



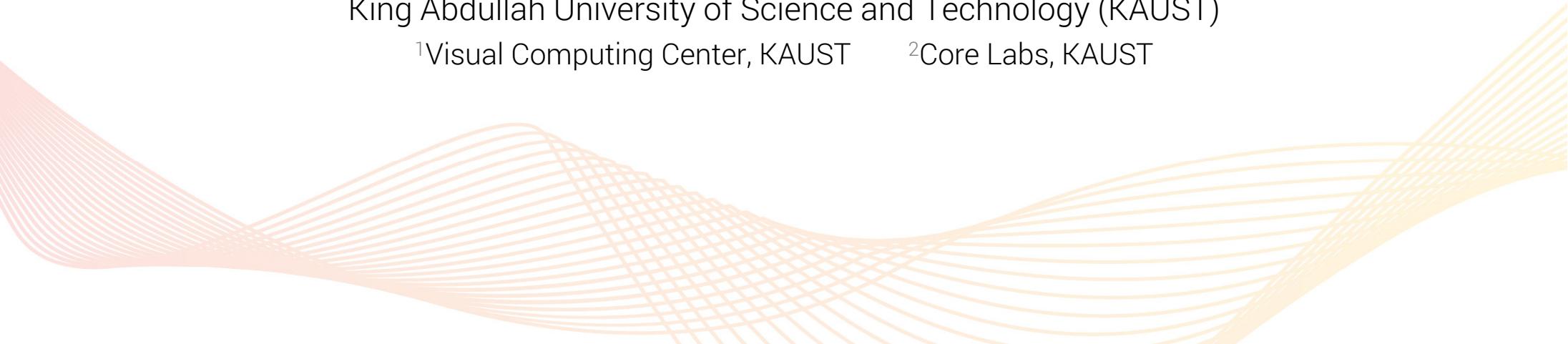
# Time-Dependent Flow seen through Approximate Observer Killing Fields

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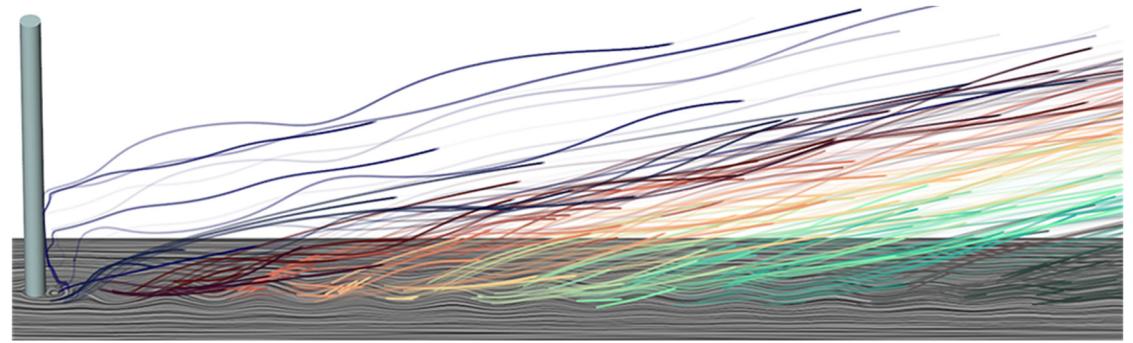


# Flow Visualization is Observer-Relative

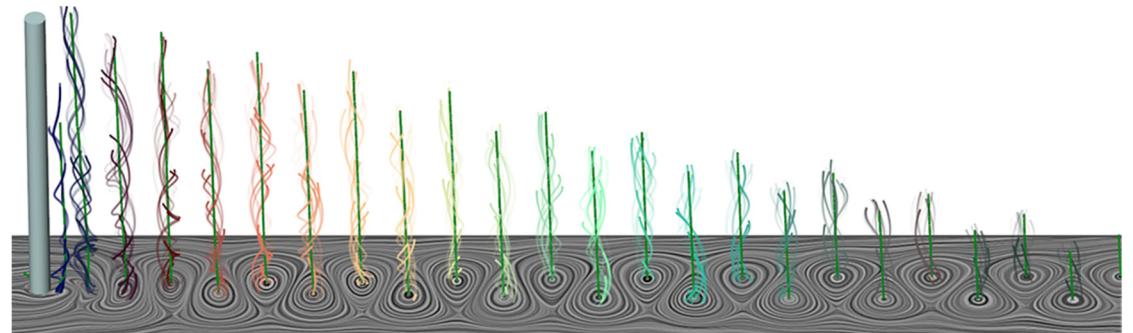
Steady vs. unsteady flow  
Flow features (vortices, ...)

One frame of reference  
cannot depict all features

Continuous observer field  
adapted to input flow



vortex street in laboratory frame

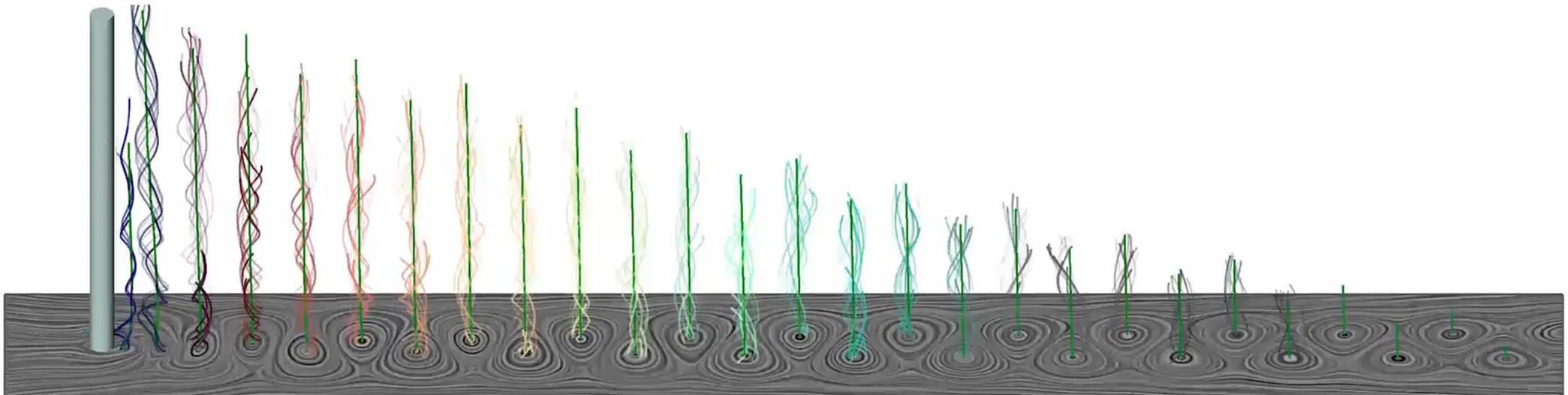
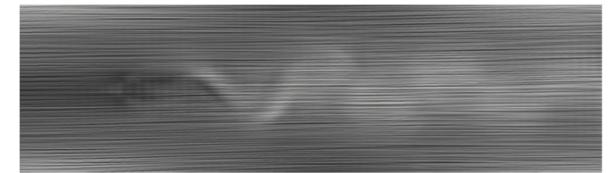


relative to approximate observer Killing field

# Mathematical Framework

Observer field from global optimization

- Carefully define desired differential properties
- Minimize them over all of space-time



# Observers and Killing Vector Fields



Wilhelm Killing (1847-1923)

# Observer Definition

Space that is in relative rigid motion

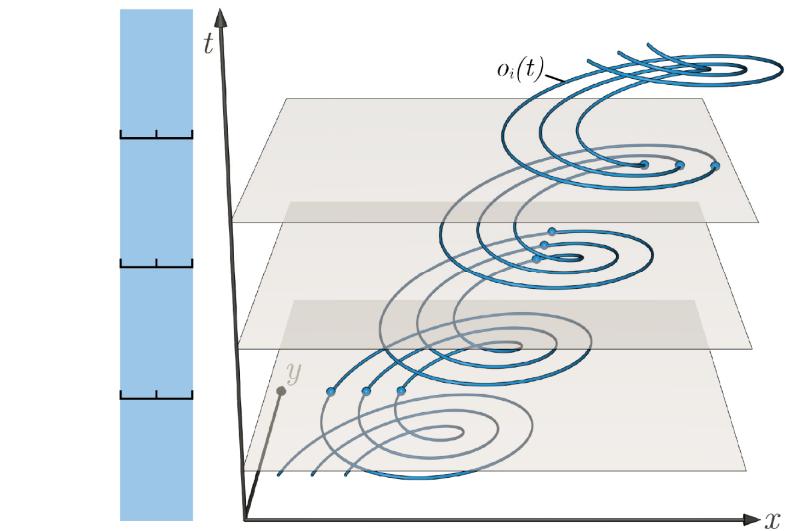
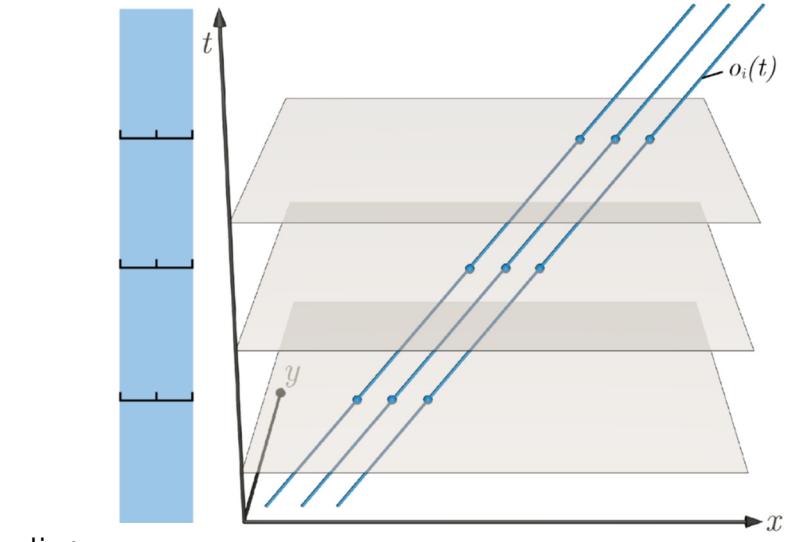
- Relative to what? Another observer

Points stay at constant distance

- Motion described by isometries
- Point trajectories are world lines

Isometries of Euclidean space

- Time-dependent translations
- Time-dependent rotations



# Describing Rigid Observer Motion

Euclidean isometries: time-dependent translations and rotations

$$c(t)$$

$$\mathbf{Q}(t)$$

Easier to work with derivatives (infinitesimal isometries)

$$\mathbf{w}(t) := \dot{c}(t)$$

$$\boldsymbol{\Omega}(t) := \dot{\mathbf{Q}}(t)\mathbf{Q}(t)^T$$

# Describing Rigid Observer Motion

Euclidean isometries: time-dependent translations and rotations

$$c(t)$$

$$\mathbf{Q}(t)$$

*Lie group*  $SO(n)$

Easier to work with derivatives (infinitesimal isometries)  
(linear!)

$$\mathbf{w}(t) := \dot{c}(t)$$

$$\boldsymbol{\Omega}(t) := \dot{\mathbf{Q}}(t)\mathbf{Q}(t)^T$$

*Lie algebra*  $\mathfrak{so}(n)$

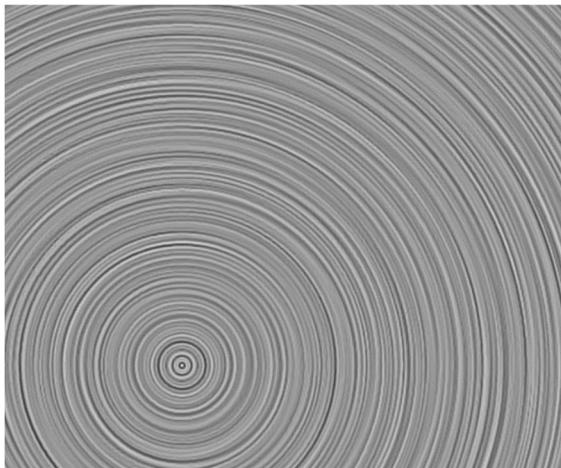
Killing fields are infinitesimal isometries (Lie algebra of isometry group)

$$\mathbf{u}(x, t) := \mathbf{w}(t) + \boldsymbol{\Omega}(t)(x - o(t))$$

# Rigid Motion as Killing Vector Field

Killing field (time-dependent)

$$\mathbf{u}(x, t) = \mathbf{w}(t) + \boldsymbol{\Omega}(t)(x - o(t))$$



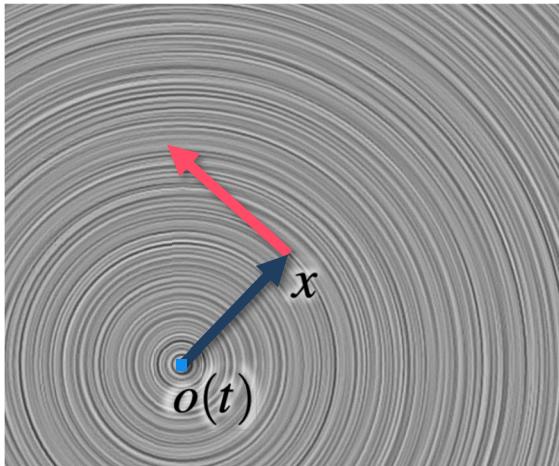
$$\begin{bmatrix} 0 & -\omega_3 & \omega_2 \\ \omega_3 & 0 & -\omega_1 \\ -\omega_2 & \omega_1 & 0 \end{bmatrix}$$

Killing's equation:  
 $\nabla \mathbf{u} + (\nabla \mathbf{u})^T = 0$

# Evaluating Killing Vector Fields

Translation corresponds to velocity of some point  $\mathbf{o}(t)$

$$\mathbf{u}(x, t) = \mathbf{u}(\mathbf{o}(t), t) + \boxed{\boldsymbol{\Omega}(t)(\mathbf{x} - \mathbf{o}(t))}$$



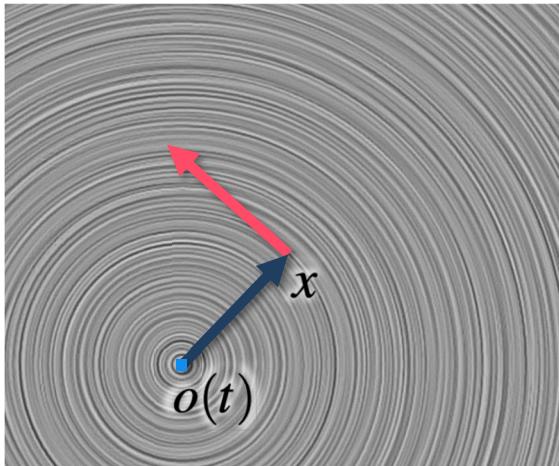
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Infinitesimal translation of  $\mathbf{o}(t)$

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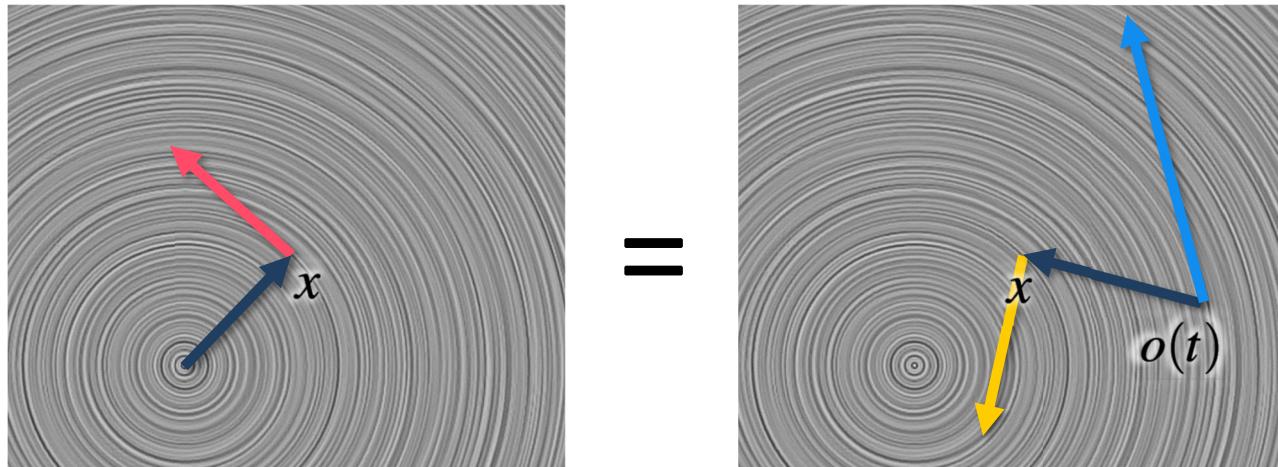
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# Killing Fields are Independent of “Origin”

Choice of  $o(t)$  is arbitrary (well-known property of Killing fields)

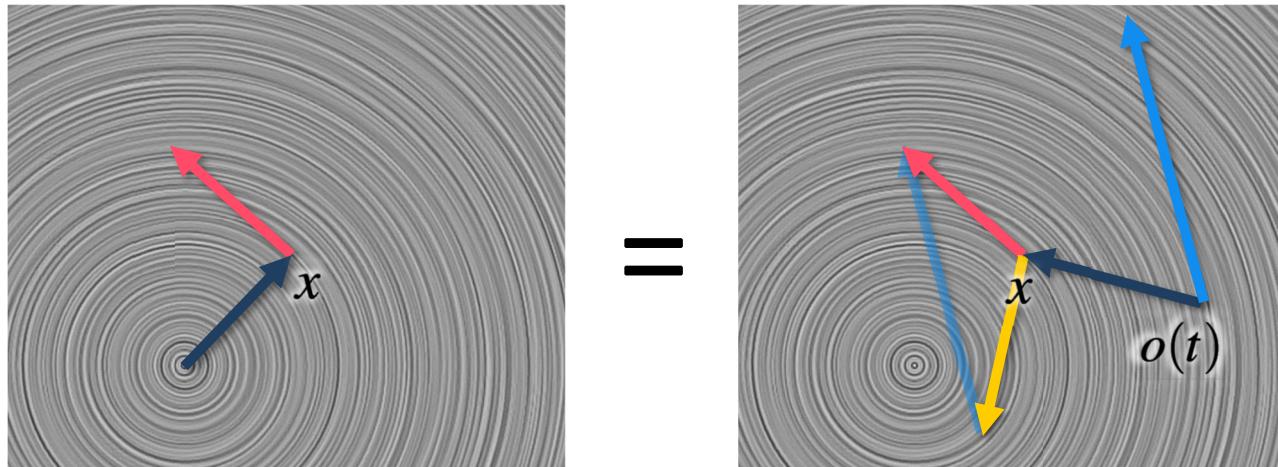
$$\mathbf{u}(x, t) = \boxed{\mathbf{u}(o(t), t)} + \boxed{\Omega(t)(x - o(t))}$$



# Killing Fields are Independent of “Origin”

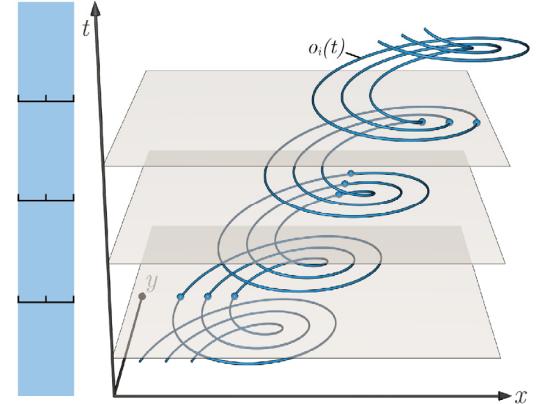
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# Observer Fields: One Observer

One Killing field describes one observer  $i$

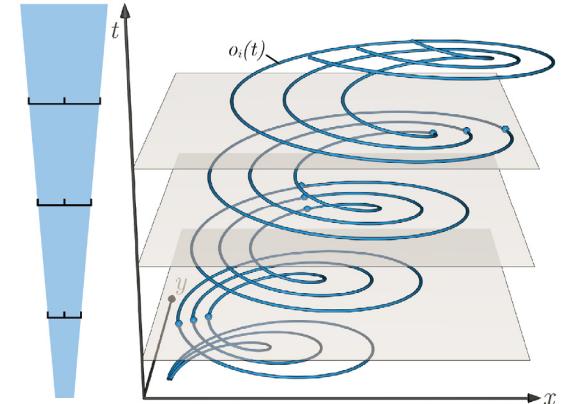


$$\mathbf{u}_i(x, t) = \boxed{\mathbf{u}_i(o_i(t), t)} + \boldsymbol{\Omega}_i(t)(x - o_i(t))$$

$\mathbf{u}_i(x, t)$  is a Killing field

# Observer Fields: Multiple Observers

Continuous observer field  $\mathbf{u}$



$$\mathbf{u}_i(x, t) := \boxed{\mathbf{u}(o_i(t), t)} + \boldsymbol{\Omega}_i(t)(x - o_i(t))$$

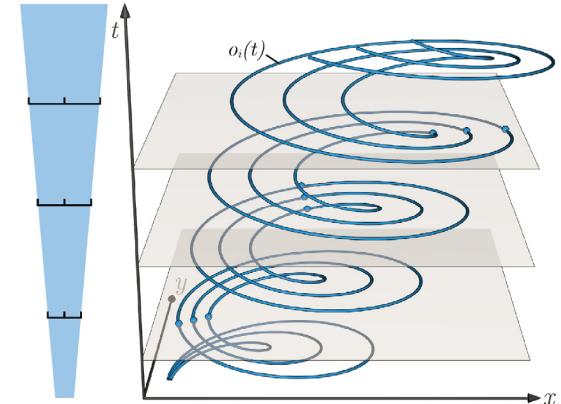
World lines  $o_i(t)$ : integral curves of  $\mathbf{u}$  and  $\boldsymbol{\Omega}_i(t) := \frac{1}{2} \left( \nabla \mathbf{u} - (\nabla \mathbf{u})^T \right) (o_i(t), t)$

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$\mathbf{u}(x, t)$  is arbitrary

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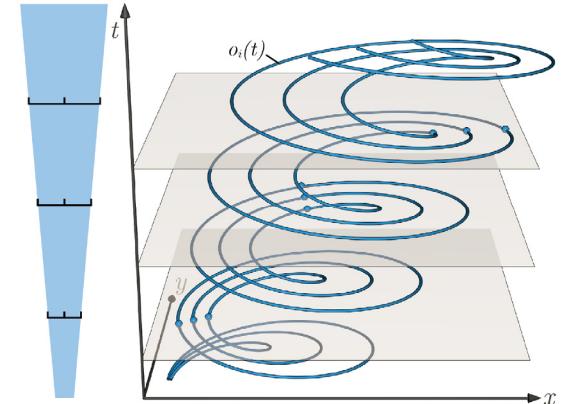
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# Approximate Observer Killing Fields

Continuous observer field  $\mathbf{u}$



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World lines  $o_i(t)$ : integral curves of  $\mathbf{u}$  and  $\boldsymbol{\Omega}_i(t) := \frac{1}{2} \left( \nabla \mathbf{u} - (\nabla \mathbf{u})^T \right) (o_i(t), t)$

Each  $\mathbf{u}_i(x, t)$  is a Killing field (one per observer)

Choose  $\mathbf{u}(x, t)$  to be an approximate Killing field:

$$\text{min. } \text{Killing energy } K\mathbf{u} := \nabla \mathbf{u} + (\nabla \mathbf{u})^T$$

# Time Derivatives

# Observed Time Derivative

Original observer:

No relative observer motion

$$\mathbf{u} = 0$$

$$\frac{\mathcal{D}}{\mathcal{D}t} \mathbf{v}_{\mathbf{u}} = \frac{\partial \mathbf{v}}{\partial t}$$

Observer field-relative time derivative

Field  $\mathbf{v}_{\mathbf{u}} = \mathbf{v} - \mathbf{u}$  as perceived by the observer field  $\mathbf{u}$

# Observed Time Derivative

Galilean observer:

Constant-velocity translation

$$\frac{\partial \mathbf{u}}{\partial t} = 0 \quad \boldsymbol{\Omega} = 0$$

$$\frac{\mathcal{D}}{\mathcal{D}t} \mathbf{v}_{\mathbf{u}} = \frac{\partial \mathbf{v}}{\partial t} + \nabla \mathbf{v}(\mathbf{u})$$

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# Observed Time Derivative

Rigid motion observer:

Exact Killing field

$$\nabla \mathbf{u} = \boldsymbol{\Omega}$$

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# Observed Time Derivative

General observer:

Arbitrary observer field

$$\frac{\mathcal{D}}{\mathcal{D}t} \mathbf{v}_{\mathbf{u}} = \frac{\partial \mathbf{v}}{\partial t} - \frac{\partial \mathbf{u}}{\partial t} + \nabla \mathbf{v}(\mathbf{u}) - \nabla \mathbf{u}(\mathbf{v})$$

Observer field-relative time derivative

Field  $\mathbf{v}_{\mathbf{u}} = \mathbf{v} - \mathbf{u}$  as perceived by the observer field  $\mathbf{u}$

# Observed Time Derivative is a Lie Derivative

General observer:

Arbitrary observer field

$$\boxed{\frac{\mathcal{D}}{\mathcal{D}t} \mathbf{v}_{\mathbf{u}} = L_{\mathbf{u}}(\mathbf{v}_{\mathbf{u}})} = \frac{\partial \mathbf{v}}{\partial t} - \frac{\partial \mathbf{u}}{\partial t} + \nabla \mathbf{v}(\mathbf{u}) - \nabla \mathbf{u}(\mathbf{v})$$

Time-dependent Lie derivative of  $\mathbf{v}_{\mathbf{u}} = \mathbf{v} - \mathbf{u}$  with respect to  $\mathbf{u}$

Important: Lie derivatives of objective vector fields are objective

# Optimization

# Approximate Observer Killing Fields

Global  $L_2$  minimization over space and time (sparse linear system)

$$\min_{\mathbf{u}} \int_{\tau, \xi} (E_K + \lambda D_t + \mu R)(\mathbf{u}, \xi, \tau) d\xi d\tau$$

Goals: approximately Killing, small observed time derivative

$$E_K(\mathbf{u}, \xi, \tau) := \frac{1}{2} \| K\mathbf{u}(\xi, \tau) \|_F^2$$

$$D_t(\mathbf{u}, \xi, \tau) := \frac{1}{2} \left\| \frac{\mathcal{D}}{\mathcal{D}t} \mathbf{v}_{\mathbf{u}}(\xi, \tau) \right\|_2^2.$$

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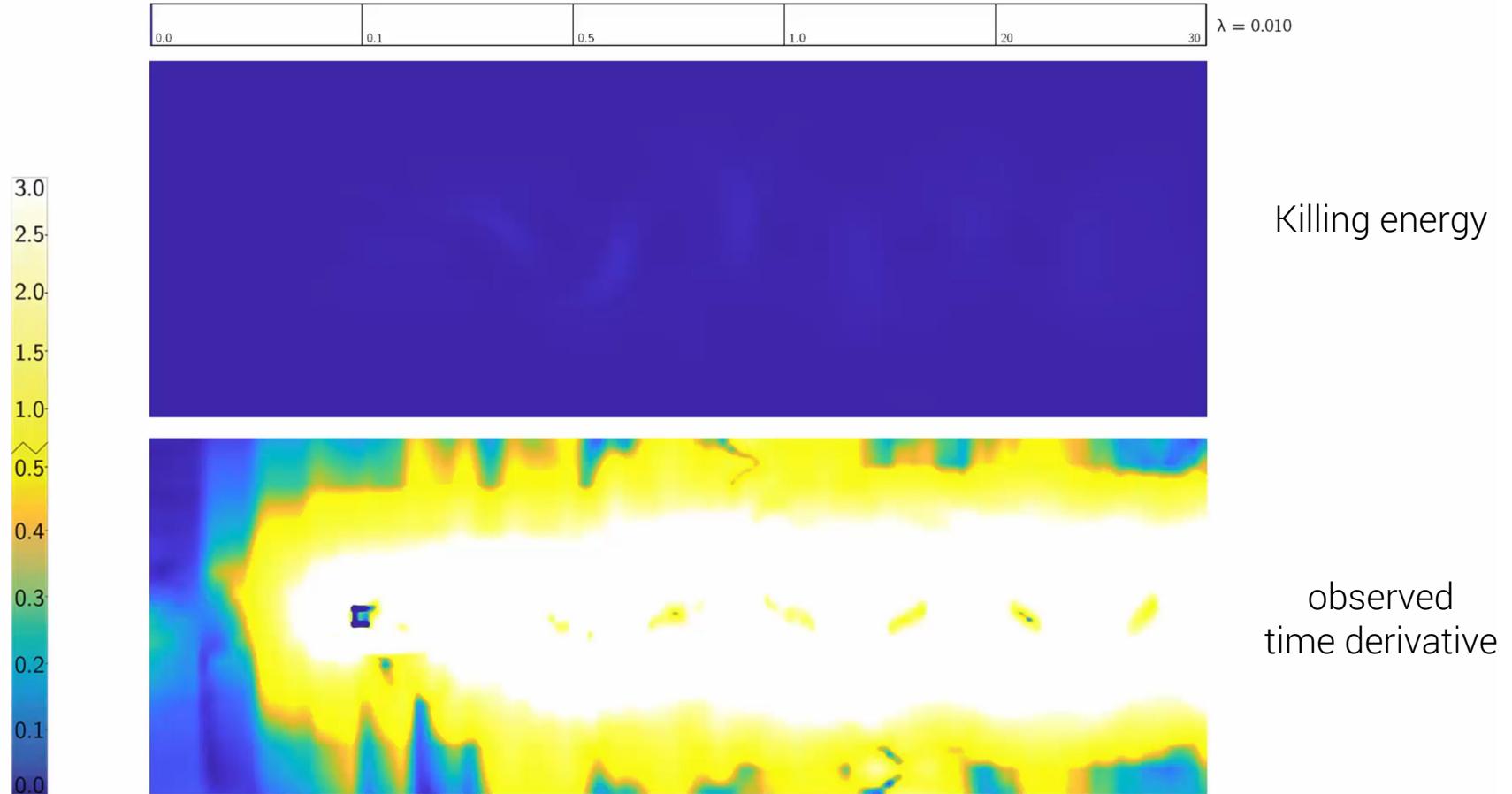
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$$\text{regularizer } R(\mathbf{u}, \xi, \tau) := \frac{1}{2} \| \mathbf{v}_{\mathbf{u}}(\xi, \tau) \|_2^2$$

# Approximate Observer Killing Fields

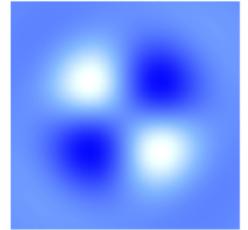
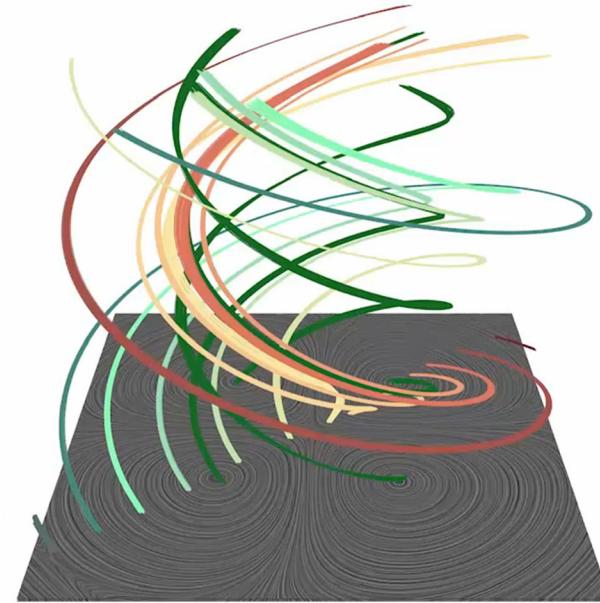
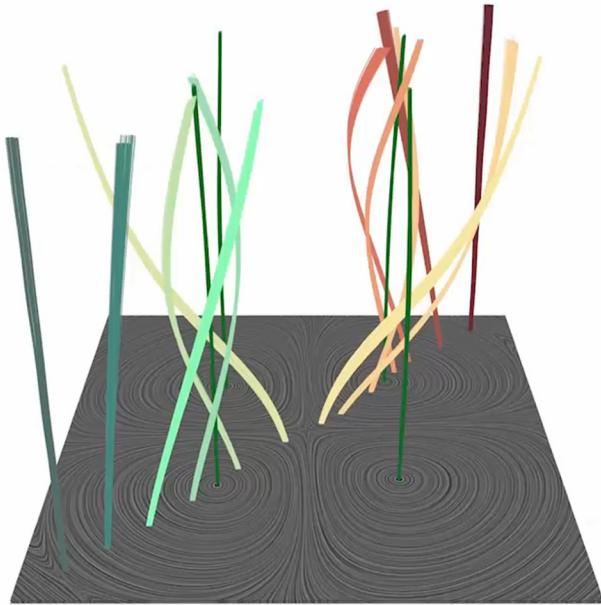


# Visualization

# Visualization Using Observer Fields



vorticity

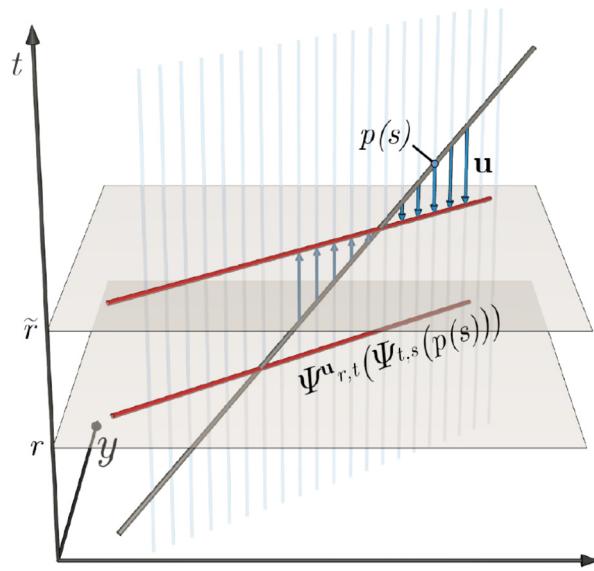


vorticity

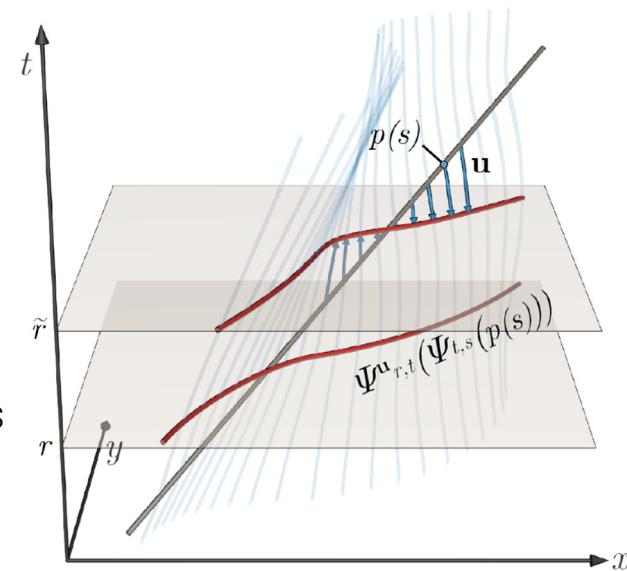
Visualization depends on chosen observation time

# Visualization Using Observer Fields

Generalize stream/path/streak/time lines to observed variants  
Can transform the input field according to observer field



different observation times



# Conclusions

One observer velocity field: Infinite set of reference frames

Observed time derivative (Lie derivative)

Global optimization: Approximately Killing, as steady as possible

Observer field-relative visualization

- Must choose observation time
- Can compute observation time field

Observed flow field is objective

- Objective flow features (direct computation or in observation time field)

# Thank You!

Visit us at [vccvisualization.org](http://vccvisualization.org)



MATLAB code on github!

