**Common Design Strategies for Exploring Signaling Networks in Biology and Intellectual Geographies in History** Erica Savig, M.Arch. PhD Candidate, Cancer Biology Stanford University Lab of Garry P. Nolan National Science Foundation Graduate **Research Fellow** Stanford Graduate Research Fellow

> Nicole Coleman Director, Humanities + Design Stanford University

#### **Embedding Subjective User-Specific Perspectives into Visualizations**

## Architecturalizing Mass Cytometry Data

- Constructing User-Specific Mental Models
- New Direction: Tapping into Perceptual Potentials By Using Natural Forms and Qualitative Features

## Mapping the Republic of Letters

- Allowing User-Defined Data Models
- New Direction: Tapping into Domain Expertise by Building Contextual Schema Through an Interactive Visual Interface

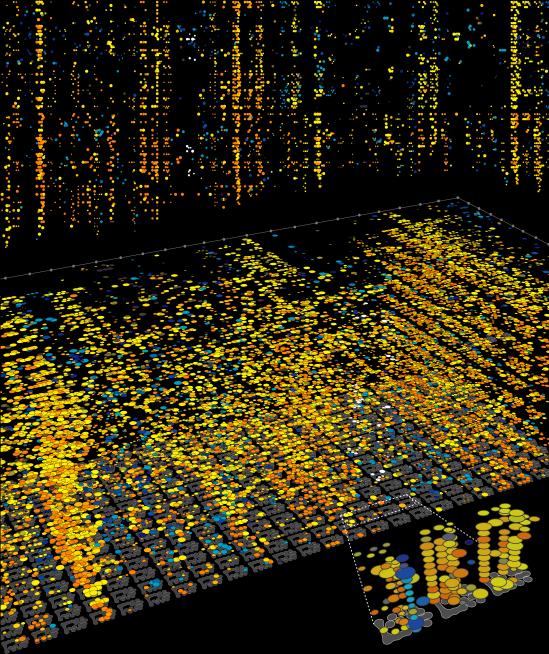
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Cover of Nature Biotech, Sept 2012.

Mass Cytometry Data on Biological Systems is Large, Hyper-Dimensional, and Complex

1.2B data points:
1 patient blood sample
24 drugs
2M cells per drug
25 phospho-proteins per cell

reduced and visualized as

113,000 data points:
1 patient blood sample
24 drugs (x axis)
12 stimulation conditions (z axis)
12 cell types (y axis)
14 phospho-proteins per cell
(nested diagram)
2 drug measures (circle size & color)

## **Extended Information Context**

**Patients** have very different cancers

#### **Patient Stratification** allows for the

development of therapies per "type" of cancer, and for physicians to ultimately be able to treat each patient uniquely

**Tumors** consist of a variety of types of cells, including cancer cells and *immune cells* 

within a cell type

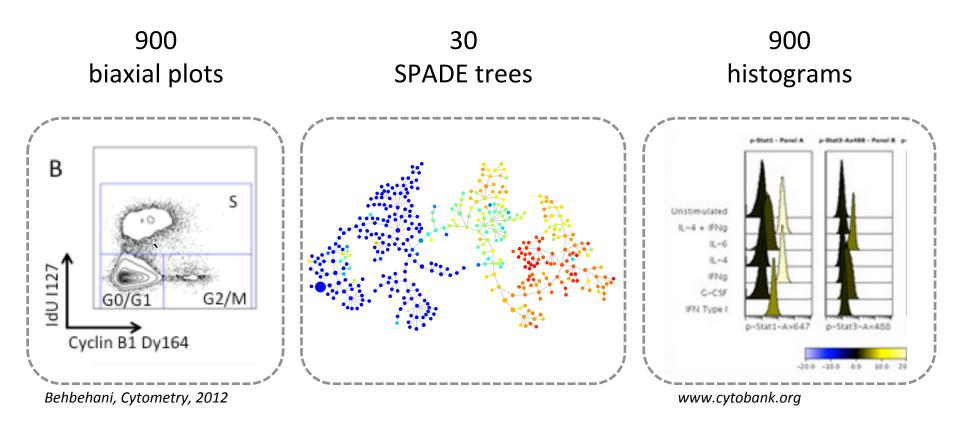
Natural Killer Cells CD8+T cells  $\bigcirc$ T regs MDSCs Bevacizumab **Single Cells** have variations of behaviors even

**Céll Types** have unique and shared behaviors; some *cells fight cancer cells while* others reinforce them; cell types can indicate the aggressiveness of cancer; they can also be used as cell therapies

#### **Proteins**

on, within and secreted by cells enable us to identify specific cell behaviors; they are often targeted for drug therapies

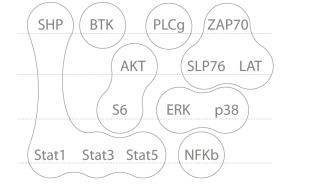
For a <u>single patient and single experimental condition</u>... (assuming 30 cell types and 30 proteins measured)

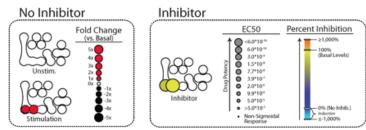


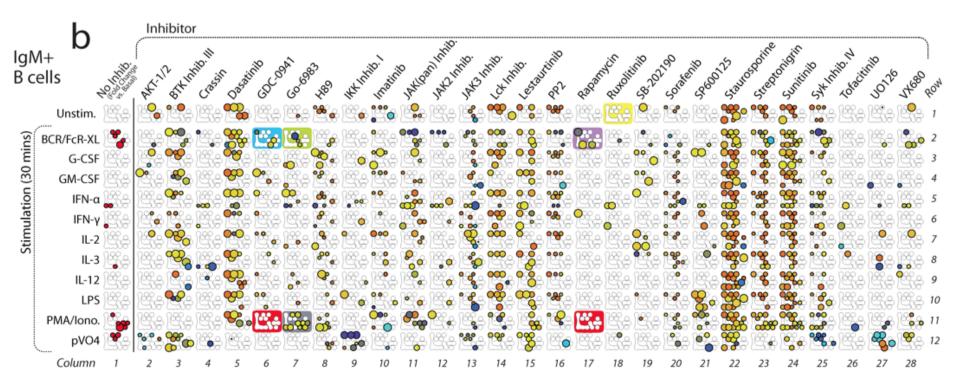
increasing scale of data context

## **Nested Organizations Visualize Data Across Scales**

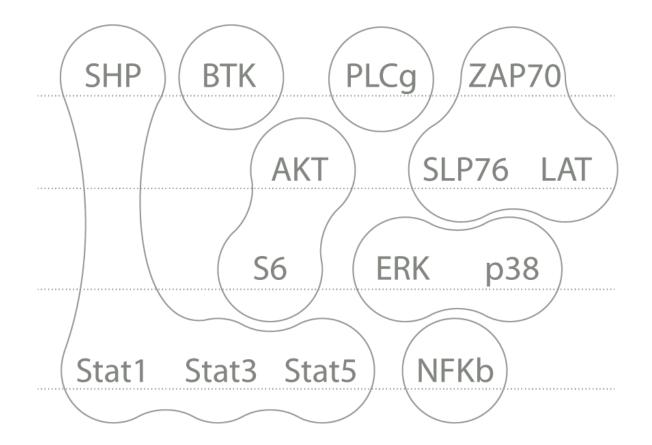
The diagram provides a layer of **organization** to view more data, and embeds **contextual** information to ease interpretation.





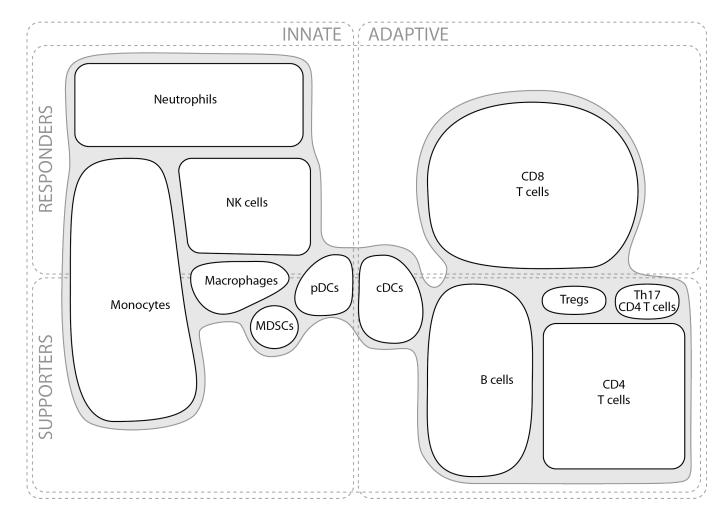


Bodenmiller, et al. Nature Biotech. Sept 2012.



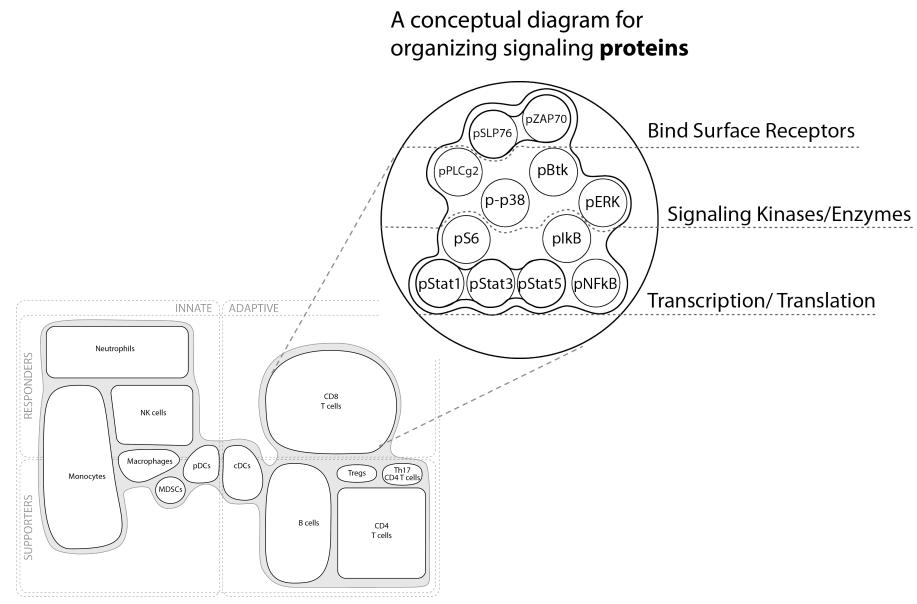
Example of a conceptual diagram for organizing signaling data on single phospho-proteins – a "signaling network," so to speak

Erica Savig and Bernd Bodenmiller



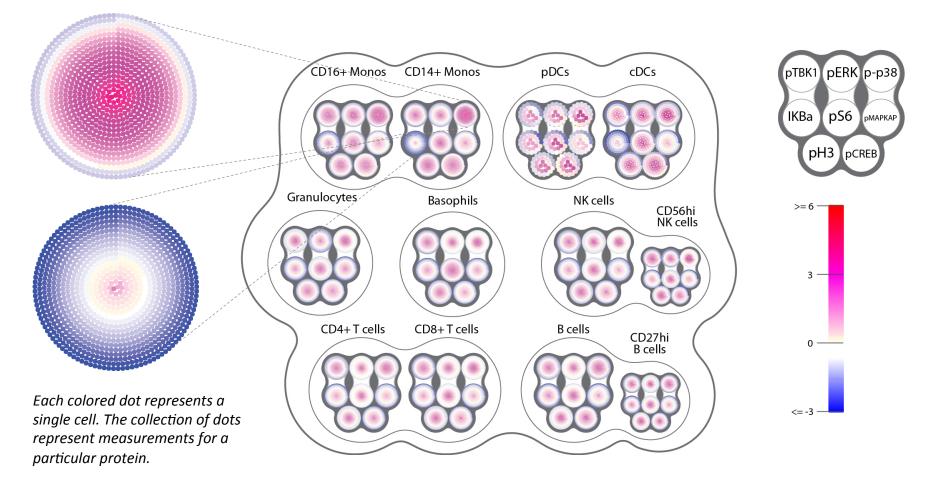
#### A conceptual diagram for organizing immune **cell types**. *Erica Savig and Gabi Fragiadakis*

#### **Nesting Contextual Organizations Supports Synthesis of Data Across Scales**



Erica Savig and Gabi Fragiadakis

## **Mental Maps and Nesting Improve Data Exploration**

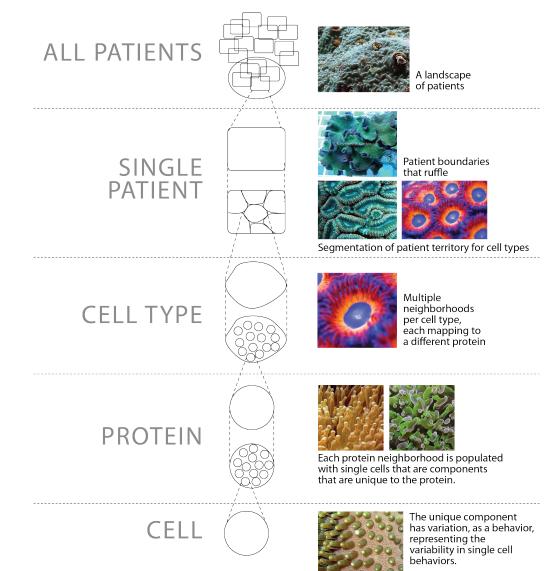


Flagelin stimulation of peripheral blood mononuclear cells\_

the difference in protein levels between the stimulation state of single cells and the basal/unstimulated state of the median per cell type. Erica Savig, Elena Hsu and Bill O'Gormon

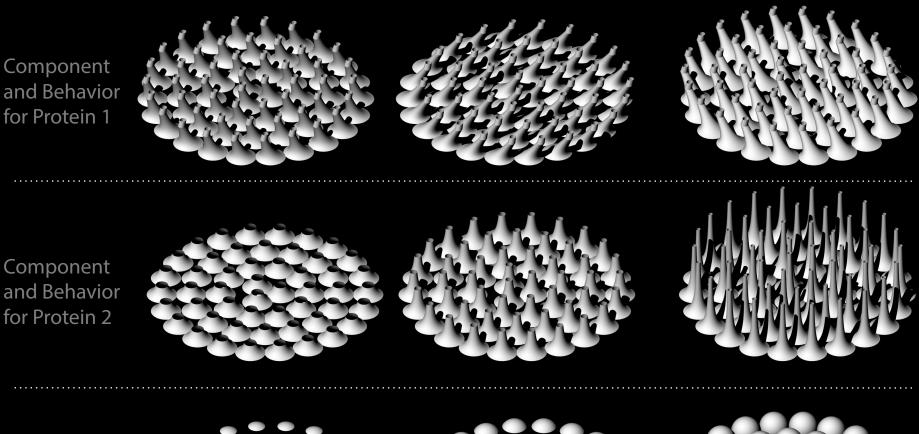
## New Direction: Tapping into Perceptual Potentials

Using Natural Forms and Qualitative Features to Offer Substantive Representations for Offloading Existing and New Knowledge

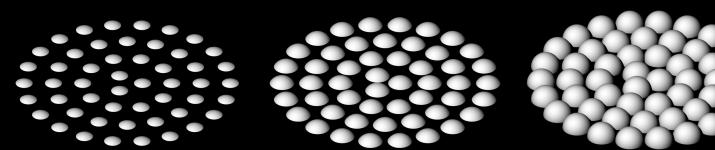


#### Parametric Modeling Quantitatively Maps Single Cell Protein **Levels to Individual Qualitative Components**

Component and Behavior for Protein 1



Component and Behavior for Protein 3



#### **Designing Qualitative Multi-Scalar Data Architectures**

Considerations To Be Addressed:

- Selecting Appropriate Representations Per Protein
- Maintaining Contextual Organization at Various Scales
- Maintaining Data Structure within Architectural Relationships
- Bottom-Up Emergent Representations Across Scales
- Total Synthesis

Example of 5 different "cell types" with different combinations of "protein responses" for 3 different proteins.

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Joseph Priestley's Chart of Biography, 1765

Early Modern Historical Data is Heterogeneous, Multi-dimensional, and Incomplete

We are attempting to understand the intellectual communities that made up the "Republic of Letters" through case studies spanning three centuries, based on

# hundreds of thousands of documents

(mostly letters) and biographical data on tens of thousands of individuals.

#### The Information Context: Biographical + Correspondence

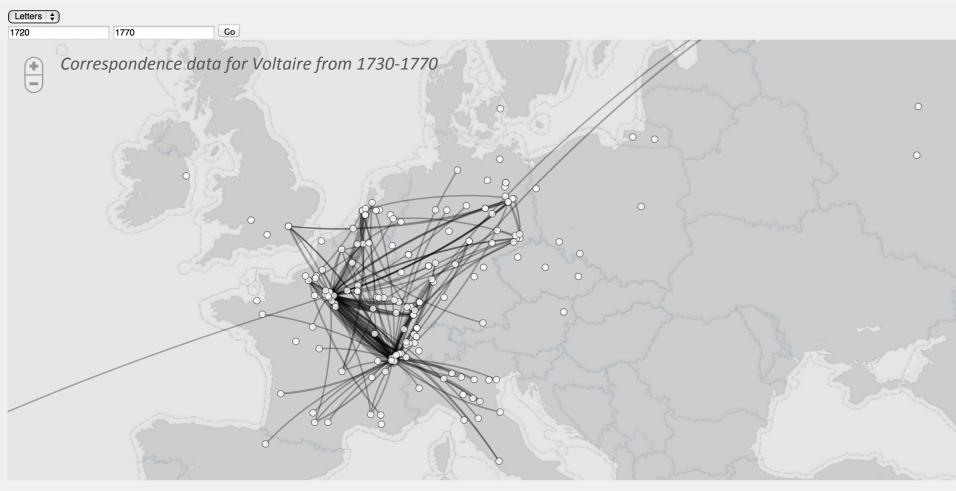


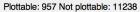
## **Current Visualizations Do Not Accommodate Incomplete and Imprecise Data**

deorac

#### Flight Pattern Maps Timelines **Network Graphs** om TSBD Office Tippit calls HO Oswald seen at hus stop. Police says Tippit shot Homicide Chief calls JFK pronounced dead Tippit's body discovered Rifle found TSBD ordered cut off Police car outside Oswald's home Oswald inside Texas theatre ice radio assassin's location Bullet 399 discovered Officer Tippit calls HQ twice Police rad TV reports shots cription on police radio Fake secret service agent pulled over Hulls found on 6th floor of TSBD rds taxi Oswald seen entering Texas Theater t.o.d. aconvention 13:00 shot 13:00 11:00 12:00

## **Spatial-Temporal-Relational Dynamics**

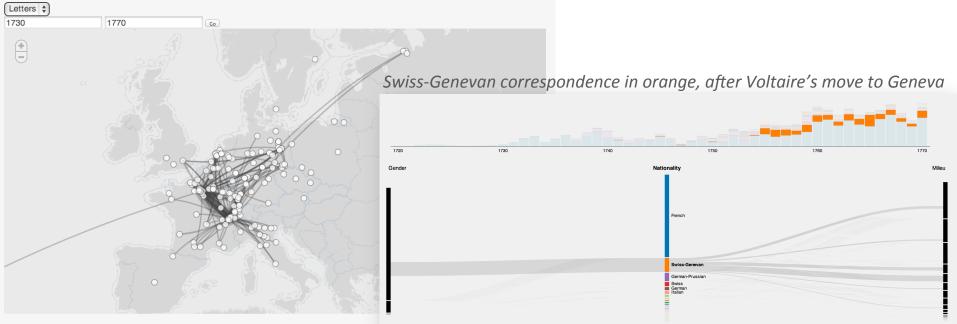




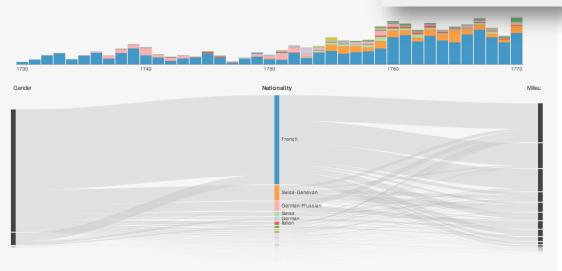
85% of Data is Not Plotted Due to Missing Information



## **Interactivity with User-Defined Attributes**



Plottable: 941 Not plottable: 11054

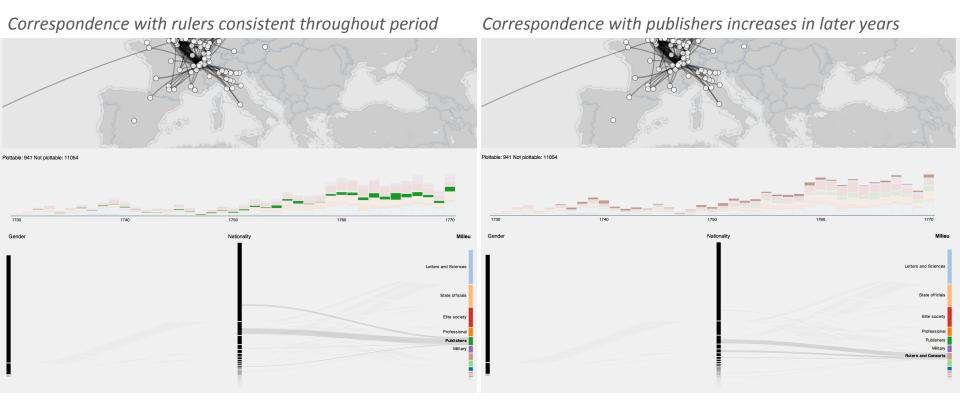


#### **User-Defined Attributes**

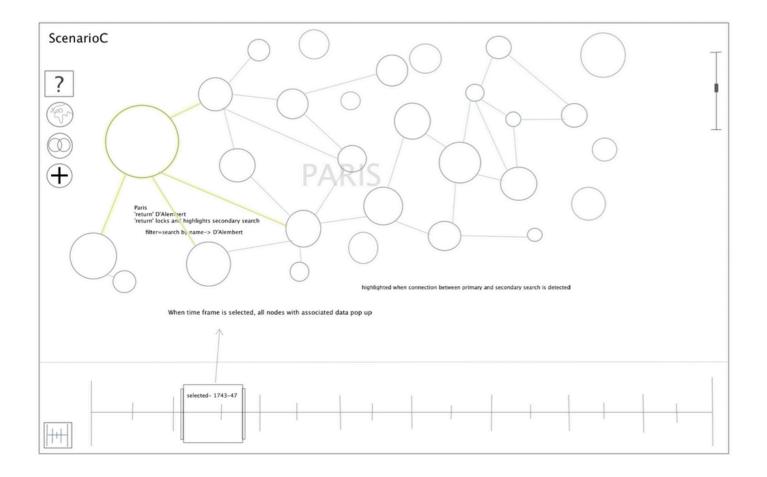
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Interactivity with Parallel Visualizations Help with Multi-Dimensional Data Exploration

#### **User-Defined Schema for Categorization by Social Group**

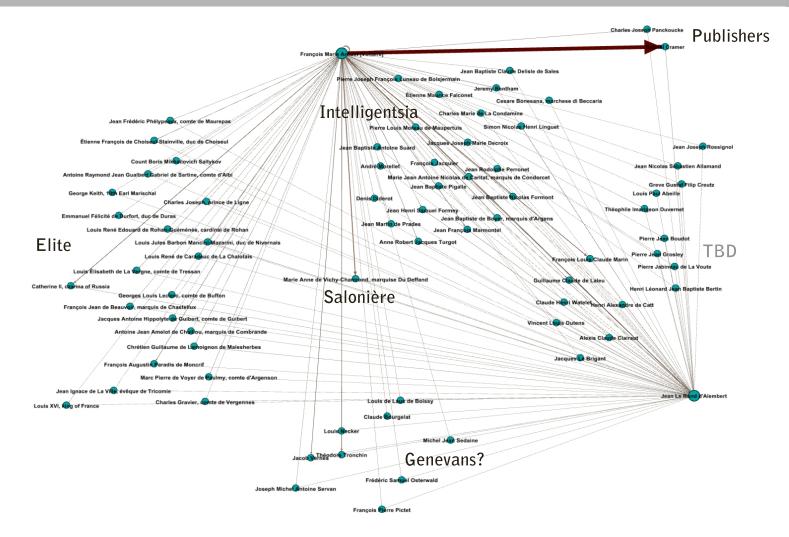


### **Spatial-Temporal-Relational Dynamics**



We think in terms of possible networks, loosely defined based on affiliation, shared location, or other nonexplicit types of relationship.

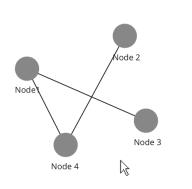
#### Freedom to Construct Our Own Organizational Scheme is Part of the Knowledge Production Process

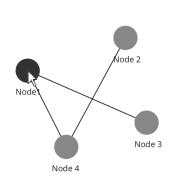


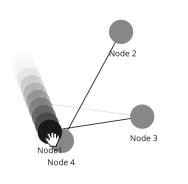
Correspondents Common to Voltaire and D'Alembert based on letters authored by Voltaire and D'Alembert only

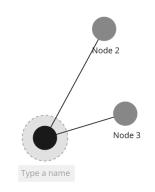
#### **New Direction:** Building Schema Directly, Contextually, Through the Visual Interface

#### Treat more nodes as one

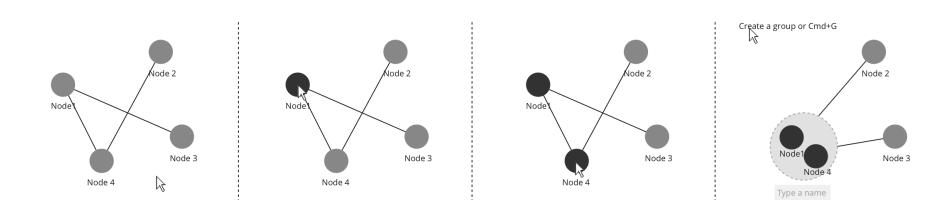








#### Create a group of nodes



Common Design Strategies for Exploring Signaling Networks in Biology and Intellectual Geographies in History

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