

# Are We There Yet?

## A Roadmap of Network Visualization From Surveys to Task Taxonomies

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CVAST



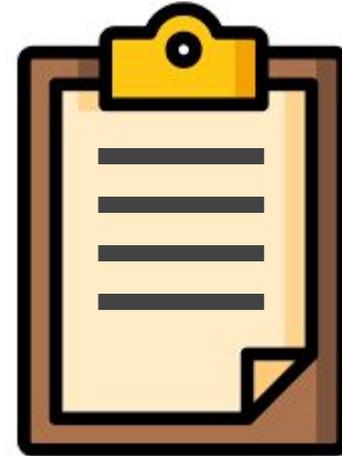
Introduction

Roadmap & Disciplines

Task Taxonomies & Coverage

Discussion & Results

Open Challenges & Summary



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Roadmap & Disciplines

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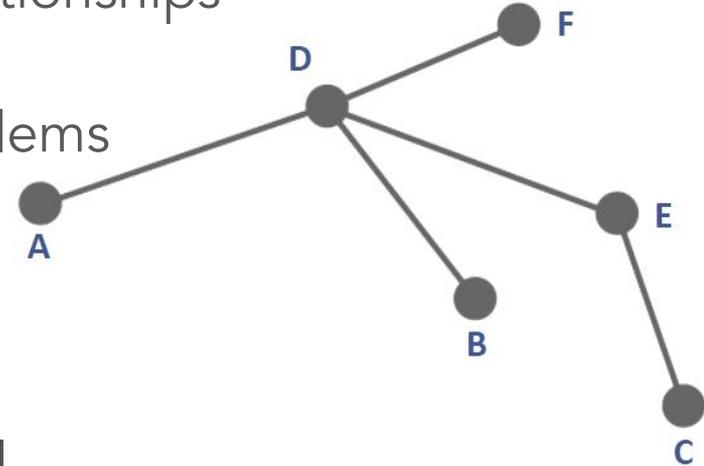
# Introduction

Networks are a set of data points and relationships

Abstract structure that models many problems

Have a wide range of applications

Network visualization provides meaningful representations of such data



$V = \{A, B, C, D, E, F\}$

$E = \{(A, D); (D, B); (D, E); (D, F); (E, C)\}$

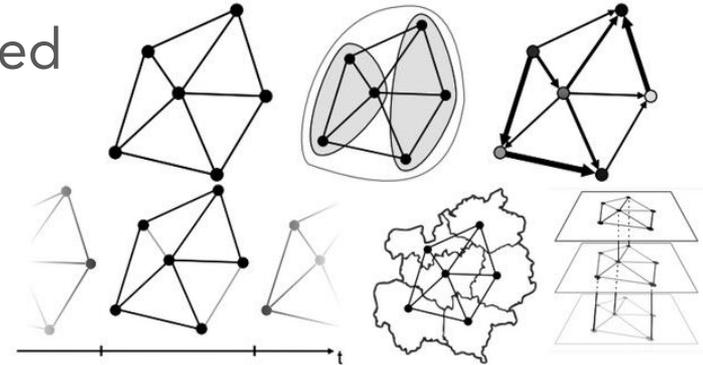
Network visualization is expanding and pursuing challenging topics

e.g., Dynamic, Multi-variate, Large, Geospatial networks

Research in these various topics is scattered

Classifications are often inconsistent

Lack of task taxonomies for most topics



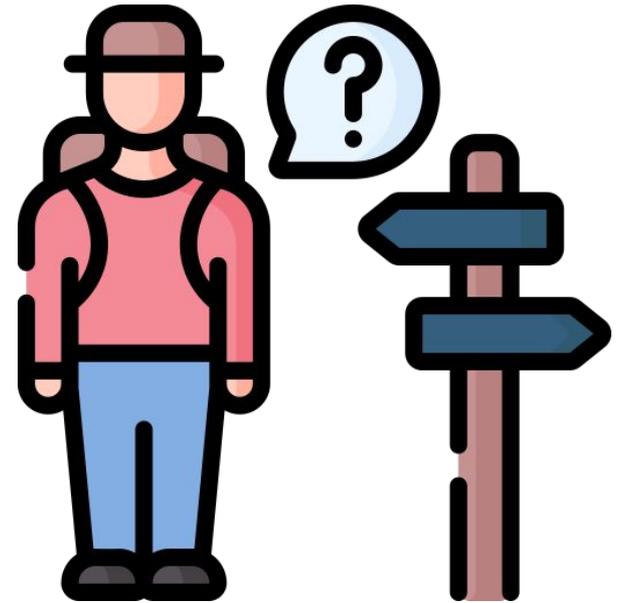
*Hadlak et al., "A survey of multi-faceted graph visualization.", 2015.*

# Motivation

Can be overwhelming

Overview easily lost

How can I contribute?



Difficult to answer questions like:

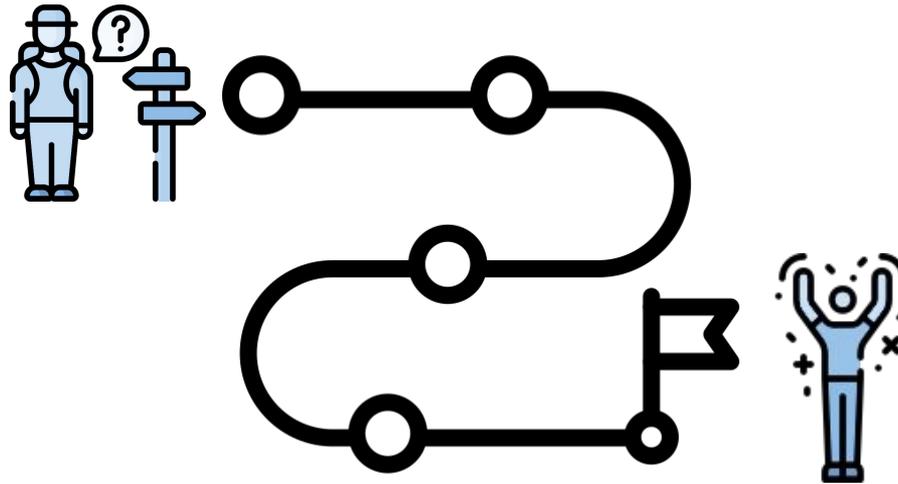
“What has already been done?”

“What areas are yet to be explored?”



# Our Goal

Provide a roadmap detailing the research directions in network visualization and relationships between them



Following PRISMA statement [Page et al., 2021]

Multiple refinement cycles

Forward and reverse lookup (citing or cited by)

Keywords:

*(Survey | STAR | Taxonomy | Design Space) & ((Graph | Network) Viz.)*



# Methodology

Publication venue	Count
TVCG	9
CGF	9
EuroVis	3
VIS	2
Information Visualization	3
AVI	2
Other	15

Total of 43 papers included

From an initial set of 152 papers

Filtered according to inclusion criteria

Window of interest 2000-2021



Survey inclusion criteria (SC):

SC1: Is a systematic review of literature about a specific branch of network visualization

SC2: Focus is on network visualization not algorithmic and graph theoretical contributions



Task taxonomy inclusion criteria (TC):

TC1: Has a categorization of tasks for a specific network visualization type

TC2: Is obtained empirically or by extending/adapting previous ones

TC3: Is formally evaluated and proved effective



Discipline inclusion criteria (DC):

DC1: Should have at least one survey dedicated to it

DC2: Data type should have unique characteristics alongside networked nature



# Related Work

We were inspired by the idea of a meta-survey

Meta Survey on InfoVis Surveys [McNabb et al., 2017]

86 surveys from InfoVis literature

Meta Survey on Text Visualization [Alharbi et al., 2018]

13 surveys from text analysis and visualization

Meta Survey on Interpretation of ML [Chatzimpampas et al., 2020]

18 surveys from ML about interpretability and explainability



*McNabb et al., "Survey of Surveys: Mapping the landscape of survey papers in information visualization", 2017*

*Alharbi et al., "SoS TextVis: A survey of surveys on text visualization", 2018*

*Chatzimpampas et al., "A survey of surveys on the use of visualization for interpreting machine learning models", 2020* 14

Introduction

Roadmap & Disciplines

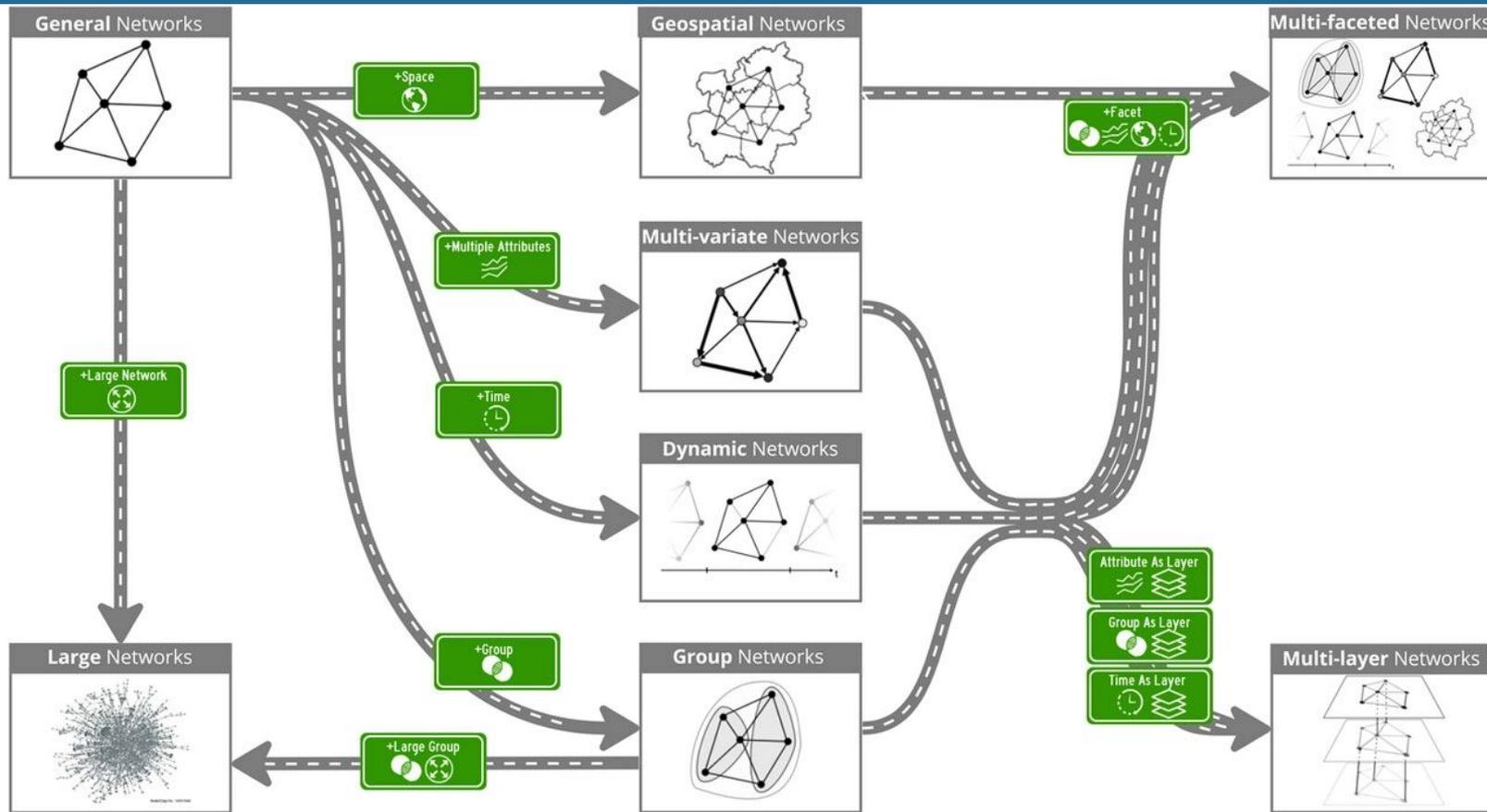
Task Taxonomies & Coverage

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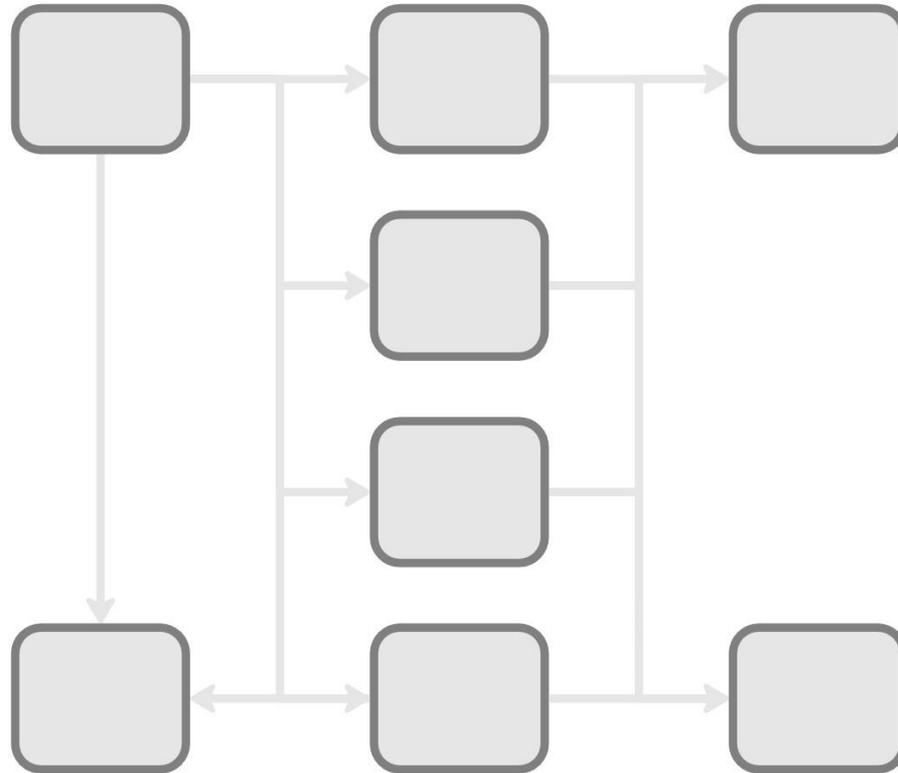
Open Challenges & Summary



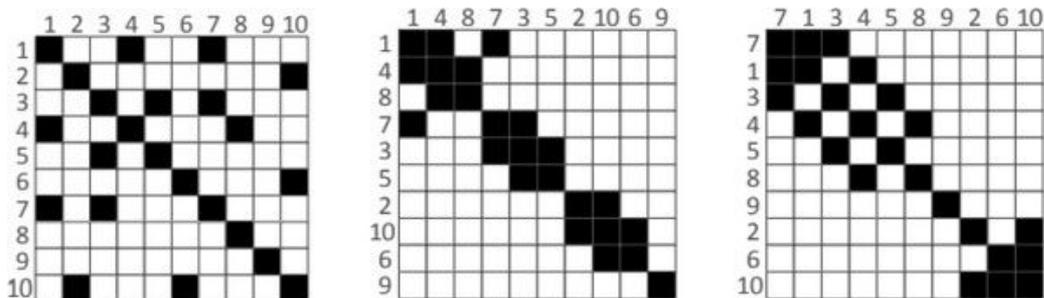
# The Roadmap



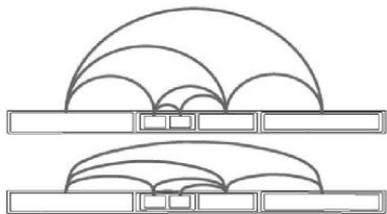
# Disciplines



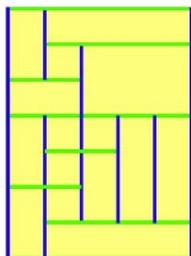
# General Network Visualization



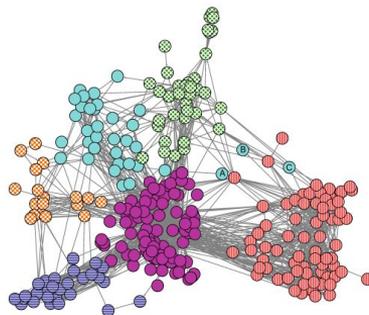
Behirsch et al., "Matrix reordering methods for table and network visualization", 2016



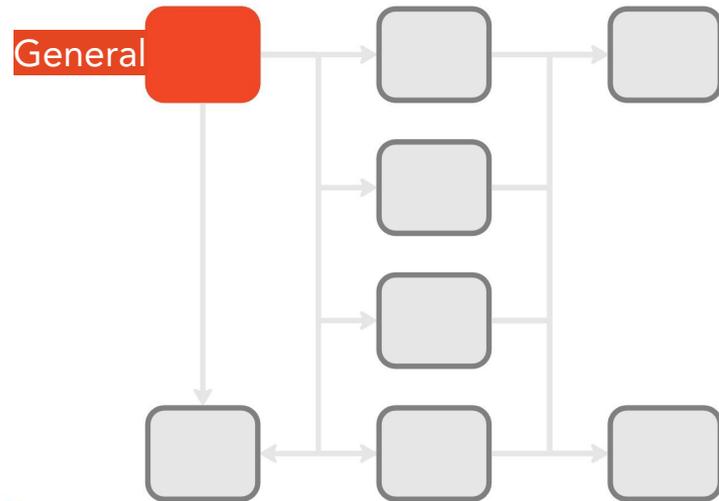
Neumann et al., "ArcTrees: Visualizing Relations in Hierarchical Data", 2005



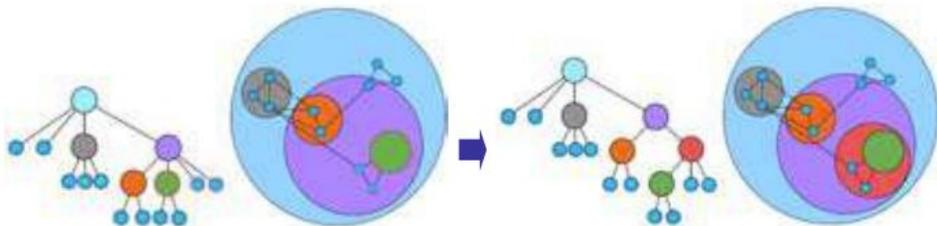
Battista et al., "Graph Drawing Algorithms for the Visualization of Graphs", 1999



Gibson et al., "A survey of two-dimensional graph layout techniques for information visualisation", 2013

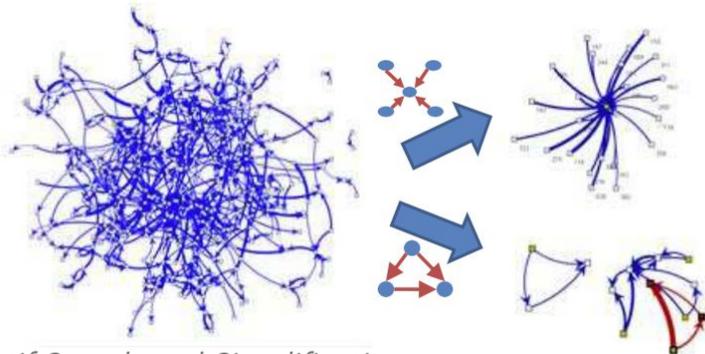


# Large Network Visualization



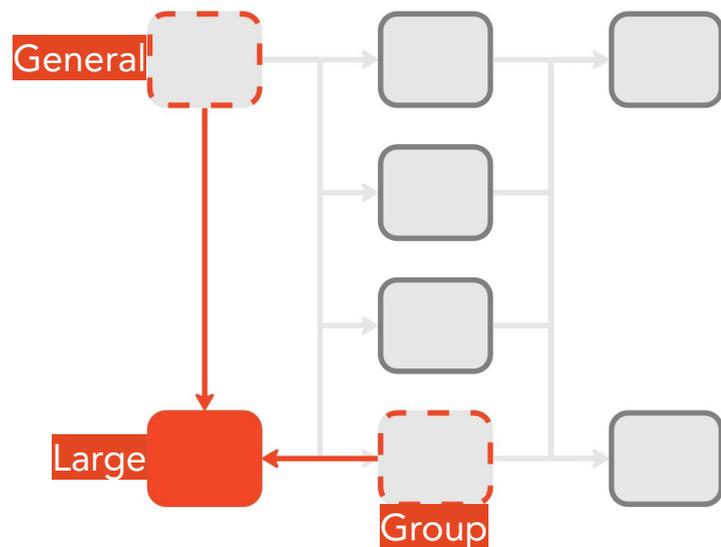
*Aggregating nodes*

*Archambault et al., "Steerable exploration of graph hierarchy space", 2008*

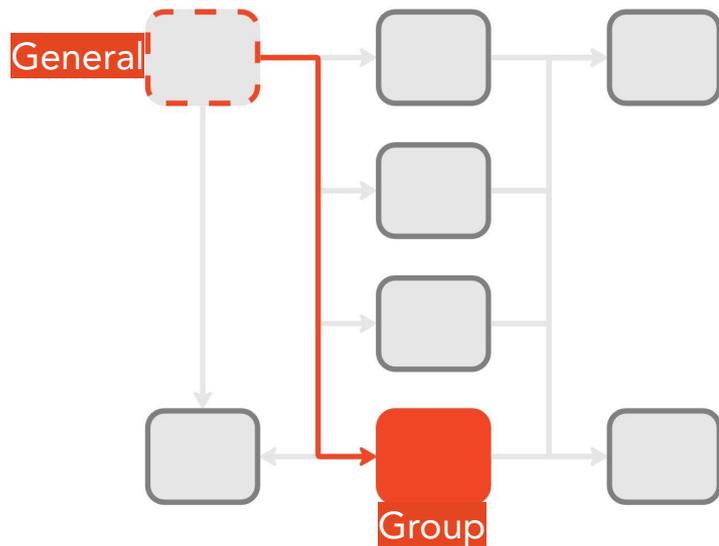
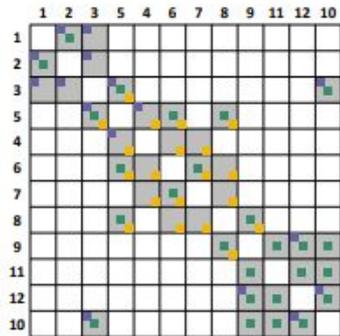
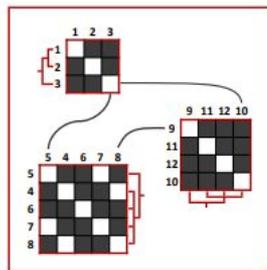
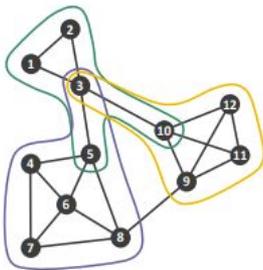
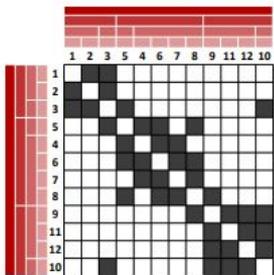
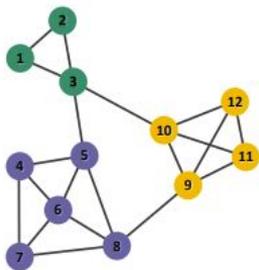


*Graph Motif Search and Simplification*

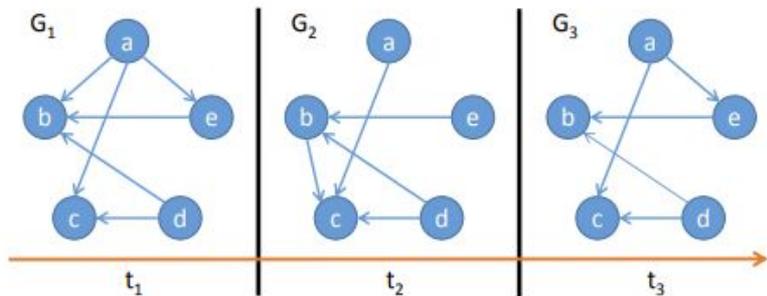
*von Landesberger et al., "A system for interactive visual analysis of large graphs using motifs in graph editing and aggregation", 2009*



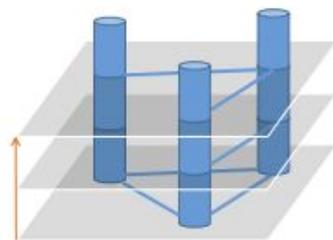
# Group Network Visualization



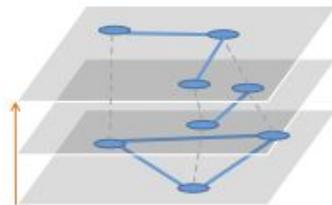
# Dynamic Network Visualization



Juxtaposition

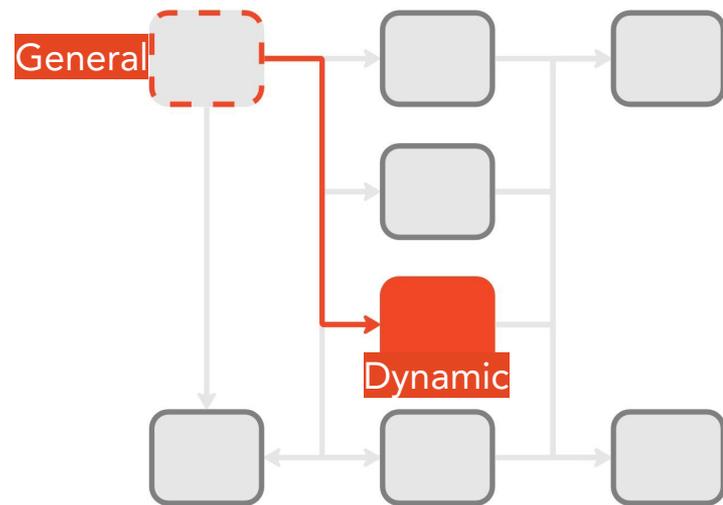


fixed positions

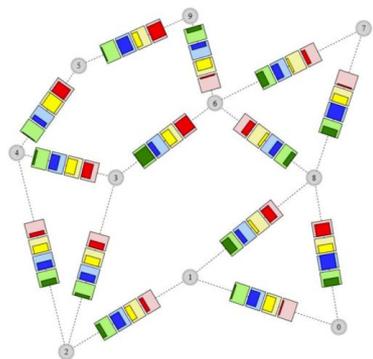


relaxed positions

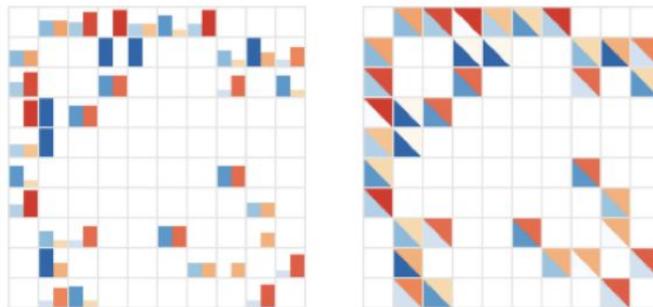
Superimposition



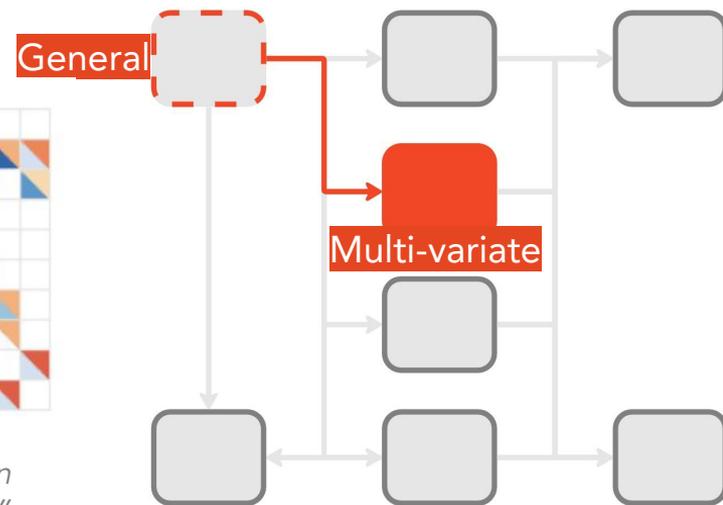
# Multi-variate Network Visualization



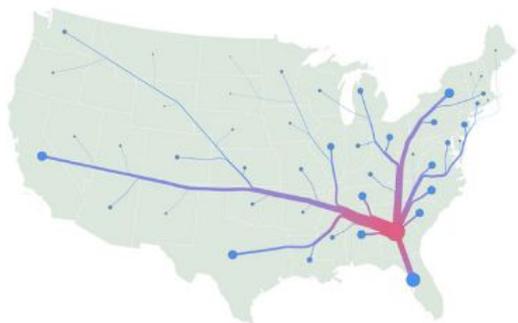
Schöffel et al., "A User Study on Multivariate Edge Visualizations for Graph-Based Visual Analysis Tasks", 2016



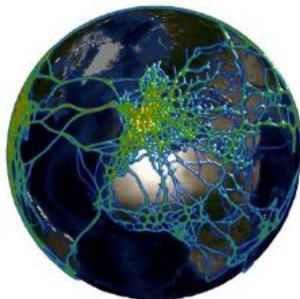
Alper et al., "Weighted graph comparison techniques for brain connectivity analysis", 2013



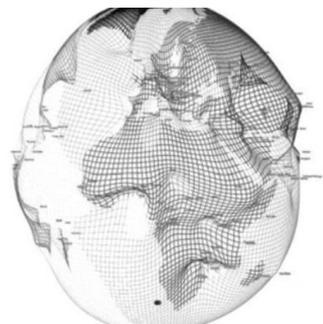
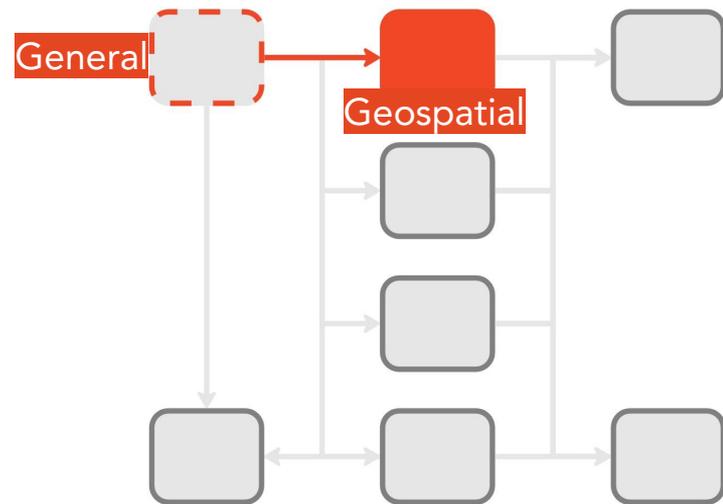
# Geospatial Network Visualization



Sun, "A spatial one-to-many flow layout algorithm using triangulation, approximate Steiner trees, and path smoothing", 2019

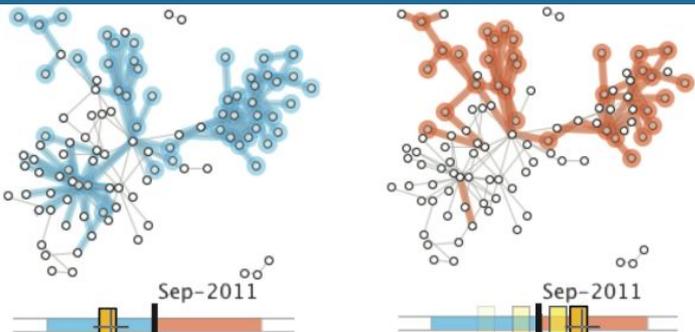


Lambert et al., "Winding Roads: Routing edges into bundles", 2010

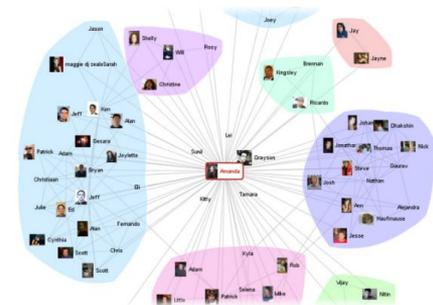


Alper et al., "Dynamic visualization of geographic networks using surface deformations with constraints", 2007

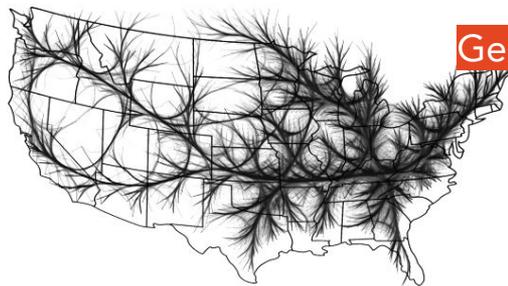
# Multi-faceted Network Visualization



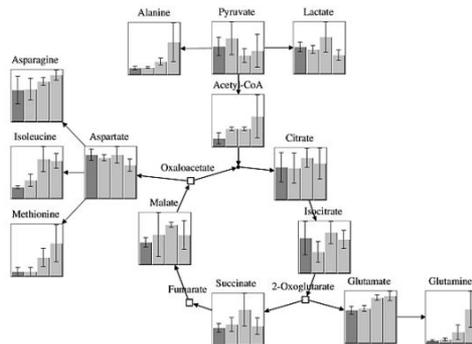
Bach et al., "GraphDiaries: Animated transitions and temporal navigation for dynamic networks", 2014



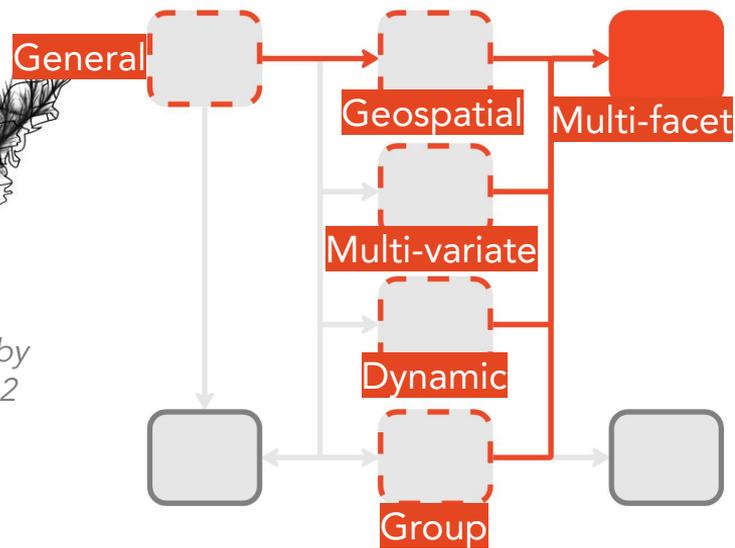
Heer et al., "Vizster: Visualizing online social networks", 2005



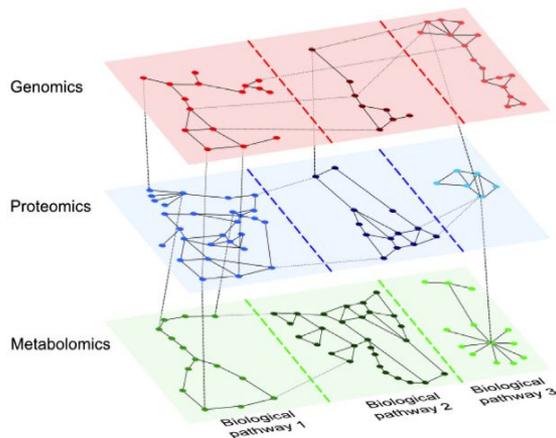
Hurter et al., "Graph bundling by kernel density estimation", 2012



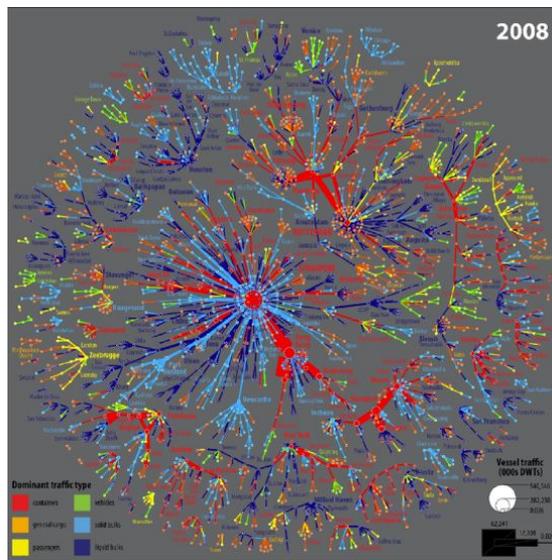
Borisjuk et al., "Integrating data from biological experiments into metabolic networks with the DBE information system", 2005



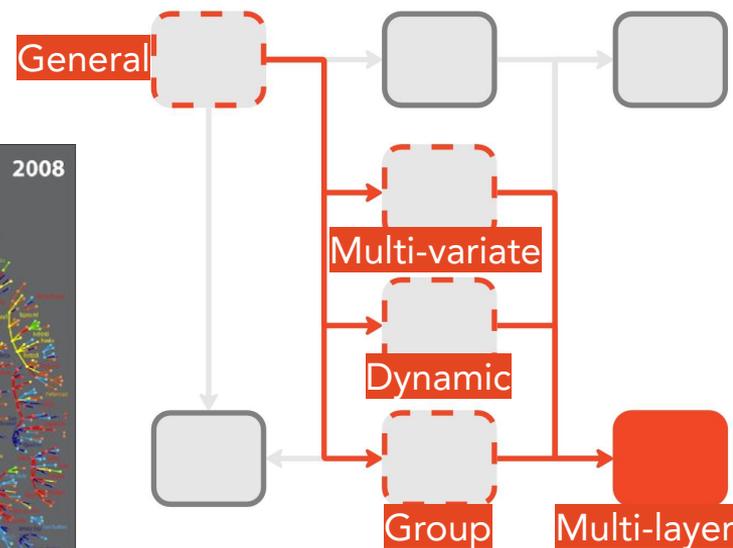
# Multi-layer Network Visualization



McGee et al., "The state of the art in multilayer network visualization.", 2019



Ducruet et al., "Multilayer dynamics of complex spatial networks: The case of global maritime flows (1977–2008)", 2017



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Roadmap & Disciplines

Task Taxonomies & Coverage

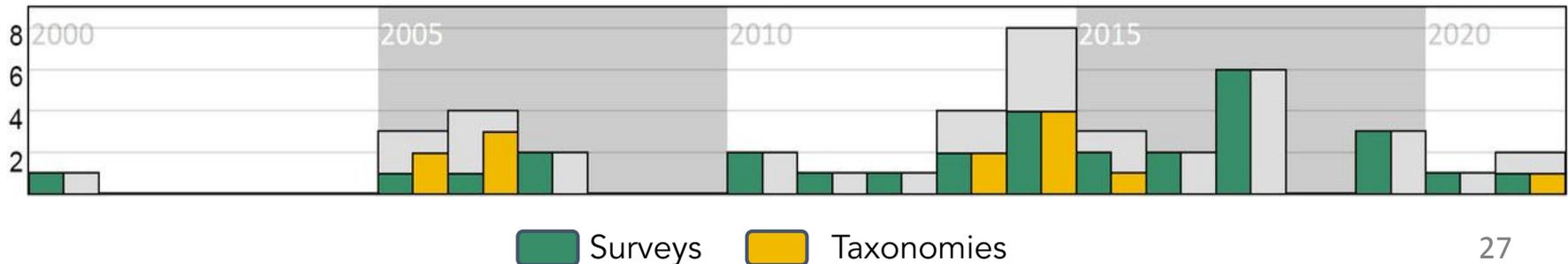
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# Task Taxonomies

Taxonomies are *lagging* behind survey literature  
Majority of disciplines lack a dedicated task taxonomy  
No clear relationship between existing taxonomies  
We categorize these based on their support and tasks



Coverage refers to the existence of a taxonomy for a specific discipline



**Specialized:** specific to the target discipline and fully supports task for that data type

Supports comparing approaches for standard tasks



**Generalized:** more abstract tasks covering a broader range of data types

Can be extended/adapted for network disciplines that lack one

# Generalized → Specialized



Adrienko & Adrienko, 2006

-----▶  
*For dynamic network visualization*

Kerracher et al., 2015

+

Graph data



Lee et al., 2006

+

-----▶  
*For multi-variate network visualization*

Pretorius et al., 2014

Valiati et al., 2006

*Adrienko & Adrienko, "Exploratory Analysis of Spatial and Temporal Data: A Systematic Approach.", 2006*

*Valiati et al., "A taxonomy of tasks for guiding the evaluation of multidimensional visualizations.", 2006*

*Lee et al., "Task taxonomy for graph visualization.", 2006*

*Kerracher et al., "A task taxonomy for temporal graph visualisation.", 2015*

*Pretorius et al., "Tasks for Multivariate Network Analysis.", 2014*

# No Support

Disciplines that lack a dedicated task taxonomy for their data type:



Large [von Landesberger et al., 2011]

Geospatial [Schöttler et al., 2021]

Multi-faceted [Hadlak et al., 2015]

Multi-layer [McGee et al., 2019]

*von Landesberger et al., "Visual analysis of large graphs: State-of-the-art and future research challenges.", 2011*

*Schöttler et al., "Visualizing and interacting with geospatial networks: A survey and design space.", 2021*

*Hadlak et al., "A survey of multi-faceted graph visualization.", 2015*

*McGee et al., "Visual analysis of large graphs: State-of-the-art and future research challenges.", 2019*

# Task Taxonomies Overview

## Coverage Overview

 Generalized Support     Specialized Support     No Support

General	Large	Group	Dynamic	Multi-variate	Geospatial	Multi-faceted	Multi-layer
							
							

# Constructing Taxonomies



Geospatial Network  
Visualization  
Taxonomy?



Lee et al., 2006  
+  
Roth, 2013



Specialized Task Taxonomy  
for Geospatial Network  
Visualization



Graph analysis tasks



Geovisualization tasks

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**Discussion & Results**

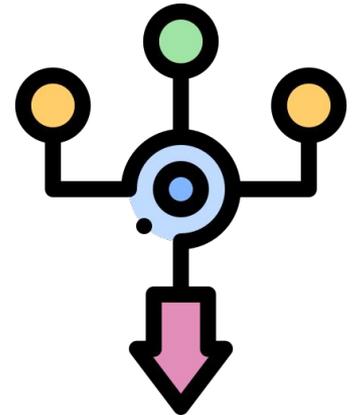
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We found inconsistencies in terminology and classifications

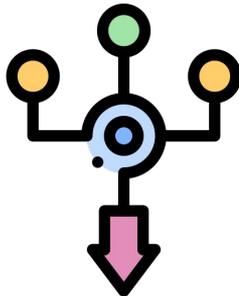
This motivated us to establish a common dictionary across disciplines

Our consolidation has 6 higher-level groups



# Consolidation

Facet Composition  
 Network Representation  
 Entity Encoding  
 Dimensionality  
 Layout  
 Aesthetic Criteria



	Terminology	General	Large	Multi-faceted	Group	Dynamic	Multi-variate	Geospatial	Multi-layer
Facet Composition	Superimposition			[HSS15]	[VBW17]	[KKC14], [BBDW17], [BDA17]		[Rod05], [SYPB21]	[KAB14], [XLSPI7], [MGF19]
	Juxtaposition	[GK10], [LHT17]	[vLKS11]	[HSS15]	[VBW17]	[MMB05], [KKC14], [BBDW17], [BDA17]	[AAK14], [NMSL19]	[SYPB21]	[KAB14], [XLSPI7], [MGF19]
	Animation	[GK10], [LHT17]	[vLKS11]	[HSS15]		[MMB05], [KKC14], [SL17], [BBDW17], [BDA17]	[AAK14]		[MGF19]
	Timeline		[vLKS11]	[HSS15]			[AAK14]		
	Integration	[GK10], [CGZ19]				[SL17], [BBDW17]	[KPW14], [NMSL19]	[SYPB21]	[MGF19]
	Nesting			[HSS15]		[KKC14]		[SYPB21]	
	Embedding				[VBW17]	[KKC14]			
	Overloading Multiple Views	[GK10], [CGZ19]	[PAKC15]	[HSS15]	[VBW17]	[KKC14]	[NMSL19]	[KPW14], [AAK14], [NMSL19]	[Rod05]
Network Representation	Node-Link	[HMM00], [SS06], [GK10], [WNF16], [CGZ19], [LHT17], [WNF16], [CGZ19], [LHT17], [WNF16], [CGZ19]	[vLKS11], [PAKC15]	[HSS15]	[SHS10], [VBW17]	[MMB05], [KKC14], [SL17], [BBDW17], [BDA17]	[KPW14], [AAK14], [NMSL19]	[Rod05], [Wol07], [SYPB21]	[KAB14], [XLSPI7], [MGF19]
	Matrix	[SS06], [GK10], [BBHR16], [CGZ19]	[vLKS11], [PAKC15]	[HSS15]	[VBW17]	[KKC14], [SL17], [BBDW17], [BDA17]	[AAK14], [NMSL19]	[SYPB21]	[KAB14], [XLSPI7], [MGF19]
	List	[GK10]				[SL17], [BBDW17]			
	Space-filling	[HMM00], [SS06], [GK10], [WNF16], [CGZ19]	[vLKS11]	[HSS15]	[SHS10]	[KKC14]	[NMSL19]		
	Hybrid	[WNF16], [CGZ19]	[vLKS11], [PAKC15]	[HSS15]	[VBW17]	[KKC14], [BBDW17]	[KPW14], [NMSL19]	[SYPB21]	[MGF19]
	Alternative	[ZXYQ13], [LHT17], [CGZ19]	[vLKS11]			[KKC14], [BDA17]	[AAK14], [NMSL19]	[SYPB21]	[MGF19]
	Entity Encoding	Node	[HMM00], [SS06], [GK10], [WNF16], [CGZ19]	[vLKS11], [PAKC15]	[HSS15]	[SHS10], [VBW17]	[KKC14], [BBDW17], [BDA17]	[KPW14], [NMSL19]	[SYPB21]
Link	[HMM00], [SS06], [GK10], [ZXYQ13], [WNF16], [LHT17], [CGZ19]	[vLKS11], [PAKC15]	[HSS15]	[SHS10], [VBW17]	[KKC14], [BBDW17], [BDA17]	[NMSL19]	[Wol07], [SYPB21]		
Network	[HMM00], [SS06], [GK10], [BBHR16], [LHT17], [CGZ19], [CS20]	[vLKS11], [PAKC15]	[HSS15]	[SHS10], [VBW17]	[MMB05], [KKC14], [BBDW17], [BDA17]	[NMSL19]	[SYPB21]	[KAB14]	
Dimensionality	1D	[GK10], [CGZ19]			[VBW17]			[SYPB21]	[MGF19]
	2D	[HMM00], [SS06], [GK10], [WNF16], [CGZ19], [LHT17], [WNF16], [CGZ19], [LHT17], [WNF16], [CGZ19]	[vLKS11], [PAKC15]	[HSS15]	[SHS10], [VBW17]	[MMB05], [KKC14], [SL17], [BBDW17]	[KPW14], [AAK14], [NMSL19]	[Rod05], [Wol07], [SYPB21]	[KAB14], [XLSPI7], [MGF19]
	2.5D	[SS06]		[HSS15]		[KKC14], [BBDW17]			[MGF19]
	3D	[HMM00], [SS06], [GK10], [LHT17], [CGZ19]	[vLKS11]	[HSS15]	[SHS10], [VBW17]	[KKC14], [BBDW17], [BDA17]	[AAK14]	[Rod05], [SYPB21]	[KAB14], [XLSPI7], [MGF19]
Layout	Energy-based	[HMM00], [SS06], [GK10], [WNF16], [CGZ19], [LHT17], [WNF16], [CGZ19], [LHT17], [WNF16], [CGZ19]	[vLKS11], [PAKC15]	[HSS15]	[VBW17]	[MMB05], [SL17], [BBDW17]	[AAK14], [NMSL19]	[Rod05], [Wol07]	[XLSPI7], [MGF19]
	Heuristic	[ZXYQ13], [BRSG07], [Kob12], [BBHR16], [CS20]			[VBW17]		[AAK14]	[Wol07]	
	Embedding (DR)	[GFV13], [BBHR16], [CGZ19], [CS20]	[vLKS11]				[AAK14]		[XLSPI7]
	Tabular	[GK10], [BBHR16]							
	Geometrical	[HMM00], [SS06], [GK10], [Kob12], [WNF16]	[vLKS11], [PAKC15]	[HSS15]	[SHS10]	[SL17], [BBDW17]	[NMSL19]	[Rod05]	[MGF19]
Aesthetic Criteria	Special-purpose	[HMM00], [SS06], [BRSG07], [GFV13], [ZXYQ13], [LHT17], [CGZ19]	[vLKS11], [PAKC15]	[HSS15]	[VBW17]	[MMB05], [SL17], [BBDW17]	[AAK14], [NMSL19]	[Rod05], [Wol07]	[XLSPI7], [MGF19]
	Nodes	[HMM00], [BRSG07], [GFV13], [WNF16], [CS20]	[vLKS11]		[SHS10]	[BBDW17]		[Wol07]	
	Links	[HMM00], [BRSG07], [GFV13], [WNF16], [CS20]	[vLKS11]			[BBDW17]		[Wol07]	
	Mental Map	[Kob12]	[vLKS11]					[Rod05]	
Aesthetic Criteria	Network	[HMM00], [BRSG07], [Kob12], [GFV13], [WNF16], [CS20]	[vLKS11]			[BBDW17]		[Wol07]	

(see paper for definitions)

Facet Composition

Network Representation

Entity Encoding

Dimensionality

Layout

Aesthetic Criteria

Superimposition

Juxtaposition

Animation

Timeline

Integration

Nesting

Embedding

Overloading

Multiple View

*Javed & Elmqvist, "Exploring the design space of composite visualization", 2012*

*Gleicher et al., "Visual comparison for information visualization", 2011*

Facet Composition

Network Representation

Entity Encoding

Dimensionality

Layout

Aesthetic Criteria

Superimposition

**Juxtaposition**

Animation

Timeline

Integration

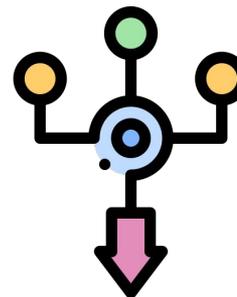
Nesting

Embedding

Overloading

Multiple View

"small multiples"  
"multiple time slices"  
"static flip books"



"Juxtaposition"

# Consolidation

Facet Composition

Network Representation

Entity Encoding

Dimensionality

Layout

Aesthetic Criteria

Energy-based

Heuristic

Embedding/Dimensionality Reduction

Tabular

Geometrical

Special-purpose

Facet Composition

Network Representation

Entity Encoding

Dimensionality

Layout

Aesthetic Criteria

Energy-based

Heuristic

Embedding/Dimensionality

Tabular

Geometrical

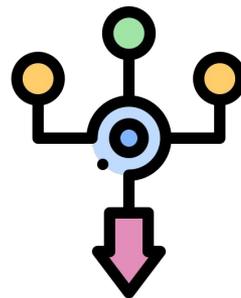
Special-purpose

“force-directed layout”

“spring layout”

“spring-embedder”

“spring-electrical layout”



“Energy-based”

Resulted in a *heatmap* (most and least popular concepts)



General network visualization most popular

2-D, node-link, energy-based layouts most discussed

Dynamic network visualization second most popular

Juxtaposition and animation most used for temporal facet

Balance between node-link and matrix based approaches

Energy-based layouts most widely used

Resulted in a *heatmap* (most and least popular concepts)



Aesthetic criteria not commonly researched outside of dynamic and general network visualization

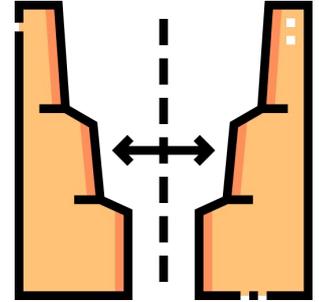
Possibly different aesthetic criteria for multi-variate, multi-layer, multi-faceted, and group network visualization?

Interesting gaps

Matrices not experimented with as much as other techniques

Hybrid & Alternative visualization techniques scarcely explored

Uncertainty in networks is discussed a lot but under-investigated



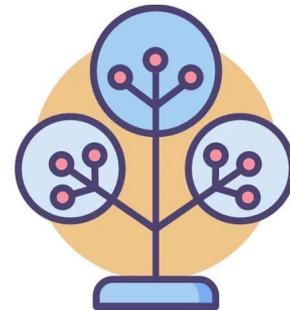
# Results - Taxonomies

How do the different task classifications relate?  
Derived a classification of tasks from literature  
Connected individual tasks and considered overlaps  
Three main categories influenced by Amar et al.

Topology

Analytic Activity

Facet

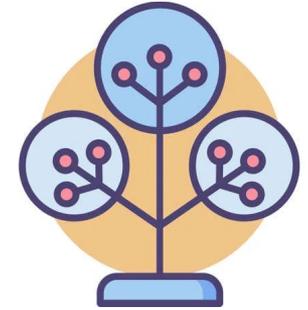


# Consolidation

Topology tasks extensively covered

Operational tasks not widely explored

Operations that do not achieve a result in analysis



Time, Space, and Group facets scarcely explored as specific tasks

Topology				Analytic Activity			Facet			
Nodes	Links	Sub-networks	Networks	Operational	Analytical	Cognitive	Time	Space	Multi-variate	Group
7	7	6	5	1	7	4	3	0	5	2
				7-6	5-4	3-0				

Introduction

Roadmap & Disciplines

Task Taxonomies & Coverage

Discussion & Results

Open Challenges & Summary



## Novel Visualization Metaphors

Size, heterogeneity, and dimensionality of networks is ever-increasing

New and alternative visualization techniques for networks have been discussed as open challenges across multiple surveys



# Ongoing Challenges

## Evaluation Methodologies

Some disciplines lack specialized taxonomies  
Hindering formal evaluations/comparisons

Network visualization is increasing in complexity  
Traditional performance metrics may not be the best  
Focus on cognitive aspects, perception, and engagement



# Ongoing Challenges

## Interaction Techniques

Highlighted as interesting from numerous surveys

No classification or survey on interaction techniques for network visualization

Interactions to support human-assisted analysis

Combining domain expert and automated analysis



# Ongoing Challenges

## Collaborative Analysis

Has big potential moving forward

Facilitating understanding and communication among collaborators

Gaining deeper insights leveraging collective intelligence

Working together synchronously or asynchronously

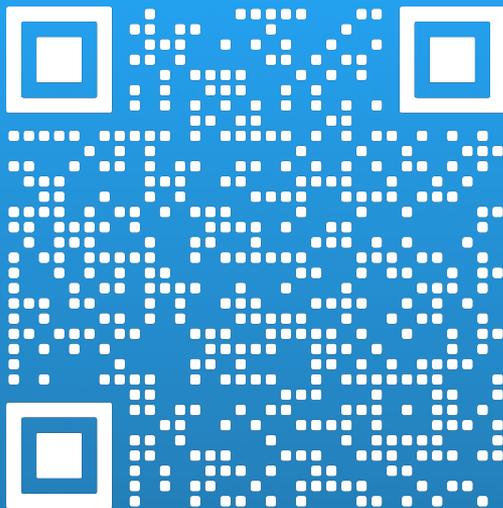


# Conclusion

Q: *"Are we there yet?"*

A: *"No, not really."*





Our paper

# Thank you!

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[velitchko.filipov@tuwien.ac.at](mailto:velitchko.filipov@tuwien.ac.at)





# Questions and Discussion

Open forum for questions and discussion  
*meta-survey of network visualization*



# Taxonomies Coverage



- Low-level tasks for InfoVis [Amar et al., 2005]
- Exploratory analysis of spatio-temporal data [Adrienko & Adrienko, 2006]
- Multi-level typology of abstract visualization tasks [Brehmer & Munzner, 2013]
- High-level multi-dimensional visualization analysis tasks [Valiati et al., 2006]
- Tasks for interactive cartography and geovisualization [Roth, 2013]



- General Network Visualization [Lee et al., 2006; Pandey et al., 2021]
- Group Structure Visualization [Saket et al., 2014]
- Dynamic Network Visualization [Ahn et al., 2016; Bach et al., 2014; Kerracher et al., 2015]
- Multi-variate Network Visualization [Pretorius et al., 2014]

Amar et al., "Low-level components of analytic activity in information visualization.", 2005

Adrienko & Adrienko, "Exploratory Analysis of Spatial and Temporal Data: A Systematic Approach.", 2006

Brehmer & Munzner, "A multi-level typology of abstract visualization tasks.", 2013

Valiati et al., "A taxonomy of tasks for guiding the evaluation of multidimensional visualizations.", 2006

Roth, "An empirically-derived taxonomy of interaction primitives for interactive cartography and geovisualization.", 2003

Lee et al., "Task taxonomy for graph visualization.", 2006

Pandey et al., "A state-of-the-art survey of tasks for tree design and evaluation with a curated task dataset.", 2021

Saket et al., "Group-level graph visualization taxonomy." 2014

Ahn et al., "A task taxonomy for network evolution analysis." 2016

Bach et al., "GraphDiaries: Animated transitions and temporal navigation for dynamic networks.", 2014

Kerracher et al., "A task taxonomy for temporal graph visualisation.", 2015

Pretorius et al., "Tasks for Multivariate Network Analysis.", 2014



Low-level tasks for InfoVis

[Amar et al., 2005]

Tasks for exploratory analysis of spatio-temporal data

[Adrienko & Adrienko, 2006]

Multi-level typology of abstract visualization tasks

[Brehmer & Munzner, 2013]

High-level multi-dimensional visualization analysis tasks

[Valiati et al., 2006]

Tasks for interactive cartography and geovisualization

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## General Network Visualization

[Lee et al., 2006; Pandey et al., 2021]

## Group Structure Visualization

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## Dynamic Network Visualization

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## Multi-variate Network Visualization

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*Lee et al., "Task taxonomy for graph visualization.", 2006*

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