# How do Users Interact with a Knowledge Graph?



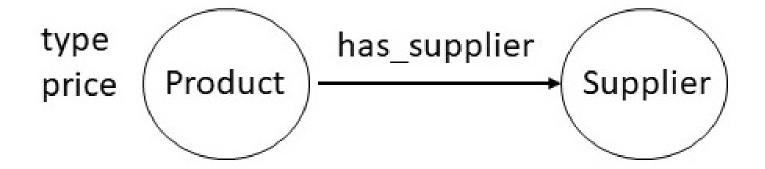
#### Outline

- Interaction Paradigms
- Visualization Techniques
- Structured Query Interfaces
- Natural Language Query Interfaces



#### Interaction Paradigms

Schema provides an overview of the knowledge graph





### Interaction Paradigms

Push	Reports	Analytics
Pull	Search/ Queries	Auto-analyze
	Known Questions	Unknown Questions



#### Interaction Paradigm

- The interface to a knowledge graph is a combination of
  - Keyword search
  - Structured queries
  - Tabular presentation
  - Graph visualization

The user interface to a knowledge graph may not even expose the graph



- General principles
- Best practices

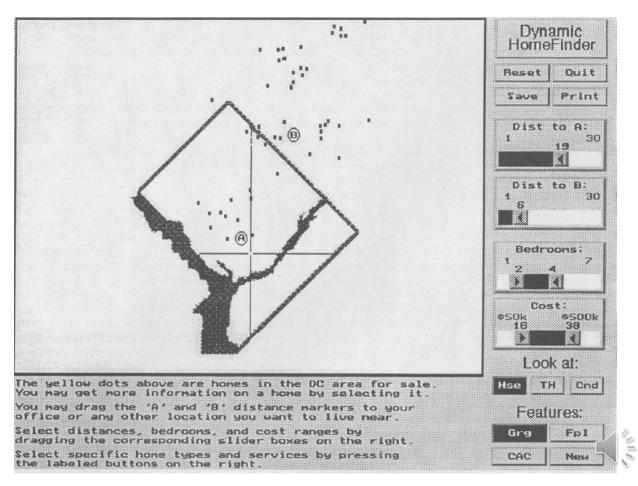


Amplify the user understanding of data



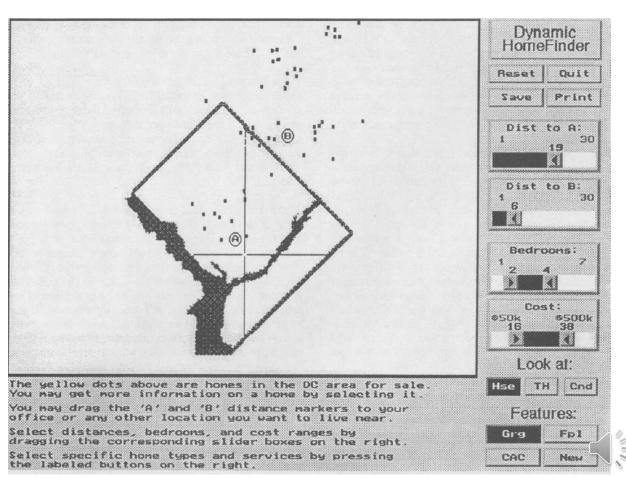
Amplify the user understanding of data

Present more information than a user might be able to remember at a time



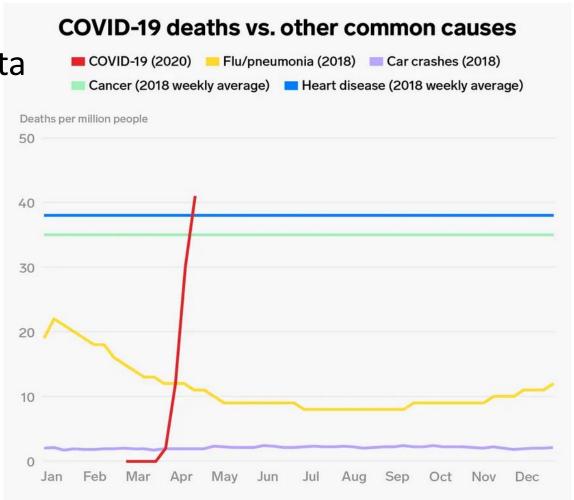
Amplify the user understanding of data

Take away the burden of having to look for information



Amplify the user understanding of data

Place relevant data next to each other





Amplify the user understanding of data

Home / Computers / Monitors & Computer Screens

## Keep track of user's attention



#### Acer Nitro 27" Class FHD IPS FreeSync Gaming Monitor

Item 1255477 | Model VG270

\*\*\*\* 4.6 (724)

Your Price

\$149.99

Shipping & Handling Included\*

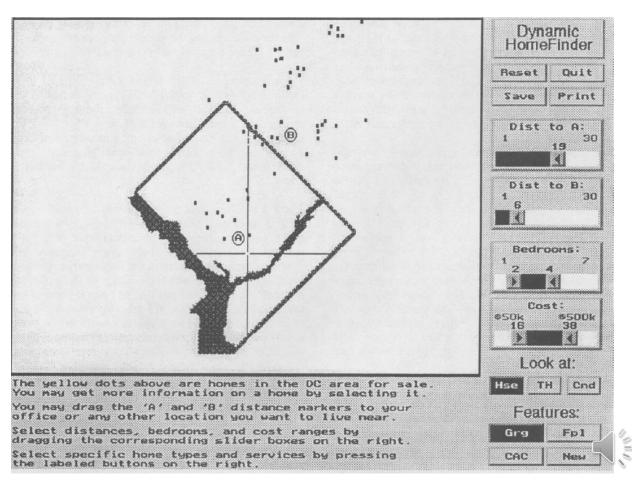
#### Features:

- 1920 x 1080 Resolution
- 75 Hz Refresh Rate
- 1ms Virtual Response Boost™
- AMD FreeSync
- VGA Cable Included



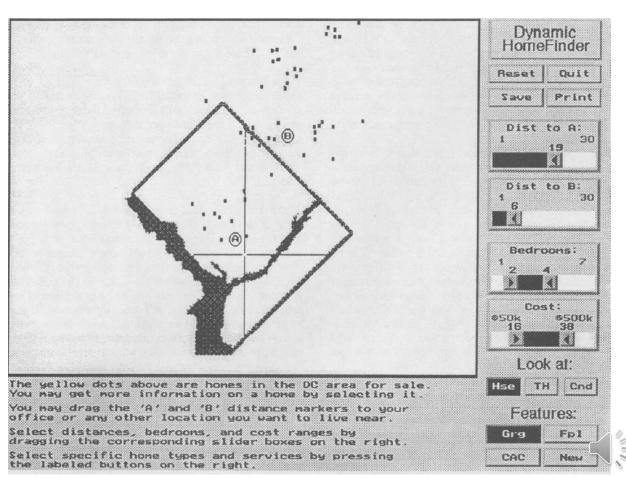
Amplify the user understanding of data

Provide more abstract view through omission and recoding of information



Amplify the user understanding of data

Allow a user to interact with and manipulate the visualization



- Amplify user understanding of data
  - Present more information than a user might be able to remember at a time
  - Take away the burden of having to look for information
  - Place relevant data next to each other
  - Keep track of user's attention
  - Provide more abstract view through omission and recoding of information
  - Allow a user to interact with and manipulate the visualization



- Amplify the user understanding of data
- Design Choices
  - Spatial substrate
  - Marks
  - Connections and enclosures
  - Retinal properties
  - Temporal encoding



- Amplify the user understanding of data
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  - Spatial substrate ————
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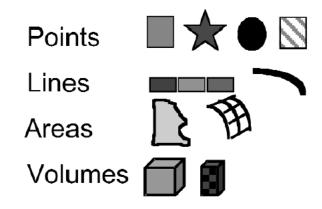
Geographical data naturally shown on a map

For non-geographic data choose suitable axes and coordinates



- Amplify the user understanding of data
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→ Visible things that happen in space that help a user in distinguishing between data items





- Amplify the user understanding of data
- Design steps
  - Spatial substrate
  - Marks
  - Connections and enclosures
  - Retinal properties
  - Temporal encoding

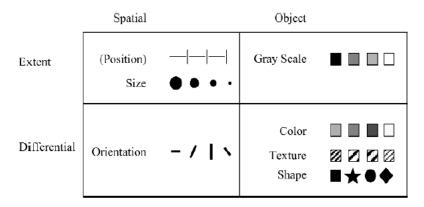
Connections include graphs, trees, and other hierarchical organization

We can draw enclosures around certain nodes



- Amplify the user understanding of data
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Color, crispness, hue, transparency can be used to make a point





- Amplify the user understanding of data
- Design Choices
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  - Retinal properties
  - Temporal encoding —

Animation of data as it changes over time can help understand its evolution over a period of time



- Amplify the user understanding of data
- Design Choices
- Visualization type
  - Simple
  - Composed
  - Interactive
  - Attentive-Reactive



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Static mapping of data into up to three dimensions



- Amplify the user understanding of data
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User selectively controls, expands, and navigates

Movable filters

Dynamic queries

Overview + Detail



- Amplify the user understanding of data
- Design Choices
- Visualization type
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  - Interactive
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The system anticipates what is most useful thing to display next

Calculate degree of interest



- General principles
- Best practices



- Best Practices
  - Five step design process
    - Identify variables that could be mapped to spatial positions
    - Combine mappings to increase dimensionality
    - Use retinal properties to add more dimensions
    - Add controls for user interaction
    - Consider attentive reactive capabilities



- Best Practices
  - Five step design process
  - Design template
    - Overview
    - Dynamic queries
    - Zooming in
    - Details on demand
    - Retrieval by example



#### Outline

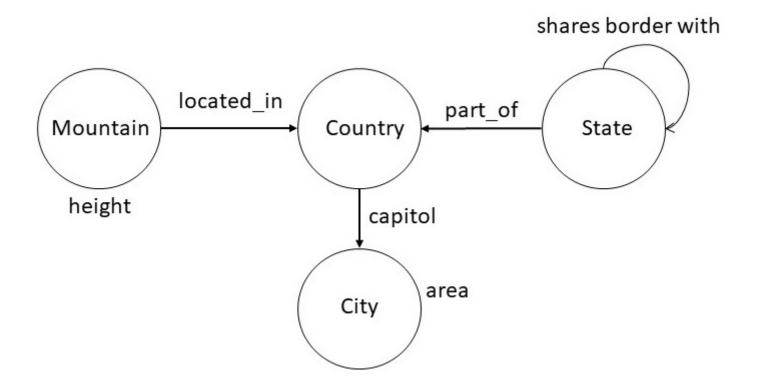
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- The queries conform to a pre-defined grammar
- System uses auto-completion in response to user's input



Example



city with largest area

top five cities by area

countries whose capitals have area at least 500 squared kilometers

states bordering Oregon and Washington

second tallest mountain in France



```
<np> ::= <noun> "and" <noun>
<np>::= <geographical-region> |
    <geographical-region> <spatial-relation> <geographical-region>
<geographical-region> ::= "capital of country" | "city" | "country" |
              "mountain" | "river" | "state"
operty> ::= "area" | "height"
<aggregate-relator> ::= "with the most number of" | "with the largest" | "with"
<aggregate-modifier> ::= "top" <number> | "second tallest"
<spatial-relation> ::= "bordering" | "inside"
<number-constaint> ::= "atleast" <quantity>
<quantity> ::= <number> <unit>
<unit> ::= "Square Kilometer"
<ranking> ::= "by"
```



<ranking> ::= "by"

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<number-constaint> ::= "atleast" <quantity>
                                                                                                                                                                                                                                                                 city with the largest area
<quantity> ::= <number> <unit>
                                                                                                                                                                                                                                                                 <geographical-region> <aggregate-relator>   <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggregate-relator> <aggreg
<unit> ::= "Square Kilometer"
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<number-constaint> ::= "atleast" <quantity>
                                                    top five cities by area
<quantity> ::= <number> <unit>
<unit> ::= "Square Kilometer"
                                                    <aggregate-modifier> <geographical-region> <ranking>   
<ranking> ::= "by"
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<aggregate-relator> ::= "with the most number of" | "with the largest" | "with"
<aggregate-modifier> ::= "top" <number> | "second tallest"
                                                             countries whose capitals have area at least
<spatial-relation> ::= "bordering" | "inside"
                                                             500 squared kilometers
<number-constaint> ::= "atleast" <quantity>
<quantity> ::= <number> <unit>
                                               <geographical-region> <aggregate-relator> <geographical-region>
<unit> ::= "Square Kilometer"
                                                  <aggregate-relator>  <number-constraint> <quantity < [ ]</pre>
<ranking> ::= "by"
```

- Grammar allows us
  - To check for legal queries
  - To auto-complete queries
  - To suggest completions of partial queries



- Improving the range of queries requires
  - Expanding the grammar
- Well-suited only for limited domains
  - Not designed to handle numerous variations in English language



#### Outline

- Interaction Paradigms
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- Structured Query Interfaces
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- Semantic Parsing Technology
  - Begin with a minimal grammar
  - Train the semantic parser to choose most likely interpretation



- Semantic Parsing System
  - Executor
  - Grammar
  - Parser
  - Model
  - Learner



- Semantic Parsing System
  - Executor ———
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Produces a SPARQL or Cypher query that could be executed by the query engine



- Semantic Parsing System
  - Executor
  - Grammar  $\rightarrow$  a grammar is set of rules of the form  $\alpha \Rightarrow \beta$
  - Model
  - Parser
  - Learner

Maps input sentence to logical forms

```
NP(x) with the largest ReINP(r) \Rightarrow argmax(1,1,x,r) top NP(n) NP(X) by the ReINP(r) \Rightarrow argmax(1,n,x,r) NP(x) has ReINP(r) at least NP(n) \Rightarrow (< arg(x,r) n)
```



- Semantic Parsing System
  - Executor
  - Grammar
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Grammar produces multiple interpretations

A model defines a probability distribution over those interpretations



- Semantic Parsing System
  - Executor
  - Grammar
  - Model
  - Parser —
  - Learner

Parser maintains a certain number of interpretations at each step

Computes the most likely interpretation



- Semantic Parsing System
  - Executor
  - Grammar
  - Model
  - Parser
  - Learner Computes the parameters of the model and in some cases additions to the grammar



- Extremely difficult problem
- Requires amassing a large amount of training data
- Most systems report accuracy in the range of 50-60%



#### Summary

- Users want to consume a knowledge graph in different modes
  - Pull vs push and interactive vs batch
- We must not assume that a graphical visualization is the best display
  - Graphs are usually effective for schema but not always for instances
- Ideal interfaces will use a combination of method
  - Leverage visualization design principles

