

# trelliscope

D&R visualization tool  
<http://tessera.io>

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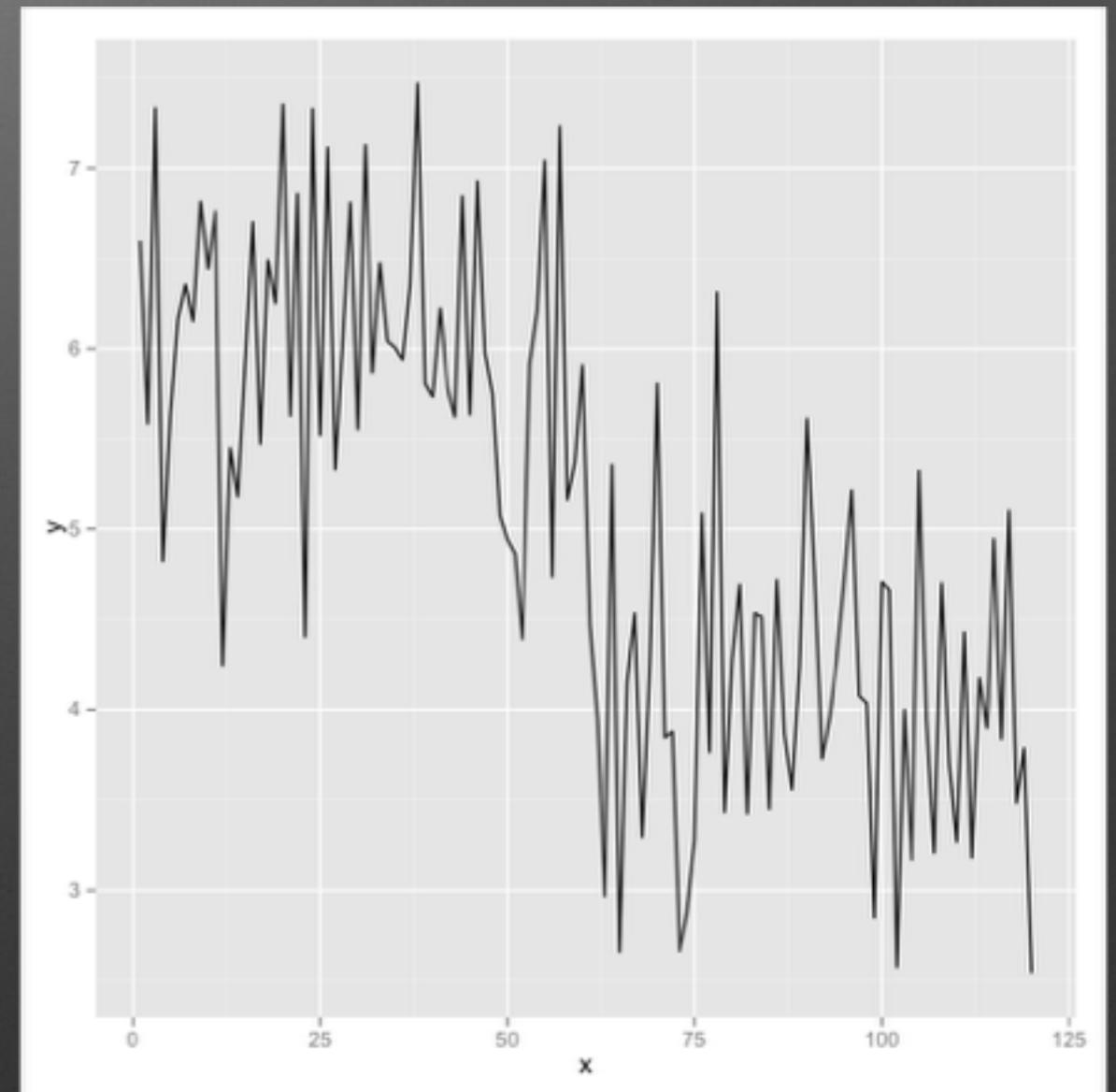
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# Motivation

- 'Blind' analysis can be very dangerous
  - Miss key data structure
  - Visualization is a critical component
- Visualization handles **very complex structures**
  - Multiple variables
  - Multiple types of variables  
(continuous, discrete, date, location, etc.)

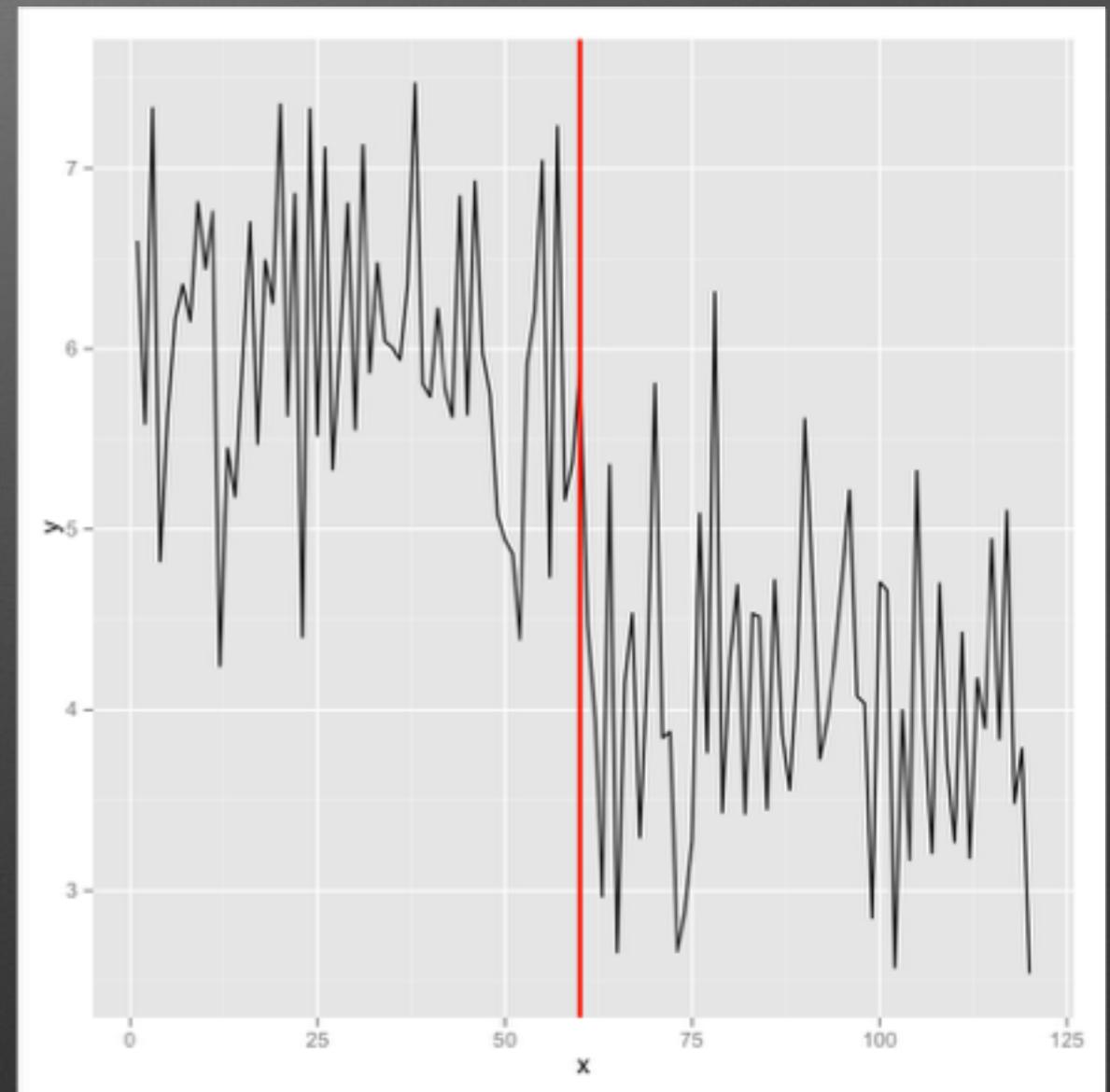
# Example

- Financial time series data
  - collected every milli-sec
  - 1 TB / day
- Can not display all data in one picture



# Example

- Financial time series data
  - collected every milli-sec
  - 1 TB / day
- Can not display **all** data in one picture
- Need to detect
  - Change points
  - Outliers
- Trelliscope!

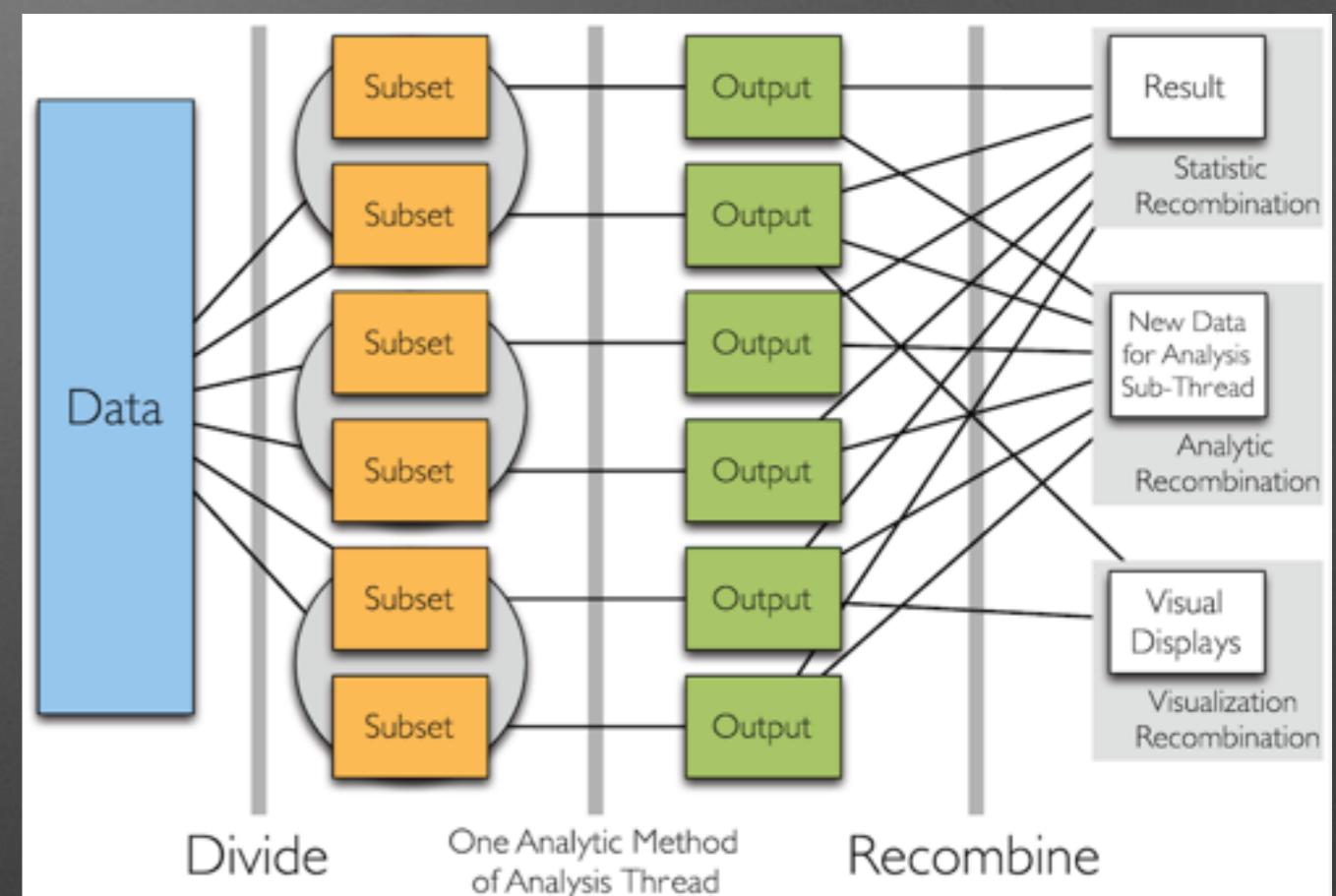


# Trelliscope

- <http://tessera.io/docs-trelliscope/>
- Divide & Recombine (D&R) visualization tool
- Based on Trellis Display
  - Effective approach to visualizing complex data
- Enables scalable, flexible, detailed visualization of data

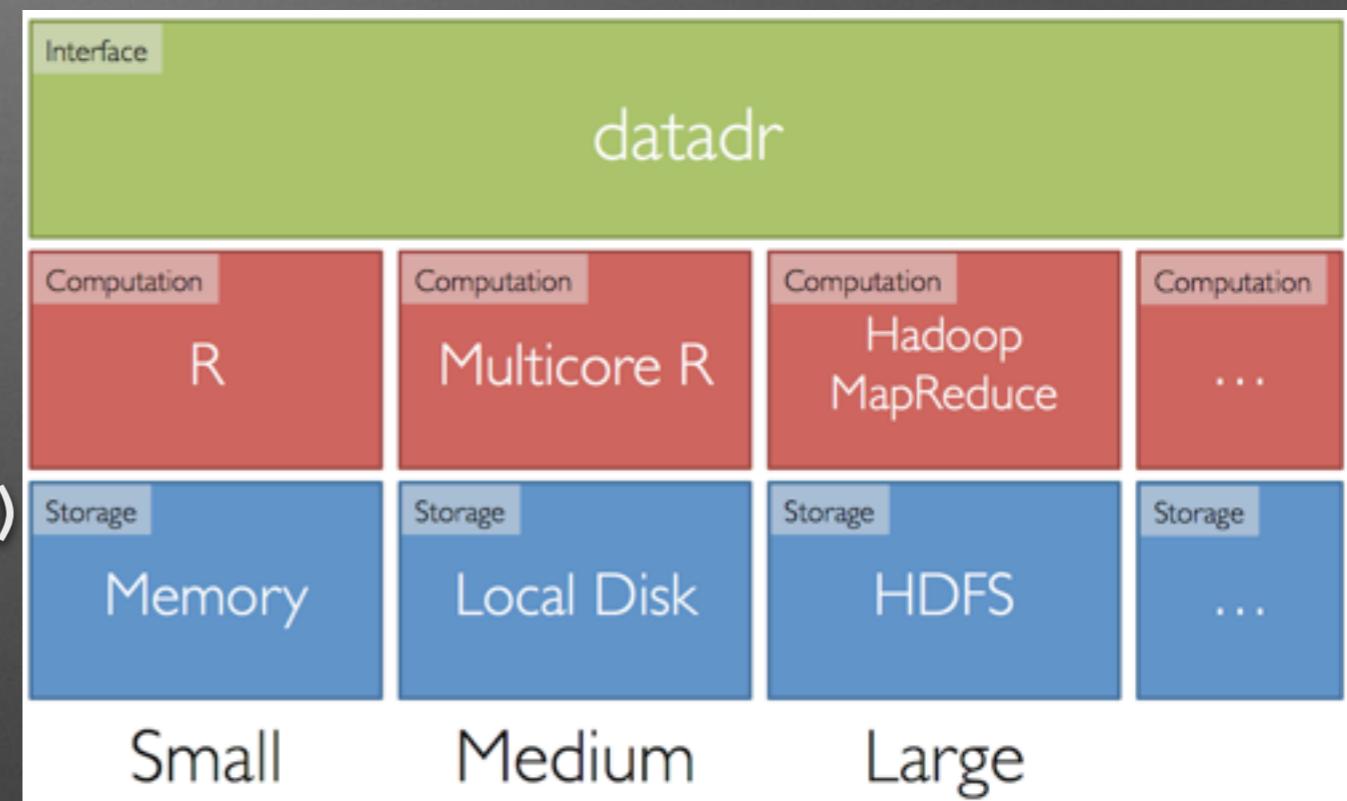
# <http://tessera.io> Stack

- Divide and Recombine



# <http://tessera.io> Stack

- Divide and Recombine
- **datadr**
  - Interface for D&R
  - Back-end agnostic
    - RHipe (Hadoop MapReduce)
    - Spark
    - Local Disk
  - Coding only within R



# <http://tessera.io> Stack

- Divide and Recombine
- `datadr`
  - Interface for D&R
  - Back-end agnostic
    - RHIPE (Hadoop MapReduce)
    - Spark
    - Local Disk
  - Coding only within R
- `Trelliscope`
  - Visualization of D&R data



# Functionality

- Apply functions
  - Visual display
    - panel function
  - Cognostics
    - computational diagnostics (metrics)
- Interactively
  - Sort
  - Filter
- Change
  - Page number
  - Panel layout
  - Labels displayed

Red Yellow Green

Trelliscope Viewer

Barrel

127.0.0.1:8100

Open a New Display

Display

Thumb

Display	Thumb
<a href="#">fields / list_vs_time_ggplot</a> : List and sold price over time w/ggplot2 2854 panels, pre-rendered=false, data storage=kvMemory, updated: 2015-02-24 00:09:02	
<a href="#">fields / list_vs_time_ex1</a> : Example 1 2854 panels, pre-rendered=false, data storage=kvMemory, updated: 2015-02-24 00:09:49	
<a href="#">fields / list_vs_time_ex2</a> : Example 2 2854 panels, pre-rendered=false, data storage=kvMemory, updated: 2015-02-24 00:10:09	

Close

Trelliscope

View Options

- Panel Layout
- Panel Function
- Panel Labels
- Related Displays

Cognostics

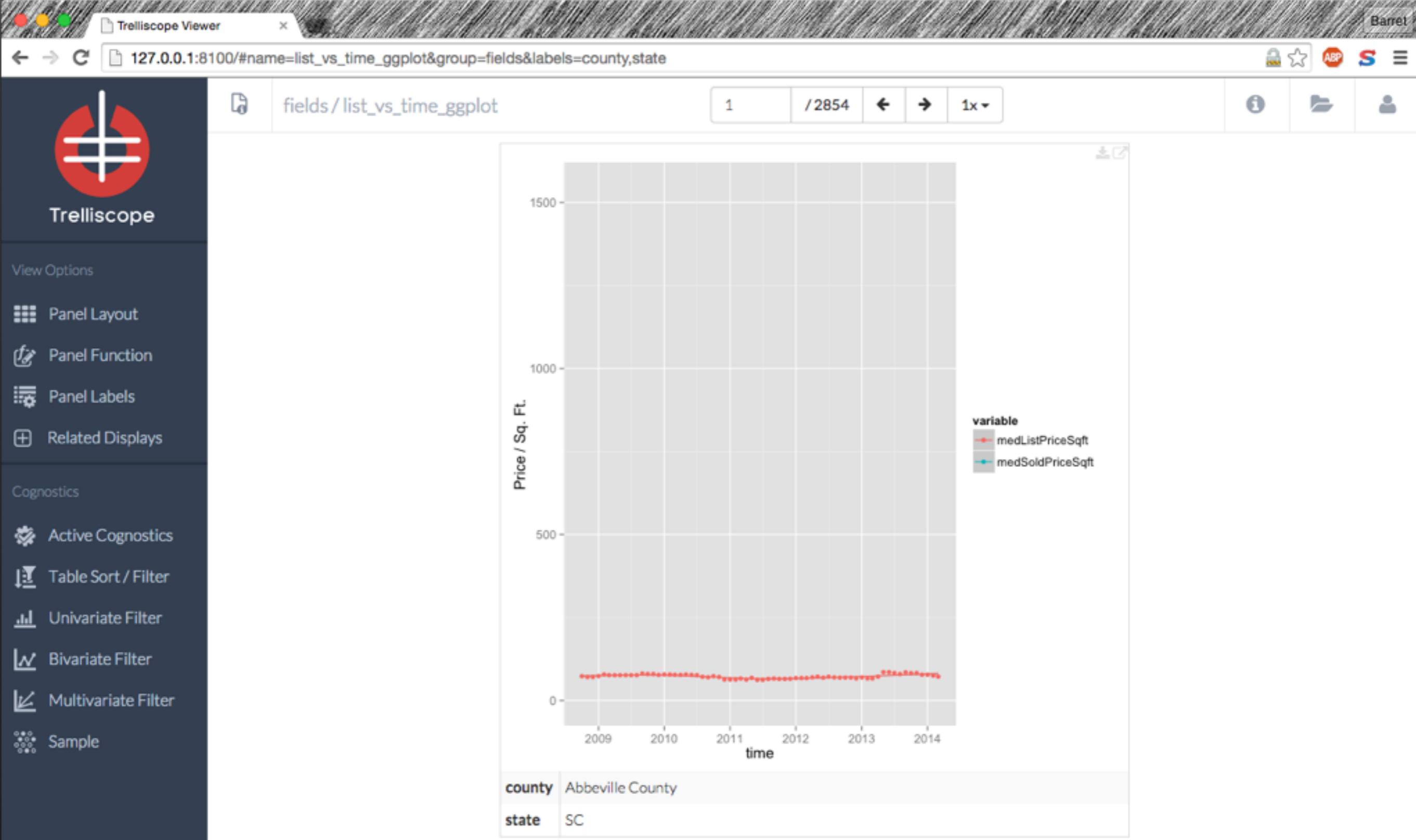
- Active Cognostics
- Table Sort / Filter
- Univariate Filter
- Bivariate Filter
- Multivariate Filter
- Sample

Information icon

Folder icon

User icon

ABP S



Trelliscope Viewer

127.0.0.1:8100/#name=list\_vs\_time\_ggplot&group=fields&labels=county,state

## Cognostics View / Sort / Filter

View cognostics in a table and specify sort order or filtering of panels.  
Shift-click on the panel header sorting buttons for multi-column sorting.

county	state	slope	meanList	meanSold	nObs
New York County	NY	0.24381422	1,113.30647	1,089.42031	6
Harney County	OR	0.16029776	113.17146	NaN	1
Kossuth County	IA	0.10273192	54.18891	NaN	1
Santa Barbara County	CA	0.08631320	320.35298	236.23978	6
District of Columbia	DC	0.08214633	369.05464	422.47440	6
Knox County	NE	0.08081005	88.57545	33.97869	1
Howard County	IA	0.07111307	54.99439	NaN	1
Mills County	TX	0.06996998	182.08283	NaN	1
Texas County	OK	0.06808895	62.11879	56.38022	1
St. Helena Parish	LA	0.06261914	75.69734	NaN	1

Columns to show

- panelKey
- county
- state
- slope
- meanList
- meanSold
- nObs
- zillowHref

Table Sort / Filter

Univariate Filter

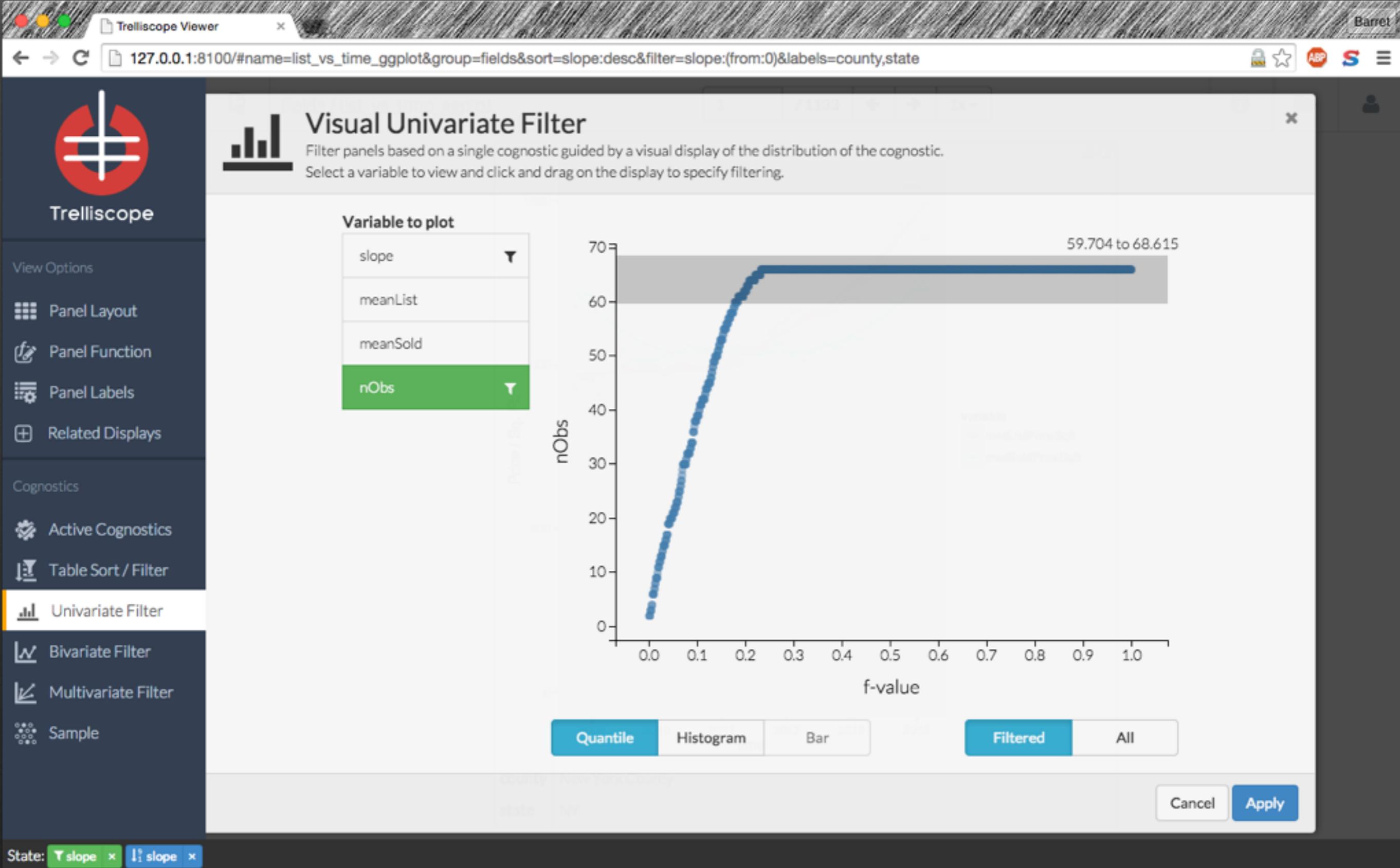
Bivariate Filter

Multivariate Filter

Sample

Showing entries 1 - 10 of 1133

Cancel Apply



Trelliscope Viewer

127.0.0.1:8100/#name=list\_vs\_time\_ggplot&group=fields&sort=slope:desc&filter=slope:(from:0),nObs:(from:59.7035416216216,to:68.6151956756757)&labels=co... ABP S

## Panel Function Editor

Edit the code that generates each panel.

```
1 panelFn <-  
2 structure(function(x) {  
3   x %>%  
4     select(time, medListPriceSqft, medSoldPriceSqft) %>%  
5     gather(key = "variable", value = "value", medListPriceSqft, medSoldPriceSqft, -time) %>%  
6     ggplot(aes(x = time, y = value, color = variable)) +  
7       geom_smooth() +  
8       geom_point() +  
9       ylim(yRanges) +  
10      labs(y = "Price / Sq. Ft.")  
11 }, class = c("function", "ggplotFn"))
```

Note: this feature is currently disabled - panels will not update when you click 'Apply'...

Cancel Apply

State: ▼ slope ▼ nObs ▼ slope

Trelliscope Viewer

127.0.0.1:8100/#name=list\_vs\_time\_ggplot&group=fields&sort=slope:desc&filter=slope:(from:0),nObs:(from:59.7035416216216,to:68.6151956756757)&labels=co... ABP S E

## Panel Layout

Specify the arrangement of the panels on each page by entering the number of rows and columns of panels per page. Future functionality for fixing / varying levels of cognostics per page to come.

**Rows**: 1

**Columns**: 3

**Fixed Per Page**

**Varies Per Page**

**Panel Arrangement**

By Row      By Column

Cancel      Apply

**Trelliscope**

View Options

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Panel Labels

Related Displays

Cognostics

Active Cognostics

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Sample

State: slope nObs !slope

Trelliscope Viewer

127.0.0.1:8100/#name=list\_vs\_time\_ggplot&group=fields&sort=slope:desc&filter=slope:(from:0),nObs:(from:59.7035416216216,to:68.6151956756757)&labels=co... ABP S

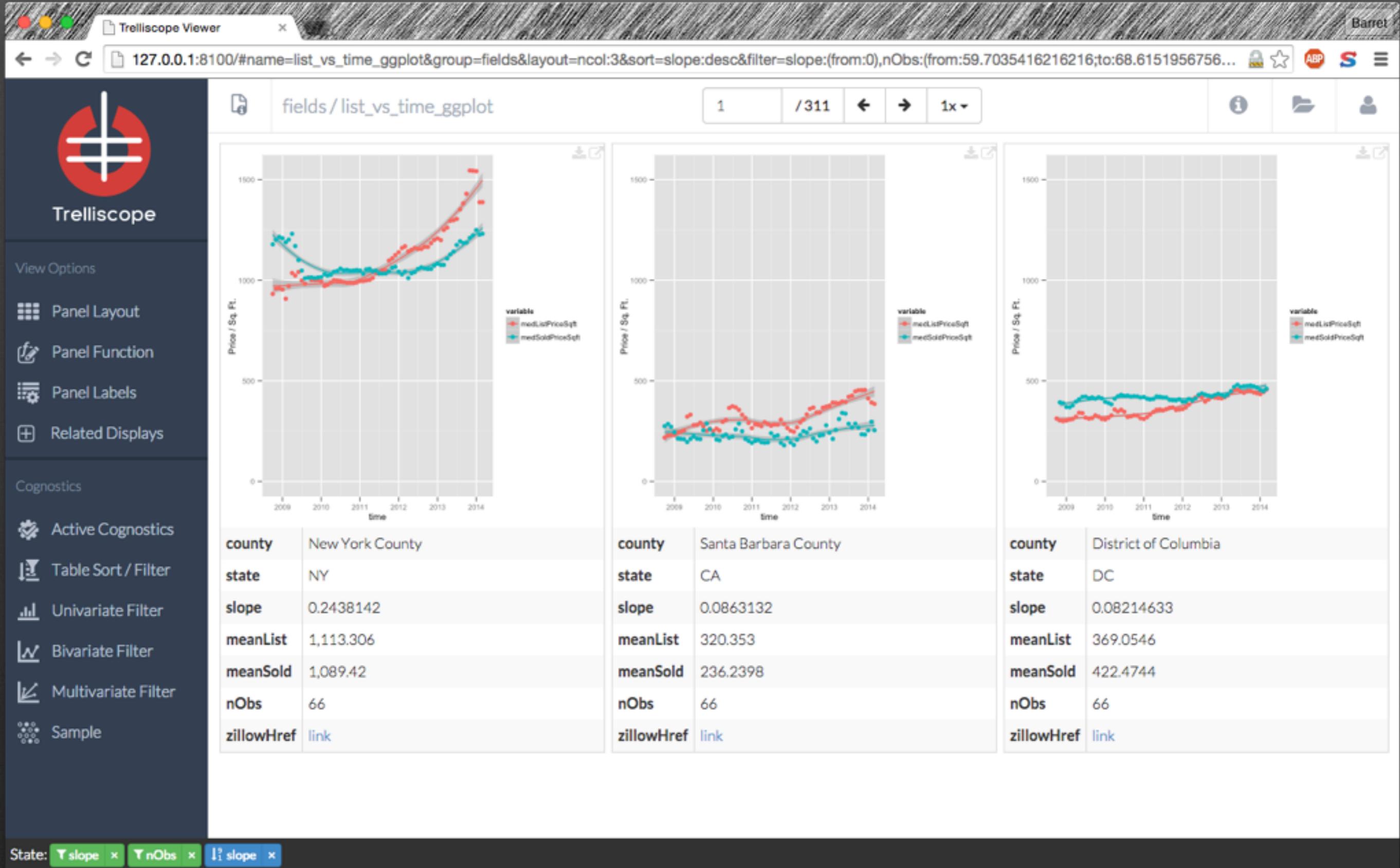
## Panel Labels

Specify which cognostics to view underneath each panel.  
Select cognostics to view by clicking and/or dragging the 'Show' column.

Cognostic	Show
panelKey	
panelKey: panel key	
condVar	
county: conditioning variable	✓
state: conditioning variable	✓
common	
slope: list price slope	✓
meanList: mean	✓
meanSold: mean	✓
nObs: number of non-NA list prices	✓
zillowHref: zillow link	✓

Cancel Apply

State: slope nObs !slope



# Future Work

- Split into 3 separate packages
  - trelliscopejs - html / javascript
  - trelliscoper - R server
  - trelliscopeServerjs - node.js server
- Functionality
  - Sample
  - Multi-panel display
  - Multivariate filtering
  - Research
    - Automatic cognostics
    - Suggested ordering



# tessera.io

Open source environment for  
deep analysis of large complex data