

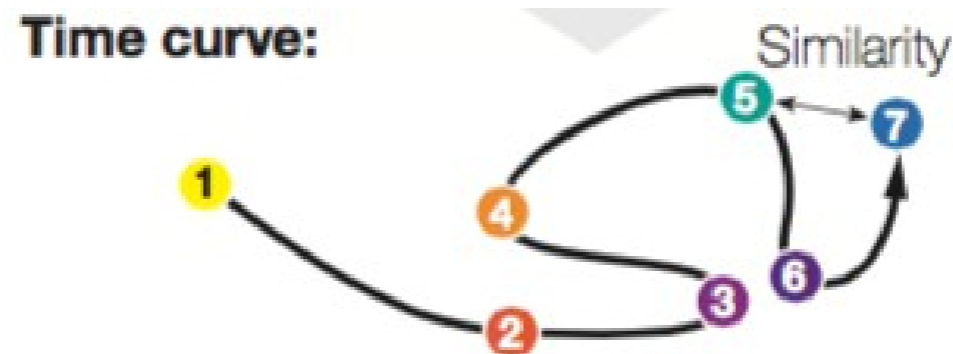
Time Curves: Folding Time to Visualize Patterns of Temporal Evolution in Data

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The temporal ordering of data cases is preserved.
Spatial proximity now indicates similarity.

From TVCG 2015

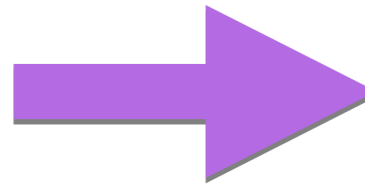
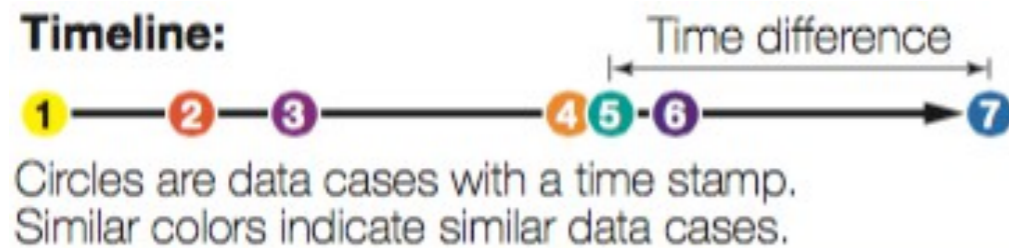
Present by Jianhui (Jimmy) Chen

CPSC 547 InfoVis

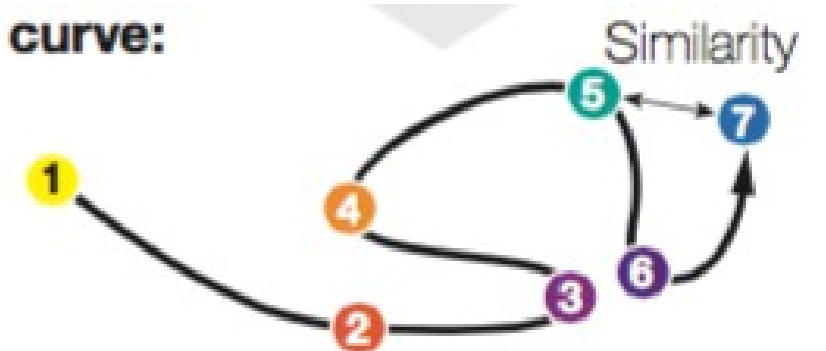
Overview

Data: 7 versions of a Wiki article
Task: explore document history

Timeline:



Time curve:



The temporal ordering of data cases is preserved.
Spatial proximity now indicates similarity.

Pattern: after 4, 5, the article comes back to 3 at 6

Encoding channels: shape, colour

Outline

What

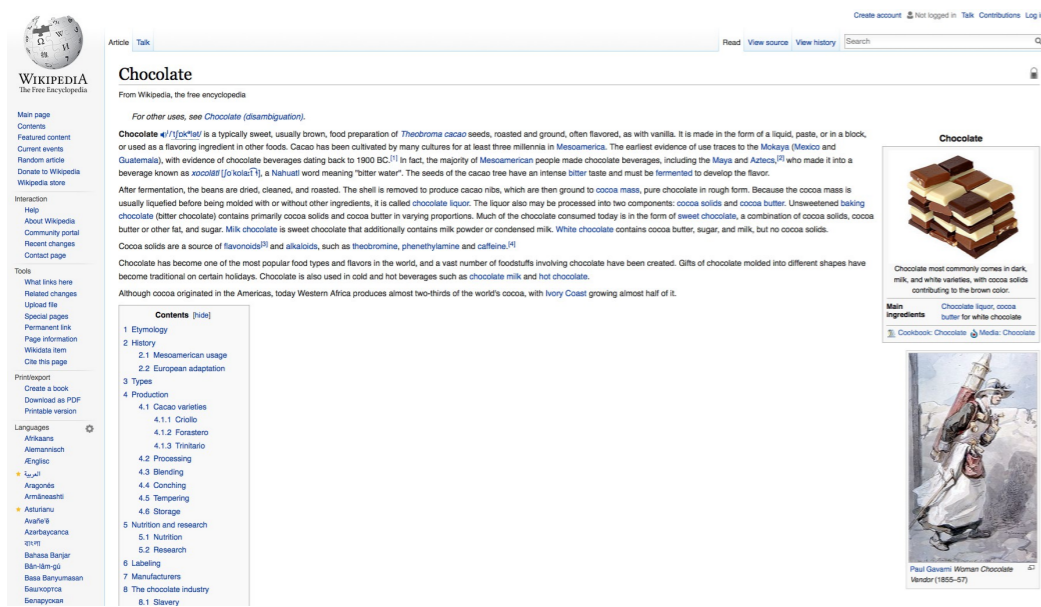
Why

How

Validation

What

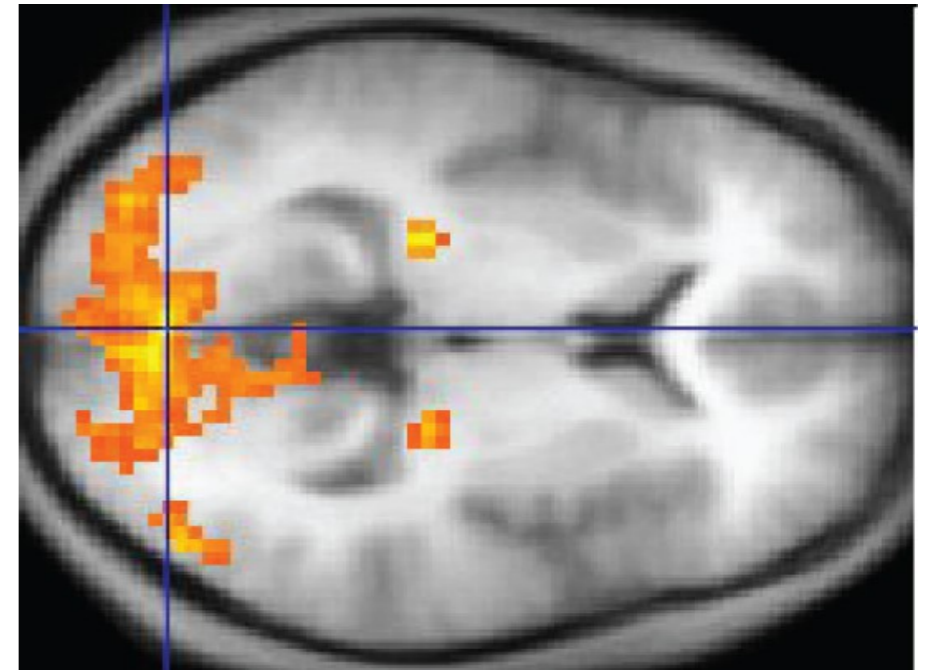
General temporal data:



Wiki articles



Videos



fMRI

Data abstraction: distance matrix

```
"distancematrix": [  
  [0, 0.7, 0.3],  
  [0.7, 0, 0.5],  
  [0.3, 0.5, 0]  
],
```

Outline

What

Why

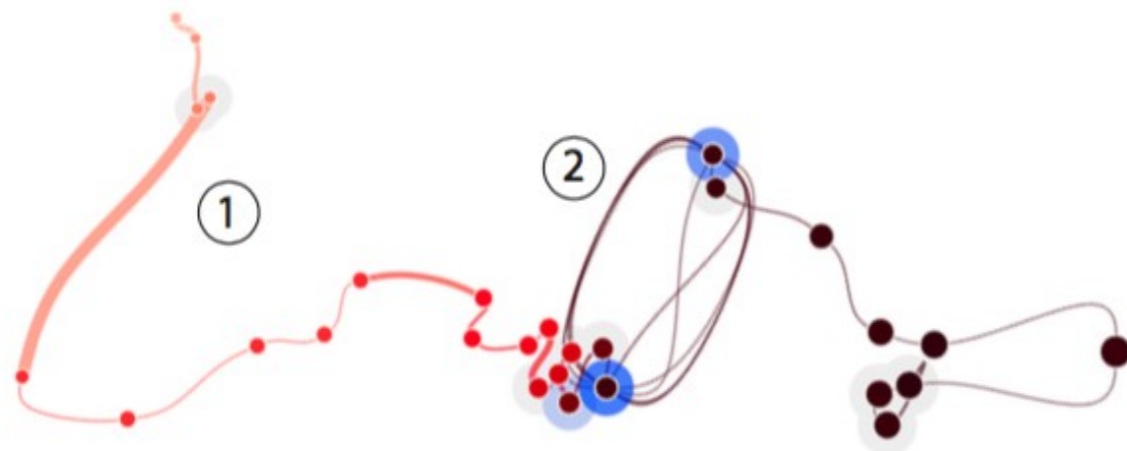
How

Validation

Why

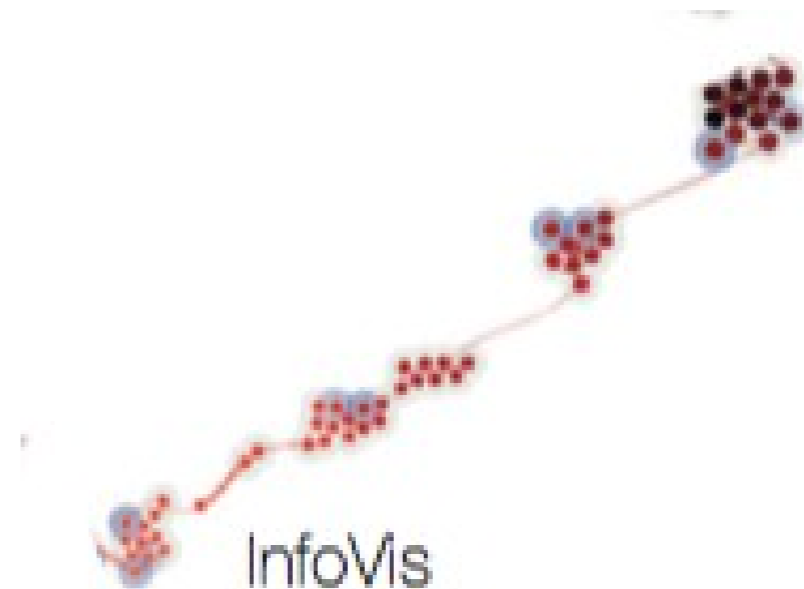
Motivation: patterns can be of great interest to domain experts or general audience

Task: overview and identify patterns



Wiki article on Chocolate

Long progress at first, edit war in the middle.



Wiki article on InfoVis

Cluster, progress, cluster...

Outline

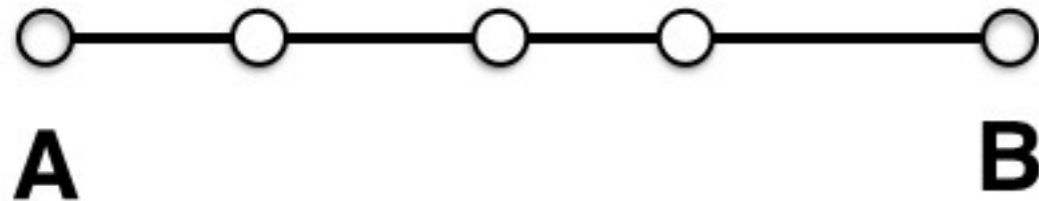
What

Why

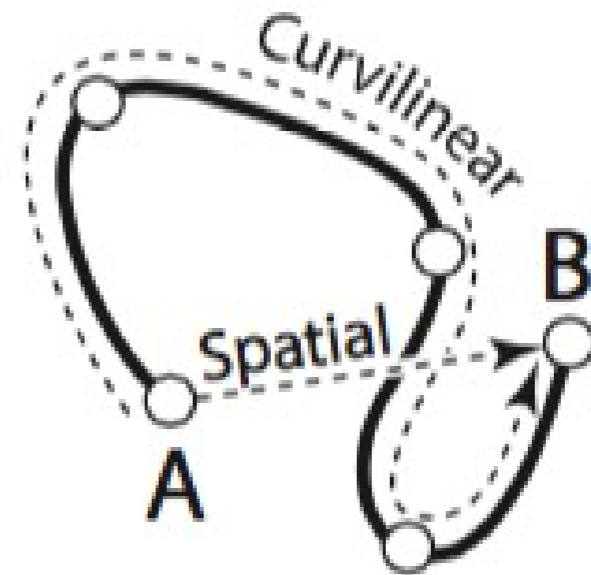
How

Validation

How (method)



Timeline



Time curve

Information encoding

Rank distance: how far in time

Curvilinear distance: cumulated changes

Spatial distance: effective changes

TL TC

Y Y

Y Y+

N Y

How (implementation)

Distance matrices: number of characters inserted or deleted, Euclidean distance,...

Time points positions: “classical” MDS method (not clearly defined) [46]

Curves: Bézier curve

Overlap removal: a simple iterative approach (not clearly defined)

Rotating curves : time goes from left to right

- A combination of other methods
- Sufficient for re-implementation

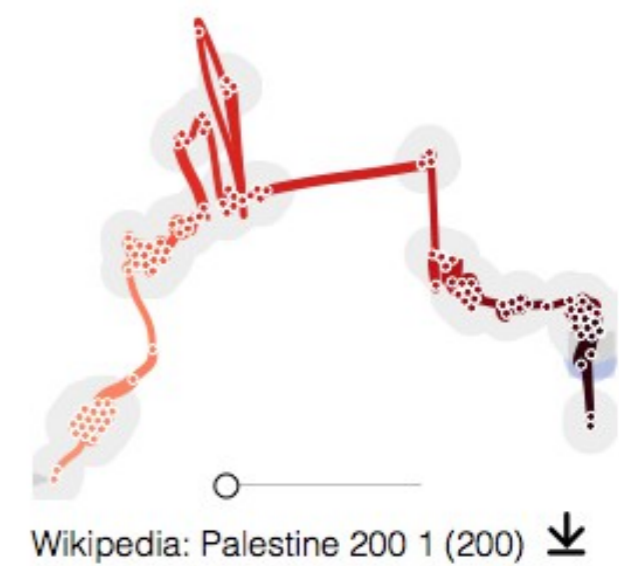
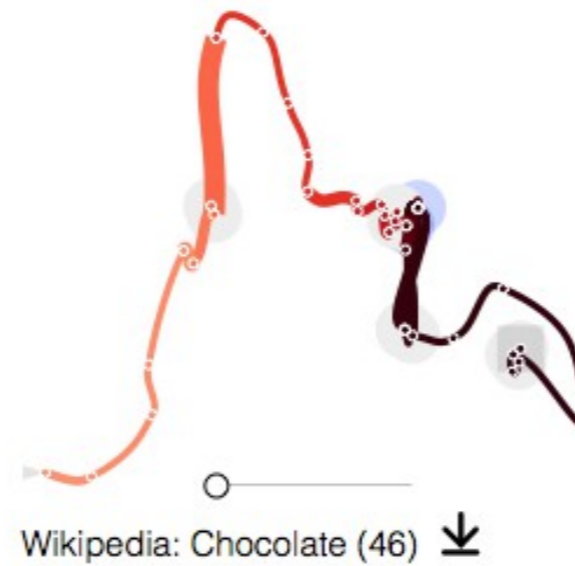
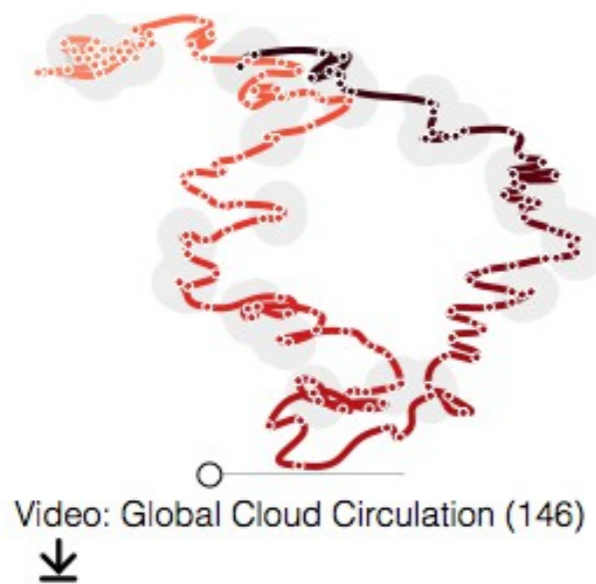
MDS: multidimensional scaling

[46] Multidimensional scaling: I. Theory and method

Live demo

<http://www.aviz.fr/~bbach/timecurves/>

Time Curves



Outline


What

Why


How


Validation

Validation

 **Domain situation**
Observe target users using existing tools

 **Data/task abstraction**

 **Visual encoding/interaction idiom**
Justify design with respect to alternatives

 **Algorithm**
Measure system time/memory
Analyze computational complexity

Analyze results qualitatively

Measure human time with lab experiment (*lab study*)

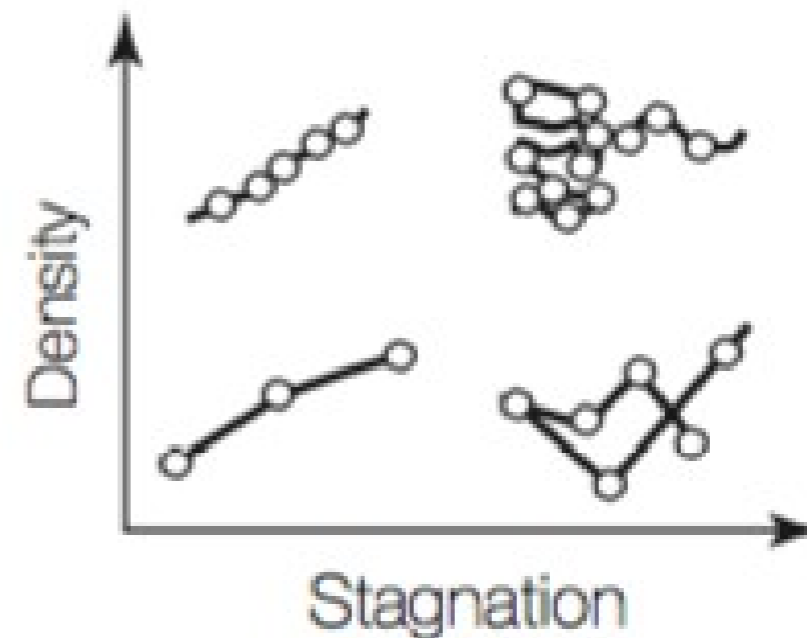
Observe target users after deployment (*field study*)

Measure adoption

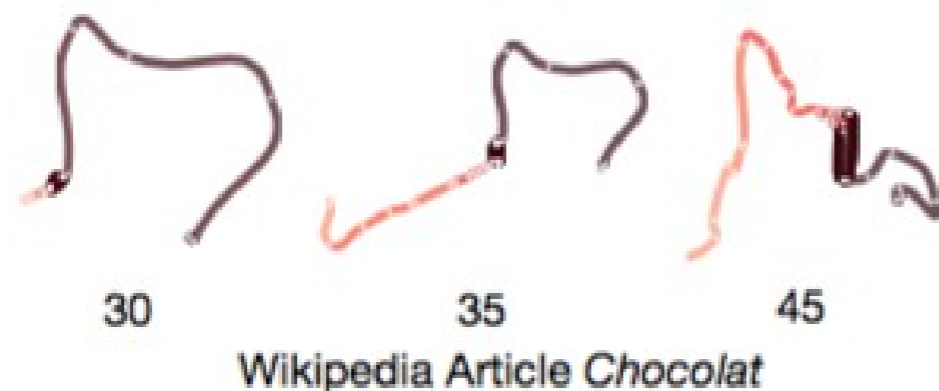
Validation (algorithm)

# time points	time (sec)
50	9
100	20
500	500

Computational Complexity $O(N^3)$



Perceptual scalability:
depends on data complexity and
and down-sampling method.



Stability: shape is kept when adds new time points.

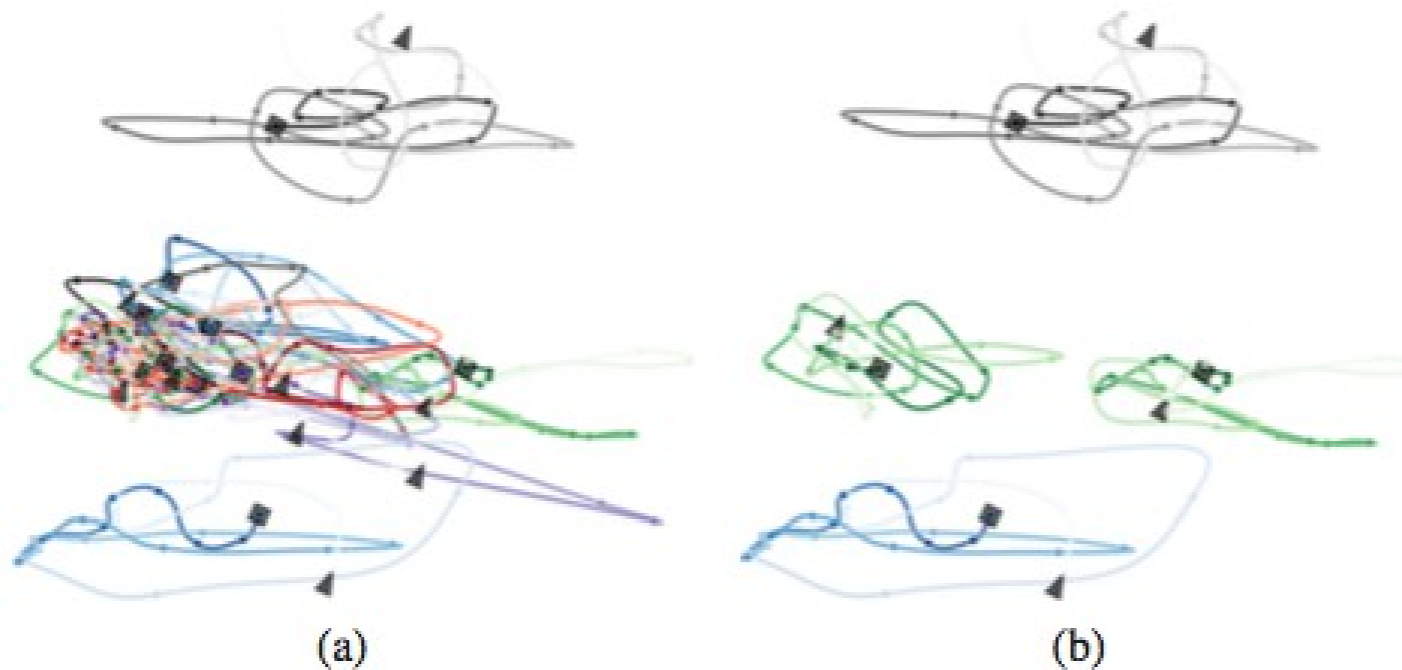
Validation (domain situation)

Informal user feedback

Users : one neuroscientist over two months

Task : identify/compare patterns in fMRI data

Result: encouraging feedback regarding the usability



Pattern: meaningful difference between individuals in (b)

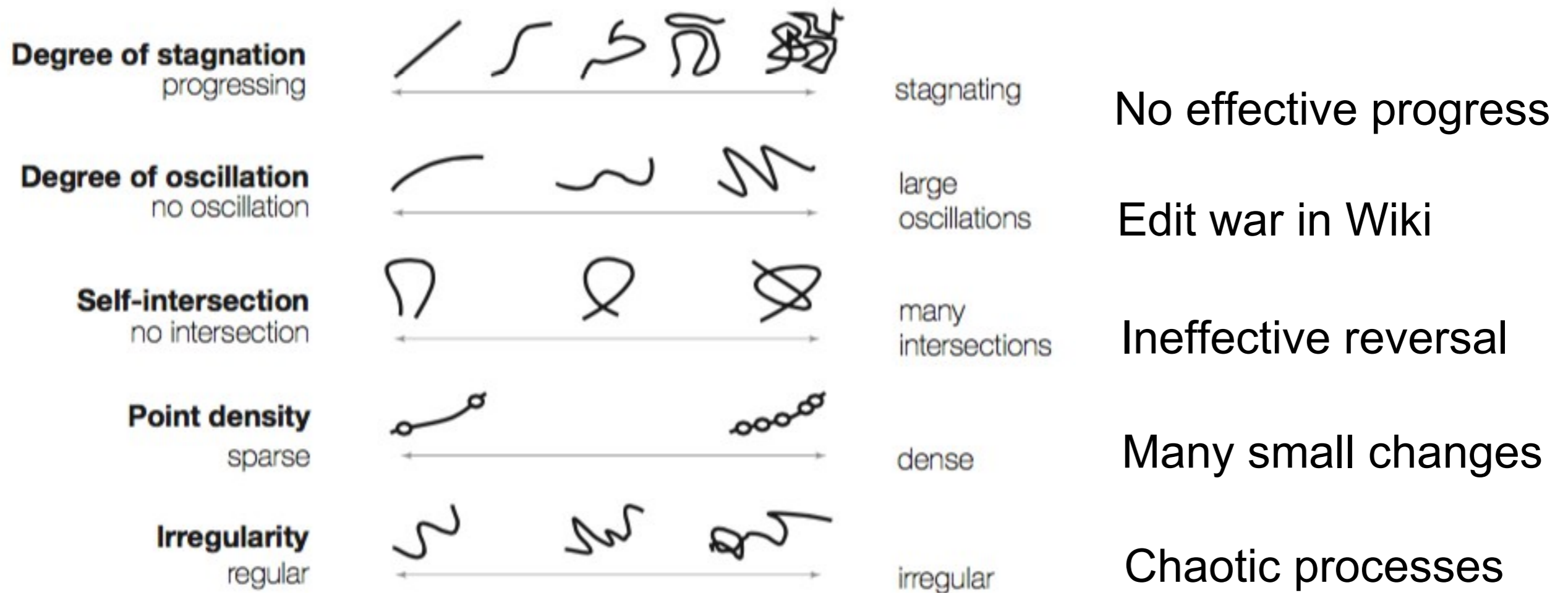
Time curves: summary

What: Data	Time series: Wikipedia histories, videos and dynamic network
What: Derived	Pairwise distances
Why: Tasks	Reveal patterns in temporal datasets
How: Encode	Circles and dots: time stamp Curve: evolution Distance and colour: similarity
Scale	About 100 time points

What else?

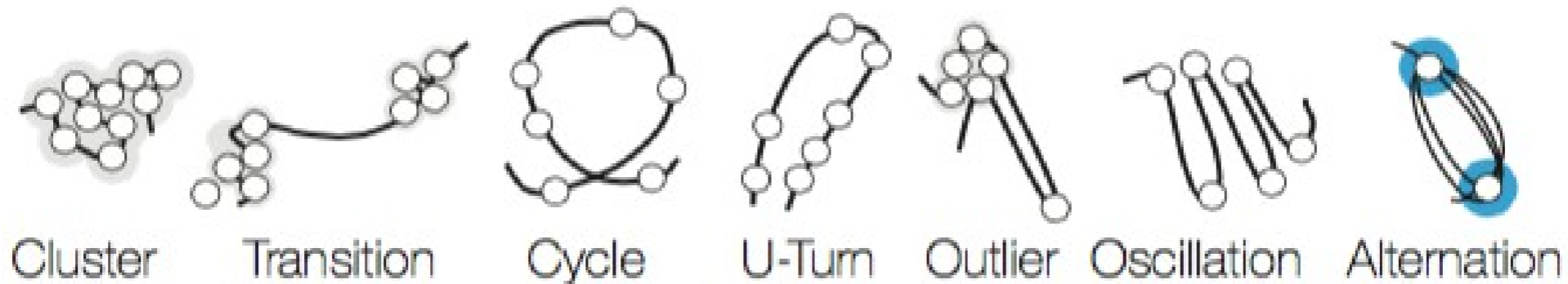
Patterns and examples!

Geometric characteristics



Curves between two remote time points

Patterns



Cluster : minor revision

Transition: big progression

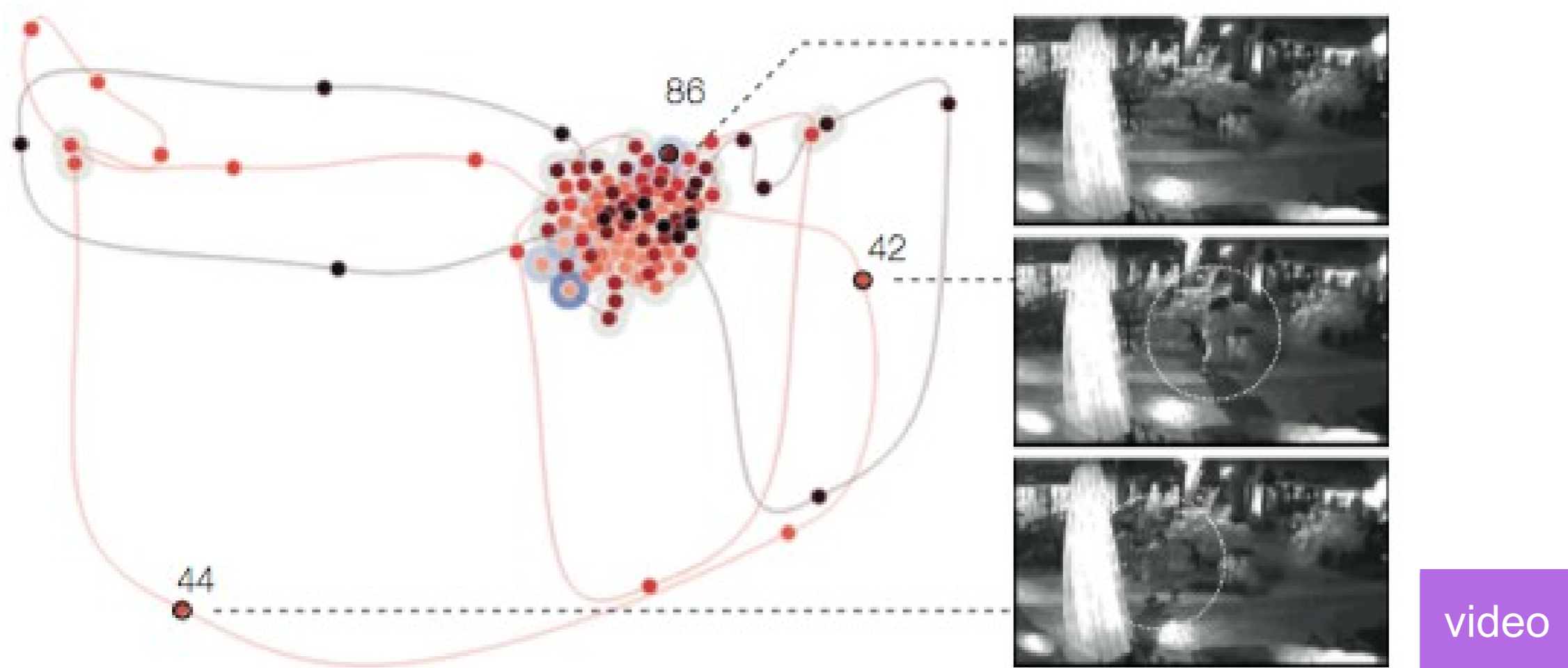
Cycle : back to previous point after a long progression

Outlier : large sudden changes

...

Specific combination of geometric characteristics

Surveillance video



Derived data

Time stamp: one frame/second

Distance : normalized absolute pixel difference

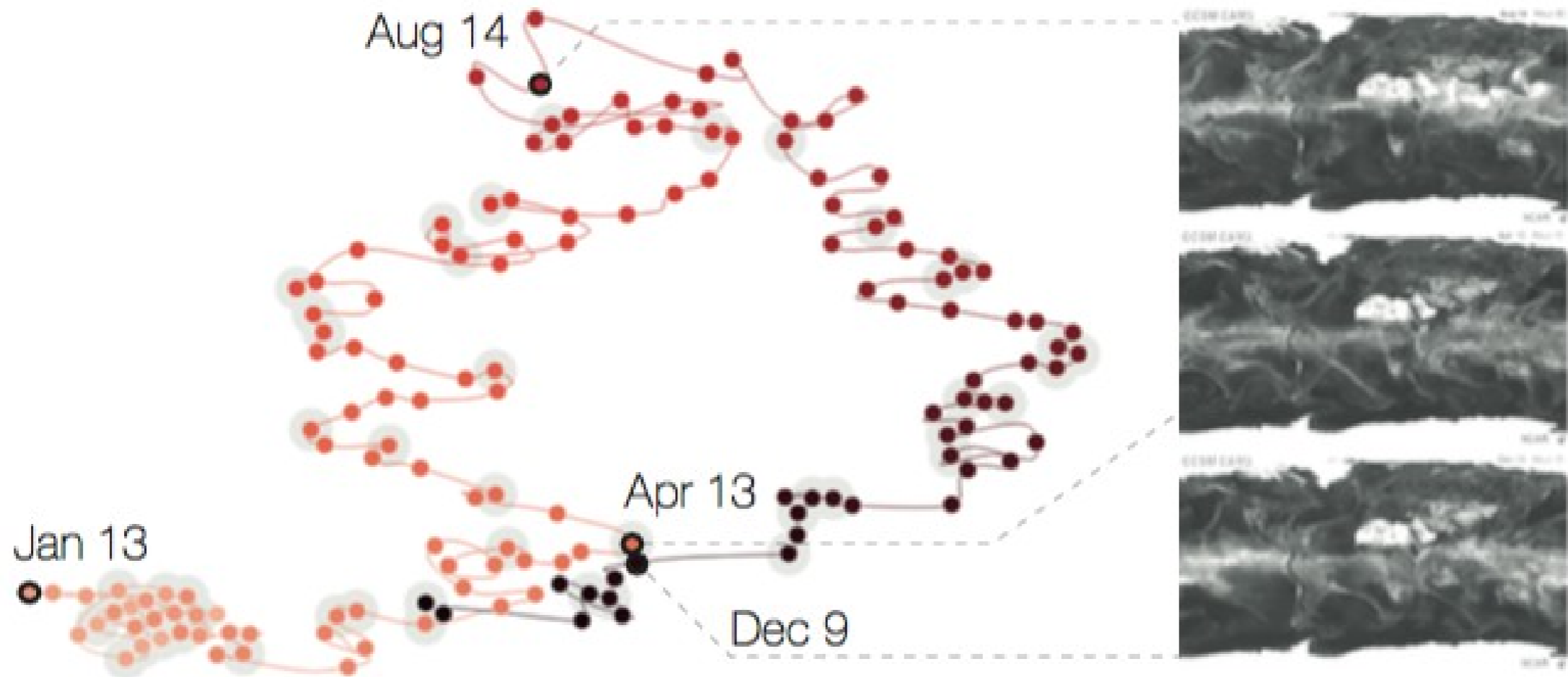
Patterns

Cluster: minor changes

Outliers: moving people

Video summarization, anomaly detection

Cloud coverage and precipitation



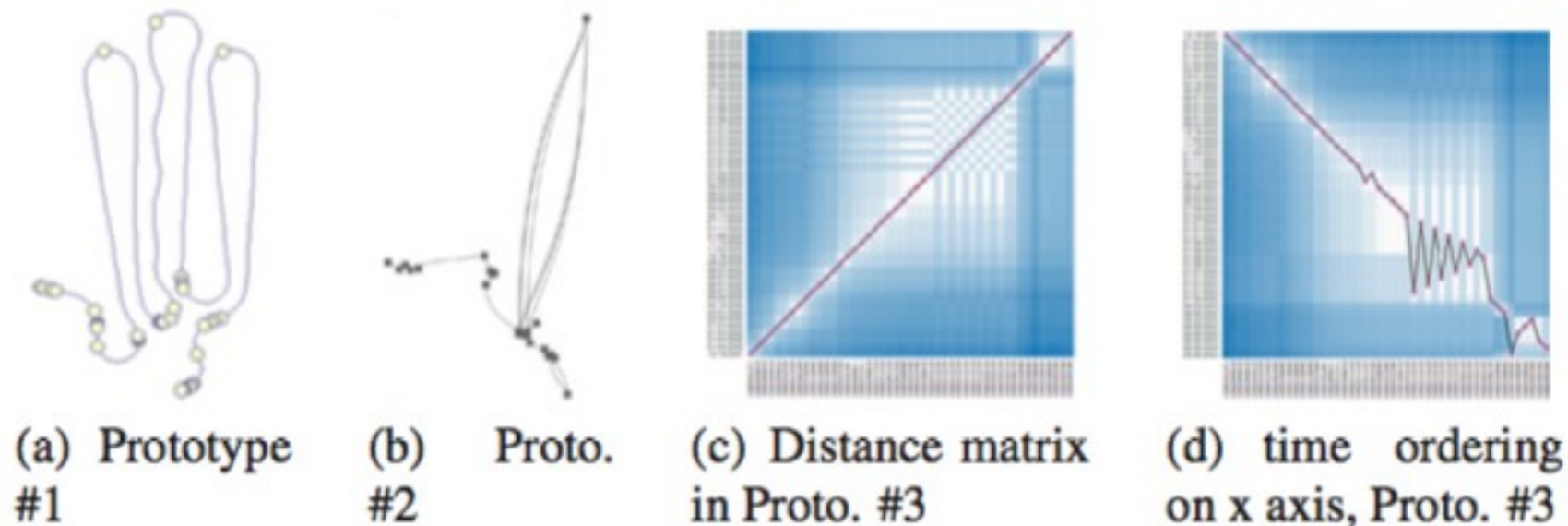
Patterns:

Extremes: Jan & Aug

Dec goes to Apr

Conclusion

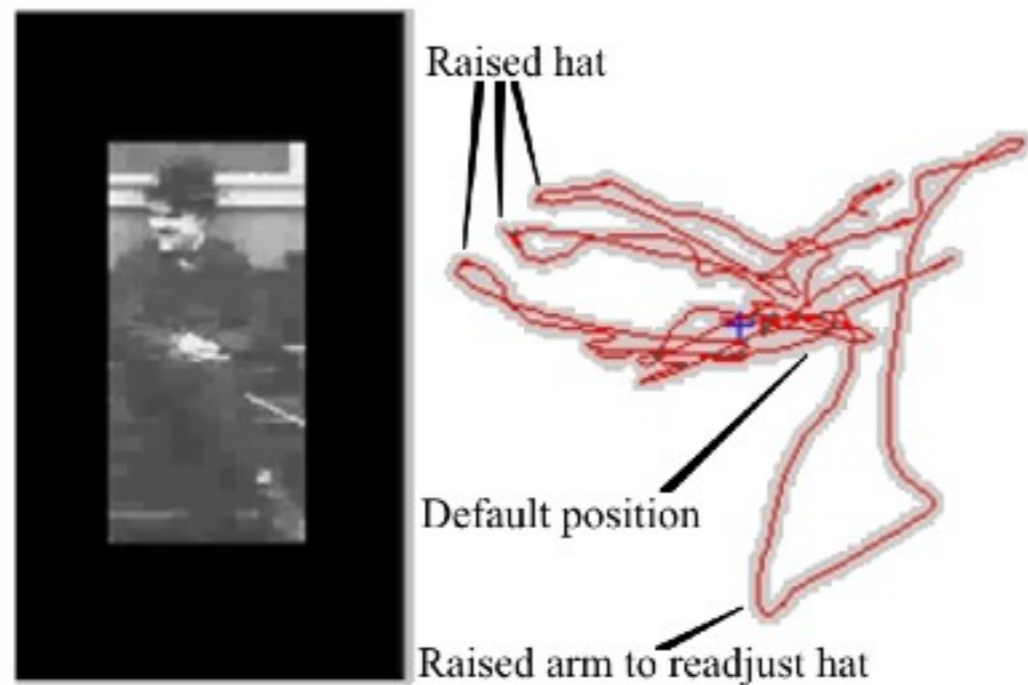
- A general approach for visualizing patterns of evolution in temporal data
- Demonstrated by lots of examples (solid work)
- Gives developing history of time curve method



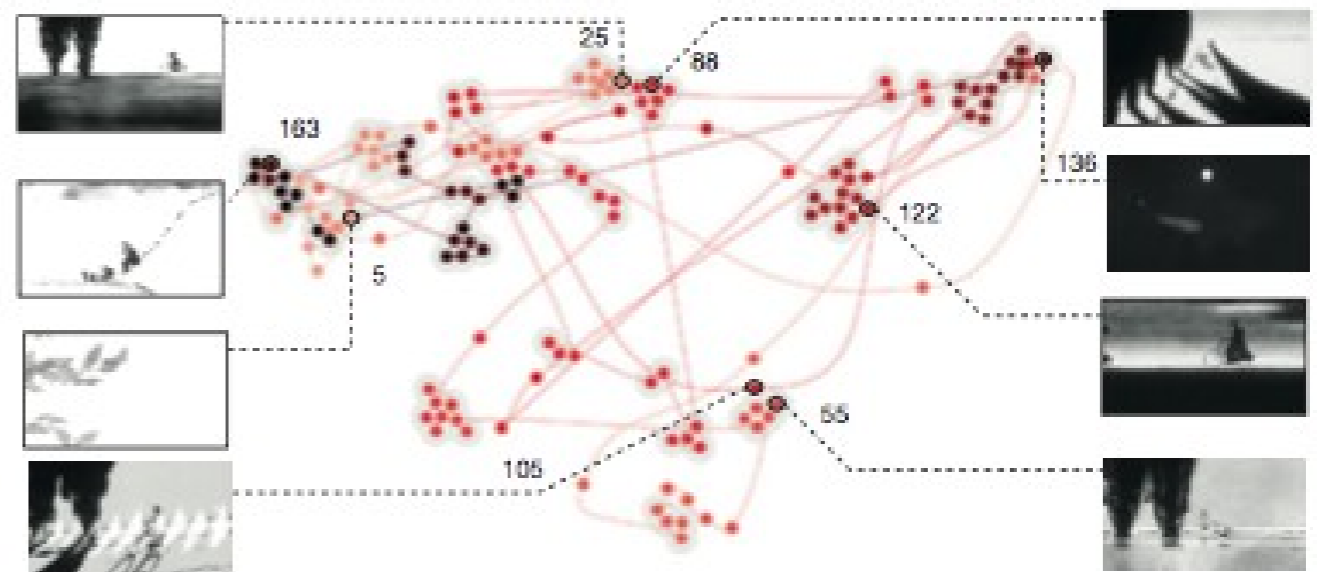
Useful in other domains such software engineering management, law making study...

Critiques

- No direct comparison with previous work
- Validation is insufficient



Video Interpretation from [37]



Animated movie example in the paper

[37] Image Spaces and Video Trajectories: Using Isomap to Explore Video Sequences

Thanks!
Q&A

