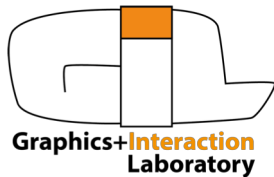


Information Visualization

Multi-dimensional Data (Hypervariate Data, Multivariate Data)



Sample Data

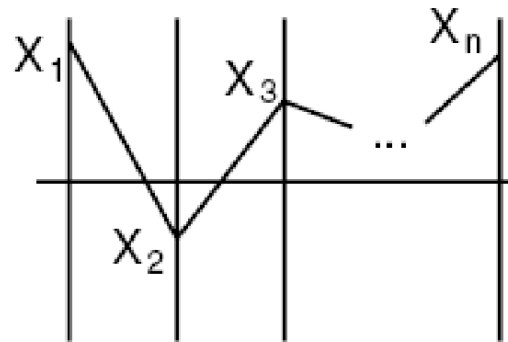
- ▶ Famous car data set
 - ▶ Car models released from 1970 to 1982

1	MPG	Cylinders	Horsepower	Weight	Acceleration	Year	Origin
2	18	8	130	3504	12	70	USA
3	15	8	165	3693	11.5	70	USA
4	18	8	150	3436	11	70	USA
5	16	8	150	3433	12	70	USA
6	17	8	140	3449	10.5	70	USA
7	15	8	198	4341	10	70	USA
8	14	8	220	4354	9	70	USA
9	14	8	215	4312	8.5	70	USA
10	14	8	225	4425	10	70	USA
11	15	8	190	3850	8.5	70	USA
12	15	8	170	3563	10	70	USA
13	14	8	160	3609	8	70	USA
14	15	8	150	3761	9.5	70	USA
15	14	8	225	3086	10	70	USA
16	24	4	95	2372	15	70	Europe
17	22	6	95	2833	15.5	70	USA
18	18	6	97	2774	15.5	70	USA
19	21	6	85	2587	16	70	USA



Parallel Coordinates (PC)

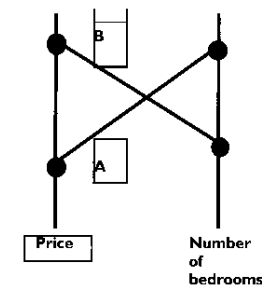
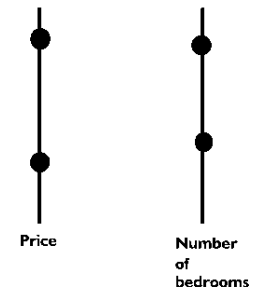
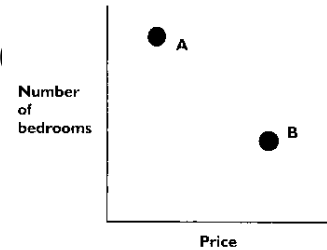
- N-dimensional data tuples $x_1, x_2, x_3, \dots, x_n$ depicted as a polyline, where the points $x_1, x_2, x_3, \dots, x_n$ are connected via n parallel Y-axes



- Each column mapped onto virtual axis

- Nice intro on

<http://eagereyes.org/techniques/parallel-coordinates>

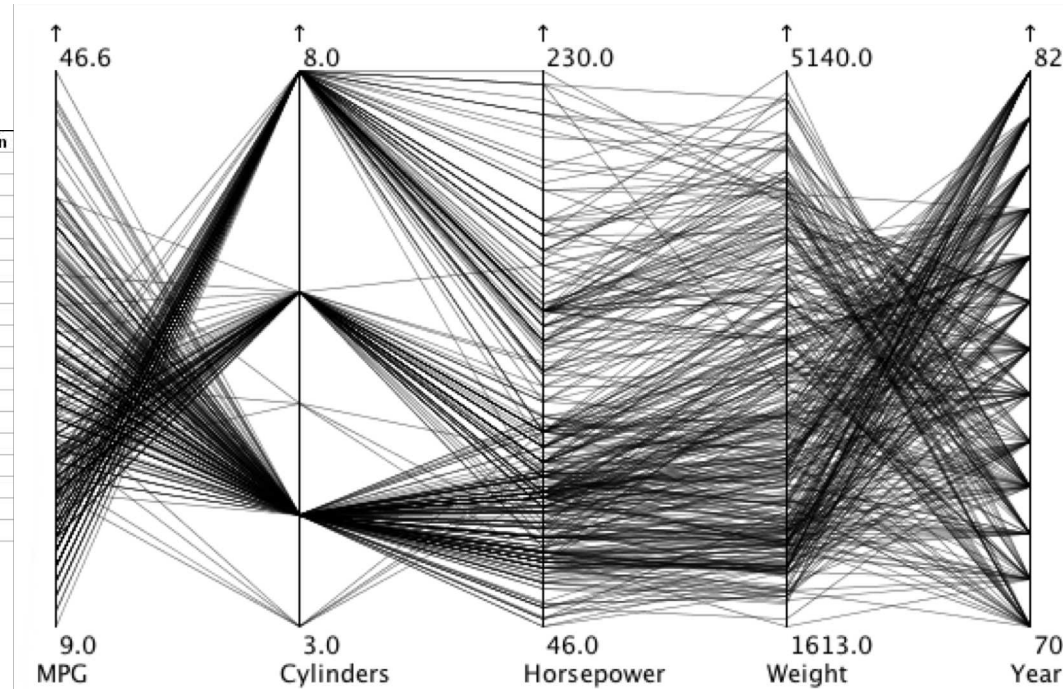


[Spence 2001]



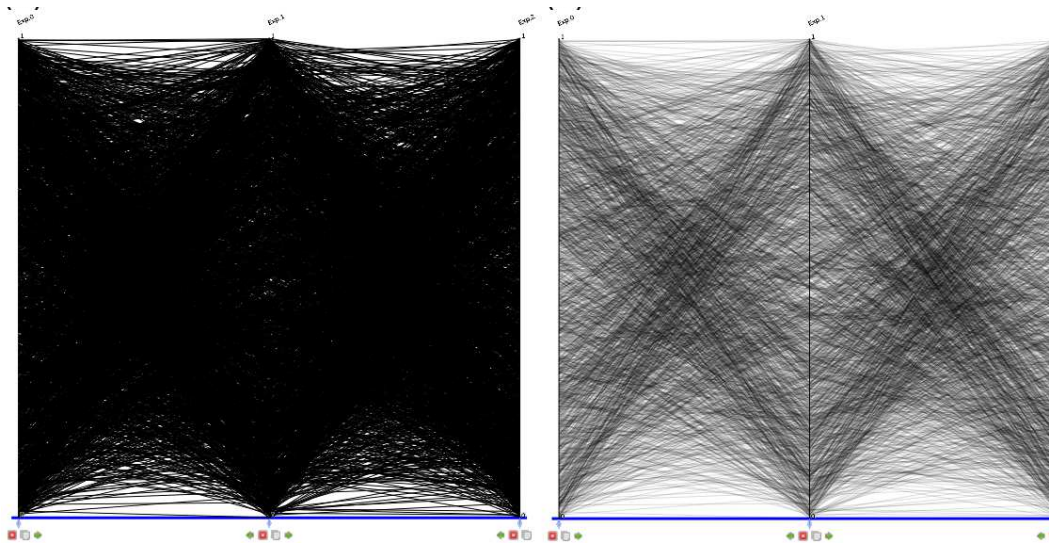
Parallel Coordinates Example: Car Dataset

1	MPG	Cylinders	Horsepower	Weight	Acceleration	Year	Origin
2	18	8	130	3504	12	70	USA
3	15	8	165	3693	11.5	70	USA
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16	24	4	95	2372	15	70	Europe
17	22	6	95	2833	15.5	70	USA
18	18	6	97	2774	15.5	70	USA
19	21	6	85	2587	16	70	USA



Parallel Coordinates Limitations

- ▶ Overplotting for large data sets
 - ▶ Transparency
 - ▶ Sampling
 - ▶ Random sampling



Parallel Coordinates Limitations (2)

- ▶ Only adjacent axes can be related to each other
- ▶ Number of axes is limited

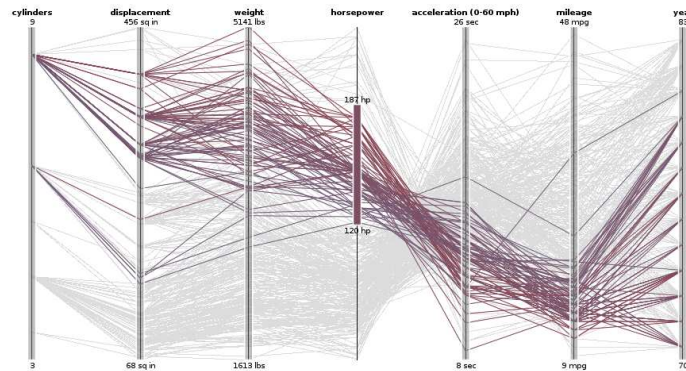


[Yang 2003]



ProtoVis PC Implementation

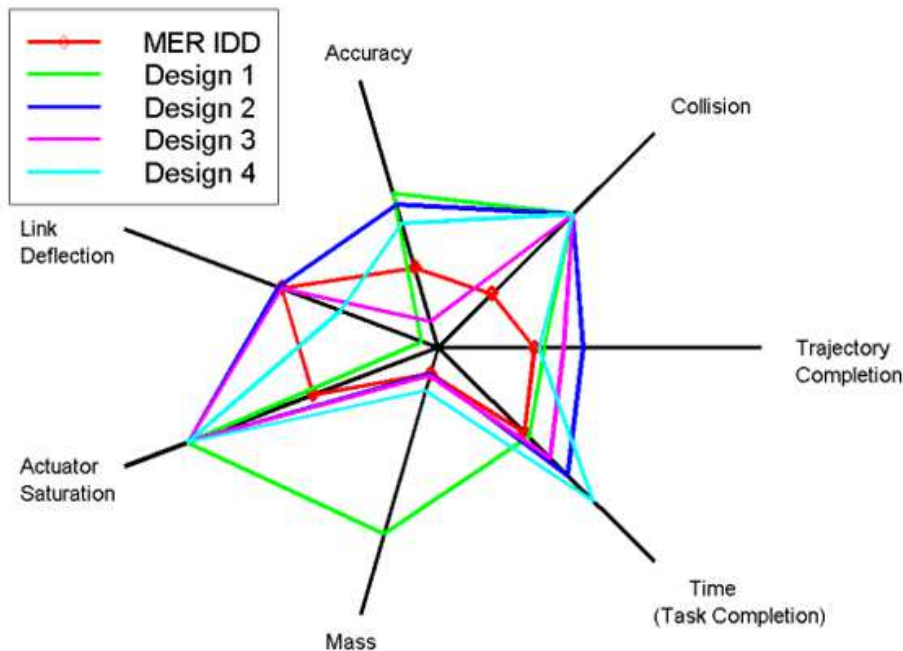
- ▶ Available on <http://vis.stanford.edu/protovis/>
- ▶ Java script and SVG
- ▶ Native web-visualization
- ▶ Cars dataset in ProtoVis
<http://vis.stanford.edu/protovis/ex/cars.html>



Star Plot

- ▶ Similar to parallel coordinates
- ▶ Radiate from a common origin

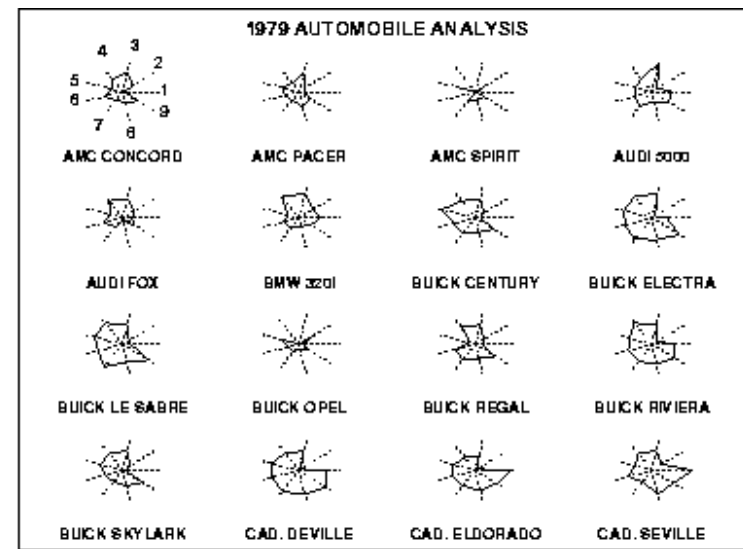
Star Plot of MER IDD and Automated Designs



<http://start1.jpl.nasa.gov/caseStudies/autoTool.cfm>

[Coekin1969]

- 1 Price
- 2 Mileage (MPG)
- 3 1978 Repair Record (1 = Worst)
- 4 1977 Repair Record (1 = Worst)
- 5 Headroom
- 6 Rear Seat Room
- 7 Trunk Space
- 8 Weight
- 9 Length



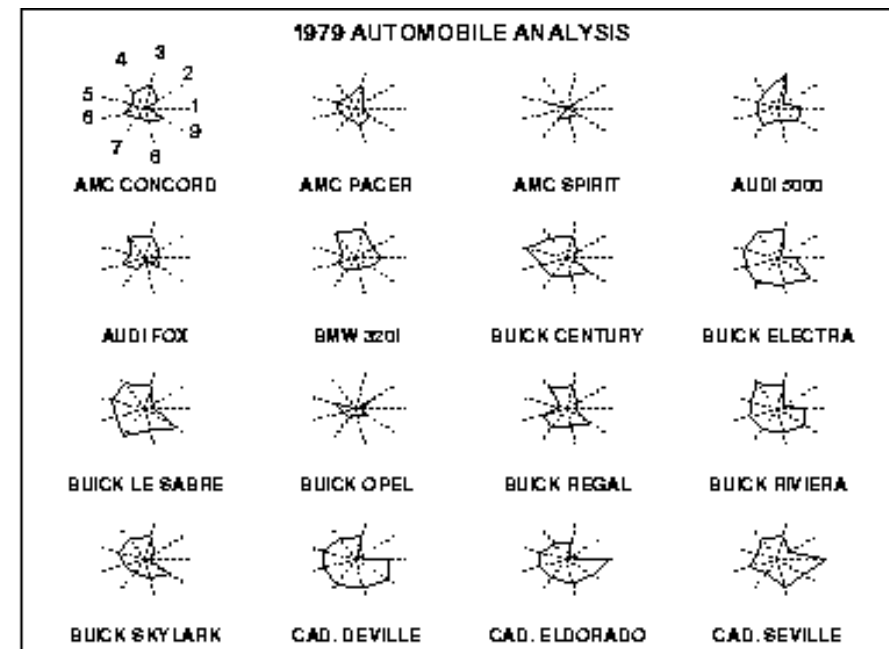
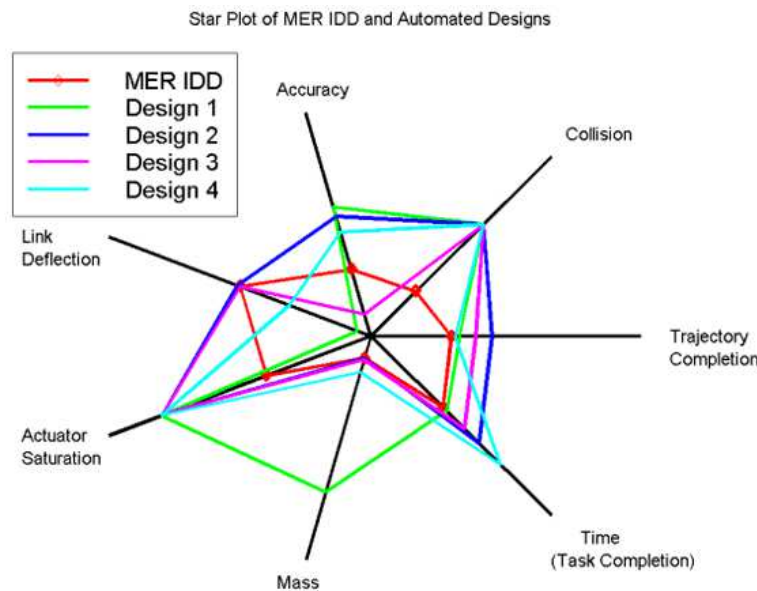
<http://www.itl.nist.gov/div898/handbook/eda/section3/starplot.htm>



Star Plot

[Coekin1969]

- Find similarities, find max/min values
- Problem: Does not scale well

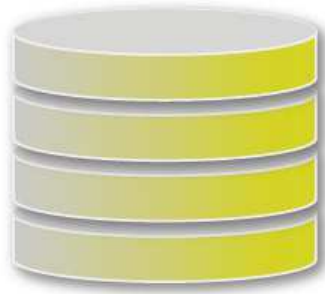


<http://start1.jpl.nasa.gov/caseStudies/autoTool.cfm>

<http://www.itl.nist.gov/div898/handbook/eda/section3/starplot.htm>



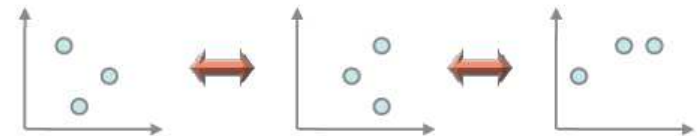
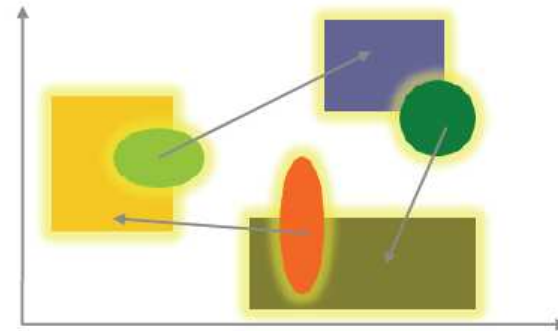
Visualizing Complex Data



Complex dataset



Complex visualization



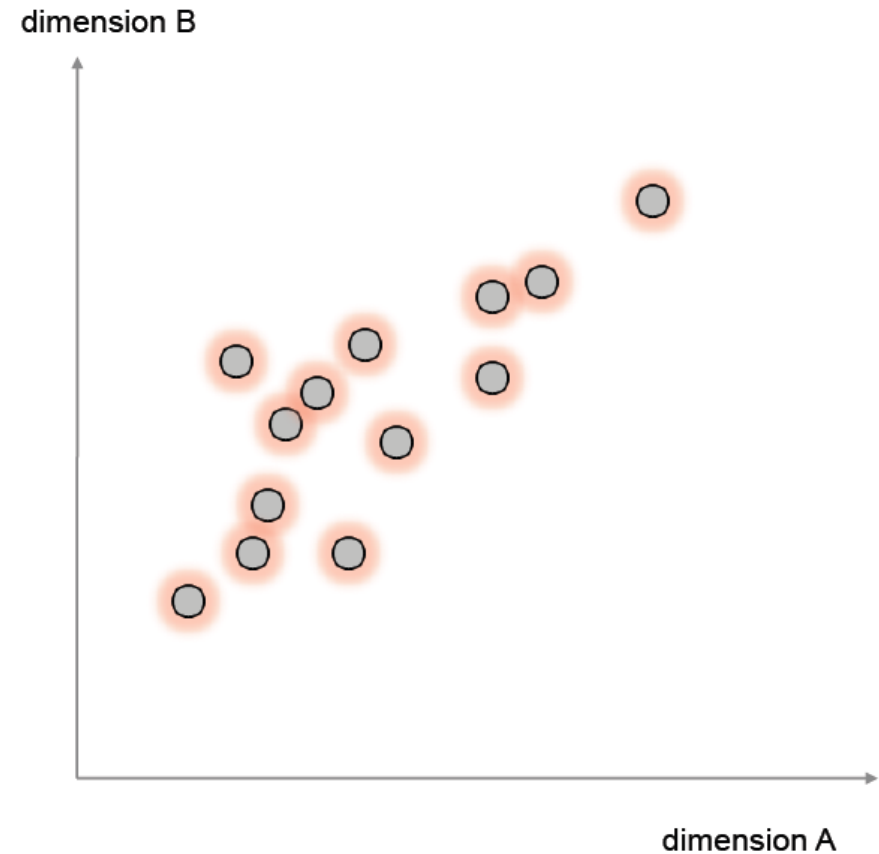
Many simple visualizations



Scatterplots



- Assign dimensions to graphical axes
 - Two (typical) or three
- Data cases as points in the space defined by axes
- Additional dimensions
 - Point color
 - Point size
 - Point shape
 - ...
- **Limited** number of displayed dimensions!



Problem



- Many (most?) interesting real-world datasets have **many** dimensions
 - Certainly more than a scatterplot can show!
- Two possible solutions:
 1. More complex visual representation
 - Parallel coordinates, DataMeadow, etc...
 - Lose simplicity of scatterplots
 2. Create many scatterplots (one per combination of dimensions)
 - But how to visualize them?

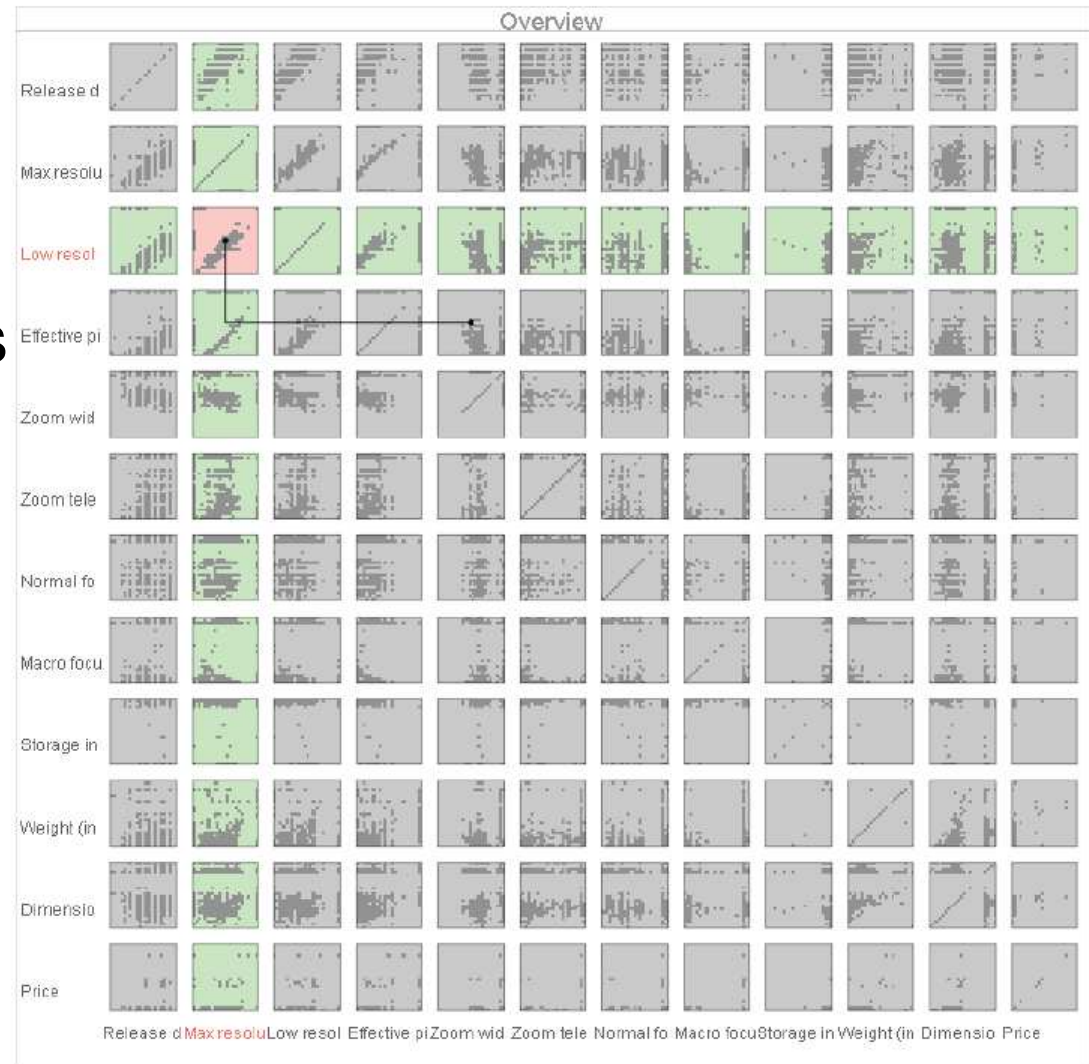
Scatterplot Matrices

- ▶ Create matrix of all data dimensions
 - ▶ Each column/row is a data dimension
 - ▶ Each cell in the matrix is a scatter plot
 - ▶ Reordering of columns/rows (manual/automatic)
- ▶ Complex data can be visualized through a sequence of simple visualizations

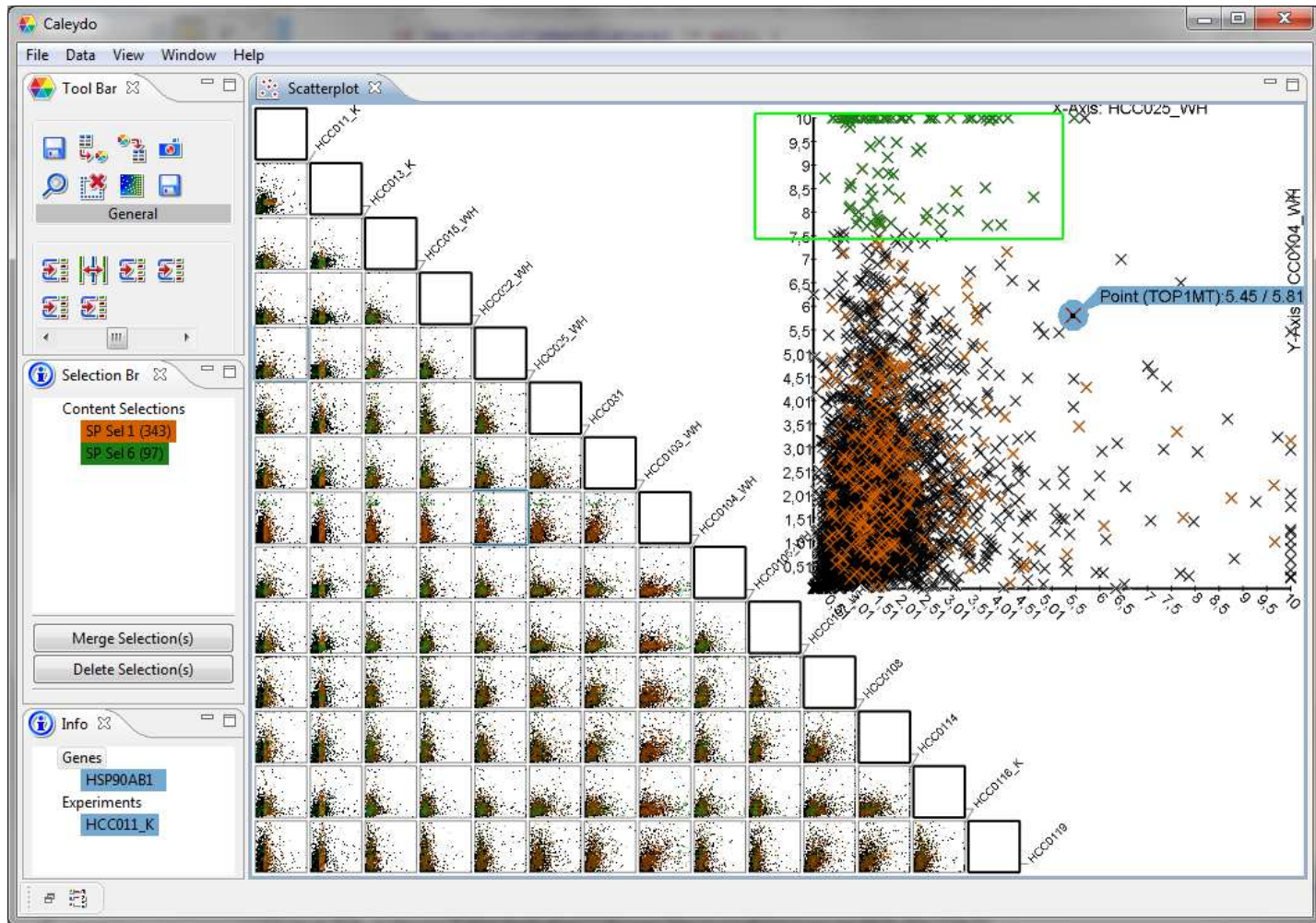


Example: Scatterplot Matrix

- Find pairwise relationships
- Clustering in groups of data

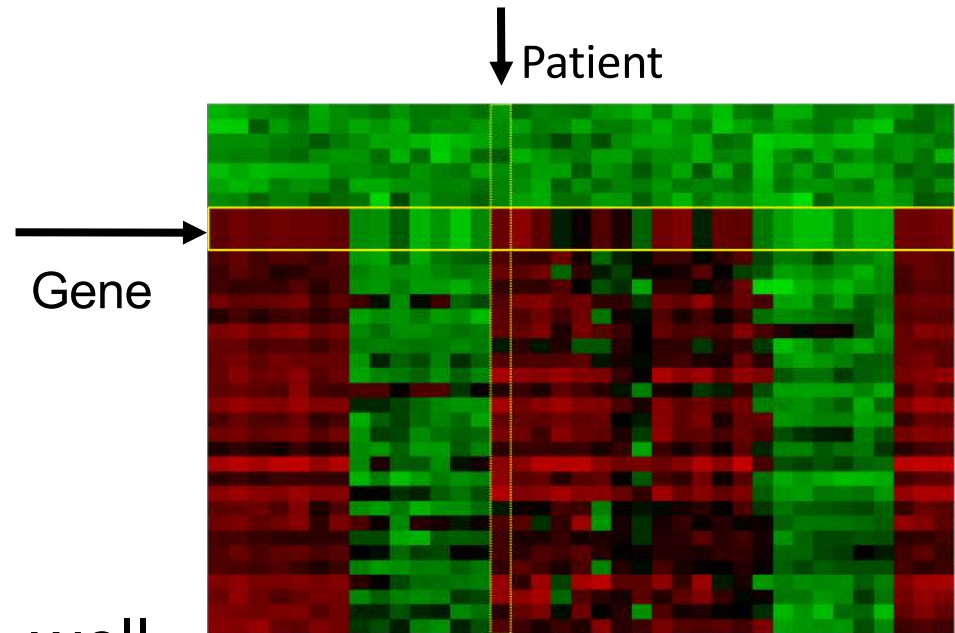


Scatterplot Matrix in Caleydo



Heat Map

- ▶ Common representation
- ▶ Color coded regulation
- ▶ Filtering and Clustering



- ▶ Problem: does not scale well
- ▶ Solution: hierarchical approach



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