

# Mathematical relations between LCS detection methods

## SIAM Conference on Applications of Dynamical Systems

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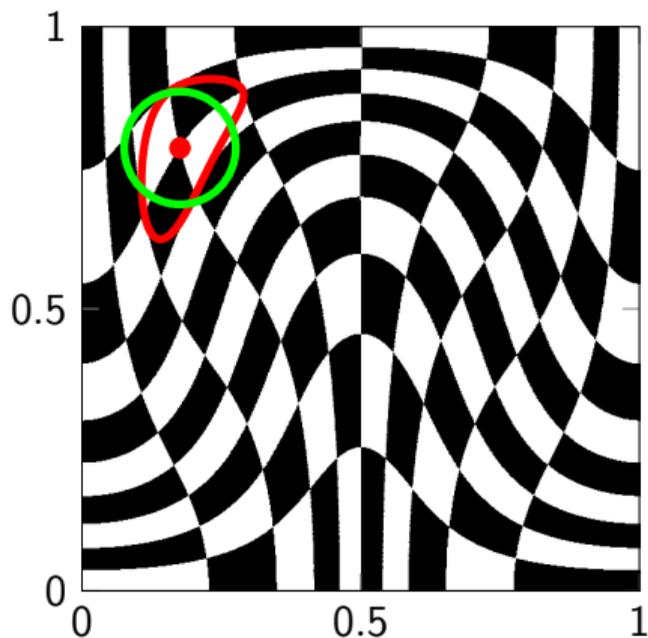
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Fokker–Planck equation (**FPE**) (Eulerian/spatial evolution equation):

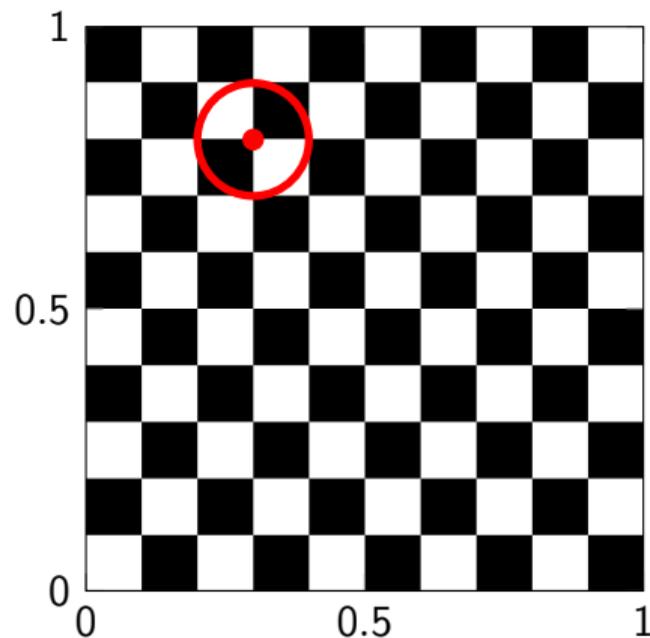
$$\partial_t u + \operatorname{div}(u \cdot v) = \varepsilon \Delta_g u$$

- ▶ **transport**/advection along velocity field  $v$
- ▶ **mixing**/diffusion according to spatial geometry/distances modeled by metric  $g$

## Changing perspectives: looking from the material



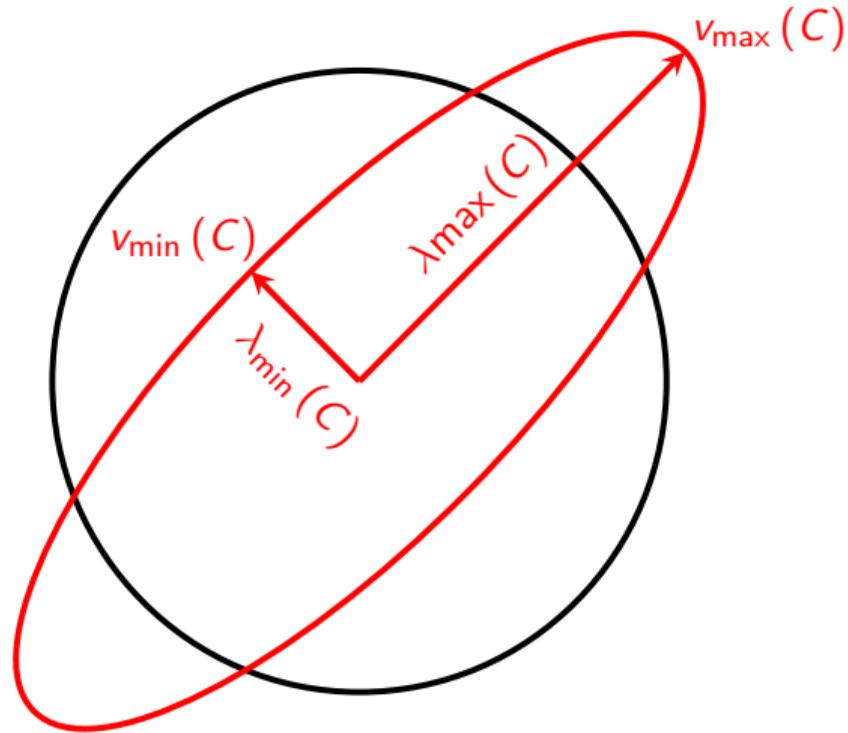
Pullback material geometry



Spatial geometry

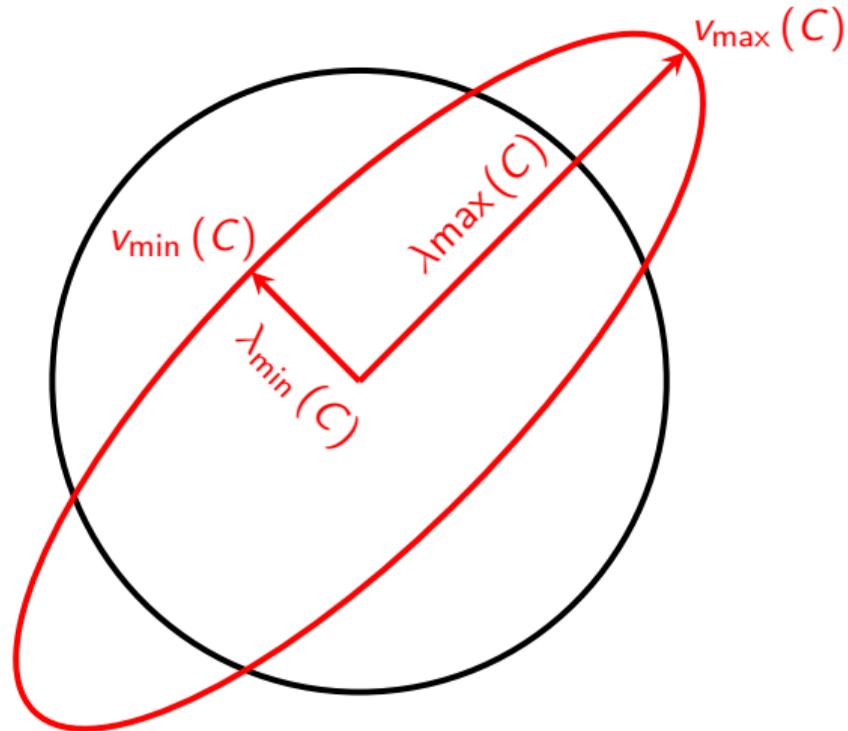
## Pullback geometry: stretching and diffusivity

- ▶ length measurement via Cauchy–Green strain tensor  $C$



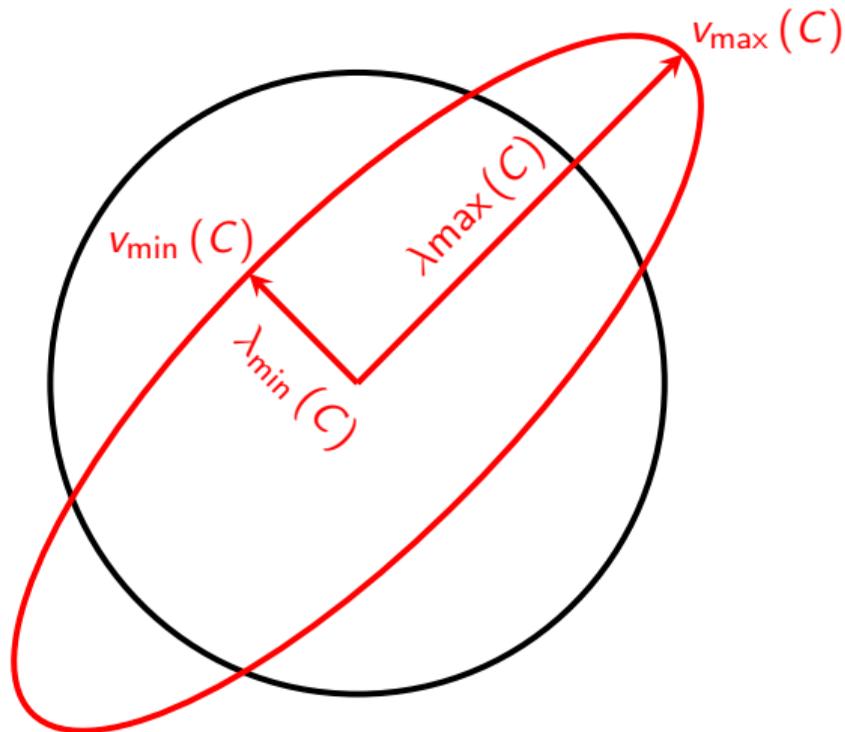
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- ▶ length measurement via Cauchy–Green strain tensor  $C$
- ▶ directional diffusivity via inverse CG strain tensor  $C^{-1}$
- ▶ strong stretching  $\iff$  weak Lagrangian diffusion
- ▶ strong compression  $\iff$  strong Lagrangian diffusion
- ▶ diffusion in Lagrangian coordinates is **anisotropic**



## Black hole vortex approach Haller & Beron-Vera 2012, 2013

Seek closed curves  $\gamma$ , parametrized by  $r$ , that stationarize averaged tangential strain

$$\delta Q(\gamma) \stackrel{!}{=} 0, \quad Q(\gamma) = \frac{1}{|\gamma|} \int_{\gamma} \sqrt{\frac{\langle r', Cr' \rangle}{\langle r', r' \rangle}} = \frac{1}{|\gamma|} \int_{\gamma} \frac{\|DF \cdot r'\|}{\|r'\|}$$

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If, as often observed “around” vortices,  $\lambda_{\max}(C) \gg 1$ , then  $\lambda_{\min}(C) \ll 1$  and

$$r' \gg v_{\min}(C), \quad \text{or equivalently} \quad \gamma^{\perp} \gg v_{\max}(C)$$

Black hole vortices admit very small (Lagrangian) cross-diffusivity.

## Lagrangian model of advection–diffusion

Eulerian:

$$\partial_t u + \operatorname{div}(u \cdot v) = \varepsilon \Delta_g u$$

Equivalent Lagrangian FPE (material evolution equation) [Thiffeault 2003]

$$\partial_t w = \varepsilon \Delta_{g(t)} w$$

$g(t) := \Phi(t)^* g = C$ —pullback metric, CG strain tensor,  $\left. \begin{array}{l} \Delta_{g(t)}$ —Laplace–Beltrami operator. \end{array} \right\} \Rightarrow evolving (material) manifold

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### Definition (Lagrangian Coherent Structures)

maximal material sets with **minimal diffusive flux**, or, **metastable/almost-invariant sets** under Lagrangian FPE

## The dynamic Laplacian as a proxy for $\Delta_{g(t)}$

Lagrangian FPE: time-dependent & anisotropic diffusion(-only) equation

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**Possible simplification:** Autonomize  $t \mapsto \Delta_{g(t)}$  by time-averaging

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**Lemma** ( Froyland 2015, DK & Keller 2016, Froyland & Kwok 2016 )

$\bar{\Delta}$  is an elliptic, nonpositive, selfadjoint, 2nd-order differential operator.

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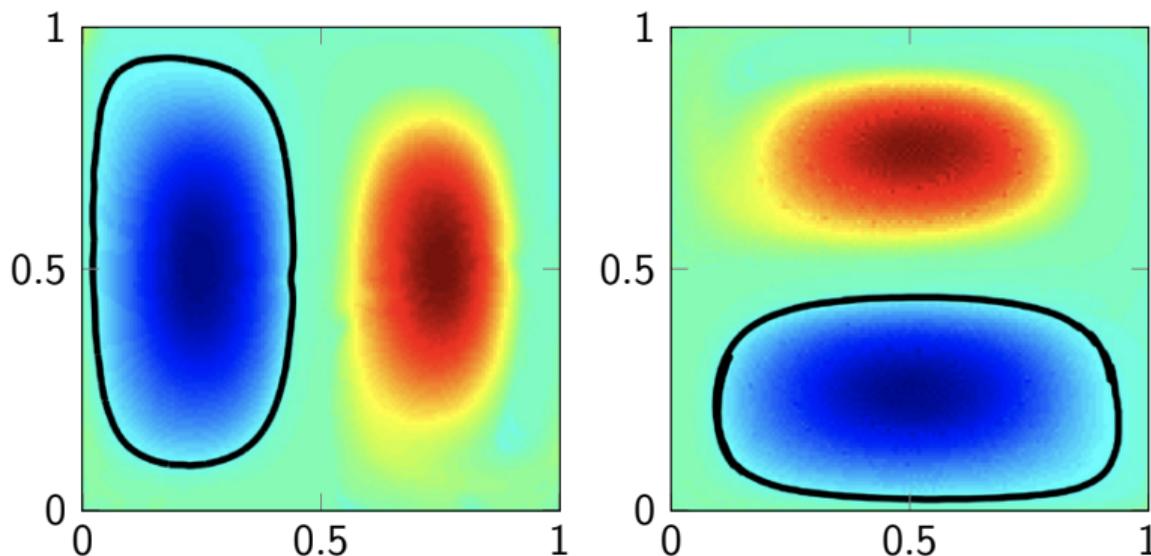
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**Theorem** (spectral convergence to probabilistic transfer operator  $\mathcal{L}_\varepsilon$ , DK & Keller 2016)

$$\mathcal{L}_\varepsilon^* \mathcal{L}_\varepsilon = I + c\varepsilon^2 \bar{\Delta} + \mathcal{O}(\varepsilon^4)$$

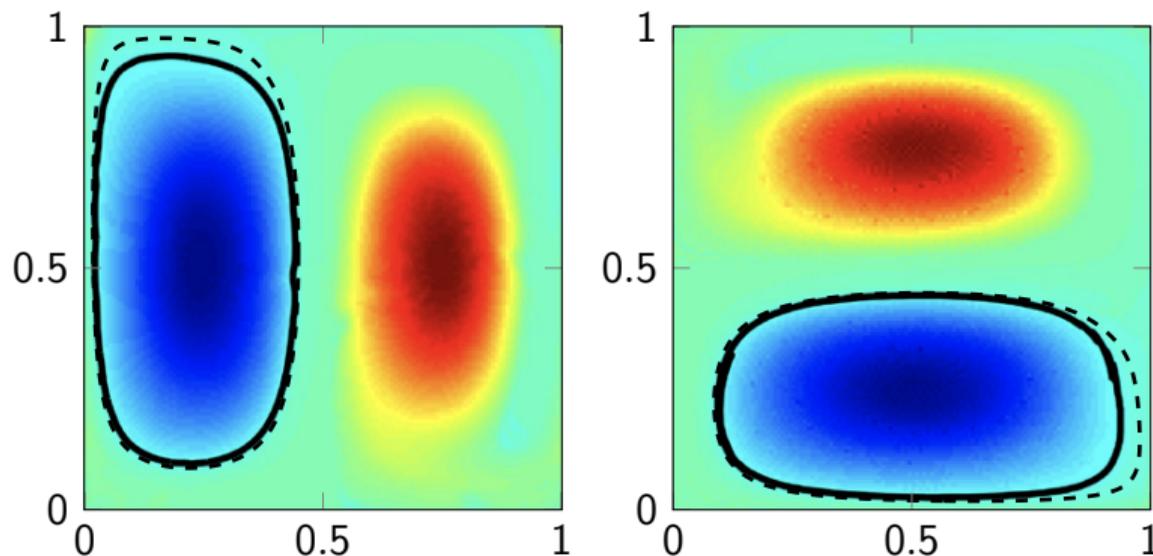
## Small example: transient double gyre [Mosovsky & Meiss, 2011], figure courtesy of [Froyland, *Nonlinearity*, 2015]



solid: level set of 2nd eigenfunction of dynamic Laplacian, minimizing  $h^D(\Gamma) = 8.2$



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solid: level set of 2nd eigenfunction of dynamic Laplacian, minimizing

dashed: outermost closed  $\lambda$ -line

$$h^D(\Gamma) = 8.2$$

$$h^D(\Gamma) = 6.7$$



# Lagrangian heat flow, initialized within coherent structure

Cylinder flow [Froyland et al., 2010]

# Lagrangian heat flow, initialized within mixing region

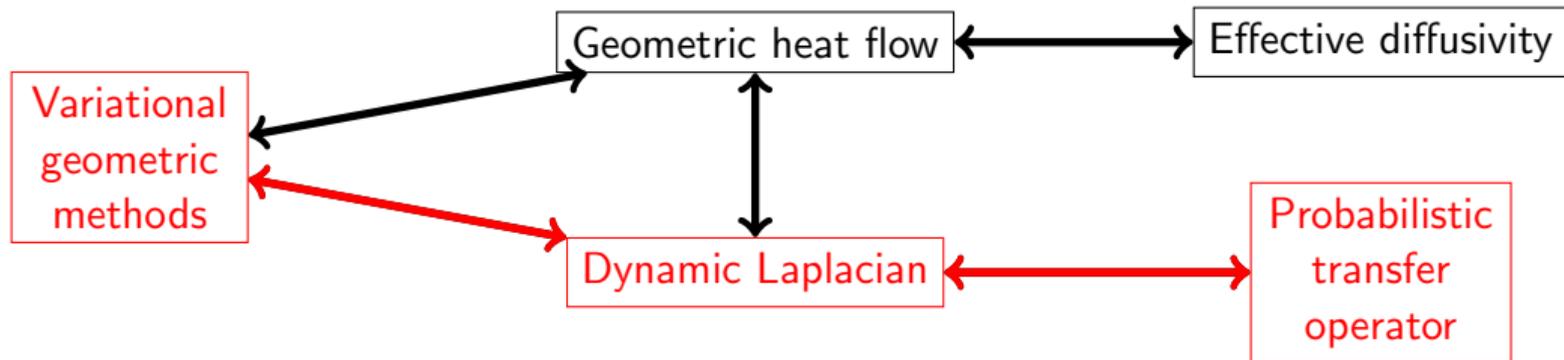
Animation 1000 times slower than previous one!

## Conclusions

- ▶ math. advection-diffusion-based relation b/w BH vortices and probabilistic TO
- ▶ within this framework strongly related objectives: minimizing Lagr. cross-diffusion
- ▶ discretization and implementation details may matter

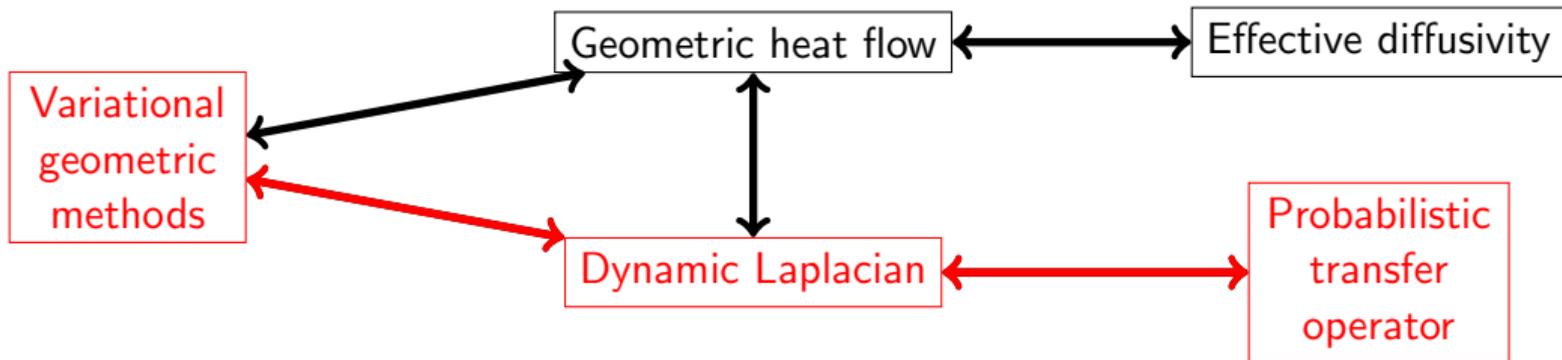
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D. Karrasch and J. Keller, *preprint*, 2016, available on ResearchGate & arXiv.