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# Mapping trajectories and flows: Facilitating a human-centered approach to movement data analytics

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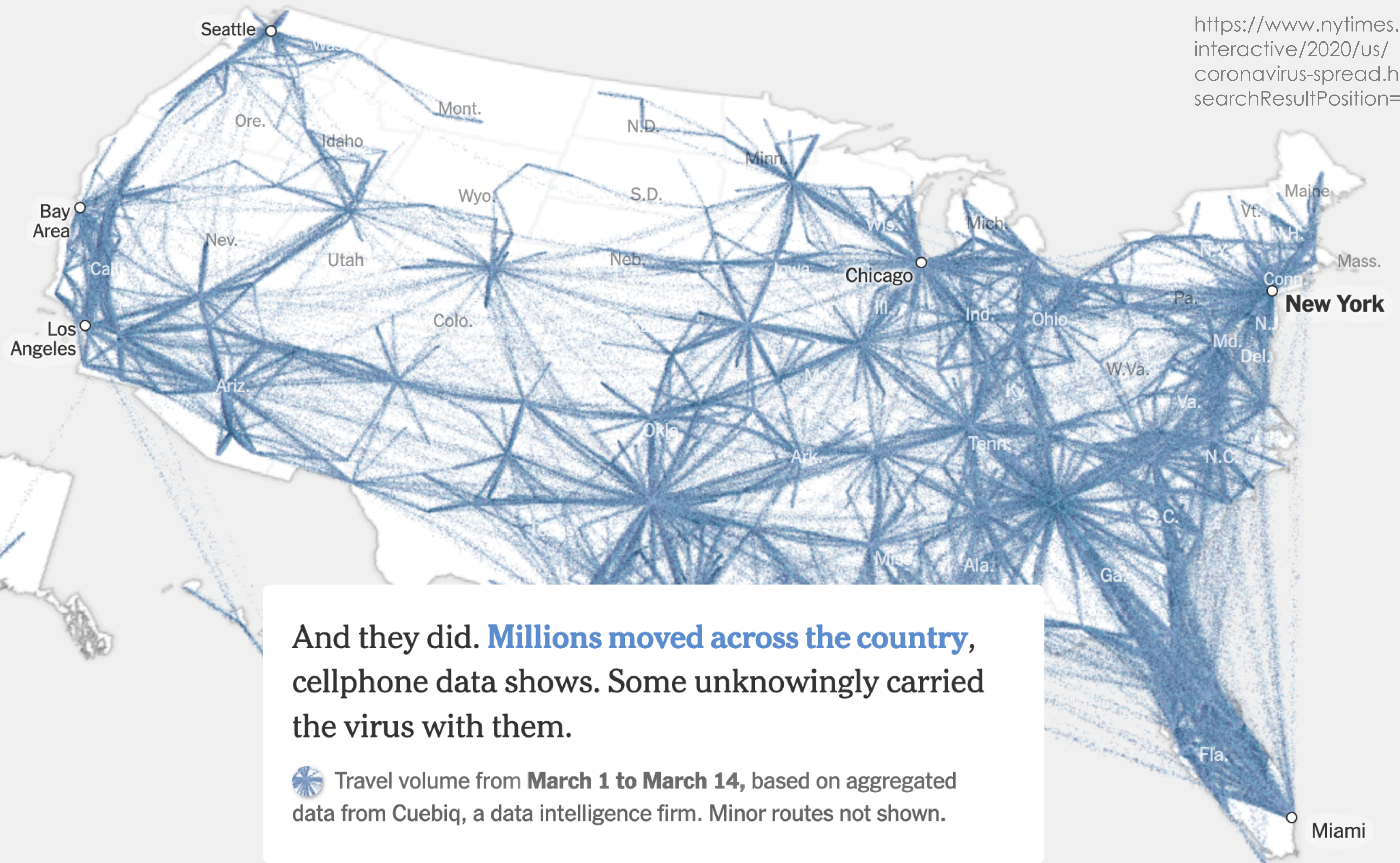
Dodge S., & Noi, E.(in press), **Mapping trajectories and flows: Facilitating a human-centered approach to data-driven movement analytics.** *CaGIS*



# Movement is central to understanding human mobility

Source: **NYTimes**  
How the virus won.

<https://www.nytimes.com/interactive/2020/us/coronavirus-spread.html?searchResultPosition=5>

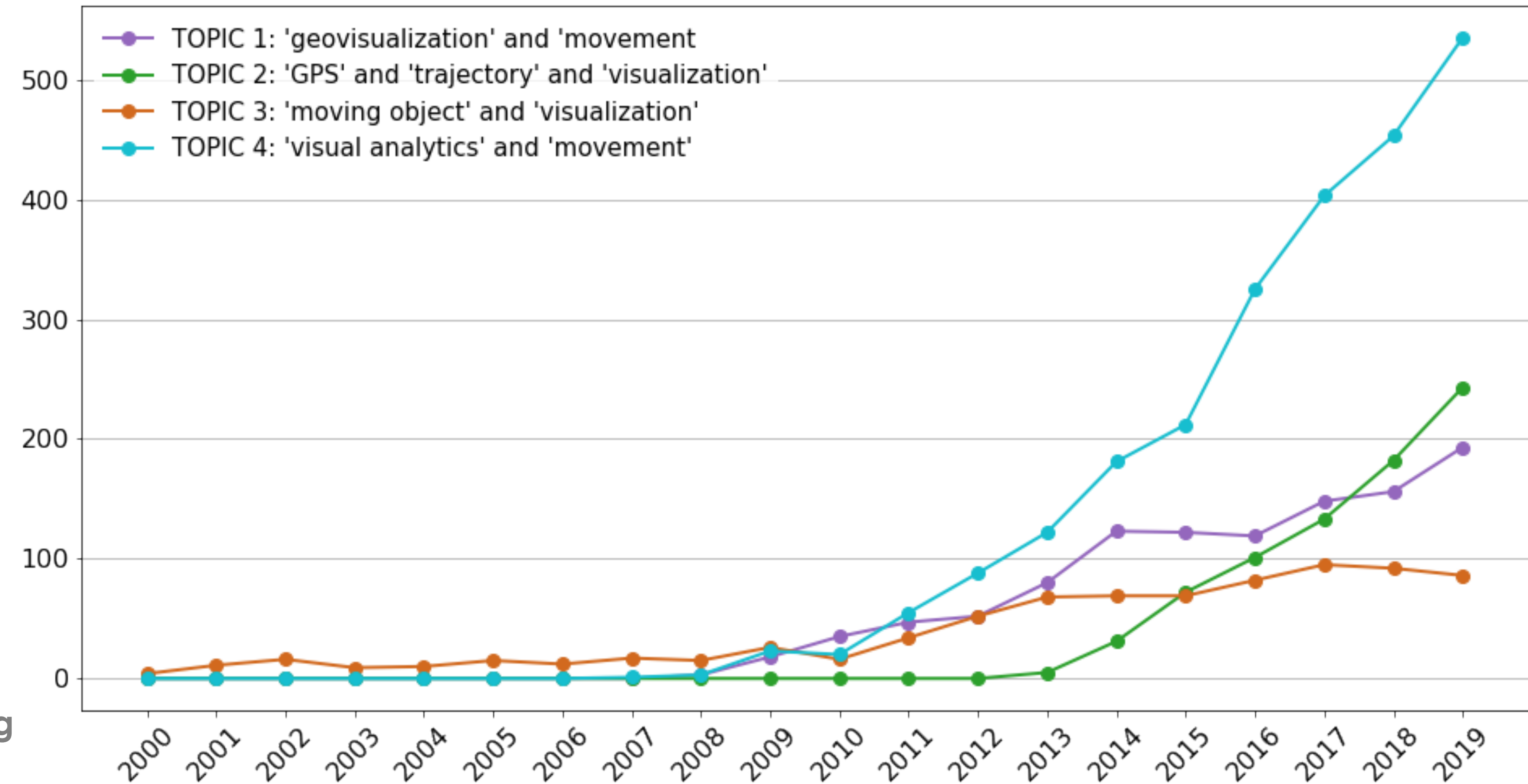


And they did. **Millions moved across the country**, cellphone data shows. Some unknowingly carried the virus with them.

 Travel volume from **March 1 to March 14**, based on aggregated data from Cuebiq, a data intelligence firm. Minor routes not shown.

# Using visualization to facilitate knowledge discovery from Movement data

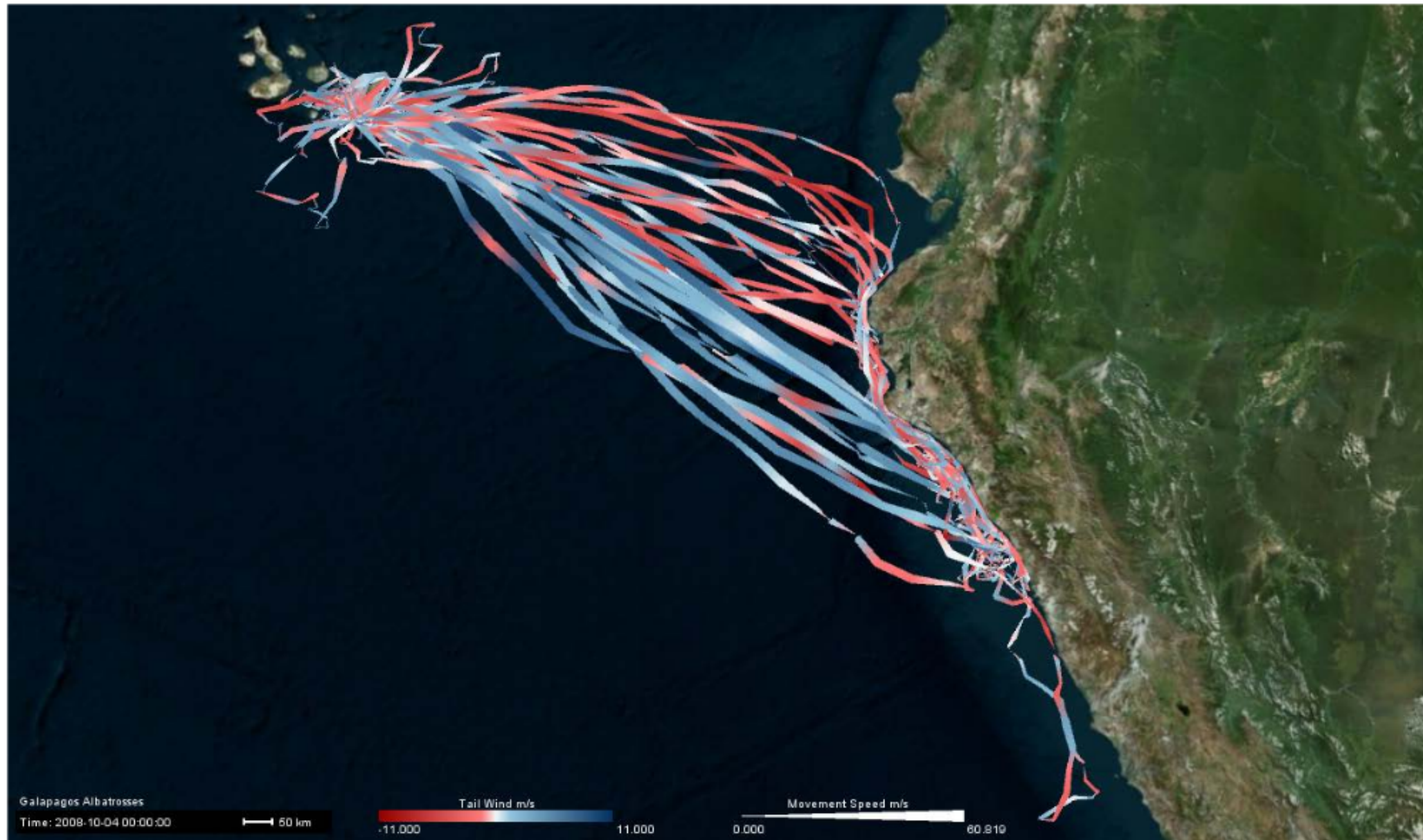
## Web of Science



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# Movement data

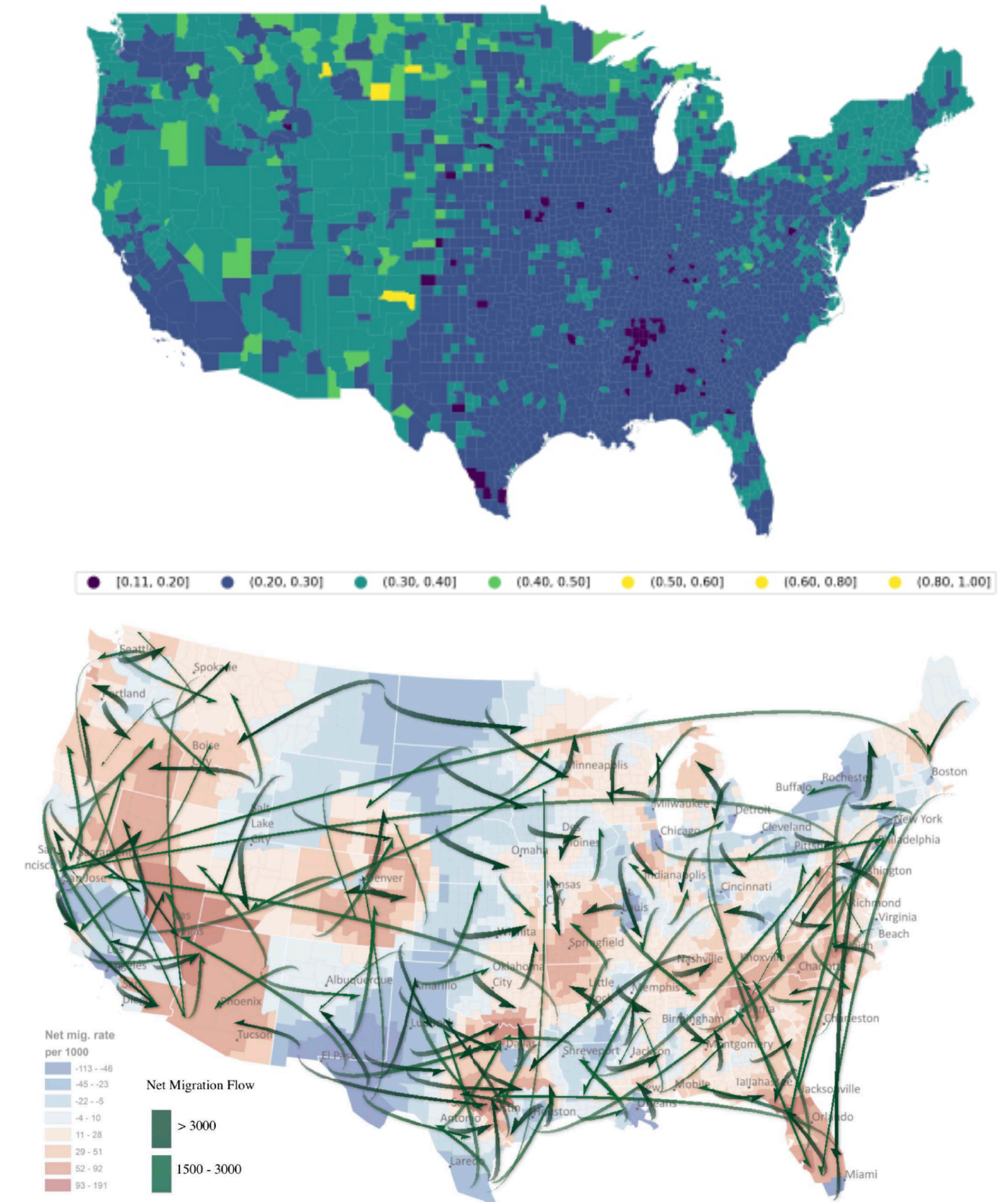
## Individual Trajectories (Lagrangian perspective)



Xavier & Dodge (2014)

GPS Trajectories of 9 adult albatrosses (90 min resolution), annotated with wind speed (m/s) and wind direction, 6-hour, 2.5°, U/V-wind components NCEP Reanalysis 2 using Env-DATA

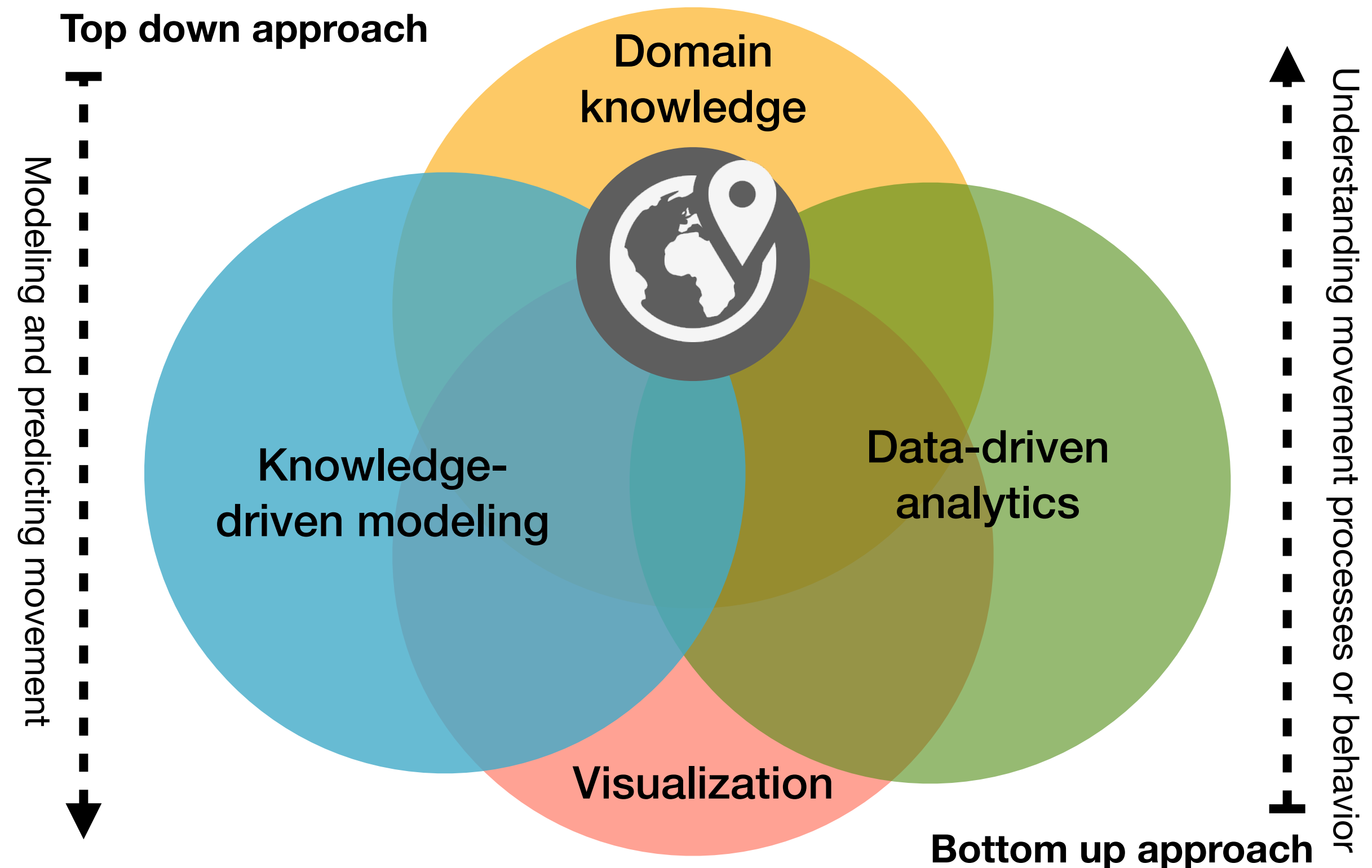
## Aggregate Movement / Flows (Eulerian perspective) March 1, 2020



US Migration: “Smoothed net migration flows for age 25-29, with population threshold = 1,000,000. The background map shows the net migration rate for age group 25-29.” Guo, 2014

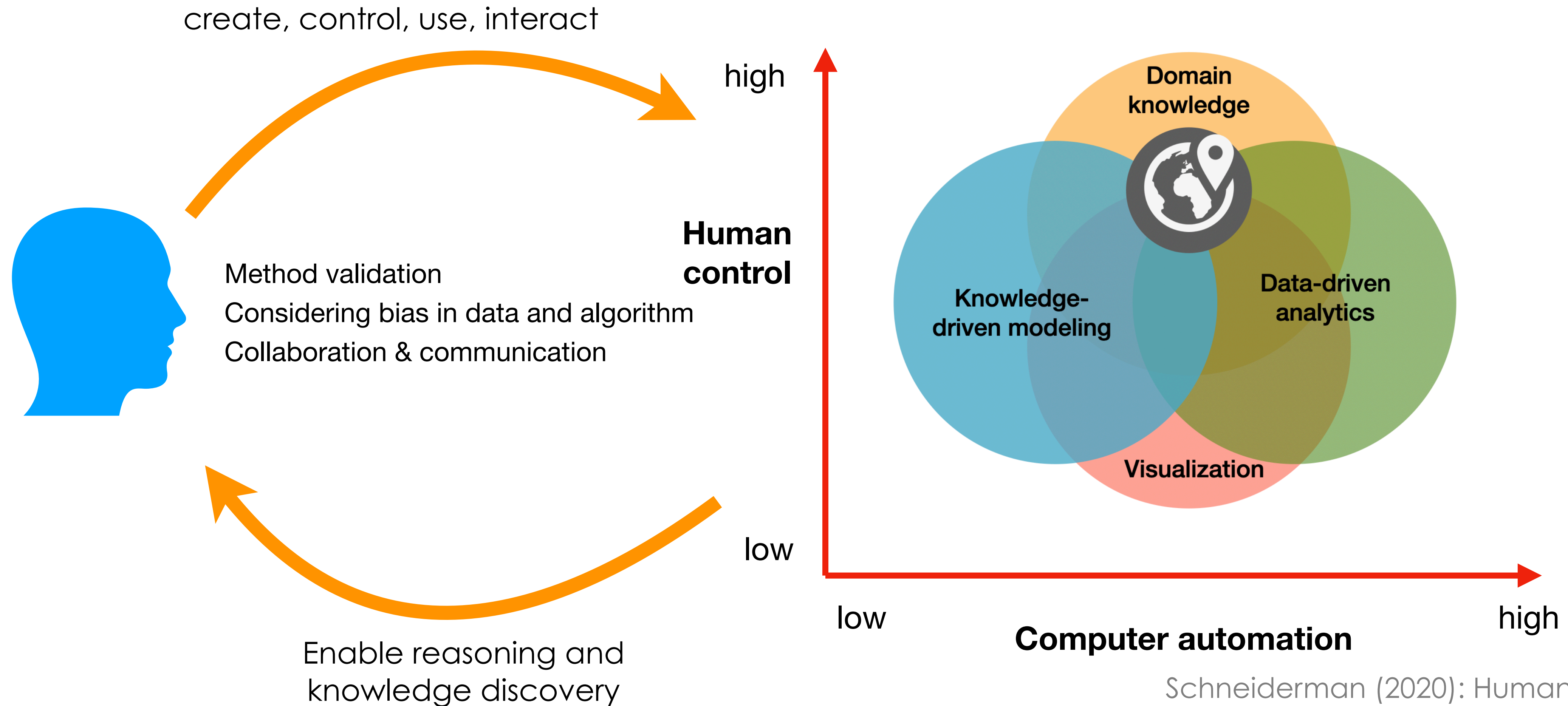
# A human-centered approach to movement analytics

TO UNDERSTANDING AND PREDICTING MOVEMENT



Dodge S. (2021), **A Data Science Framework for Movement**. *Geographical Analysis*, the GA 50th Anniversary Special Issue, 53 (1), pp. 855 –876.

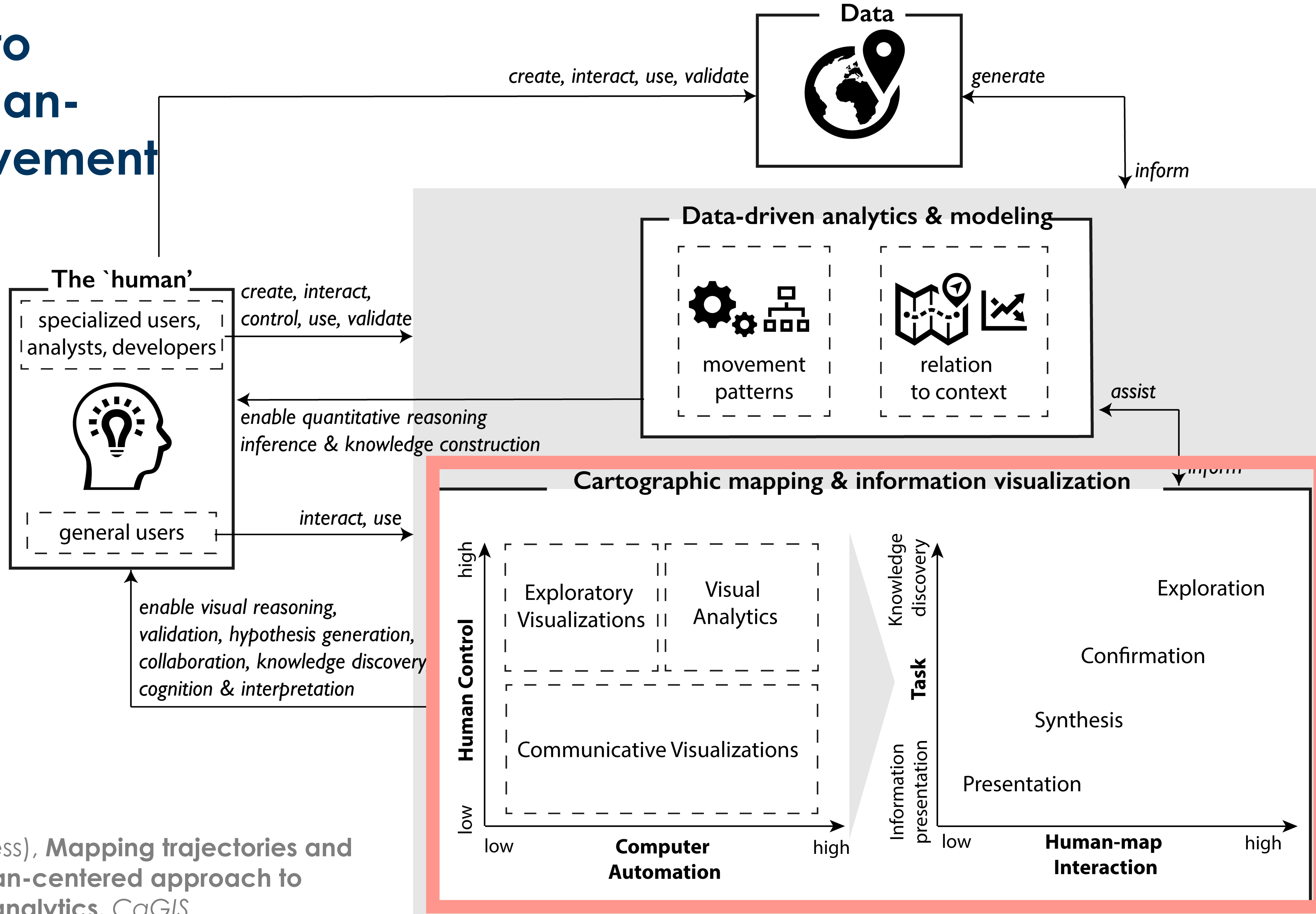
# A human-centered approach to movement analytics



Schneiderman (2020): Human-Centered AI

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# Visualization to facilitate human-centered Movement Analytics



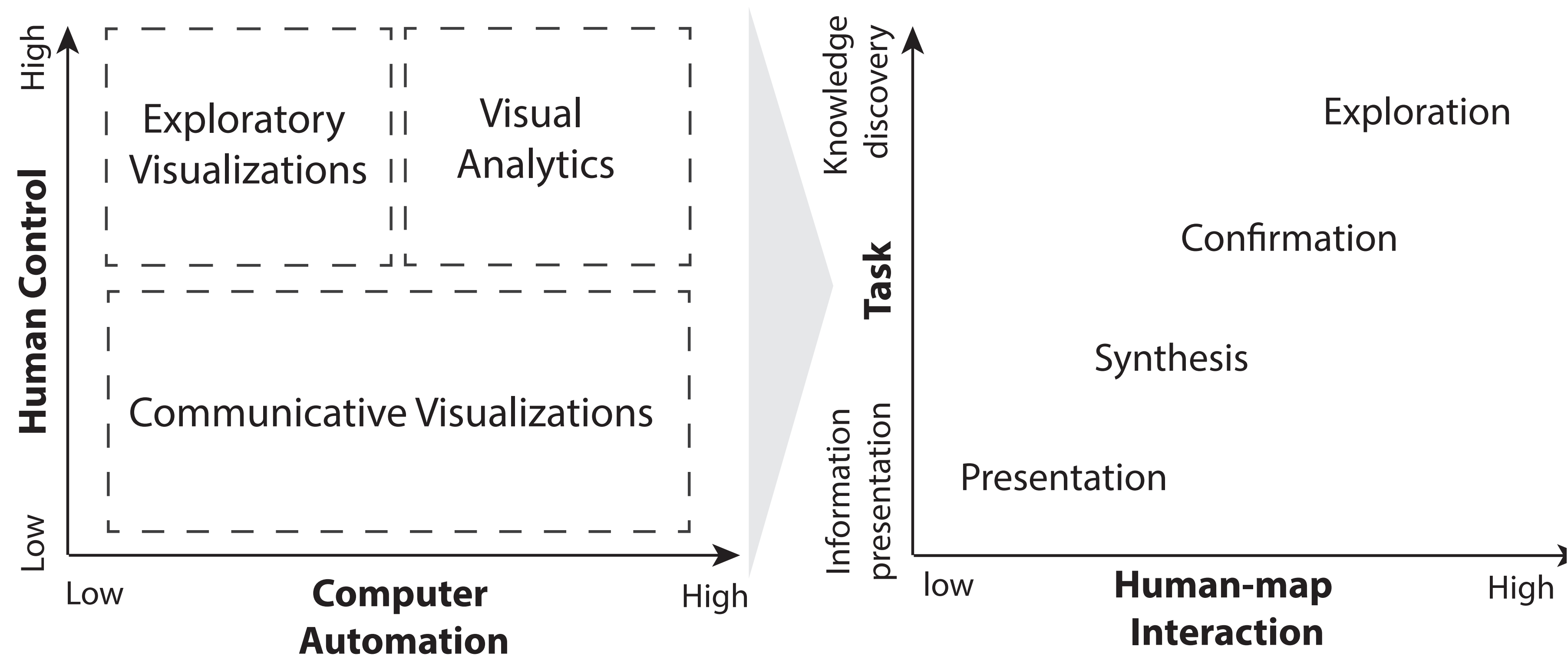
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@Noi [noiev.com](http://noiev.com)

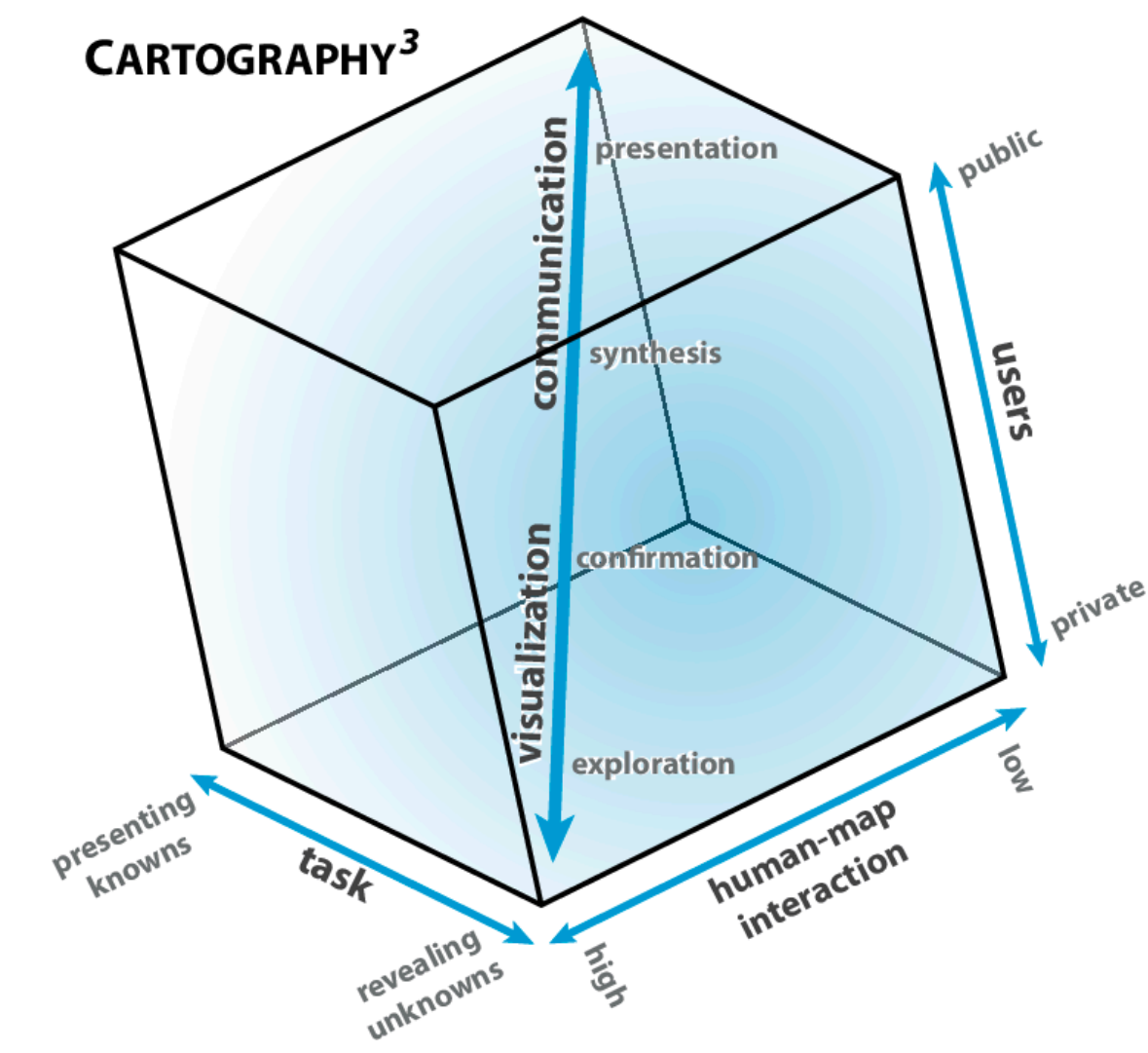
Schneiderman (2020), MacEachren et al., (2004), Roth (2013)



# Visualization to facilitate human-centered knowledge Discovery



*Schneiderman (2020), MacEachren et al., (2004), Roth (2013)*



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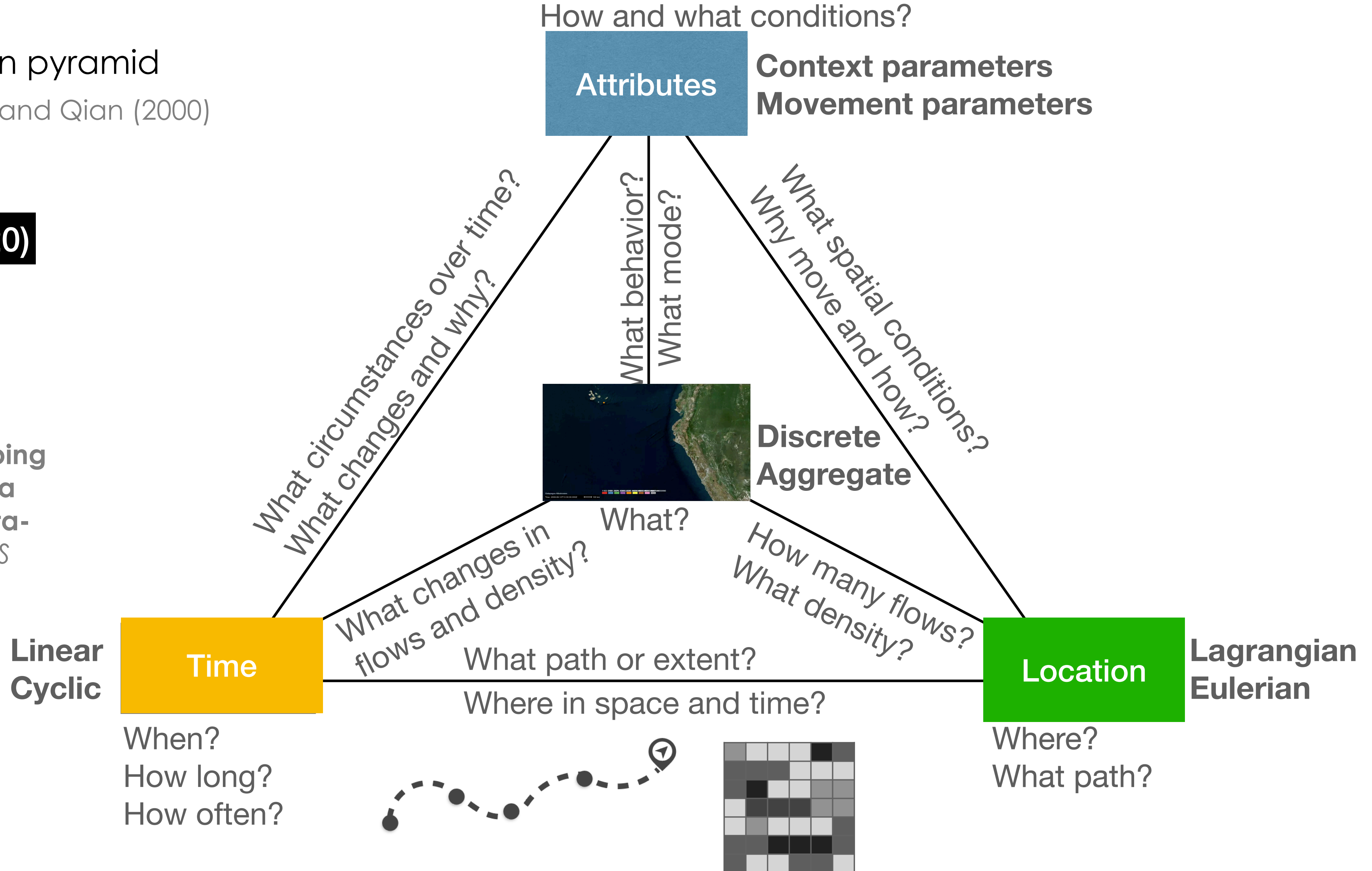
# Characterizing movement visualization

Geographic representation pyramid

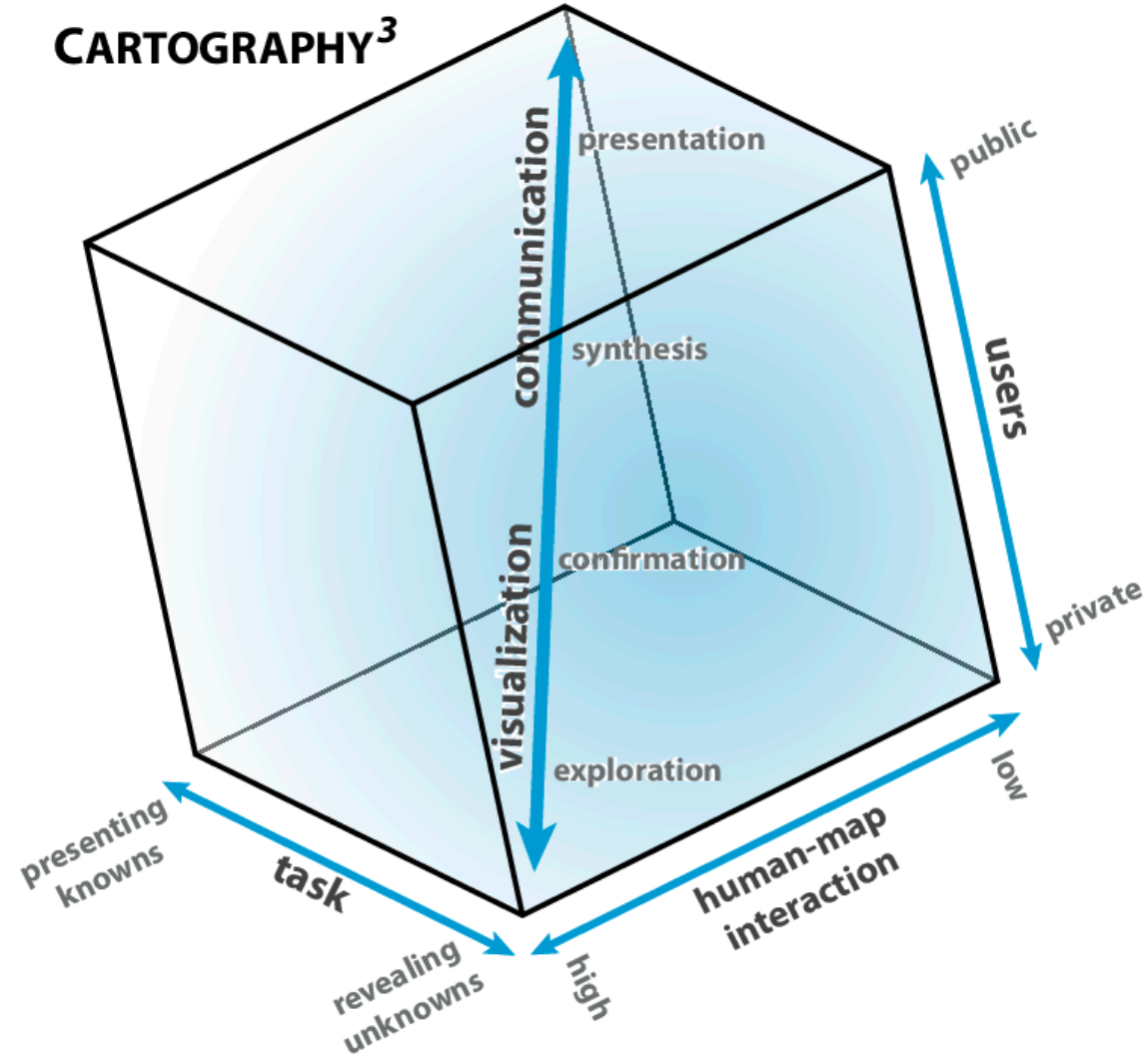
Kraak (2014), Mennis, Peuquet, and Qian (2000)

150 → 40 (from 2010-2020)

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# Characterizing movement visualization



MacEachren et al., (2004), Roth (2013)

## VISUAL ELEMENTS

## FUNCTIONAL ELEMENTS

Category	#	Elements	Element type (encoding)
Visual Elements	1	Lagrangian	binary (0/1)
	2	Eulerian	binary (0/1)
	3	Discrete	binary (0/1)
	4	Aggregate	binary (0/1)
	5	Location	binary (0/1)
	6	Time	binary (0/1)
	7	Movement parameters	binary (0/1)
	8	Context parameters	binary (0/1)
Movement data	9	Vector	binary (0/1)
Representation forms	10	Raster	binary (0/1)
Cartographic features	11	2D	binary (0/1)
	12	3D	binary (0/1)
	13	Dynamic	binary (0/1)
	14	Static	binary (0/1)
Dimensions of Cube <sup>3</sup>	13	Specialized users	binary (0/1)
	15	Public/novice user	binary (0/1)
	16	Interaction	ordinal (low/med/high)
	17	Knowledge construction	binary (0/1)
Advanced Exploratory Functions	18	Information presentation	binary (0/1)
	19	Multiple coordinated views	binary (0/1)
Design Flexibility	20	Dynamic querying	binary (0/1)
	21	Flexibility	ordinal (low/med/high)

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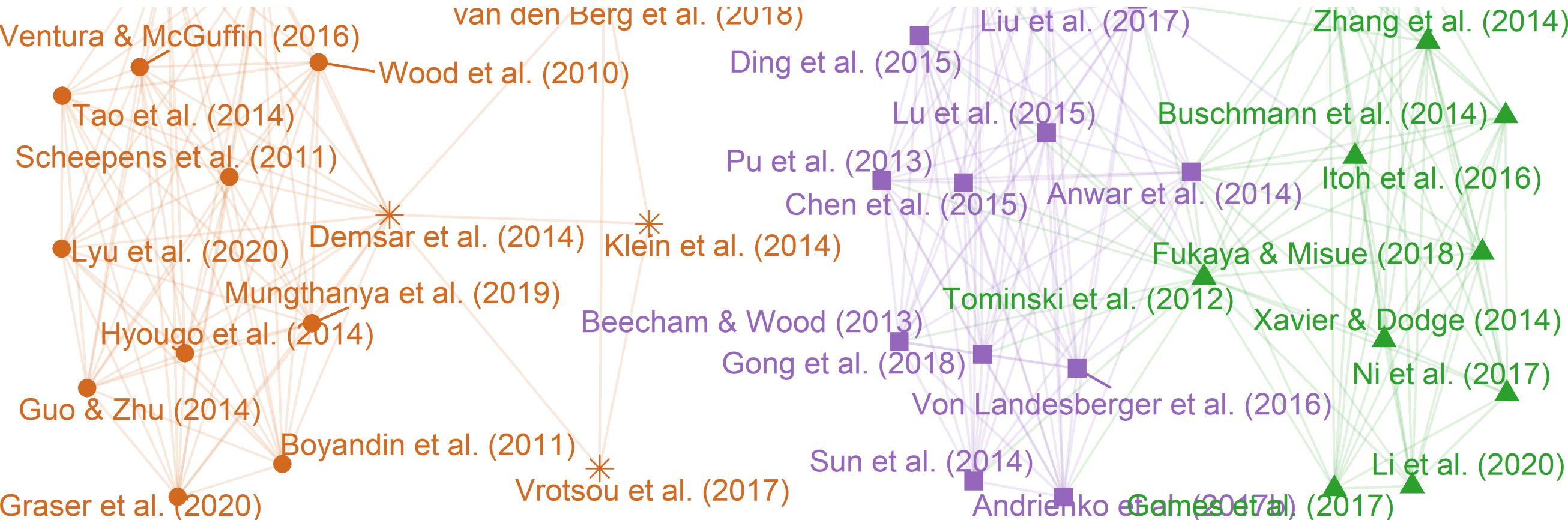
# Characterizing movement visualization

## Clustering and Community detection analysis.

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Citation	Cluster	VISUAL ELEMENTS											FUNCTIONAL										
		Vector	Raster	Lagrangian	Eulerian	Discrete	Aggregate	2D	3D	Static	Dynamic	Location	Time	Movement Parameters	Context Parameters	Multiple Coordinated Views	Dynamic Querying	Specialized user	Noice/general user	Knowledge Construction	Information presentation	Flexibility	Human-map Interaction
Andrienko, G., Andrienko, Fuchs, et al. (2017)	1																					M	H
Anwar et al. (2014)	1																					M	M
Beecham & Wood (2013)	1																					M	L
Chen et al. (2015)	1																					M	H
Ding et al. (2015)	1																					M	H
Gong et al. (2018)	1																					M	M
Krueger et al. (2016)	1																					M	H
Liu et al. (2017)	1																					M	M
Lu et al. (2015)	1																					M	M
Pu et al. (2013)	1																					M	H
Sun et al. (2014)	1																					M	H
Von Landesberger et al. (2016)	1																					M	H
Zeng et al. (2013)	1																					L	H
Boyandin et al. (2011)	2																					L	M
Demsar et al. (2014)	2																					L	M
Graser et al. (2020)	2																					L	L
Guo & Zhu (2014)	2																					L	M
Hyougo et al. (2014)	2																					L	L
Klein et al. (2014)	2																					L	M
Lyu et al. (2020)	2																					L	M
Munthanya et al. (2019)	2																					L	L
Scheepens et al. (2011)	2																					L	H
Tao et al. (2014)	2																					L	L
van den Berg et al. (2018)	2																					L	M
Ventura & McGuffin (2016)	2																					M	L
Vrotsou et al. (2017)	2																					L	L
Wood et al. (2010)	2																					L	L
Yang et al. (2017)	2																					L	M
Yu et al. (2015)	2																					L	M
Buschmann et al. (2014)	3																					M	M
Fukaya & Misue (2018)	3																					H	H
Gomes et al. (2017)	3																					M	H
Hoeber & Hasan (2018)	3																					M	H
Itoh et al. (2016)	3																					M	H
Li et al. (2020)	3																					M	H
Lock et al. (2020)	3																					M	H
Ni et al. (2017)	3																					M	H
Tominski et al. (2012)	3																					M	H
Xavier & Dodge (2014)	3																					H	H
Zhang et al. (2014)	3																					M	H

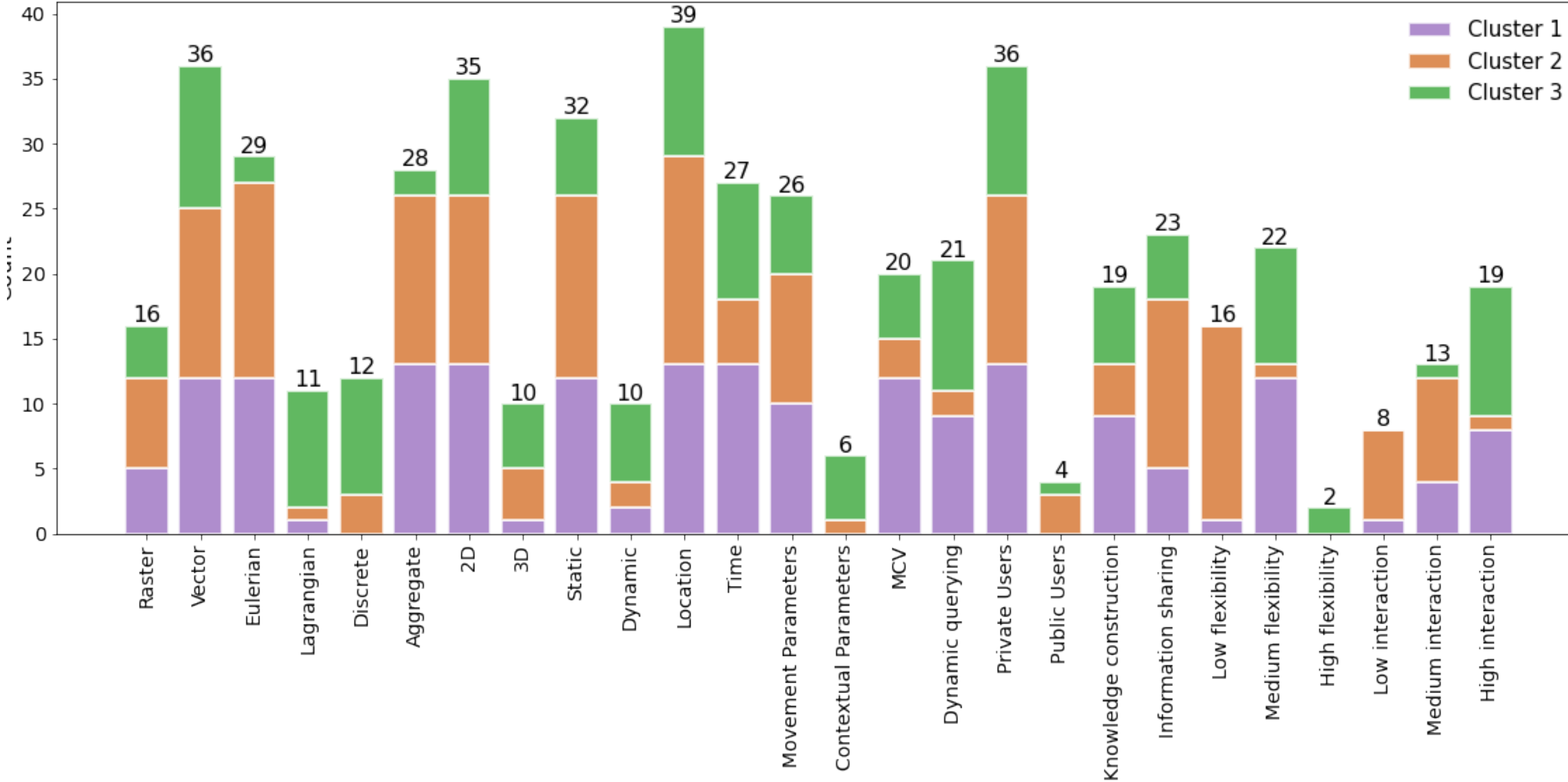
# Categories of movement visualization



Cluster 1:  
Interactive Visual Analytics of Aggregate Movement

Cluster 2:  
Communicative Visualization Methods to Map Aggregate Movement

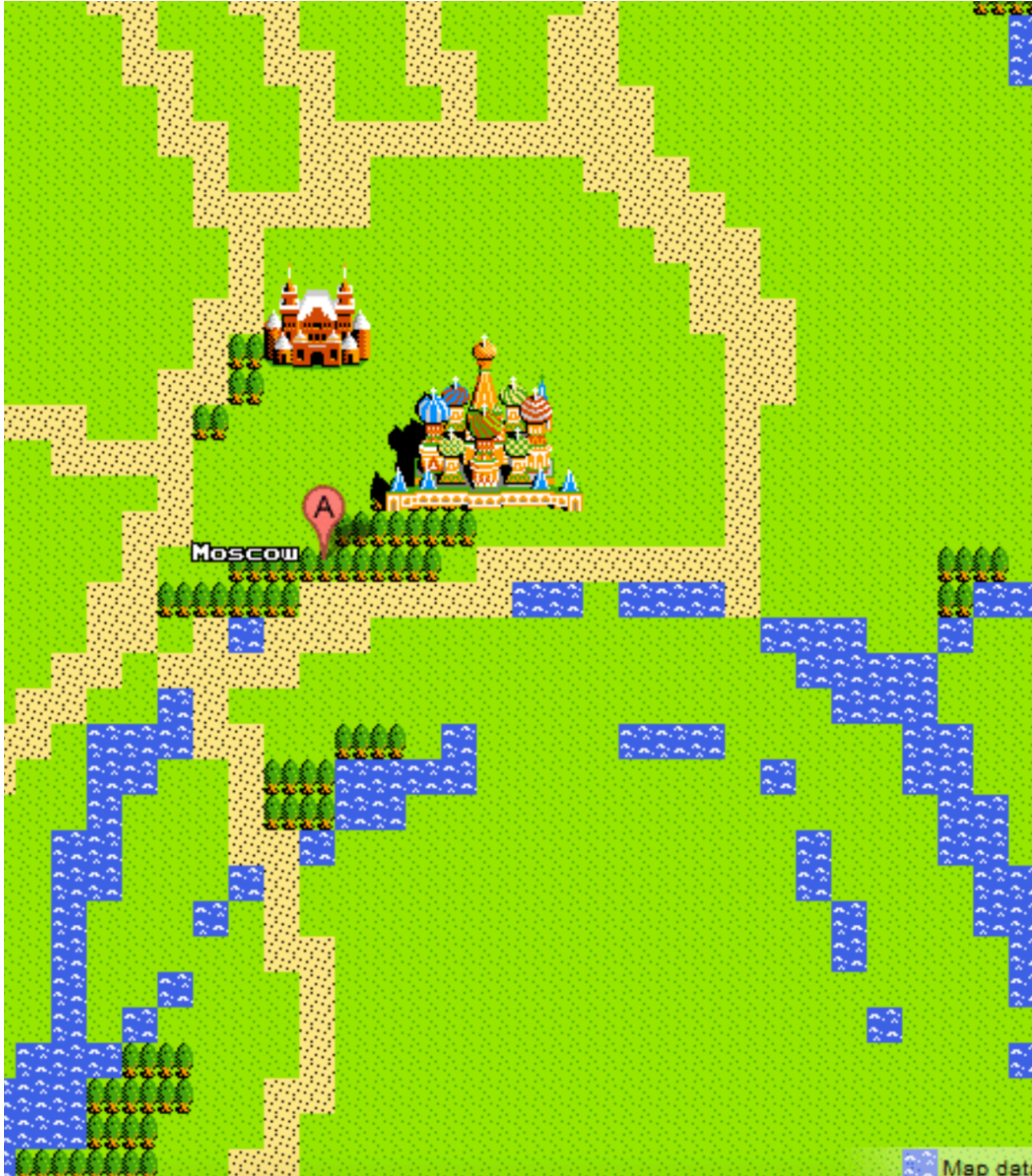
Cluster 3:  
Exploratory & Dynamic Visualization of Trajectories



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# Trends and Gaps in Movement Visualization

- Human-centered visualization tools
  - Combination of visual analytics tools and exploratory tools that is flexible enough to switch between representations (and data models)
- Mapping Context (weather, behavior, interactions)
  - Mapping movement vs contextualizing movement (the latter are rare)
- Bridging the interdisciplinary gap in tools
- Cognitive evaluation and usability studies



I would like to thank my advisor and co-author Somayeh Dodge, as well as MoveLAB at UCSB.

## Beers Questions?



*Evgeny Noi*



“ If geography is a prose, maps are iconography.  
(Lennar Meri) ”

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# Appendix



