

# **Visualization by Demonstration: An Interaction Paradigm for Visual Data Exploration**

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**Dilan Ustek** 7 March 2017

# Data Exploration without Specification



# Introduction

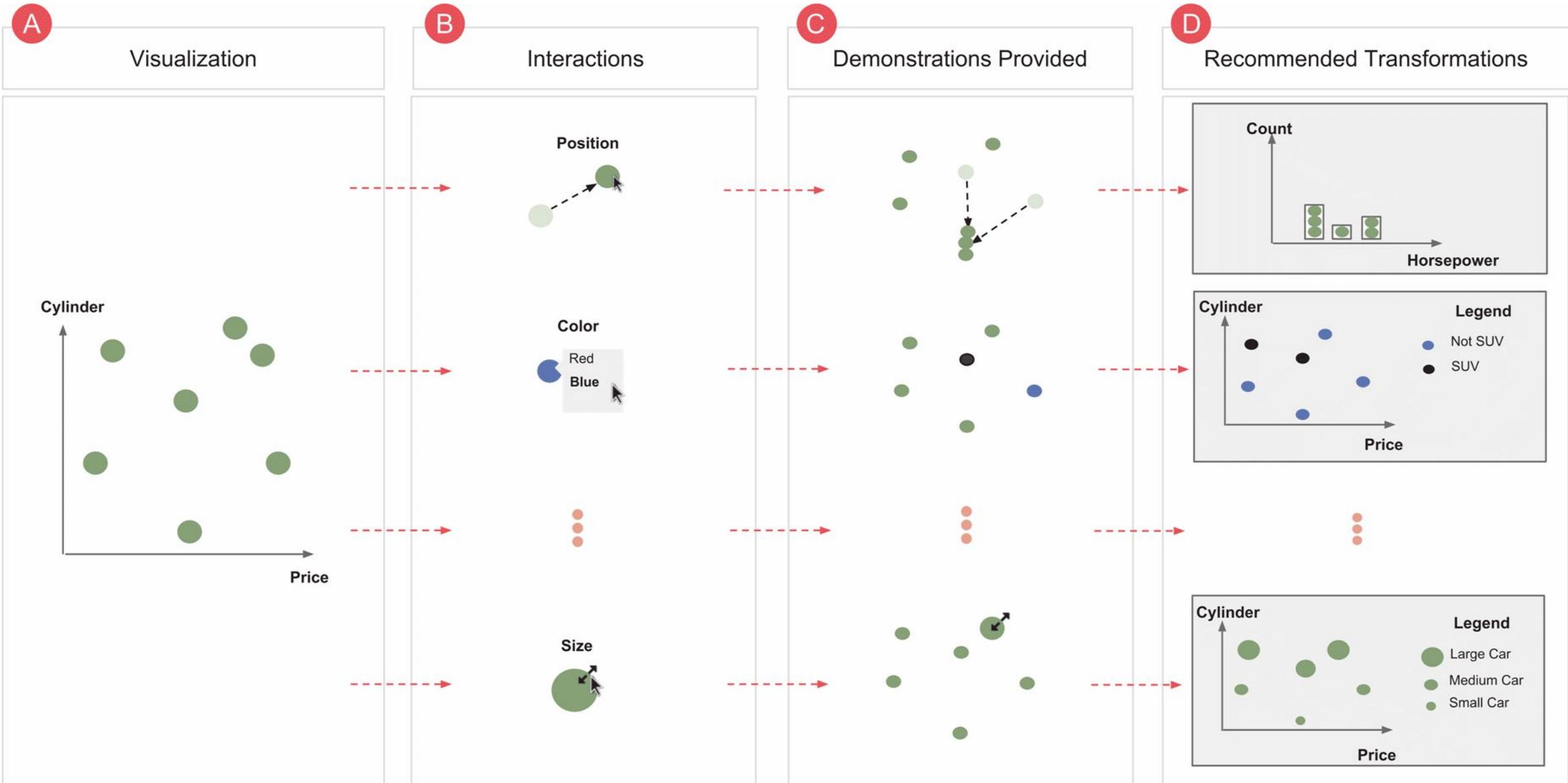
Use demonstrations to generate:

- visualizations techniques
- mappings
- parameters

# Contributions

# Visualization by Demonstration

1. Does not require users to specify vis techniques
2. Extracts vis mappings and parameters



# Video

<https://www.youtube.com/watch?v=JFdStB0nYRs>

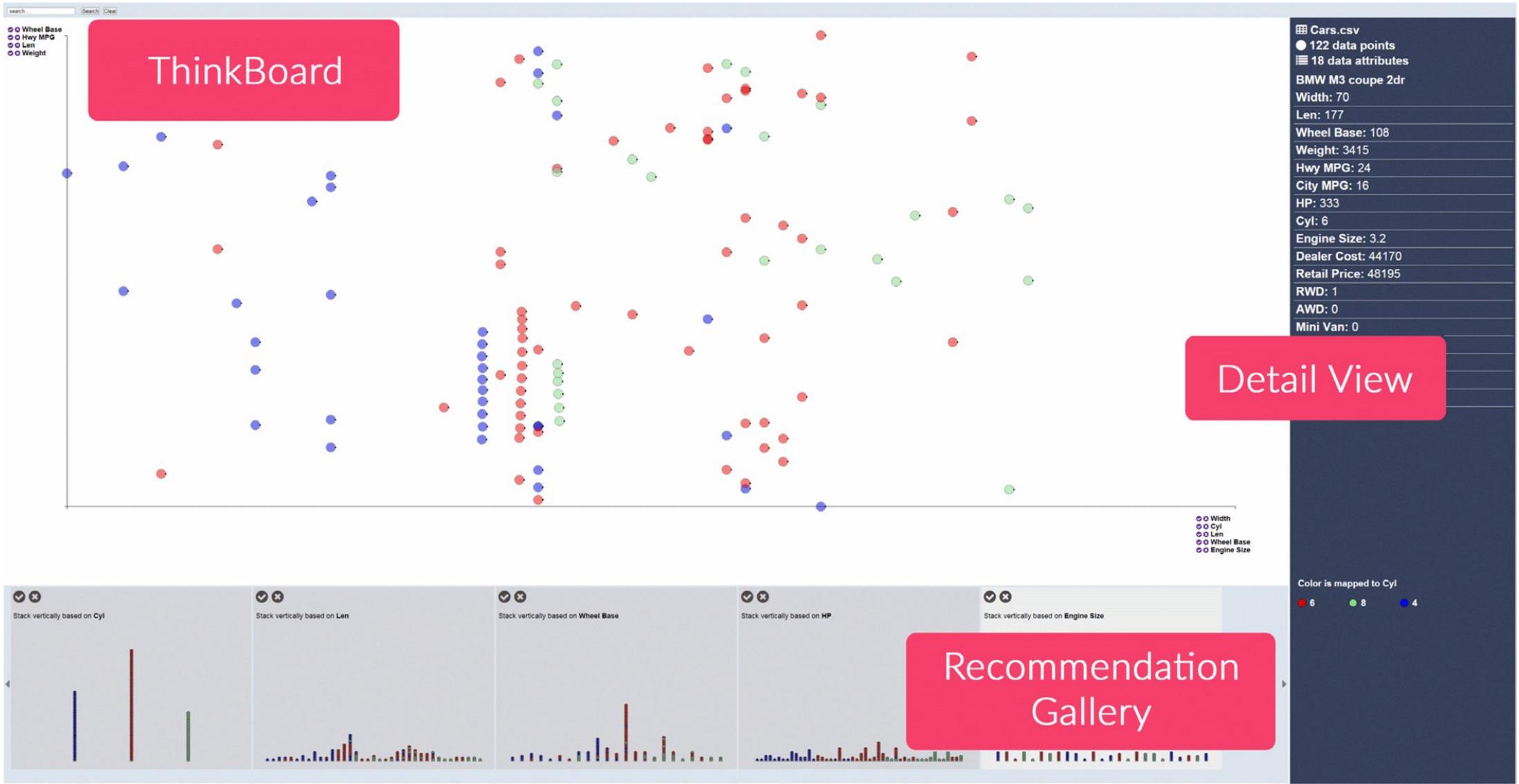
# Design Guidelines

1. Support **direct manipulation**
2. Balance **human/system** workload
3. Enable user **interactions** to drive **transformations**
4. Enhance **interpretability** of recommendations

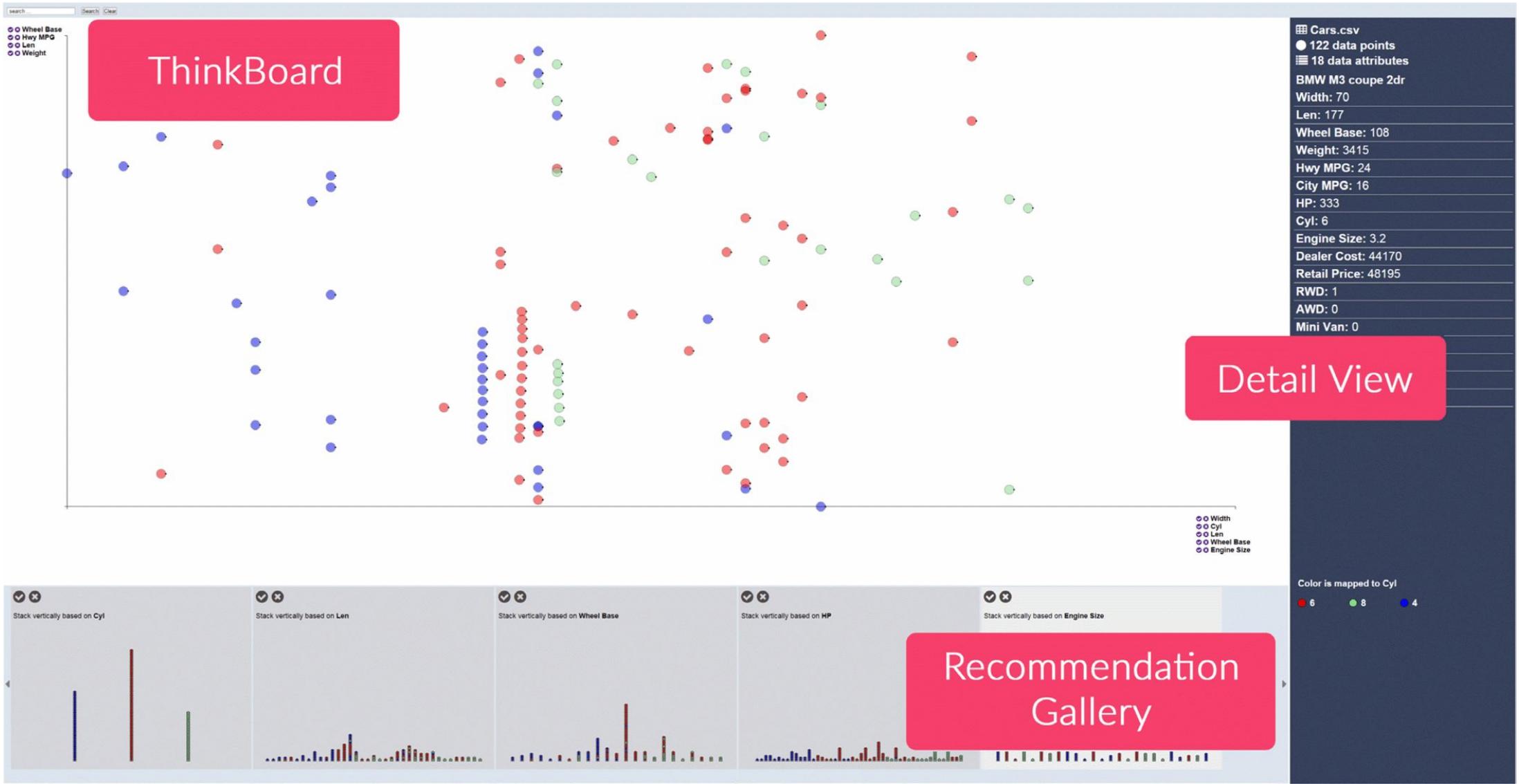
# VisExemplar



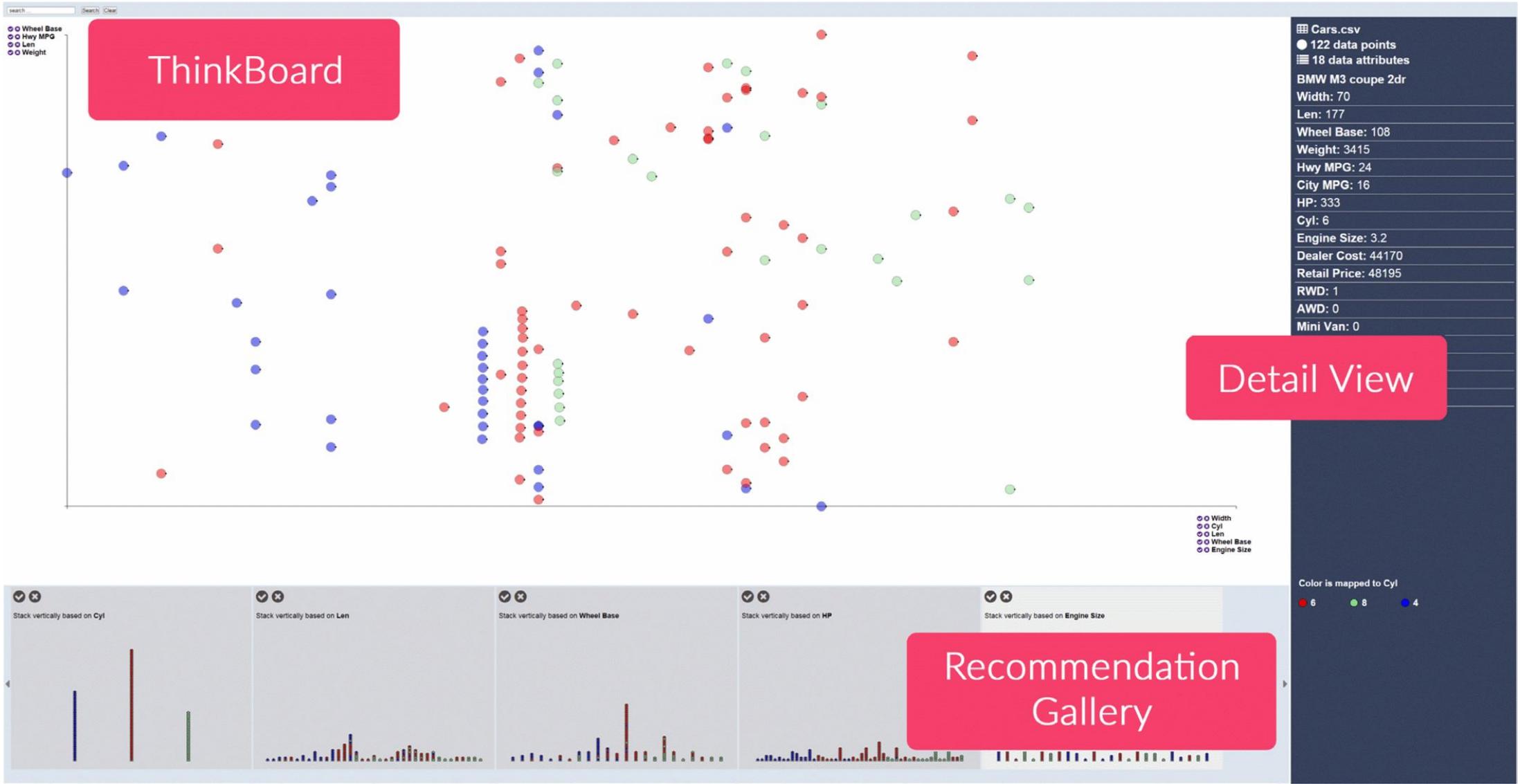
# 1. Support **direct manipulation**



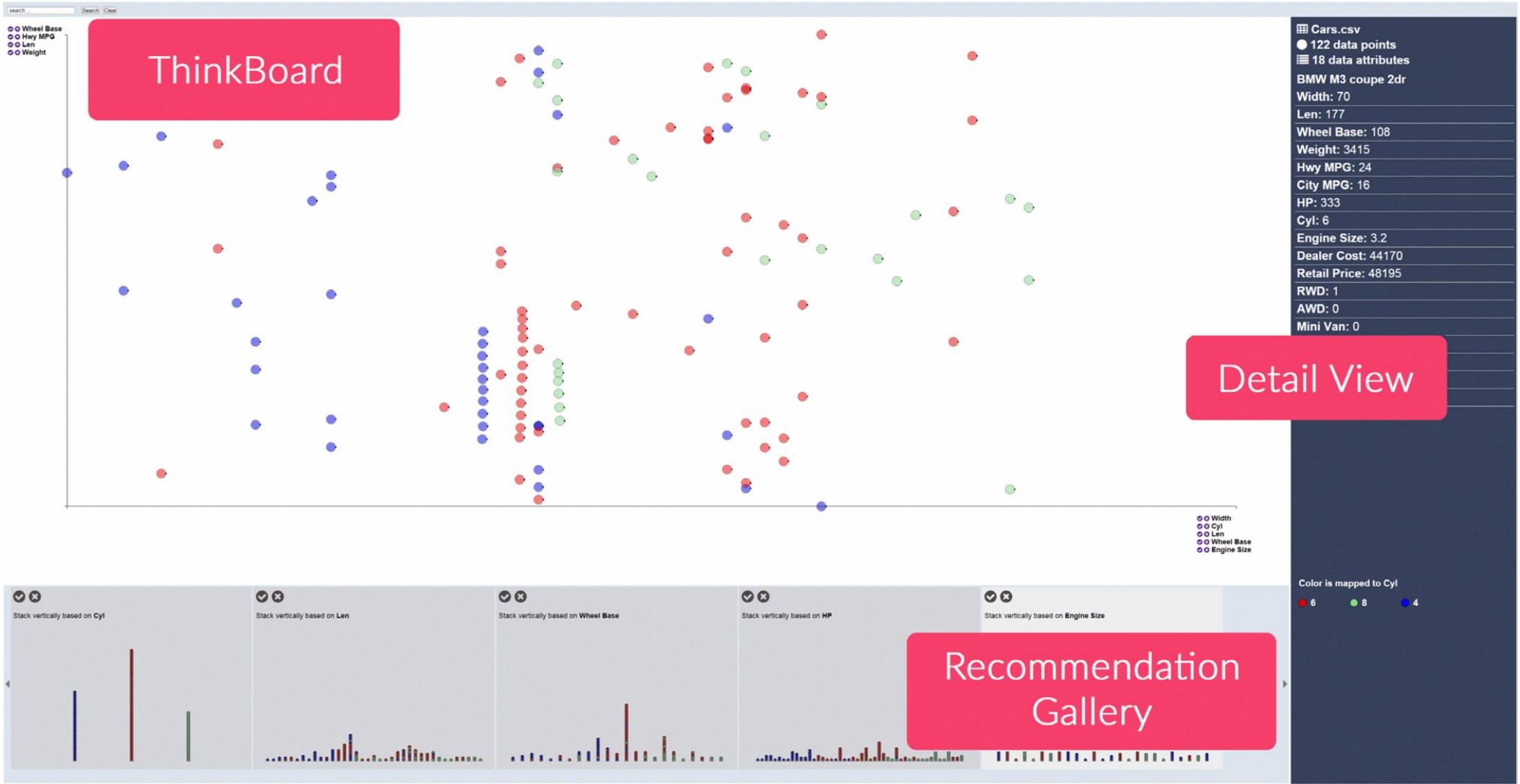
## 2. Balance **human/system** workload



# 3. Enable user **interactions** to drive **transformations**



# 4. Enhance **interpretability** of recommendations



WHAT



Table

WHY

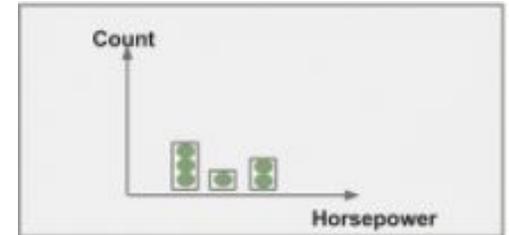


Explore, compare, and summarize

HOW



Scatterplots and bar charts  
*Manipulation:* resize, recolor, reposition

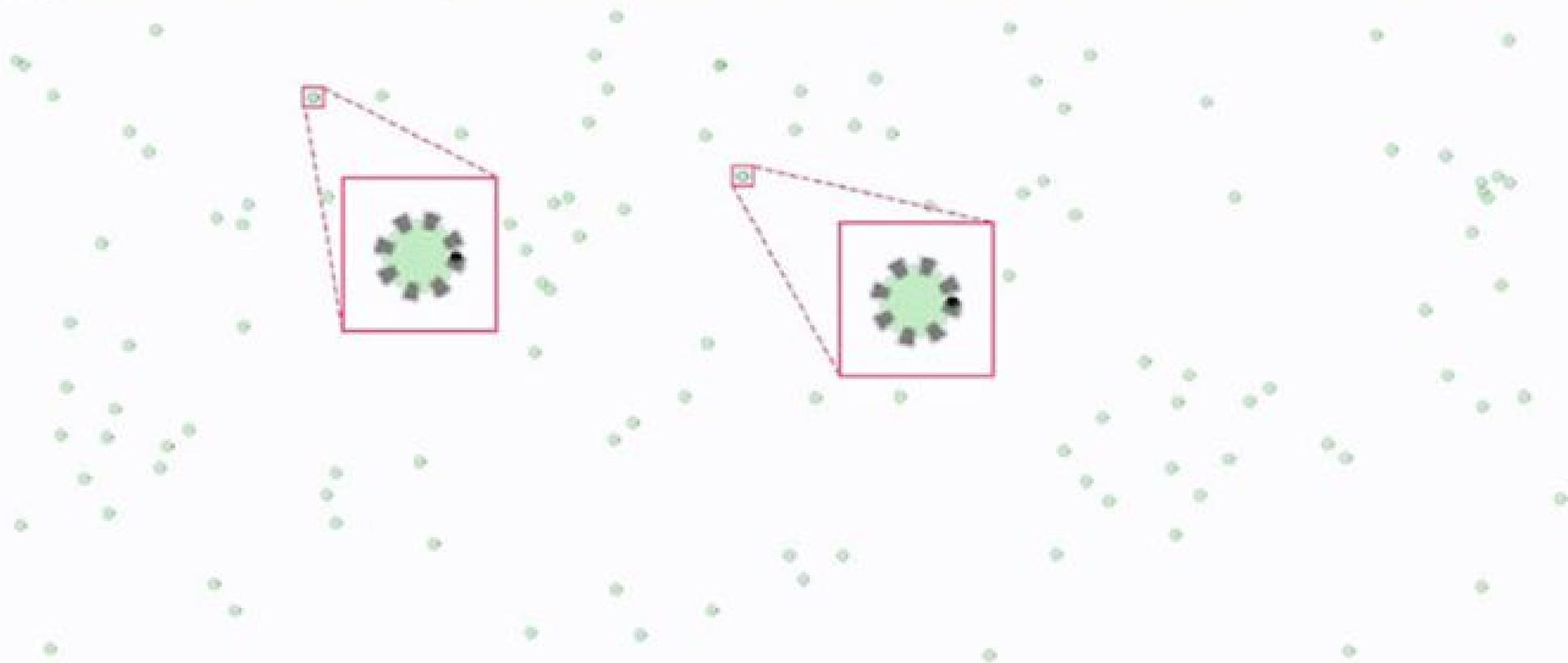


SCALE



Hundreds or Thousands

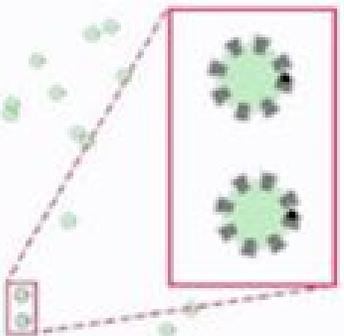
# Task Example



cars.csv
122 data points
18 data attributes
Toyota Sequoia SRS
Width: 78
Len: 204
Wheel Base: 118
Weight: 5270
Hwy MPG: 17
City MPG: 14
HP: 240
Cyl: 8
Engine Size: 4.7
Dealer Cost: 31827
Retail Price: 35695
RWD: 0
AWD: 1
Mini Van: 0
Wagon: 0
SUV: 1
Sports Car: 0
Small: 0

- Weight
- Hwy MPG
- Len
- Wheel Base
- Width

- Weight
- Hwy MPG
- Len
- Wheel Base
- Width

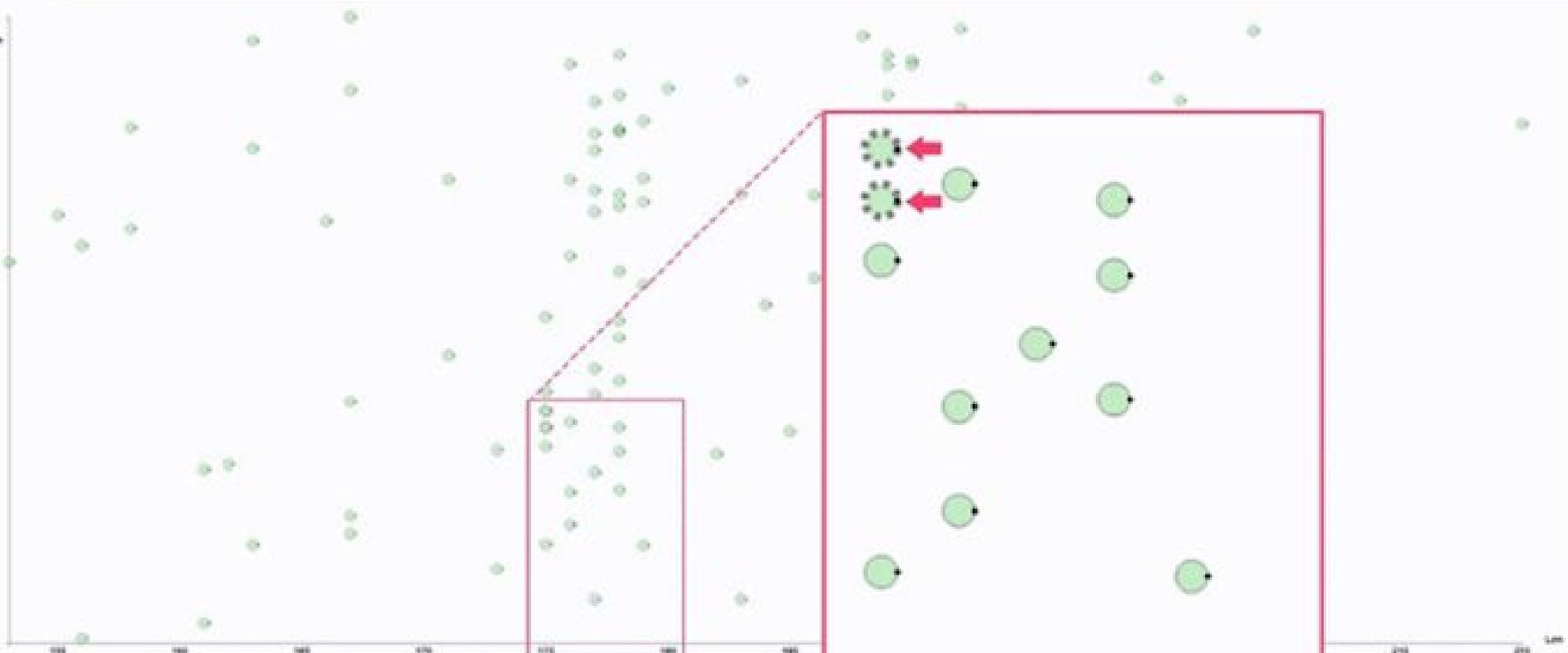


- Len
- Wheel Base
- HP
- Cyl
- Hwy MPG

- Len
- Wheel Base
- HP
- Cyl
- Hwy MPG

Cars.csv  
 122 data points  
 18 data attributes  
 Honda Civic Hybrid 4dr manual (gas/electric)  
 Width: 63  
 Len: 175  
 Wheel Base: 103  
 Weight: 2732  
 Hwy MPG: 51  
 City MPG: 46  
 HP: 93  
 Cyl: 4  
 Engine Size: 1.4  
 Dealer Cost: 16451  
 Retail Price: 20140  
 RWD: 0  
 AWD: 0  
 Mini Van: 0  
 Wagon: 0  
 SUV: 0  
 Sports Car: 0  
 Small: 1

- Average
- City MPG
- City MPG
- Wheel Base
- Weight



cars.csv

- 122 data points
- 18 data attributes

Toyota Prius 4dr (gas/electric)

Width: 68  
Len: 175  
Wheel Base: 106  
Weight: 2800  
Hwy MPG: 51  
City MPG: 59  
HP: 110  
Cyl: 4  
Engine Size: 1.5  
Dealer Cost: 19920  
Retail Price: 20910  
RWD: 0  
AWD: 0  
Mini Van: 0  
Wagon: 0  
SUV: 0  
Sports Car: 0  
Small: 1

175

180

- Cyl
- Price
- Weight
- Horsepower
- MPG



Red

Blue

**Cyl: 4**

**Engine Size: 1.5**

**Dealer Cost: 18926**

**Retail Price: 20510**

**RWD: 0**

**AWD: 0**

**Mini Van: 0**

**Wagon: 0**

**SUV: 0**

**Sports Car: 0**

**Small: 1**

Cars.csv

- 123 data points
- 10 data attributes

Toyota Prius 4dr (gas/electric)

Width: 68

Len: 175

Wheel Base: 106

Weight: 2890

Hwy MPG: 51

City MPG: 59

HP: 110

Cyl: 4

Engine Size: 1.5

Dealer Cost: 18926

Retail Price: 20510

RWD: 0

AWD: 0

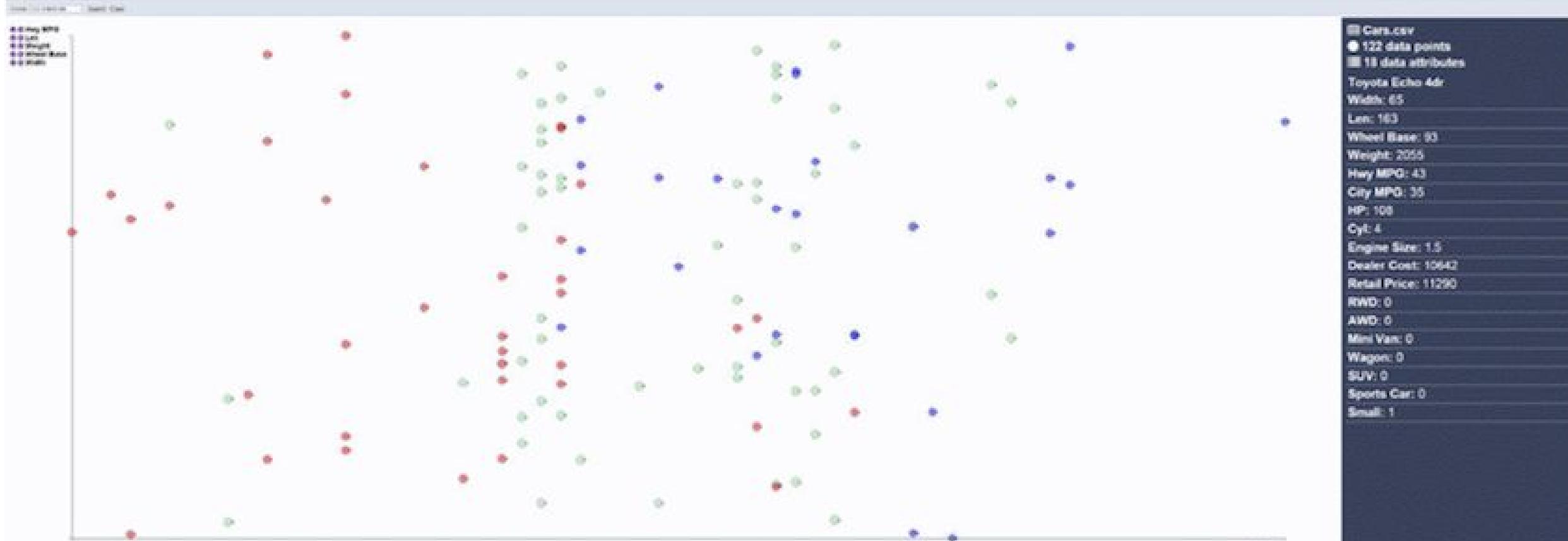
Mini Van: 0

Wagon: 0

SUV: 0

Sports Car: 0

Small: 1



**Color is mapped to Cyl**

● 6                      ● 8                      ● 4

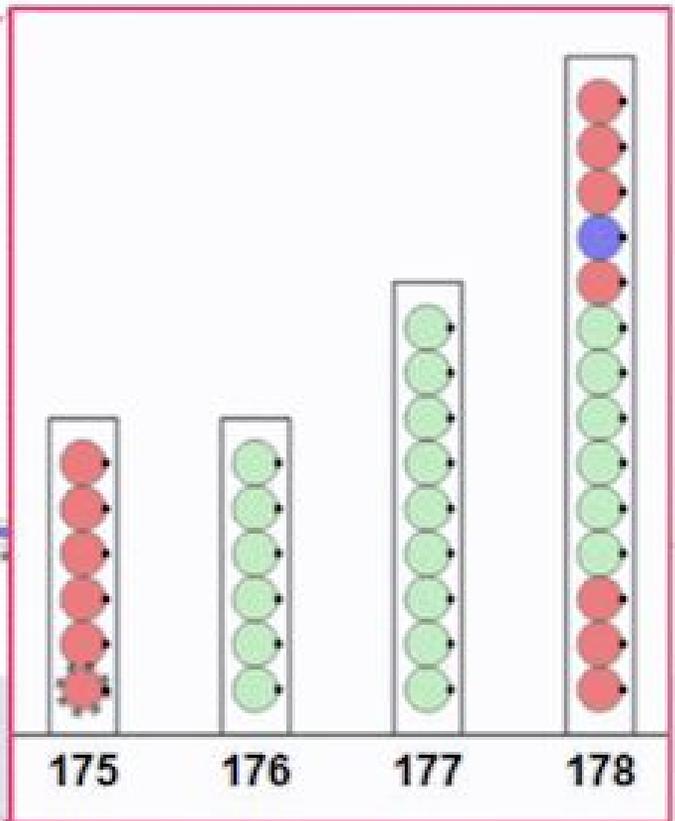
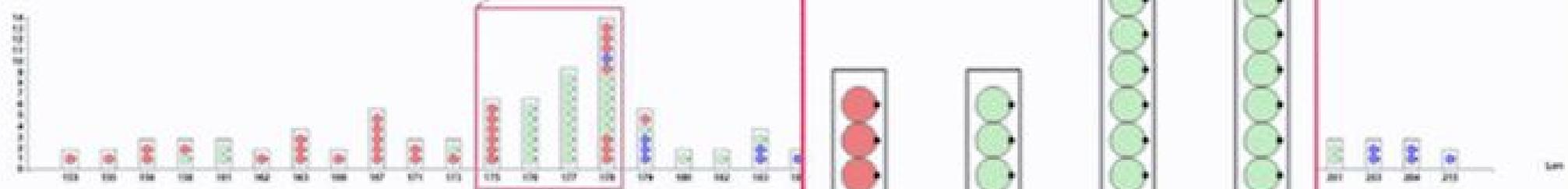
● Cyl  
● Wheel Base  
● Wgt  
● Hwy MPG  
● City MPG

Color is mapped to Cyl

● 6                      ● 8                      ● 4



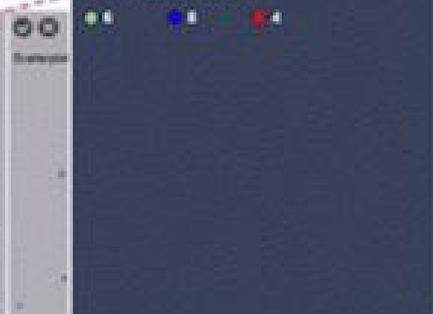
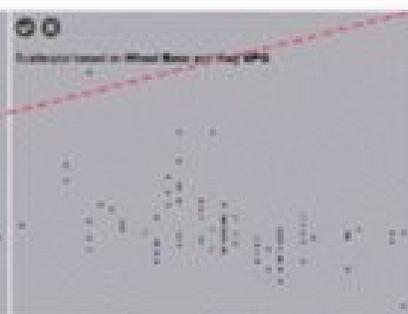
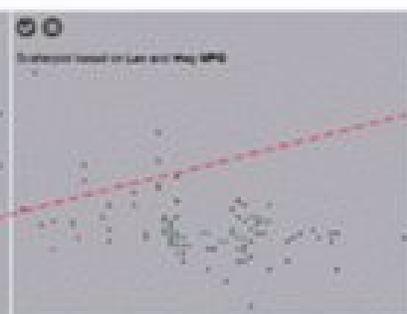
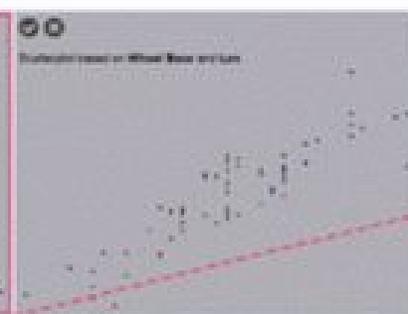
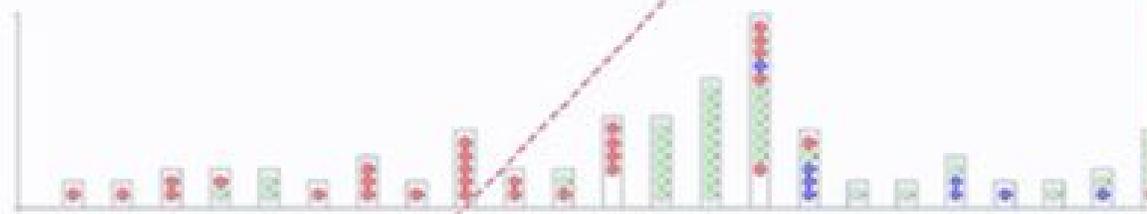
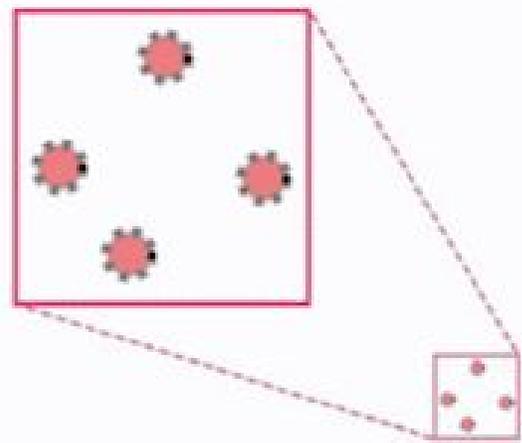
Chart



Car.csv  
● 122 data points  
■ 10 data attributes  
Lexus IS 200 4dr manual  
Width: 68  
Len: 177  
Wheel Base: 105  
Weight: 3255  
Hwy MPG: 25  
City MPG: 19  
HP: 215  
Cyl: 6  
Engine Size: 3  
Dealer Cost: 27404  
Retail Price: 31045  
RWD: 1  
AWD: 0  
Mini Van: 0  
Wagon: 0  
SUV: 0  
Sports Car: 0  
Small: 1

Color is mapped to Cyl  
● 4 ● 6 ● 8

Cars.csv  
● 122 data points  
■ 13 data attributes  
Toyota Prius 4dr (gas/electric)



# Potential Transformations

# **1. Visual Representation**

2. Data Mapping

3. Axes

4. View Specification

1. Visual Representation

**2. Data Mapping**

3. Axes

4. View Specification

1. Visual Representation

2. Data Mapping

**3. Axes**

4. View Specification

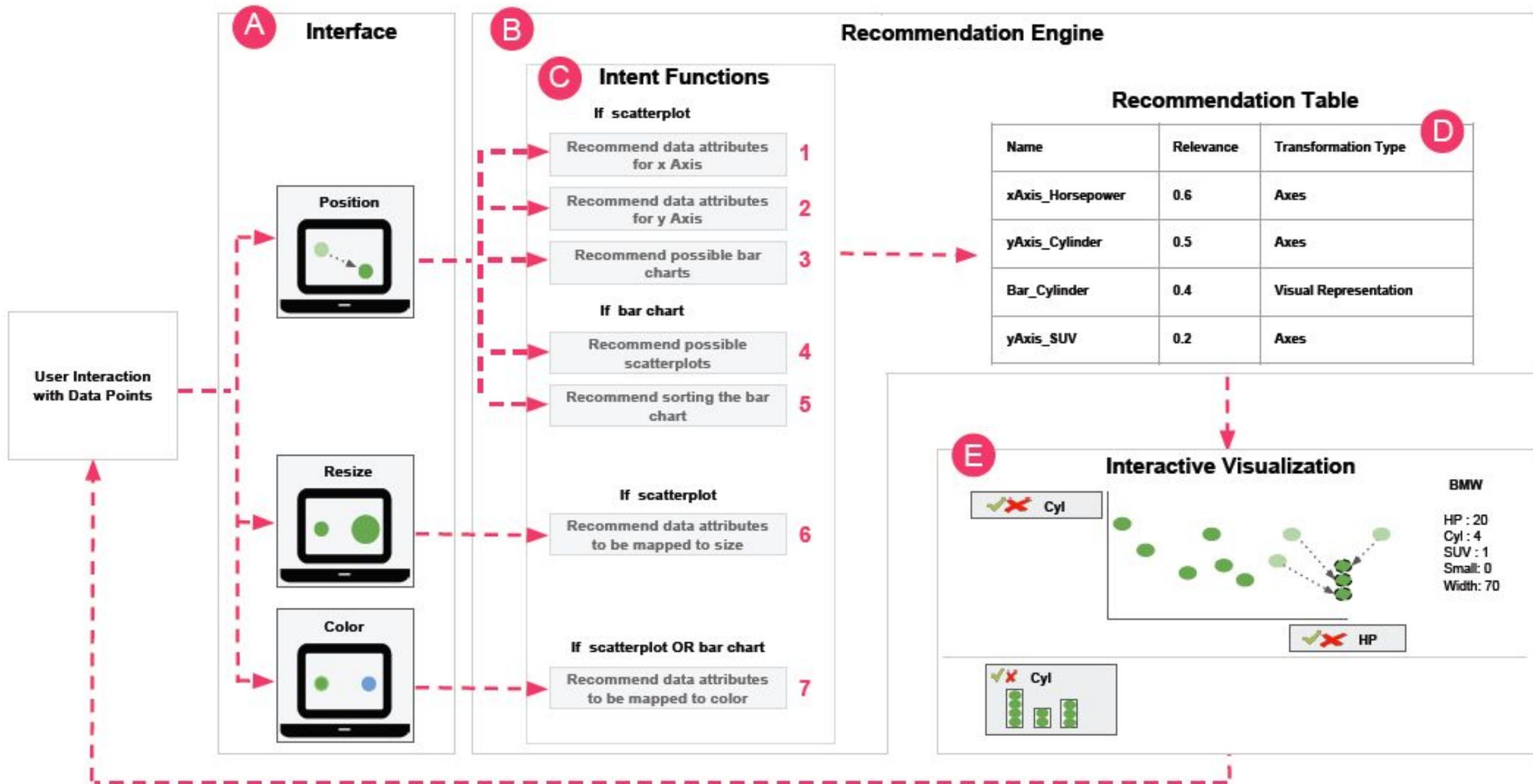
1. Visual Representation

2. Data Mapping

3. Axes

**4. View Specification**

# Recommendation Engine



# Discussion

# 1

Tradeoff between  
flexibility of vis-by-demonstration  
vs.  
the loss of formality

# 2

Other vis techniques

3

No sophisticated analytic operations

# 4

Transforming to vis techniques with  
different graphical encodings

# 5

## Consistency in visual mappings

# 6

Exploring methods of presenting  
recommendations in visualizations

# Critique

1. No **validation**
2. Need to keep track of favorite points -> makes **comparison** hard
3. Cannot **set axis** to a certain attribute
4. Great start to the exploration problem.

**Thank you!**

Dilan Ustek