

# Multi-parameter hierarchical clustering and beyond

Alexander Rolle

Institute of Geometry, TU Graz, Austria

## Introduction

- Multi-parameter hierarchical clustering was first introduced by Carlsson–Mémoli [CM10].
- In many applications, the goal is to understand clustering structure across a range of distance scales and density thresholds

### Kernel density bifiltration

- Introduced in [RS20], generalizes the degree-Rips bifiltration [LW15].
- Filters a metric probability space according to density estimates computed for all choices of bandwidth parameter.
- Satisfies a stability theorem.

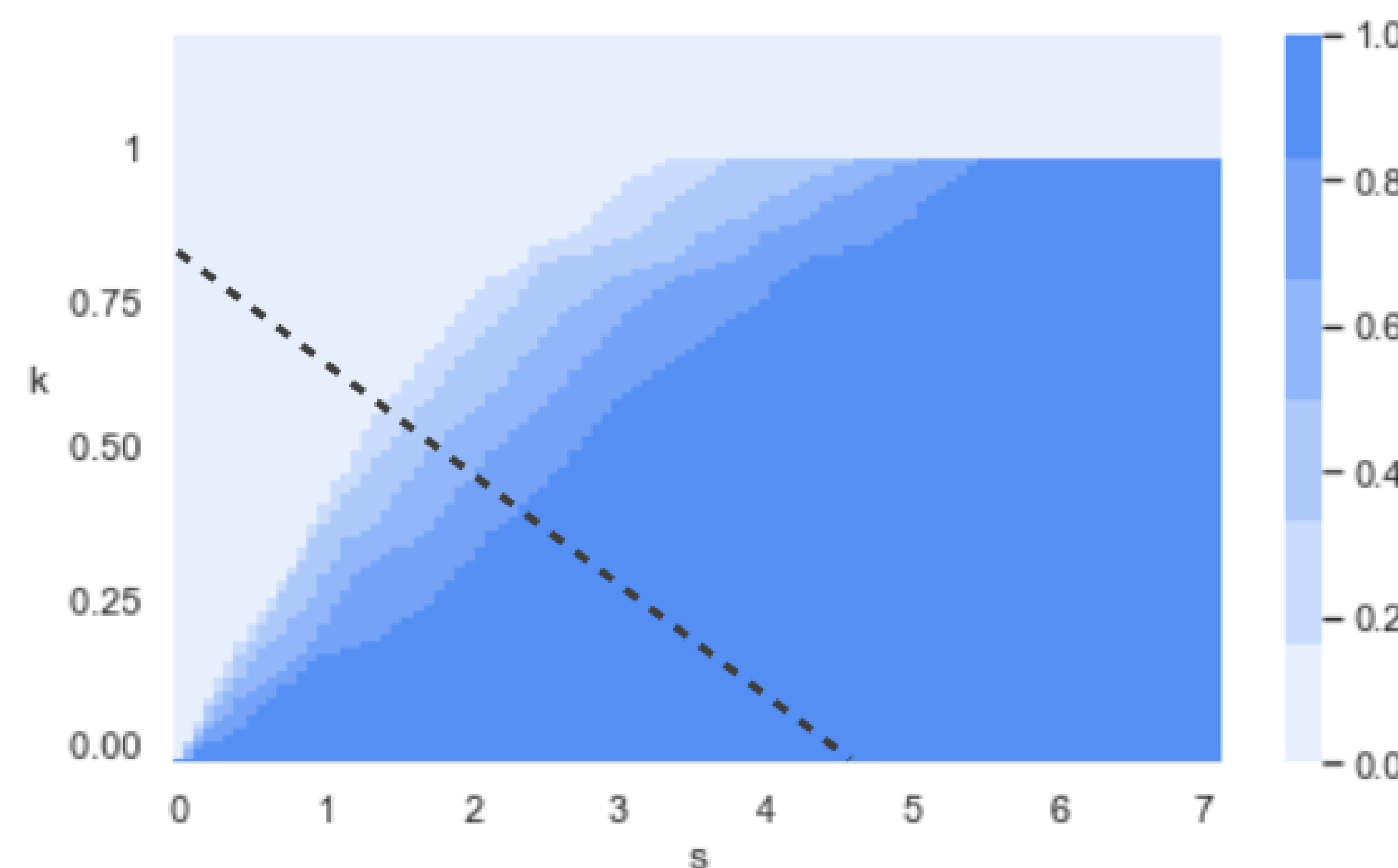
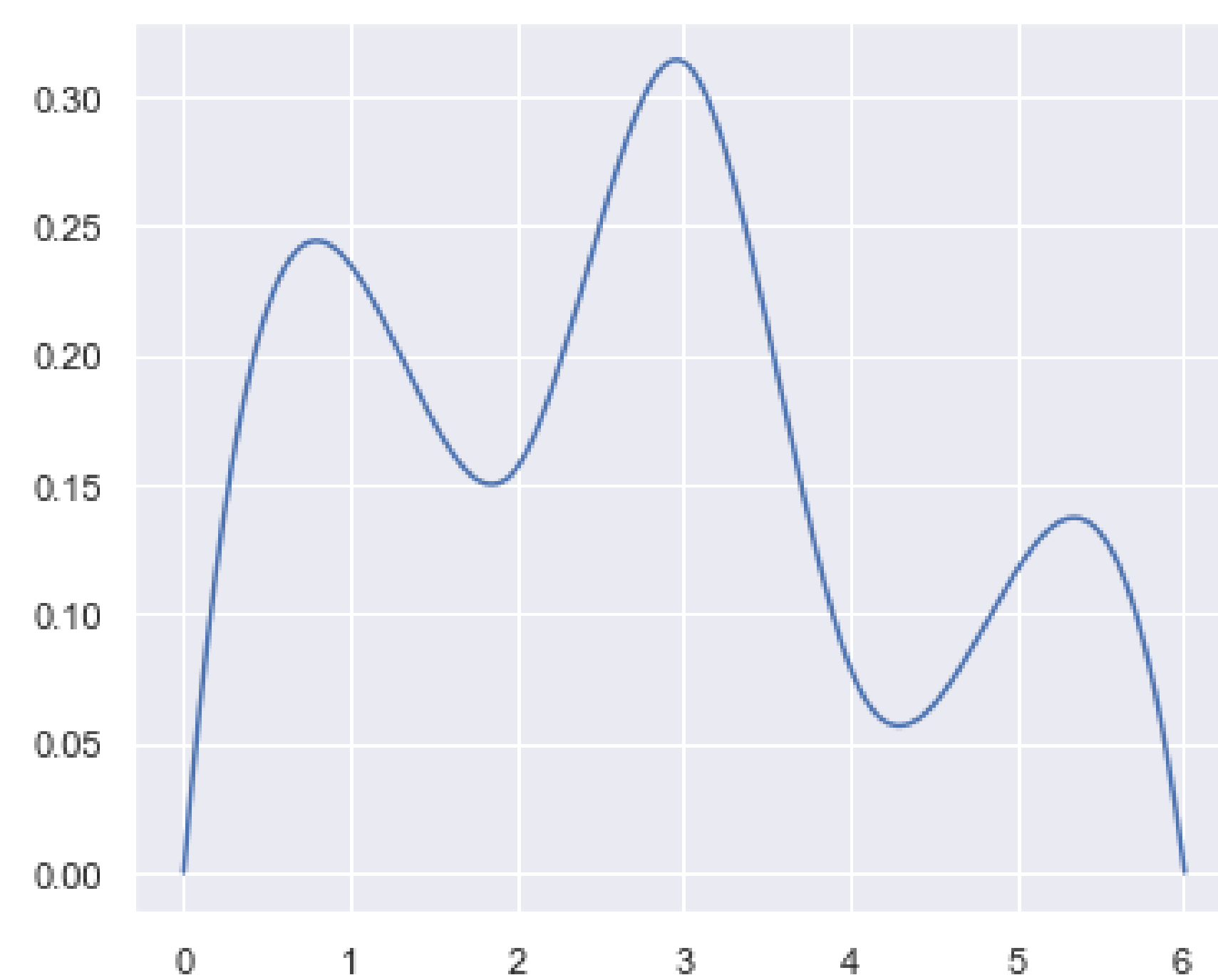


Figure: A density function  $f$  on the real line, and a heat map representing the kernel density bifiltration of the support of  $f$ . The dashed line is a choice of one-parameter slice.

## Density-based clustering

- If  $f$  is a density function, define the *density-contour hierarchical clustering* by taking connected components of super-level sets.
- Density-based clustering is the problem of approximating this, given finite samples.
- By applying single-linkage to the kernel density bifiltration, and taking one-parameter slices, we obtain an approach to density-based clustering.
- Inherits a stability theorem.

## Density estimation

- Density estimation is the problem of approximating the density function  $f$  itself.
- There is a related approach to density estimation.
- There is no longer any invariant from topology, like  $H_0$  or  $\pi_0$ , in this application.

### Future directions

- Tools from multi-parameter persistence can be used to avoid fixing distance scales or density thresholds.
- Such parameters appear in many geometrically motivated algorithms in data analysis: where else can these tools be applied?

### Acknowledgments

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### References

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