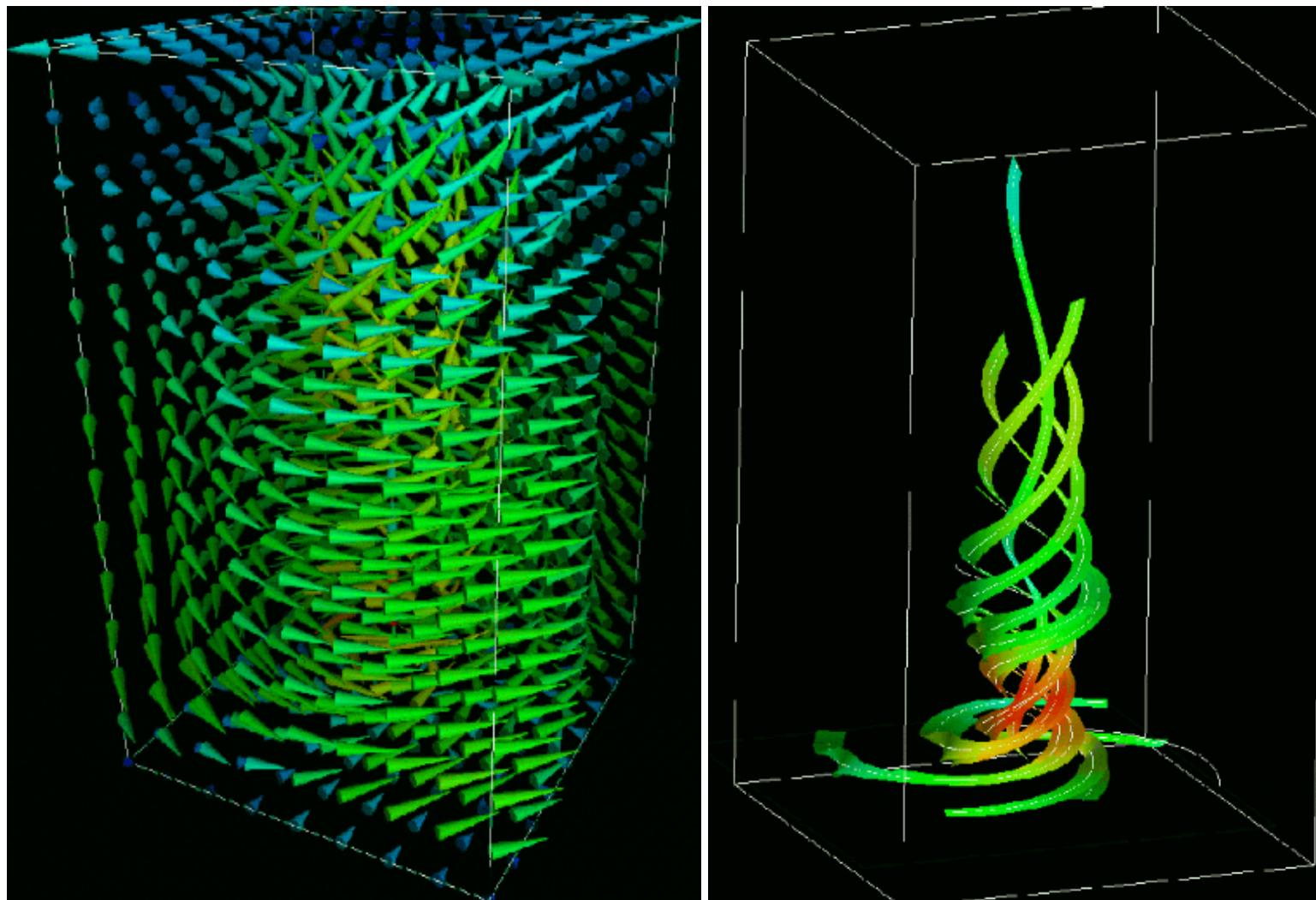
(here just for Euclidean domain; analogous on general manifolds)



Direct vs. Indirect Flow Visualization

- Direct flow visualization
 - Overview of current flow state
 - Visualization of vectors: arrow plots (“hedgehog” plots)
- Indirect flow visualization
 - Use intermediate representation: vector field integration over time
 - Visualization of temporal evolution
 - Integral curves: streamlines, pathlines, streaklines, timelines
 - Integral surfaces: streamsurfaces, pathsurfaces, streaksurfaces

Direct vs. Indirect Flow Visualization

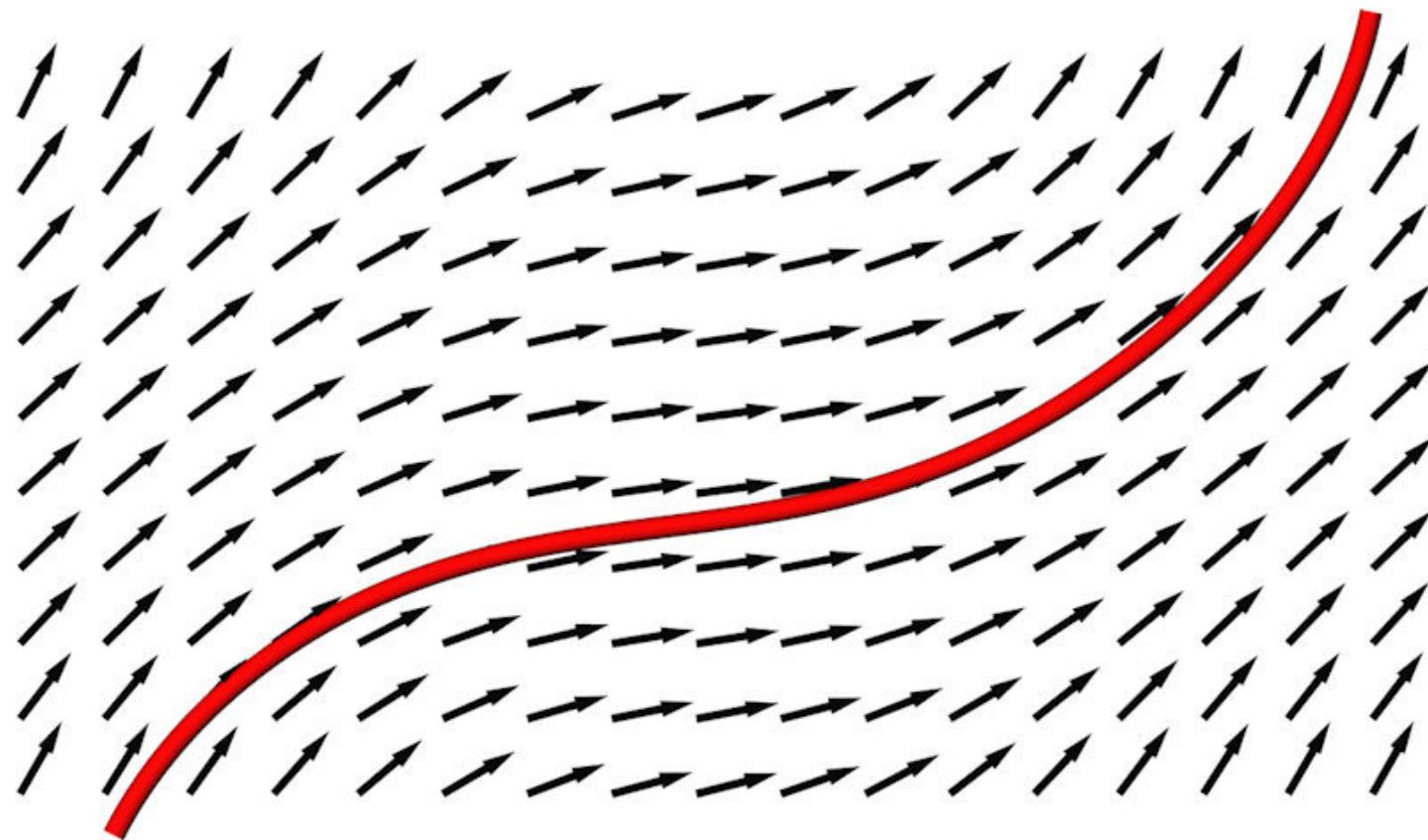


Integral Curves: Intro

Integral Curves / Stream Objects



Integrating velocity over time yields spatial motion



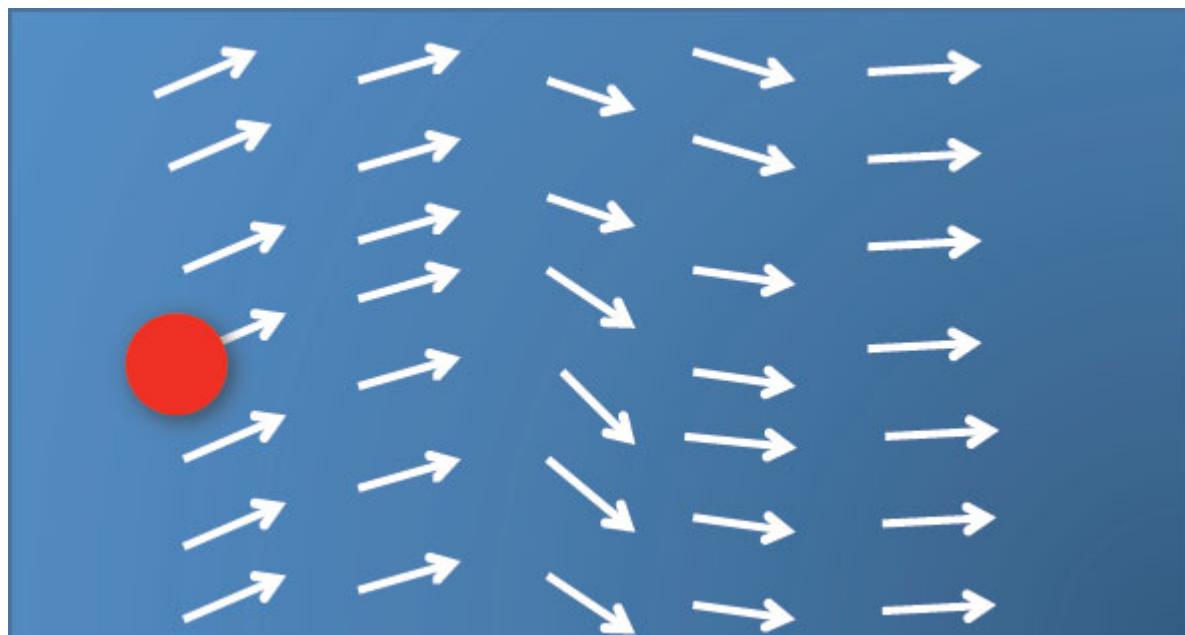
Particle Trajectories



Courtesy Jens Krüger



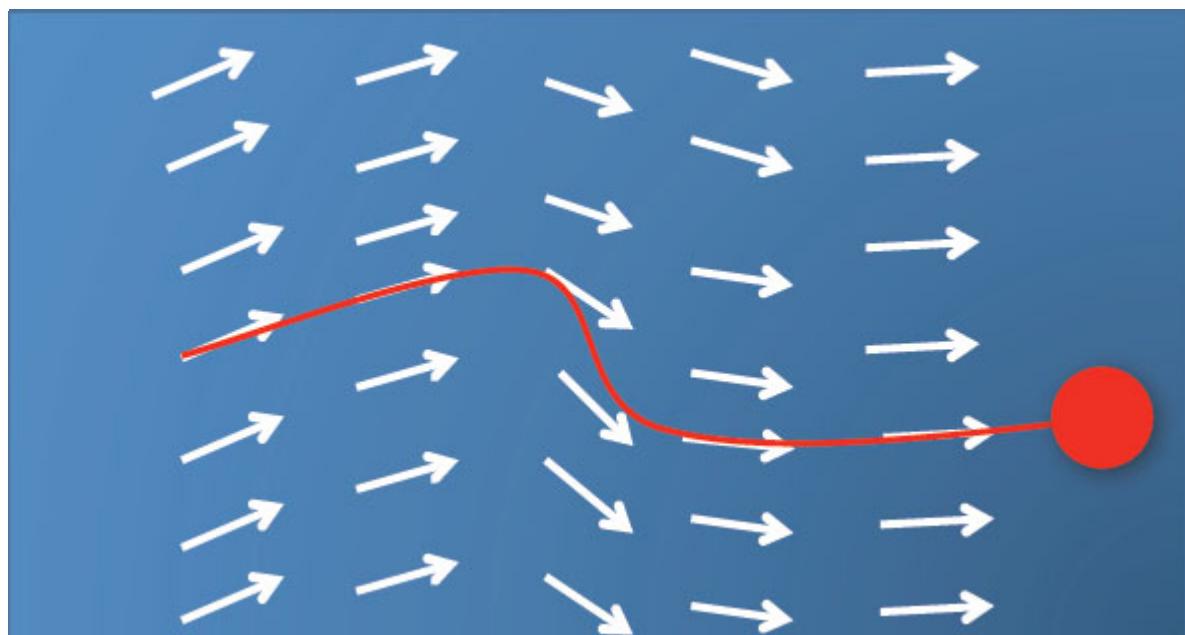
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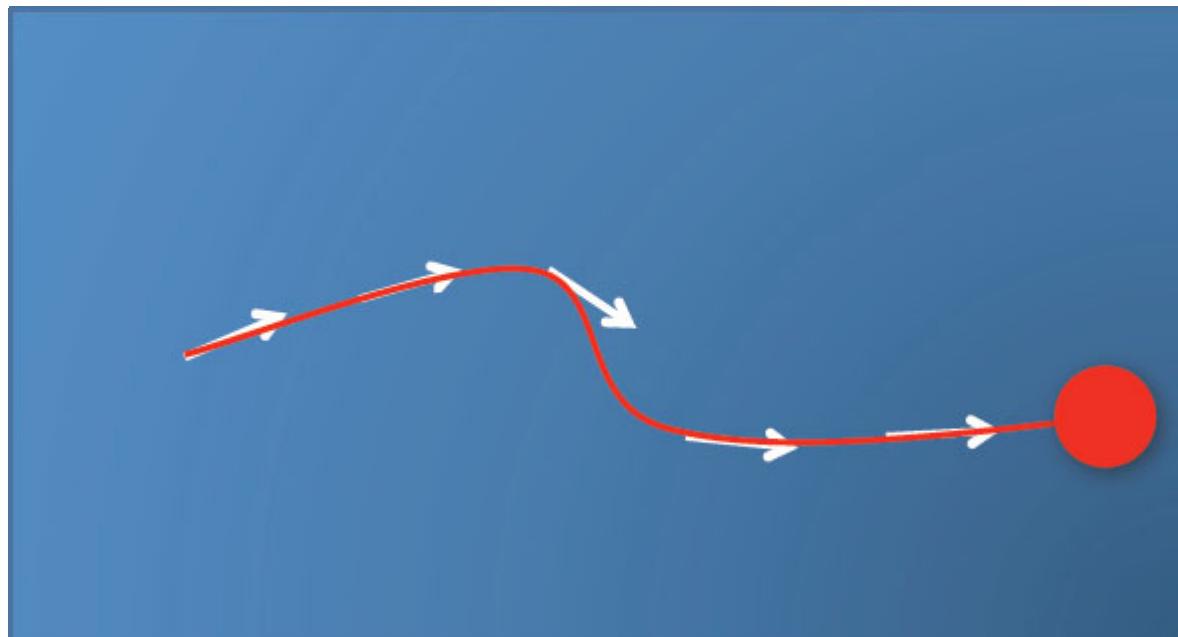


Particle Trajectories



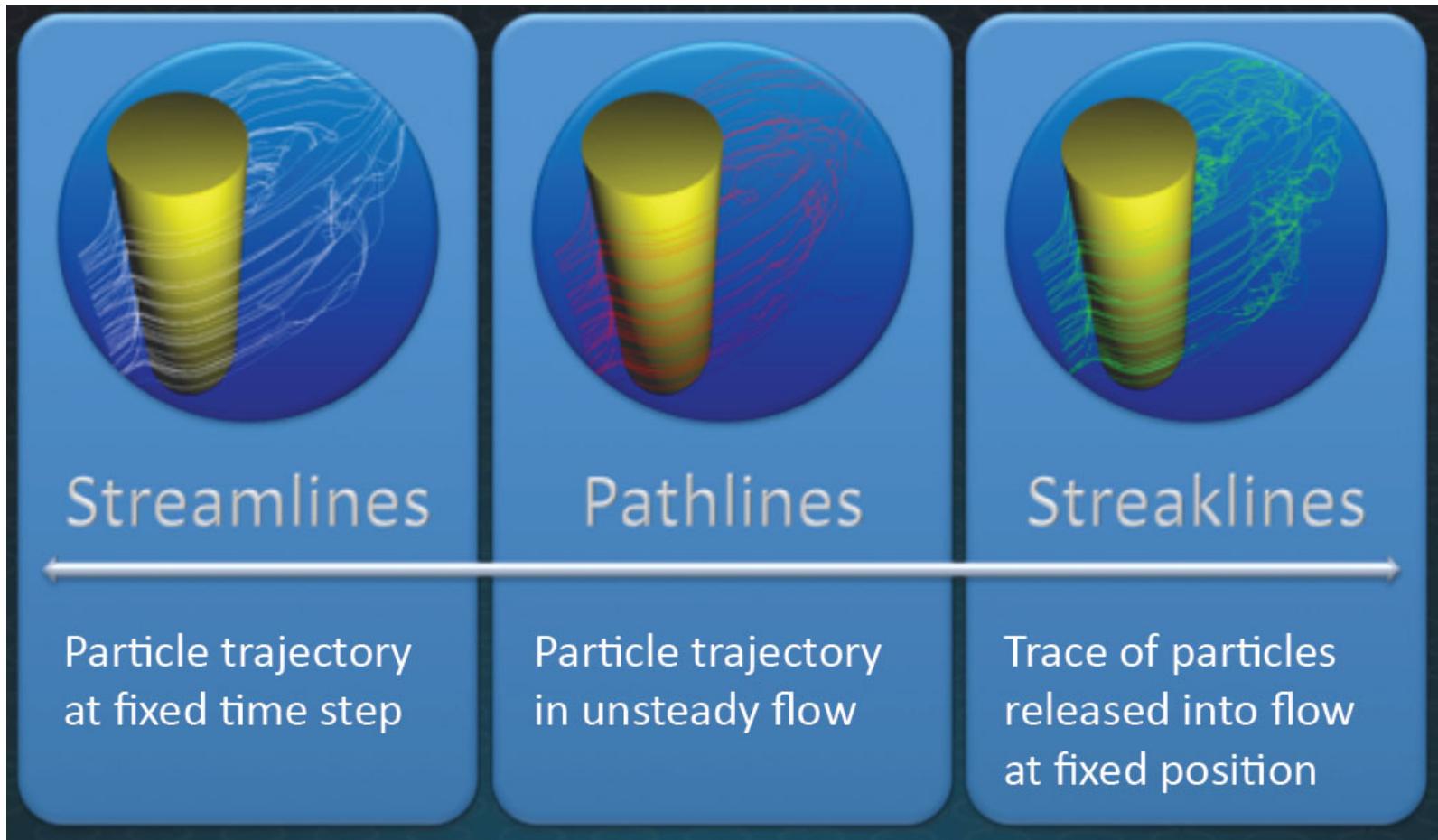
Courtesy Jens Krüger

Particle Trajectories



Courtesy Jens Krüger

Integral Curves



Streamline

- Curve parallel to the vector field in each point for a fixed time

Pathline

- Describes motion of a massless particle over time

Streakline

- Location of all particles released at a *fixed position* over time

Timeline

- Location of all particles released along a line at a *fixed time*

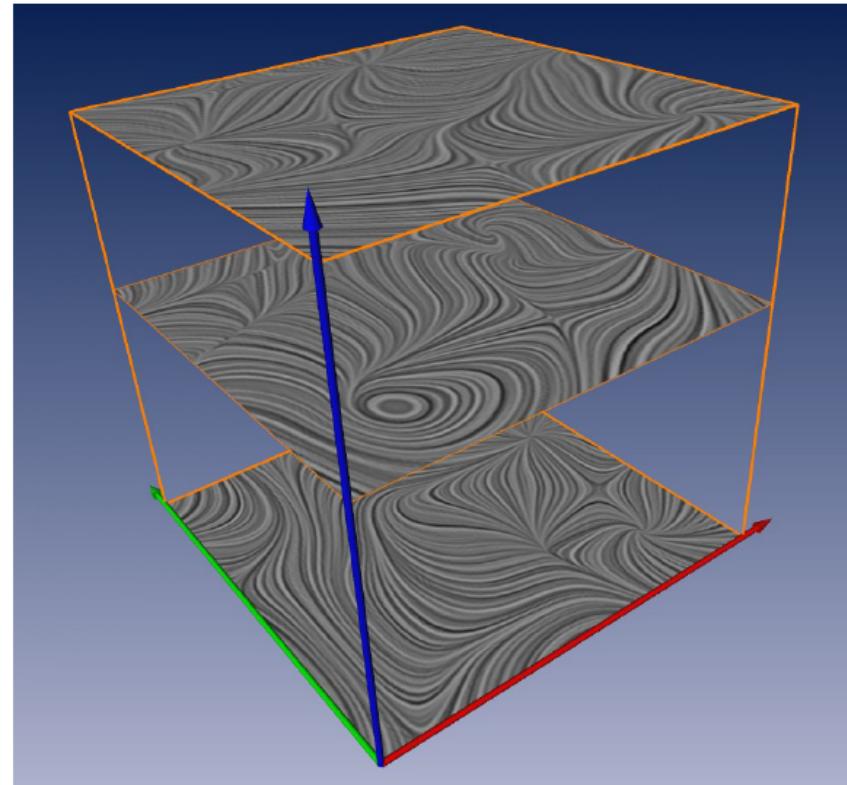
Integral Curves



Streamlines Over Time

Defined only for steady flow or for a fixed time step (of unsteady flow)

Different tangent curves in every time step for time-dependent vector fields (unsteady flow)

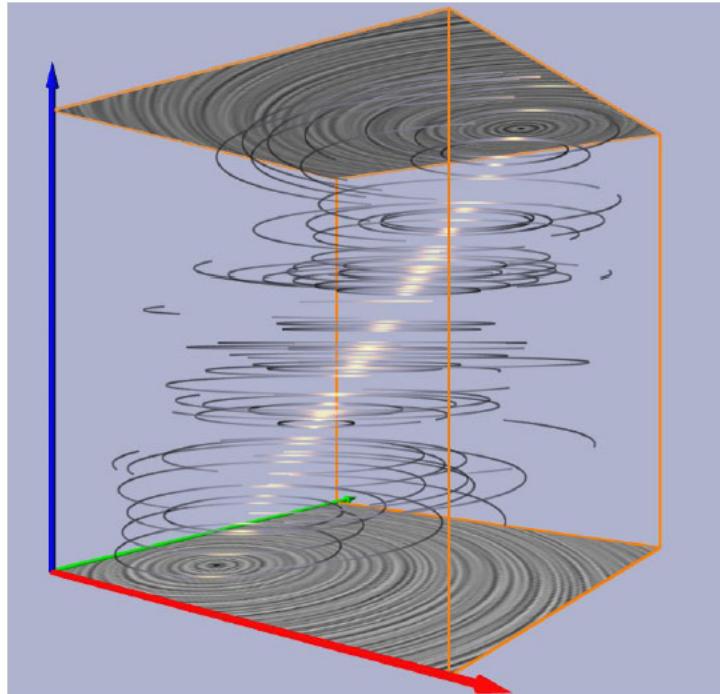


Stream Lines vs. Path Lines Viewed Over Time

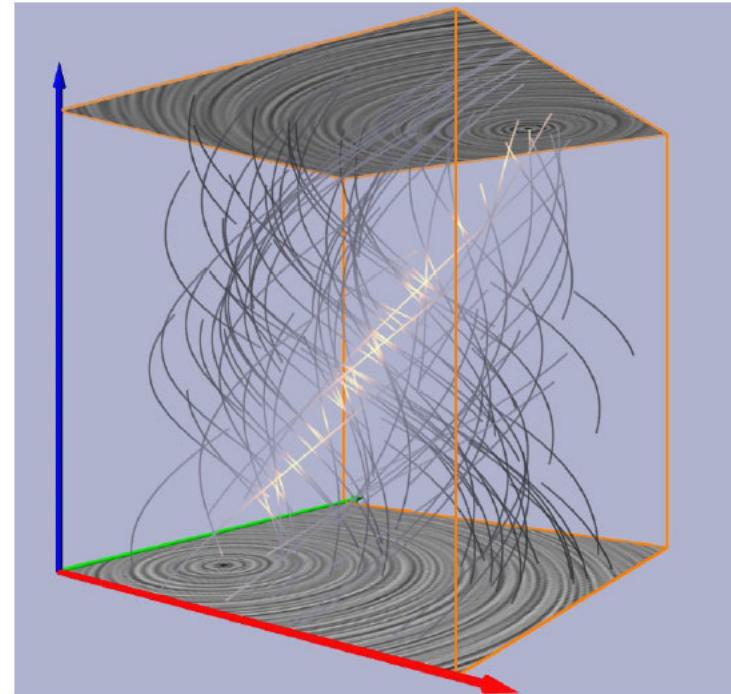


Plotted with time as third dimension

- Tangent curves to a $(n + 1)$ -dimensional vector field



Stream Lines



Path Lines

Vector fields

A static vector field $\mathbf{v}(\mathbf{x})$ is a vector-valued function of space.

A time-dependent vector field $\mathbf{v}(\mathbf{x}, t)$ depends also on time.

In the case of velocity fields, the terms steady and unsteady flow are used.

The dimensions of \mathbf{x} and \mathbf{v} are equal, often 2 or 3, and we denote components by x, y, z and u, v, w :

$$\mathbf{x} = (x, y, z), \quad \mathbf{v} = (u, v, w)$$

Sometimes a vector field is defined on a surface $\mathbf{x}(i, j)$. The vector field is then a function of parameters and time:

$$\mathbf{v}(i, j, t)$$

Vector fields as ODEs

For simplicity, the vector field is now interpreted as a **velocity** field.

Then the field $\mathbf{v}(\mathbf{x}, t)$ describes the connection between location and velocity of a (massless) particle.

It can equivalently be expressed as an **ordinary differential equation**

$$\dot{\mathbf{x}}(t) = \mathbf{v}(\mathbf{x}(t), t)$$

This ODE, together with an **initial condition**

$$\mathbf{x}(t_0) = \mathbf{x}_0 ,$$

is a so-called **initial value problem** (IVP).

Its solution is the **integral curve** (or **trajectory**)

$$\mathbf{x}(t) = \mathbf{x}_0 + \int_{t_0}^t \mathbf{v}(\mathbf{x}(\tau), \tau) d\tau$$

Vector fields as ODEs

The integral curve is a **pathline**, describing the **path** of a massless **particle** which was released at time t_0 at position x_0 .

Remark: $t < t_0$ is allowed.

For static fields, the ODE is **autonomous**:

$$\dot{\mathbf{x}}(t) = \mathbf{v}(\mathbf{x}(t))$$

and its integral curves

$$\mathbf{x}(t) = \mathbf{x}_0 + \int_{t_0}^t \mathbf{v}(\mathbf{x}(\tau)) d\tau$$

are called **field lines**, or (in the case of velocity fields) **streamlines**.

Vector fields as ODEs

In **static** vector fields, pathlines and streamlines are **identical**.

In **time-dependent** vector fields, **instantaneous streamlines** can be computed from a "snapshot" at a fixed time T (which is a static vector field)

$$\mathbf{v}_T(\mathbf{x}) = \mathbf{v}(\mathbf{x}, T)$$

In practice, time-dependent fields are often given as a dataset per time step. Each dataset is then a snapshot.

Streamline integration

Outline of algorithm for numerical streamline integration
(with obvious extension to pathlines):

Inputs:

- static vector field $\mathbf{v}(\mathbf{x})$
- seed points with time of release (\mathbf{x}_0, t_0)
- control parameters:
 - step size (temporal, spatial, or in local coordinates)
 - step count limit, time limit, etc.
 - order of integration scheme

Output:

- streamlines as "polylines", with possible attributes
(interpolated field values, time, speed, arc length, etc.)

Streamline integration

Preprocessing:

- set up search structure for point location
- for each seed point:
 - **global point location**: Given a point \mathbf{x} ,
find the cell containing \mathbf{x} and the local coordinates (ξ, η, ζ)
or if the grid is structured:
find the computational space coordinates $(i + \xi, j + \eta, k + \zeta)$
 - If \mathbf{x} is not found in a cell, remove seed point

Streamline integration

Integration loop, for each seed point \mathbf{x} :

- interpolate \mathbf{v} trilinearly to local coordinates (ξ, η, ζ)
- do an integration step, producing a new point \mathbf{x}'
- **incremental point location**: For position \mathbf{x}' find cell and local coordinates (ξ', η', ζ') making use of information (coordinates, local coordinates, cell) of old point \mathbf{x}

Termination criteria:

- grid boundary reached
- step count limit reached
- optional: velocity close to zero
- optional: time limit reached
- optional: arc length limit reached

Streamline integration

Integration step: widely used integration methods:

- **Euler** (used only in special speed-optimized techniques, e.g. GPU-based texture advection)

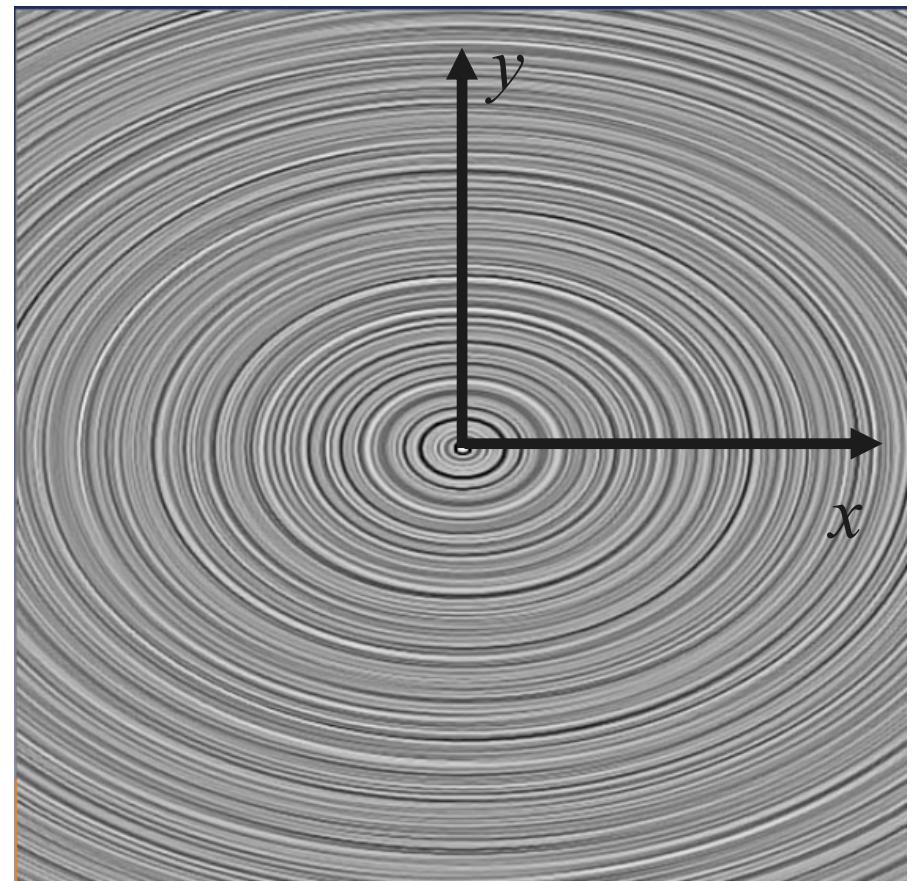
$$\mathbf{x}_{new} = \mathbf{x} + \mathbf{v}(\mathbf{x}, t) \cdot \Delta t$$

- **Runge-Kutta**, 2nd or 4th order

Higher order than 4th?

- often too slow for visualization
- study (Yeung/Pope 1987) shows that, when using standard trilinear interpolation, **interpolation errors** dominate **integration errors**.

- Numerical integration of stream lines:
- approximate streamline by polygon \mathbf{x}_i
- Testing example:
 - $\mathbf{v}(x,y) = (-y, x/2)^T$
 - exact solution: ellipses
 - starting integration from $(0,-1)$



Bonus Slides: Vectors as Derivative Operators



Vectors as Derivative Operators

A vector applied to a (real) function on the manifold gives the *directional derivative* in that direction

- From this viewpoint, the vector is a derivative operator (actually, a *derivation*)
- Can be used as *definition* of a vector (must fulfill props. of a derivation; esp. Leibniz rule)

$$f: M \rightarrow \mathbb{R}, \quad \mathbf{v} f \\ x \mapsto f(x).$$



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$$\frac{\partial}{\partial x^i} f = df \left(\frac{\partial}{\partial x^i} \right) = \frac{\partial f}{\partial x^i}$$



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$$\frac{\partial}{\partial x^i} x^j = dx^j \left(\frac{\partial}{\partial x^i} \right) = \delta_i^j$$

Kronecker delta
("identity matrix")




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For vector field: obtain directional derivative at each point

Kronecker delta
("identity matrix")

$$\mathbf{v}f: M \rightarrow \mathbb{R},$$

$$x \mapsto \mathbf{v}(x) f = df(\mathbf{v}(x)).$$

(remember that this just looks scary (maybe) ...)

Thank you.

Thanks for material

- Helwig Hauser
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