# Interweaving Multimodal Interaction with Flexible Unit Visualizations for Data Exploration



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bit.ly/databreeze







"Put-That-There": Voice and Gesture at the Graphics Interface

R.A. Bolt, 1980

How can we leverage multimodal interaction to its fullest potential to support a more fluid and free-form data exploration experience?

### Multimodal Interaction



## Flexible Unit Visualizations



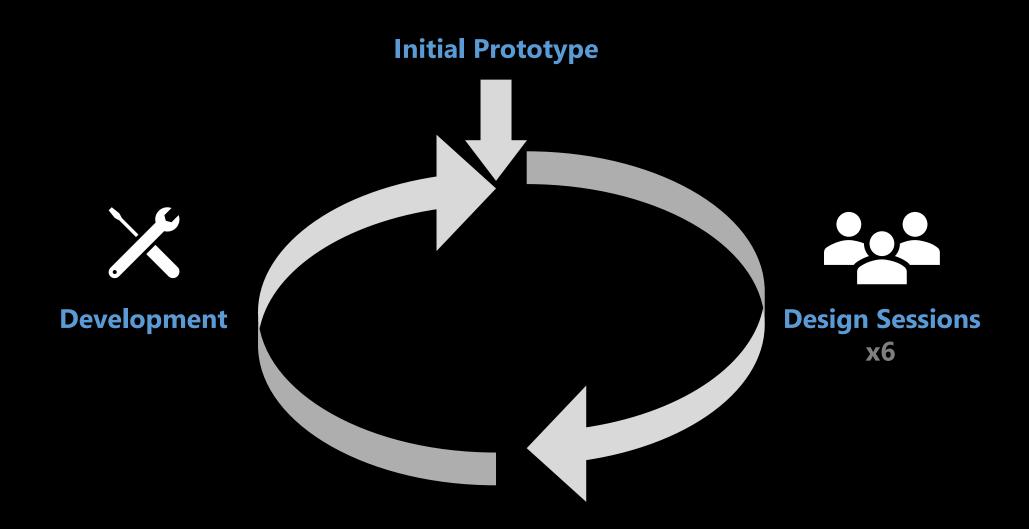






| Name                                     | Control | Region       | Expenditure | Median Debt | SAT Average | ••• |
|--|---------|--------------|-------------|-------------|-------------|-----|
| Harvard University                       | Private | New England  | 47083       | 7500        | 1501        | ••• |
| Stanford University                      | Private | Far West     | 88200       | 11500       | 1466        | ••• |
| University of California-<br>Berkeley    | Public  | Far West     | 18072       | 14480       | 1350        | ••• |
| Princeton University                     | Private | Mid Atlantic | 48021       | 7500        | 1495        | ••• |
| University of California-<br>Los Angeles | Public  | Far West     | 38489       | 15200       | 1289        | ••• |
| Massachusetts Institute of Technology    | Private | New England  | 58223       | 13000       | 1503        | ••• |
| Georgia Institute of Technology          | Public  | Southeast    | 13939       | 20750       | 1352        | ••• |
| •••                                      | •••     | •••          | •••         | •••         | •••         | ••• |

## **Design Process**



## Design Goals for Supporting Free-form Data Exploration with DataBreeze

the balls in

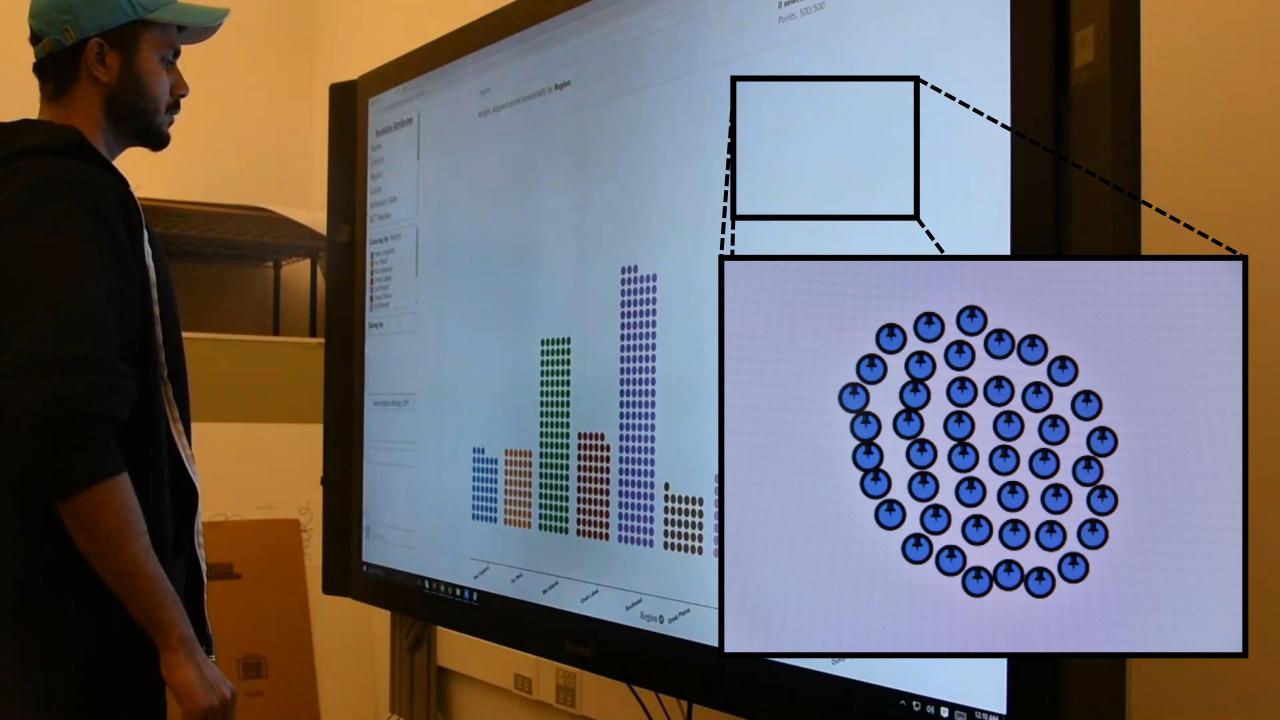
- DG1. Support both systematic binding and manual customization
- **DG2.** Support variations in input patterns
- **DG3.** Avoid complex gestures for touch/pen
- DG4. Support instruction and feedback for speech
- **DG5.** Support both global and local changes
- **DG6.** Role of pen & touch
- **DG7.** Support implicit and explicit triggering of speech
- **DG8.** Support externalization of custom mappings

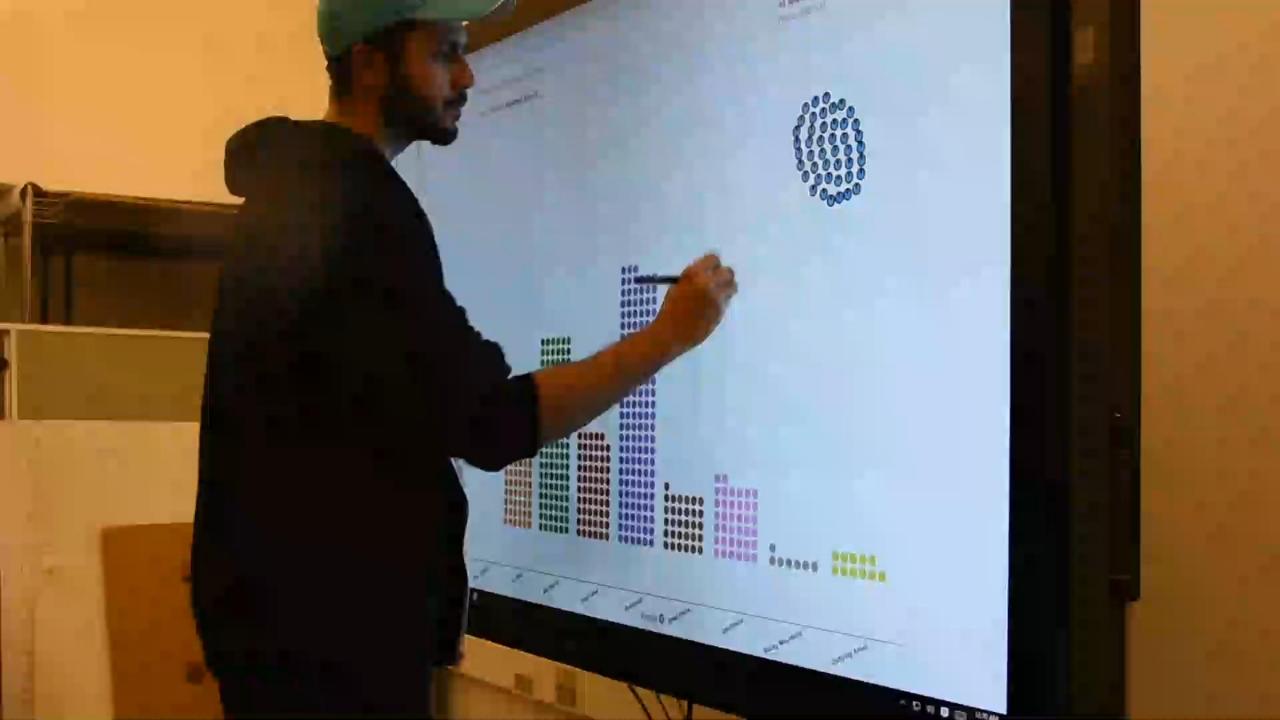
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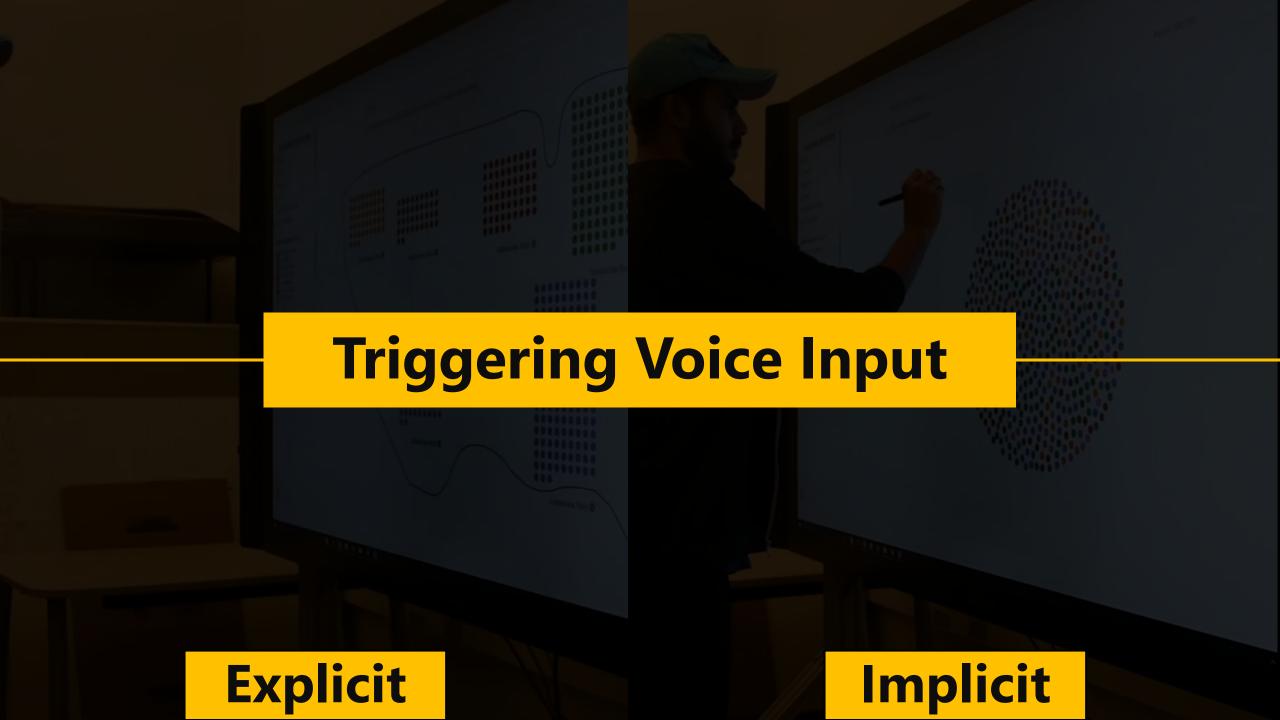
the Palls in

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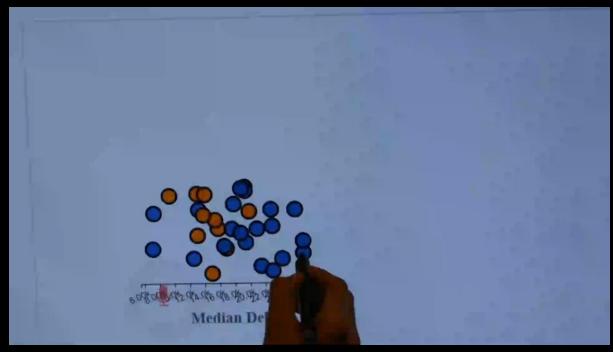


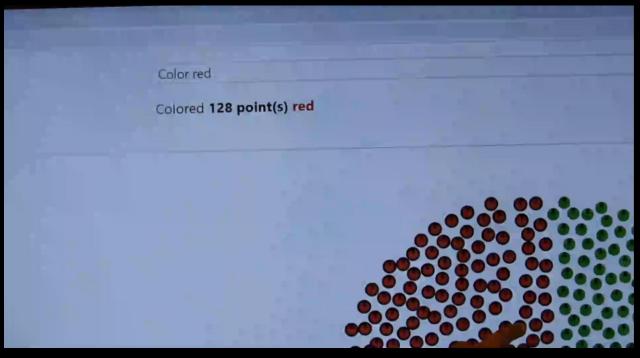




Preemptive Command Suggestions

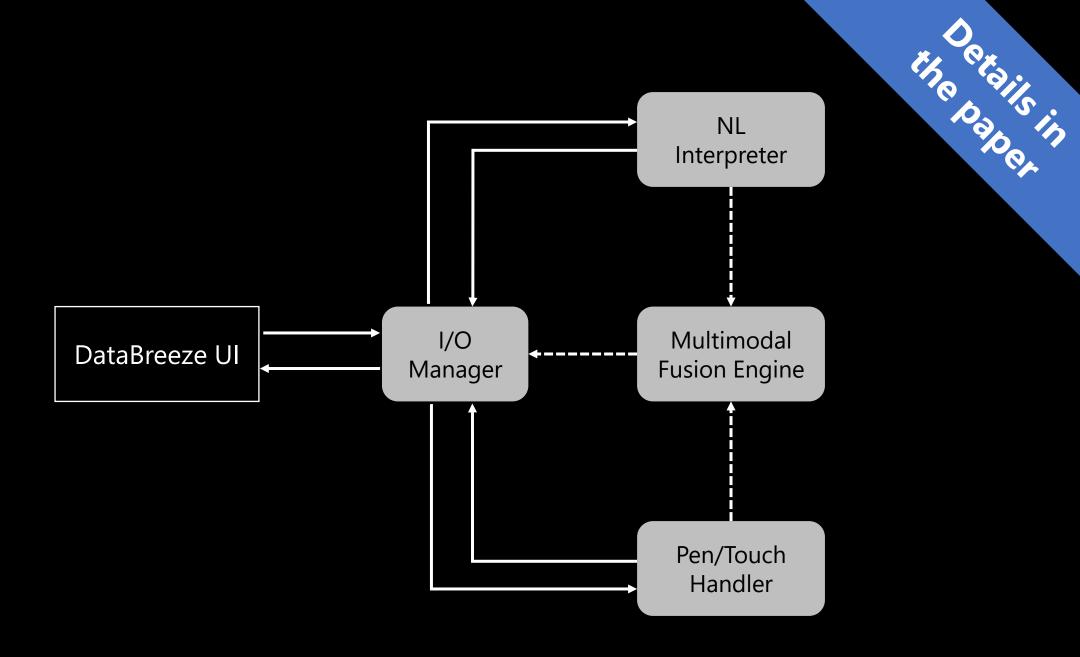
Post-hoc
Command Suggestions

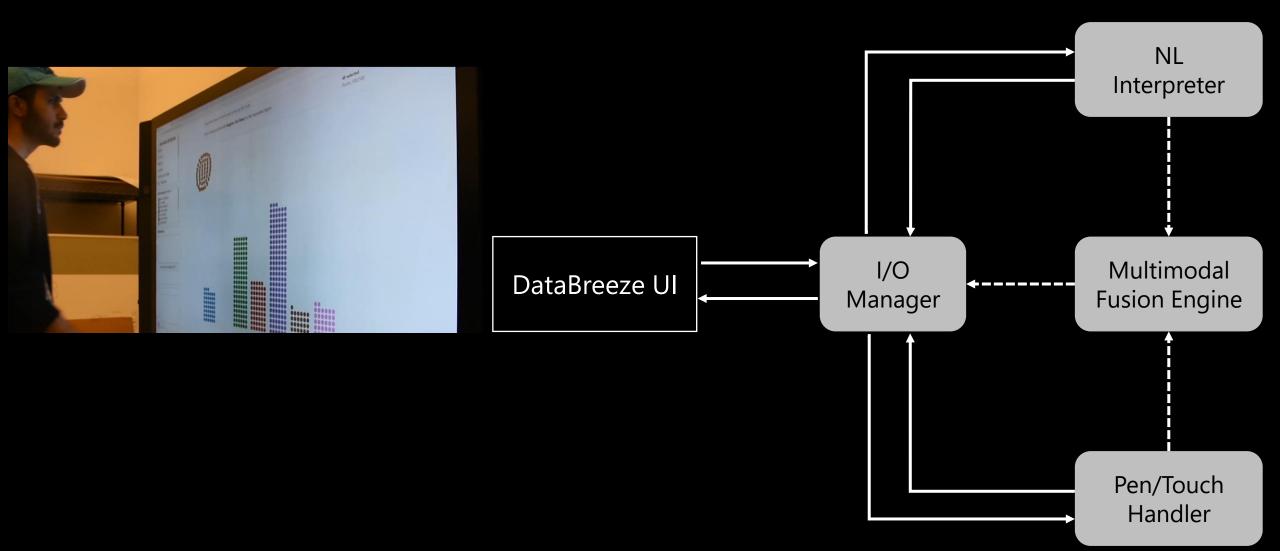




**Preemptive Command Suggestions** 

**Post-hoc Command Suggestions** 







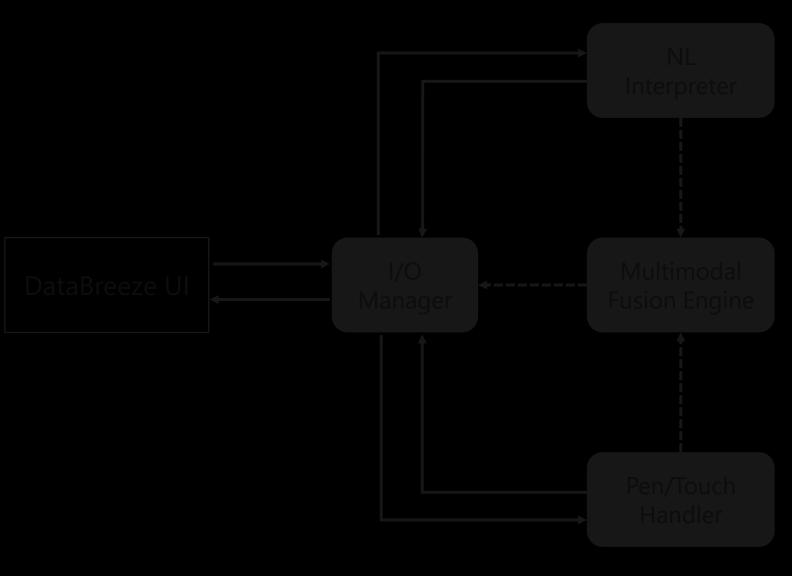


"Bring the New England schools here"

**Operation: Move** 

Parameter: (x, y)

**Target:** New England





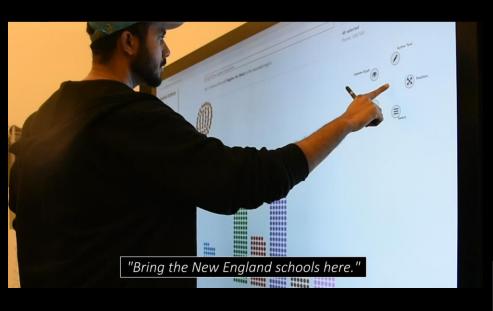
DataBreeze UI

I/O Manager

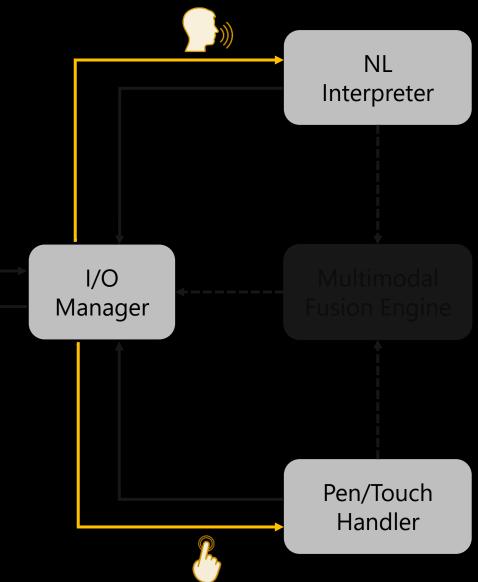
**Operation:** -

Parameter: -

**Target:** 







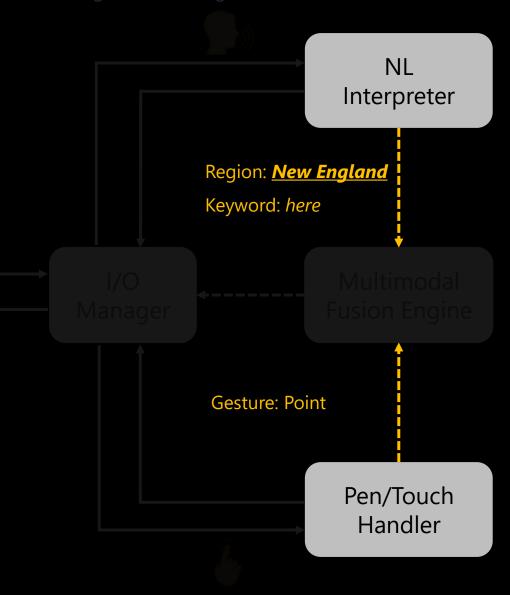
**Operation:** -

Parameter: -

Target: -



"Bring the New England schools here"



Databreeze

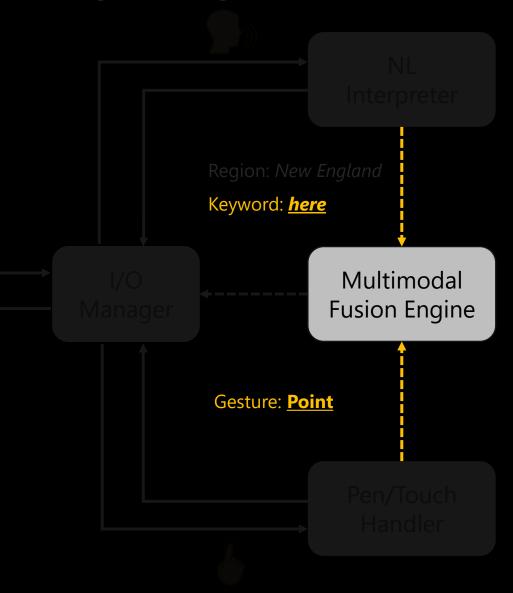
Operation: -

Parameter: -

Target: New England



"Bring the New England schools here"



DataBreeze UI

**Operation:** Move

Parameter: (x, y)

**Target:** New England



Move

(x, y)

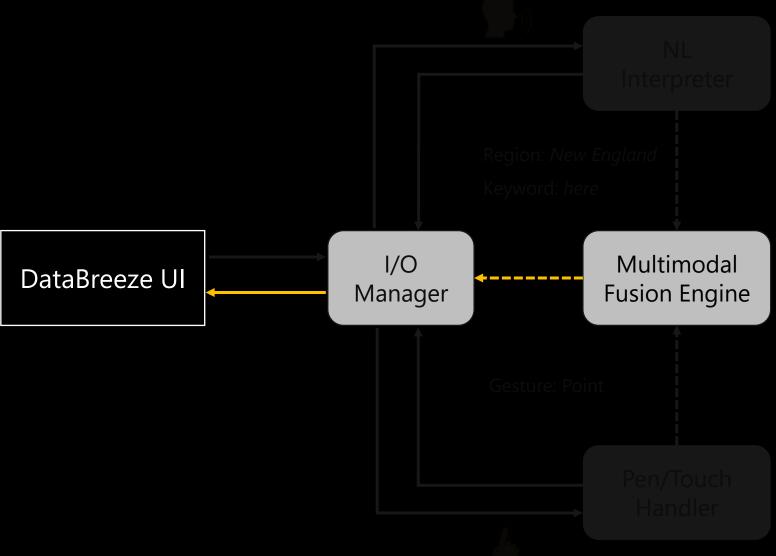
New England

**Operation:** 

**Parameter:** 

**Target:** 

"Bring the New England schools here"



### **Preliminary User Study**

#### Goal:

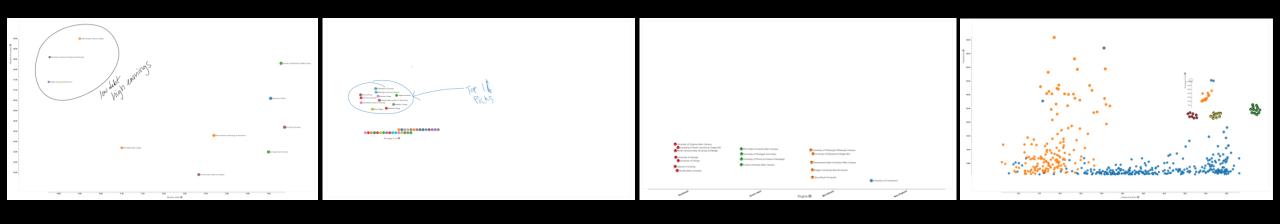
To observe if and how DataBreeze supports free-form data exploration & the role of multimodal input in facilitating this experience.







## **Usage Patterns**



**Global Views** 

**Hybrid Views** (Global + Local)



#### P4:

"The system was great for exploring data and similar to using an art board. I could just quickly drag and pull things to create groups and categories that made sense in my head."



#### **P5:**

"I really like that flexibility. Being able to drag and drop points where you want **mimics physical interaction** like you would with documents on your table"



#### P6:

"Gestures typically in my mind aren't combined with voice commands [...] but once I got used to it, it was great and saves a lot of time."

### Interaction



### Representation

### Multimodal Interaction



## Flexible Unit Visualizations









### Multimodal Interaction



## Flexible Unit Visualizations









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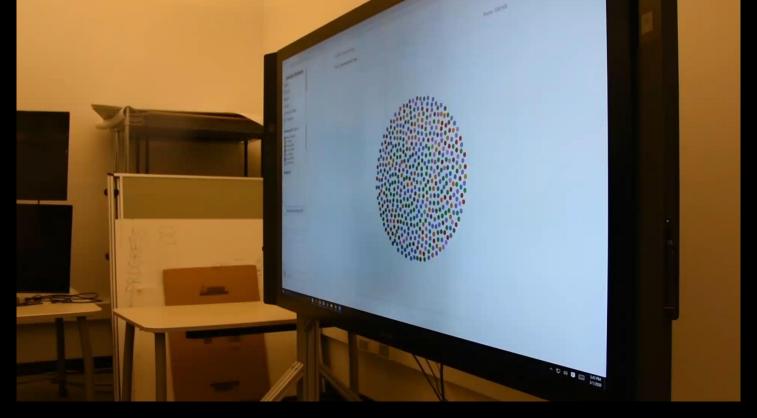
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Multimodal Interaction



**Flexible Unit Visualizations** 











