Tangential collapse

Tutorial 3: Shadows and tangential collapse

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joint with Jonathan Mattingly (Duke) Do Tran (Deutsche Bank (was: Göttingen)) http://arxiv.org/abs/2311.09455 09454 09453 09451

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Radial transport

Tangential collapse



- 1. Shadows
- 2. Fréchet means and log maps
- 3. Radial transport
- 4. Tangential collapse

<u>Shadows</u>

Def. $S_{\bar{\mu}}M$ = unit sphere in $T_{\bar{\mu}}M$ has metric **d**_s. Vectors $U, V \in S_{\bar{\mu}}M$ have

- angle $\angle(U, V) = \begin{cases} \mathbf{d}_s(U, V) & \text{if } < \pi \\ \pi & \text{otherwise} \end{cases}$
- angular pairing $\langle U, V \rangle_{\bar{\mu}} = \|U\| \|V\| \cos(\angle(U, V)).$

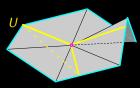
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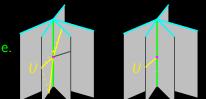
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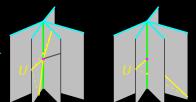
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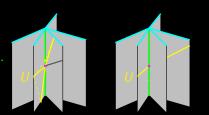
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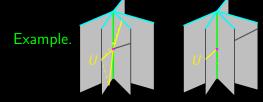
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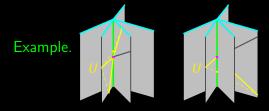
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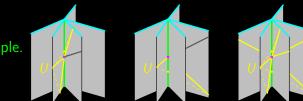
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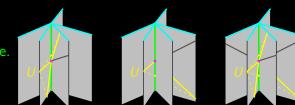
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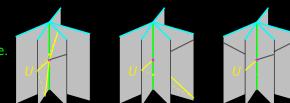
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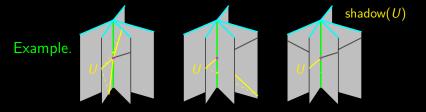
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$$\mathcal{F}_{\mu}(y) = rac{1}{2} \int_{\mathcal{M}} d(x,y)^2 \mu(dx) \uparrow$$

and Fréchet mean $\bar{\mu} = \underset{y \in M}{\operatorname{argmin}} F_{\mu}(y).$

Prop. *M* is CAT(κ) \Rightarrow *M* has tangent spaces (cones) Def. The logarithm map is $\log_{\bar{u}}: M \to T_{\bar{u}}M$

 $x\mapsto d(\bar{\mu},x)V,$

where V = unit tangent to geodesic from $\bar{\mu}$ to x.

Note. *M* singular at $\bar{\mu} \Leftrightarrow T_{\bar{\mu}}M \not\cong \mathbb{R}^d$

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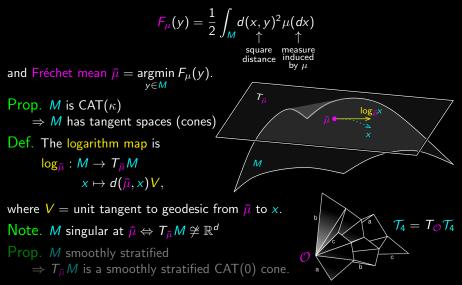
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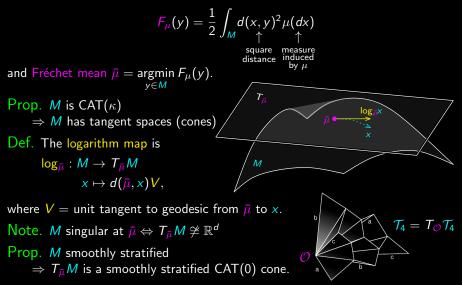
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$$Z = \log_{\mathcal{O}} z \in T_{\mathcal{O}} \mathcal{X}$$

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$$q \in [\mathcal{O}, z]$$

•
$$q' \in (\mathcal{O}, z]$$

Then radial transport $T_q \mathcal{X} \to T_{q'} \mathcal{X}$ is isometry if $q \neq \mathcal{O}$.

Idea. Z points out of stratum containing \mathcal{O} $\Rightarrow \underline{q} \in (\mathcal{O}, z]$ is strictly less singular than \mathcal{O} $\Rightarrow \overline{T}_{Z} \mathcal{X}$ is strictly less singular than \mathcal{X}

Def [Mattingly, M-, Tran & Barden, Le]. The limit tangent cone along Z is

$$\overrightarrow{T}_{Z}\mathcal{X} = \varinjlim_{q \in (\mathcal{O}, z]} T_{q}\mathcal{X}$$

The limit log map along Z is induced by $T_{\mathcal{O}}\mathcal{X} \to T_q\mathcal{X}$ for any $q \in (\mathcal{O}, z]$: $\mathcal{L}_Z : T_{\mathcal{O}}\mathcal{X} \to \vec{T}_Z\mathcal{X}$

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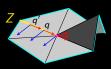
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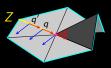
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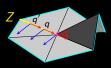
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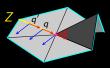
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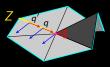
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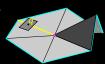
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Tangential collapse

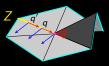
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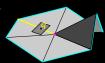
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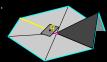
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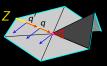
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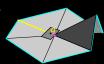
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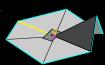
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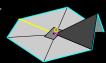
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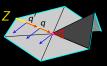
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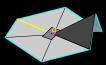
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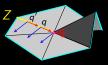
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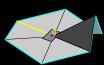
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Def. Localized μ on smoothly stratified M has fluctuating cone

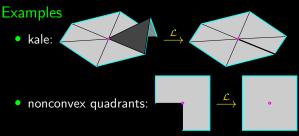
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Lemma. Adding mass to μ can only cause $\bar{\mu}$ to move into C_{μ}

Thm [Mattingly, M-, Tran 2023]. M smoothly stratified \Rightarrow some sequence of limit log maps, followed by convex projection to the relevant smooth stratum, is a tangential collapse: a continuous map $\mathcal{L}: T_{\bar{\mu}}M \to \mathbb{R}^m$ that is

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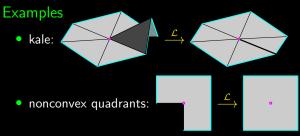
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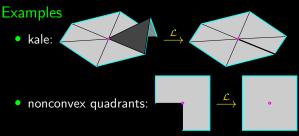
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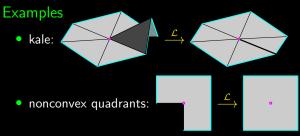
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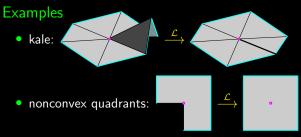
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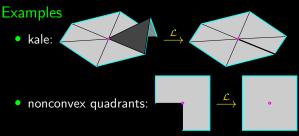
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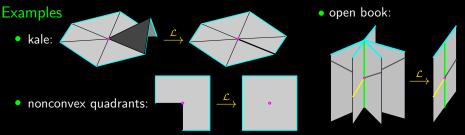
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