



Erasmus+



Innovative Lifelong e-Learning for Professional Engineers (e-ProfEng)

586391-EPP-1-2017-1-SE-EPPKA2-CBHE-JP

Training in Electrical Engineering Discipline
Modelling and Simulation in Electrical Engineering

Data visualization in data analysis

Tools

Josip Job

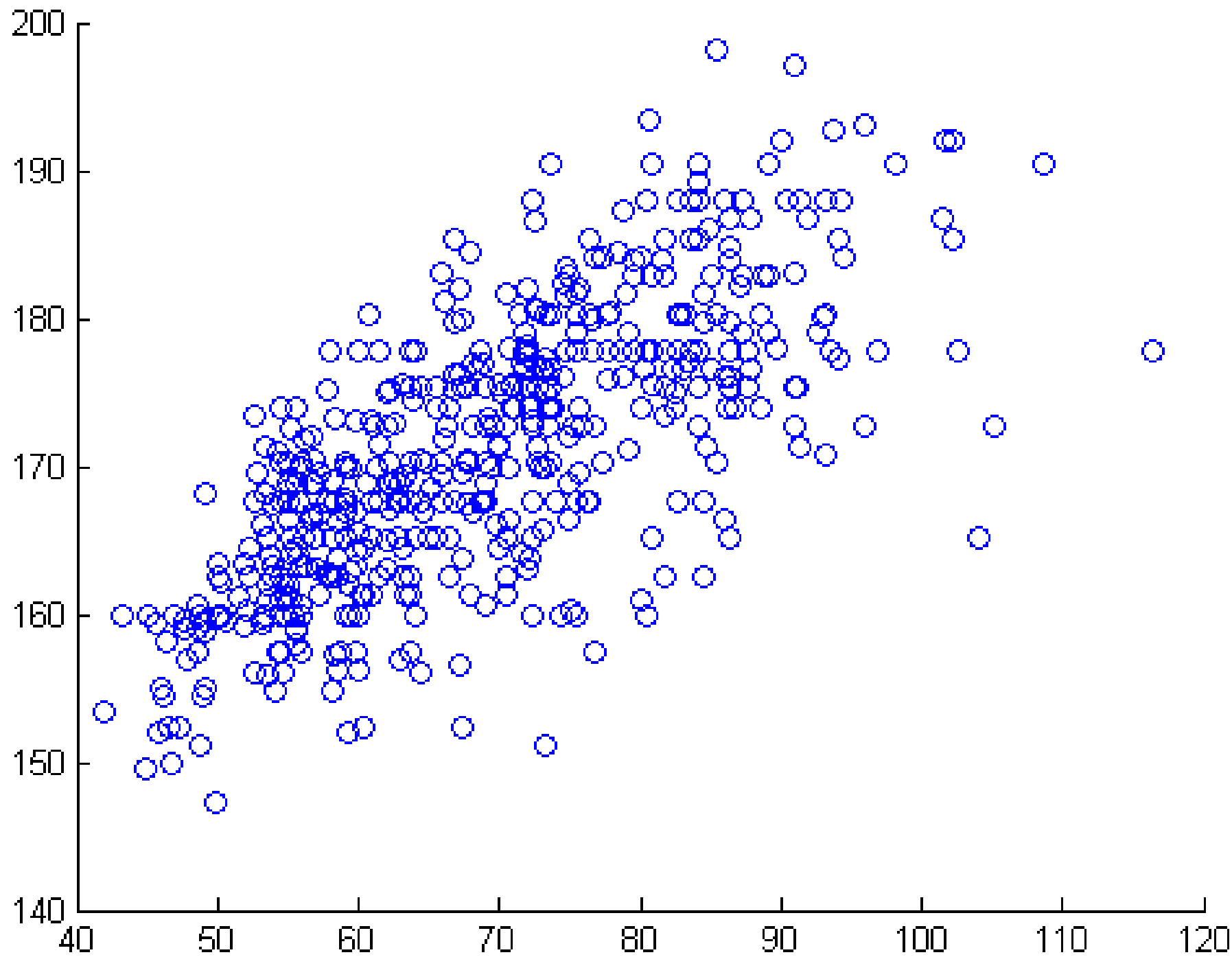
Tools

Example

- Grete Heinz, Louis J. Peterson, Roger W. Johnson, and Carter J. Kerk. *Exploring relationships in body dimensions*. Journal of Statistics Education, Volume 11, Number 2, 2003.
- The data give 21 body dimension measurements as well as:
 - age, weight, height, and gender on 507 individuals.
- The 247 men and 260 women were:
 - primarily individuals in their twenties and thirties, with
 - a scattering of older men and women, all exercising several hours a week.
- There are:
 - 507 observations
 - on 25 variables.

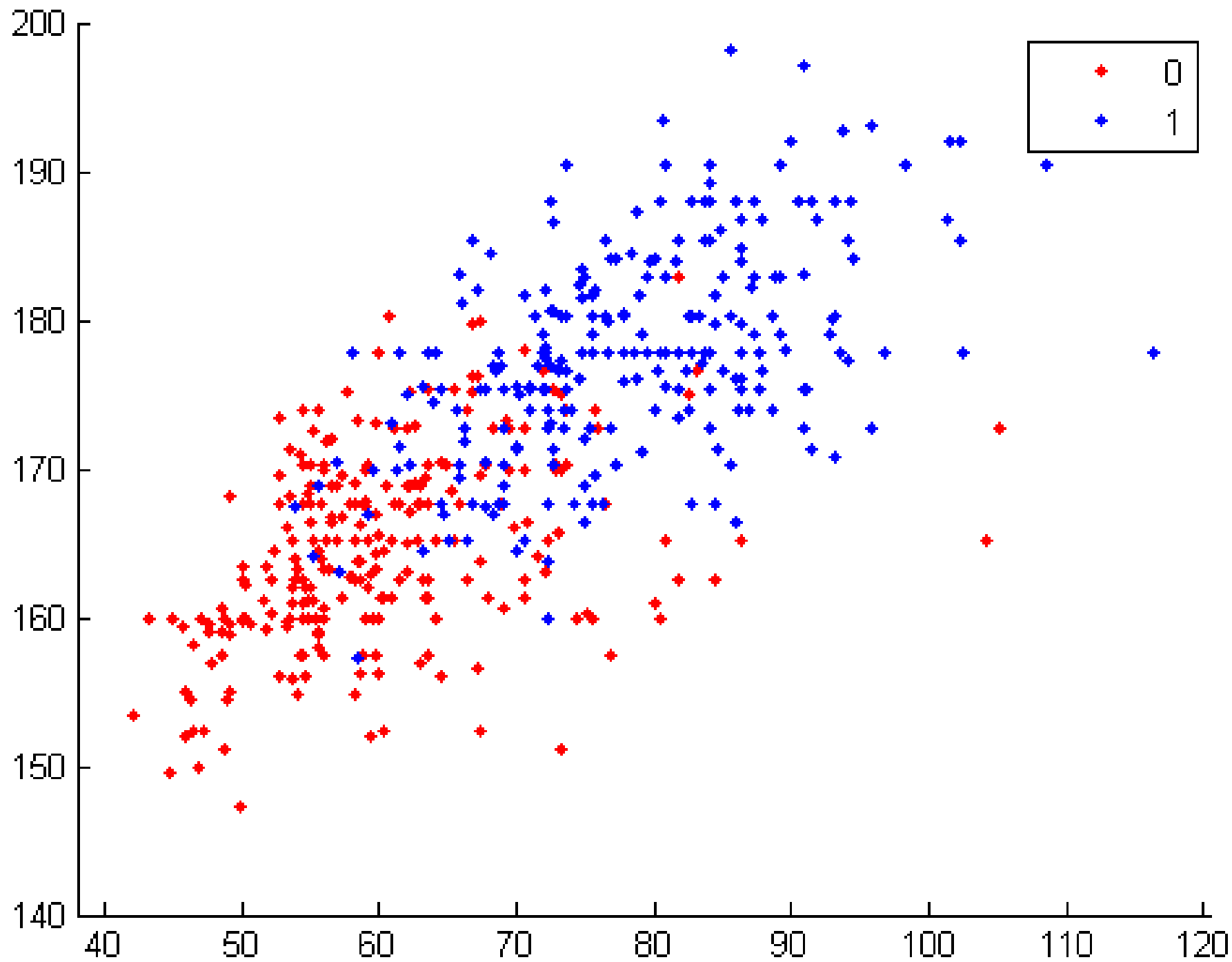
Matlab

```
scatter(body(:, 23), body(:, 23))
```



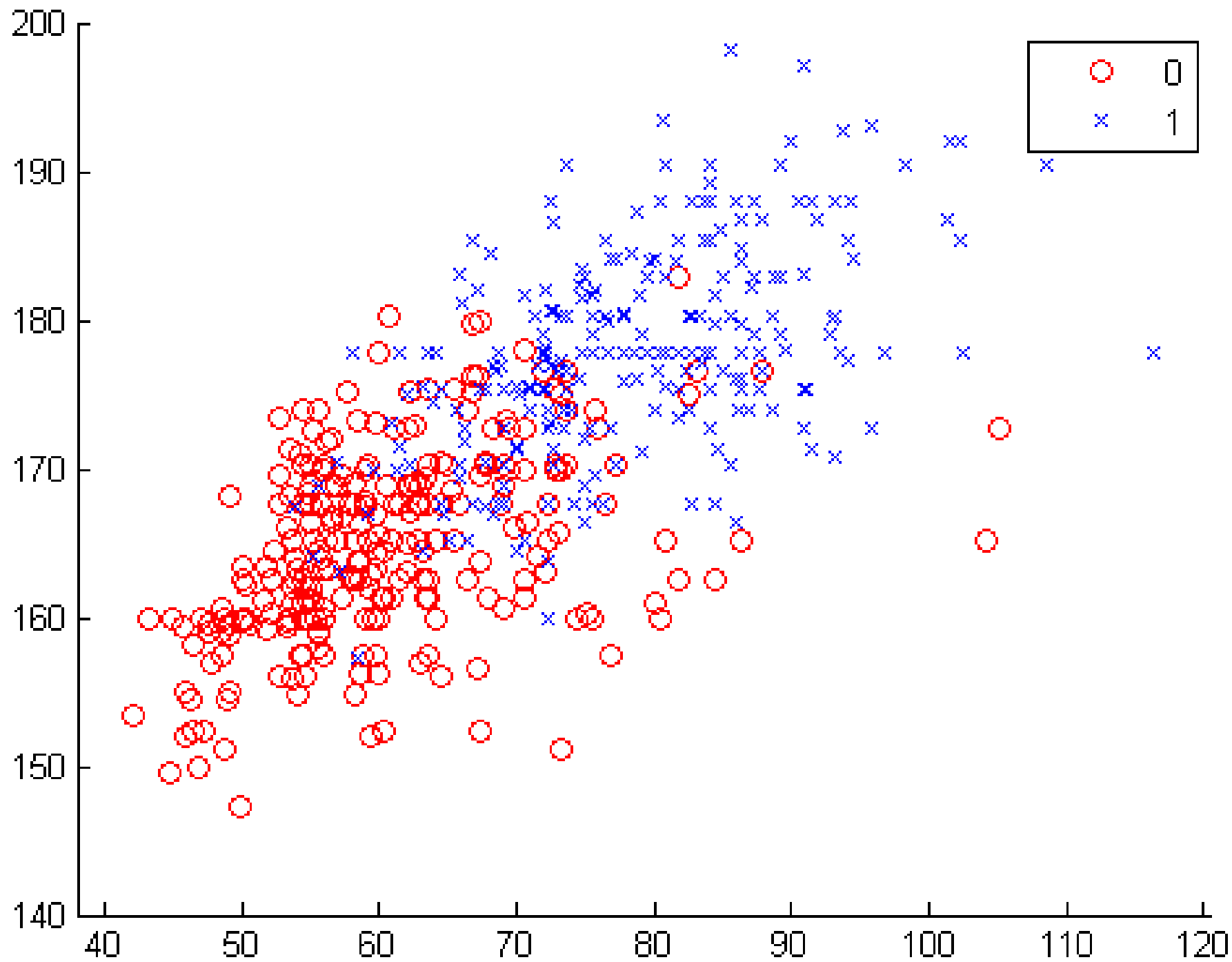
Matlab

```
scatter(body(:, 23), body(:, 23))  
gscatter(body(:, 23), body(:, 24), gr, 'rb')
```



Matlab

```
scatter(body(:, 23), body(:, 23))  
gscatter(body(:, 23), body(:, 24), gr, 'rb')  
gscatter(body(:, 23), body(:, 24), gr, 'rb', 'ox')
```

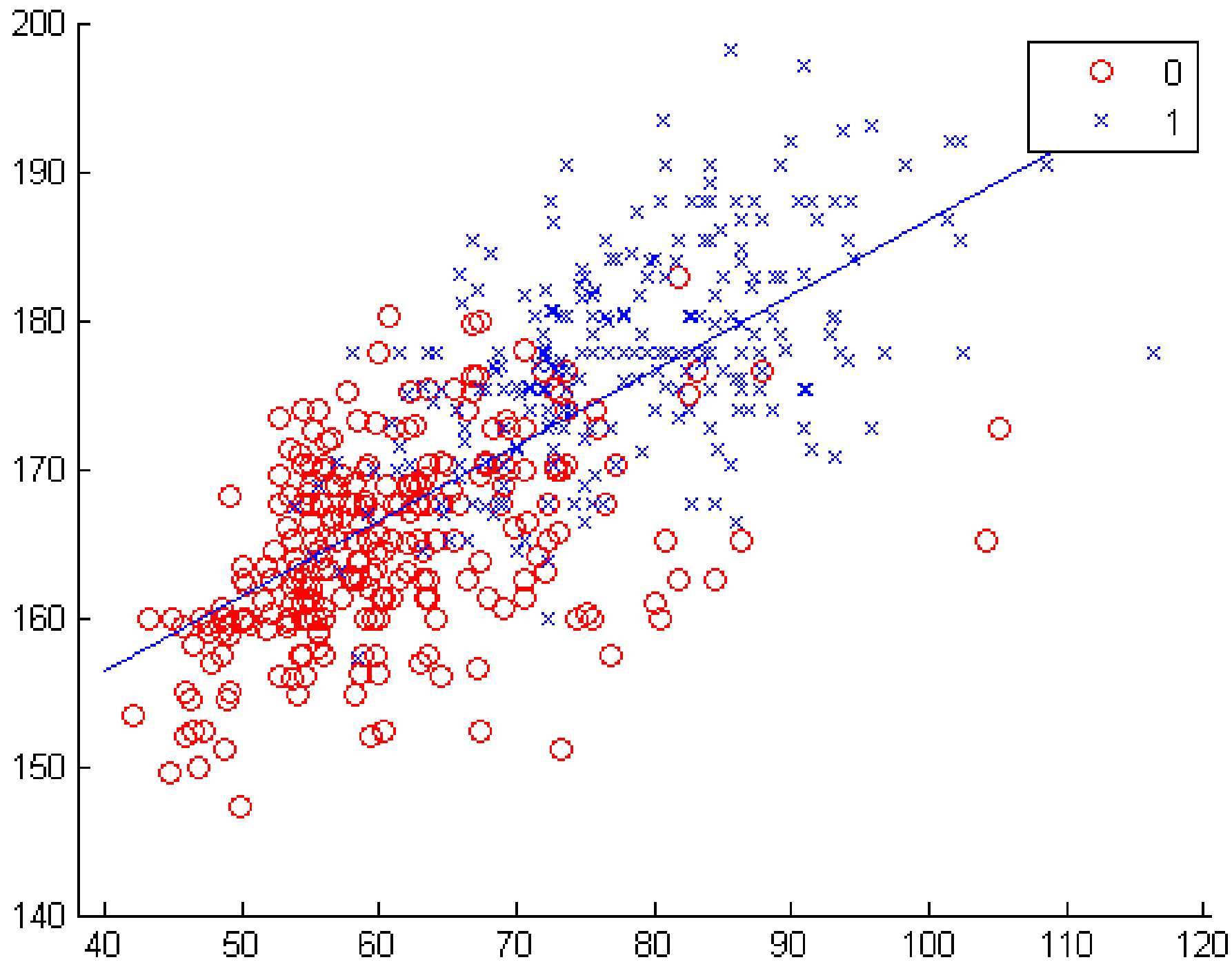



Matlab

```
scatter(body(:,23),body(:,23))
gscatter(body(:,23),body(:,24),gr,'rb')
gscatter(body(:,23),body(:,24),gr,'rb','ox')
polyfit(body(:,23),body(:,24),1)
ans =

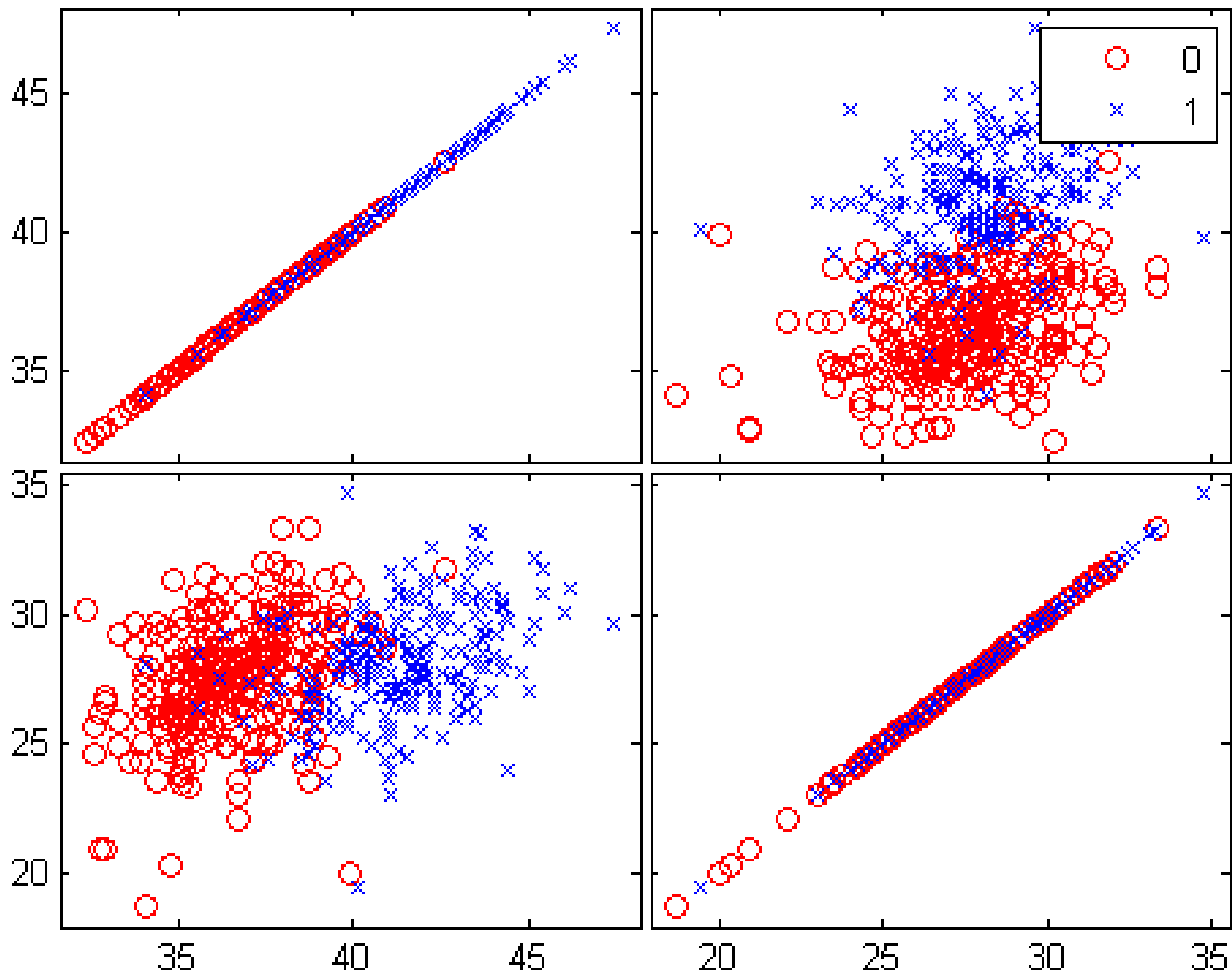
0.5056    136.1819
y=ans * x
y =

156.4064    191.7993
line(x(1,:),y)
```



Matlab

```
gplotmatrix(body(:, [1 2]), body(:, [1  
2]), gr, 'rb', 'ox')
```

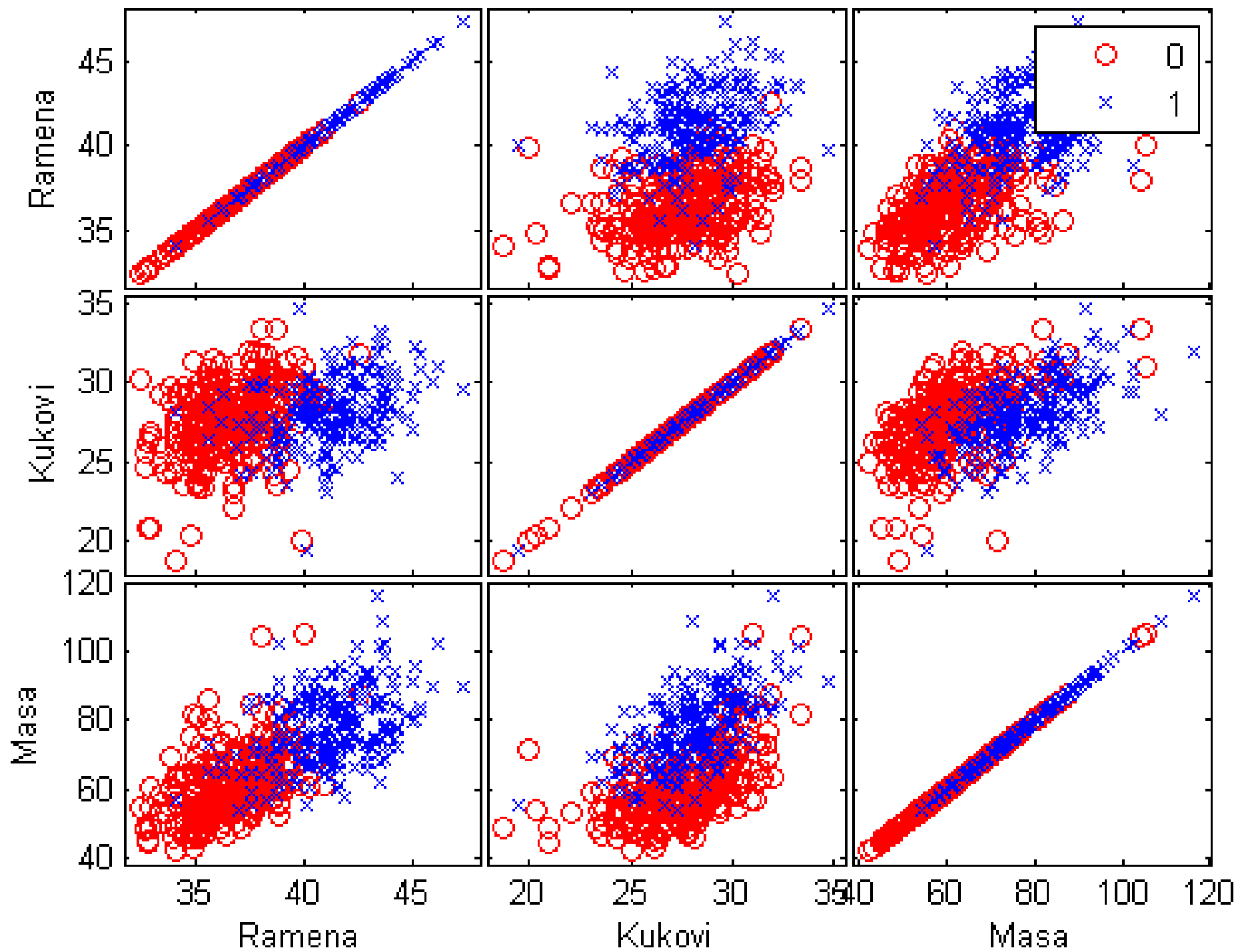


Matlab

```
gplotmatrix(body(:, [1 2 23]), body(:, [1 2  
23]), gr, 'rb', 'ox', [], 'on', '',  
{'Ramena', 'Kukovi', 'Masa'},  
{'Ramena', 'Kukovi', 'Masa'})
```

- ***English version:***

```
gplotmatrix(body(:, [1 2 23]), body(:, [1 2  
23]), gr, 'rb', 'ox', [], 'on', '',  
{'Shoulders', 'Hips', 'Weight'},  
{'Shoulders', 'Hips', 'Weight'})
```



Regression Analysis

- The regression equation is:

$$\begin{aligned} \text{Weight (kg)} = & - 120 + 0.0781 \text{ Shoulder Girth} + 0.198 \text{ Chest Girth} \\ & + 0.340 \text{ Waist Girth} + 0.0012 \text{ Navel Girth} \\ & + 0.240 \text{ Hip Girth} + 0.314 \text{ Thigh Girth} + 0.0547 \text{ Flexed Bicep Girth} \\ & + 0.532 \text{ Forearm Girth} + 0.301 \text{ Knee Girth} + 0.404 \text{ Calf Maximum Girth} \\ & - 0.0096 \text{ Ankle Minimum Girth} - 0.118 \text{ Wrist Minimum Girth} \\ & + 0.328 \text{ Height} \end{aligned}$$

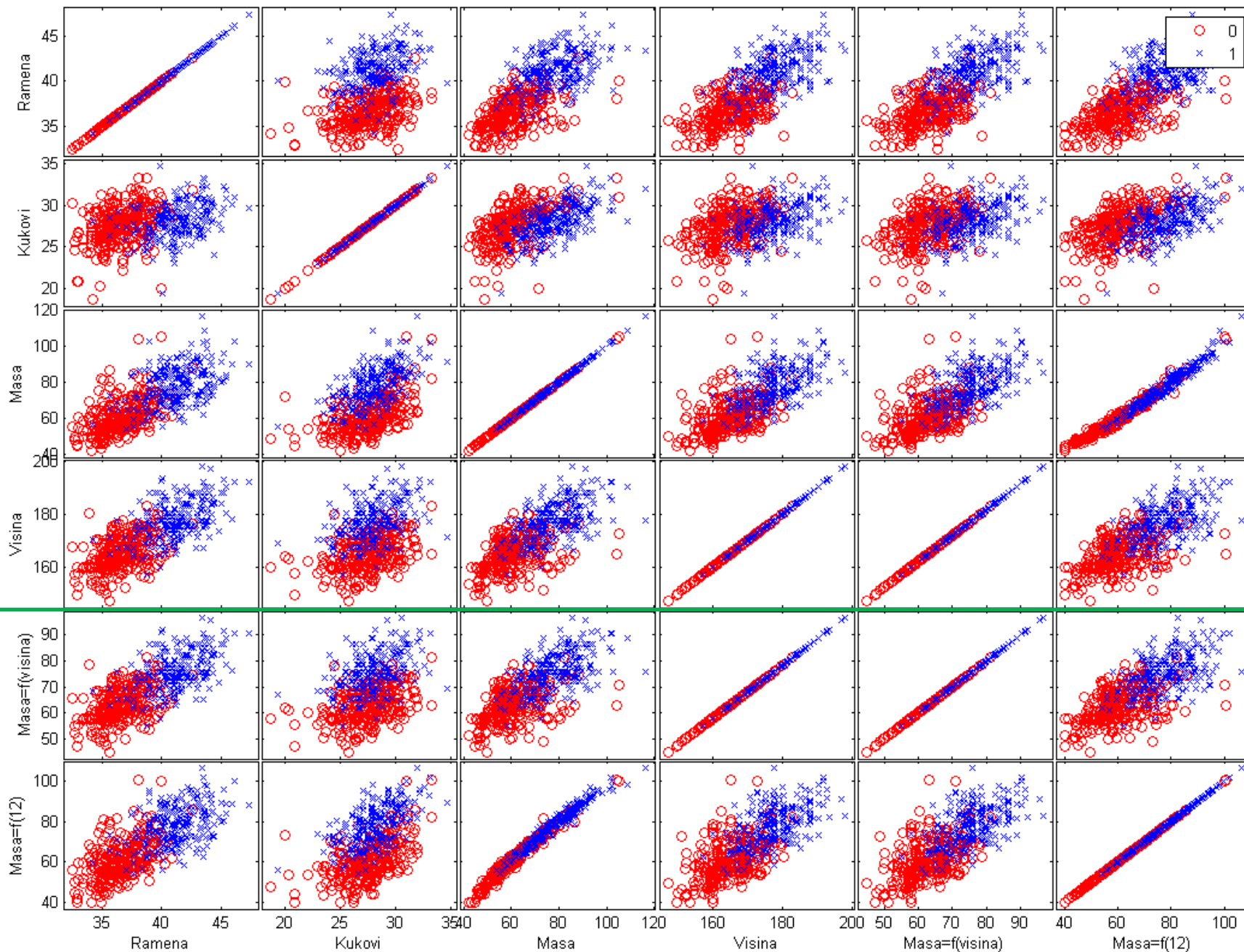
Regression Analysis

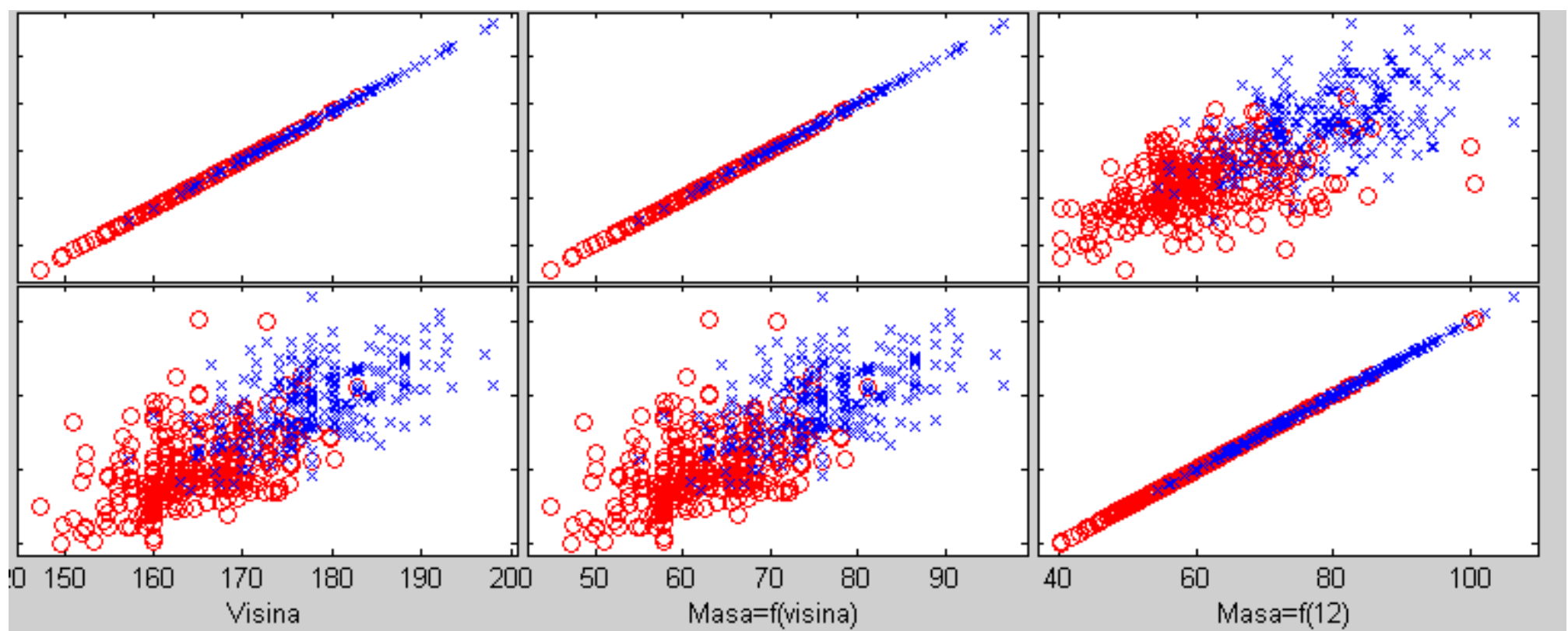
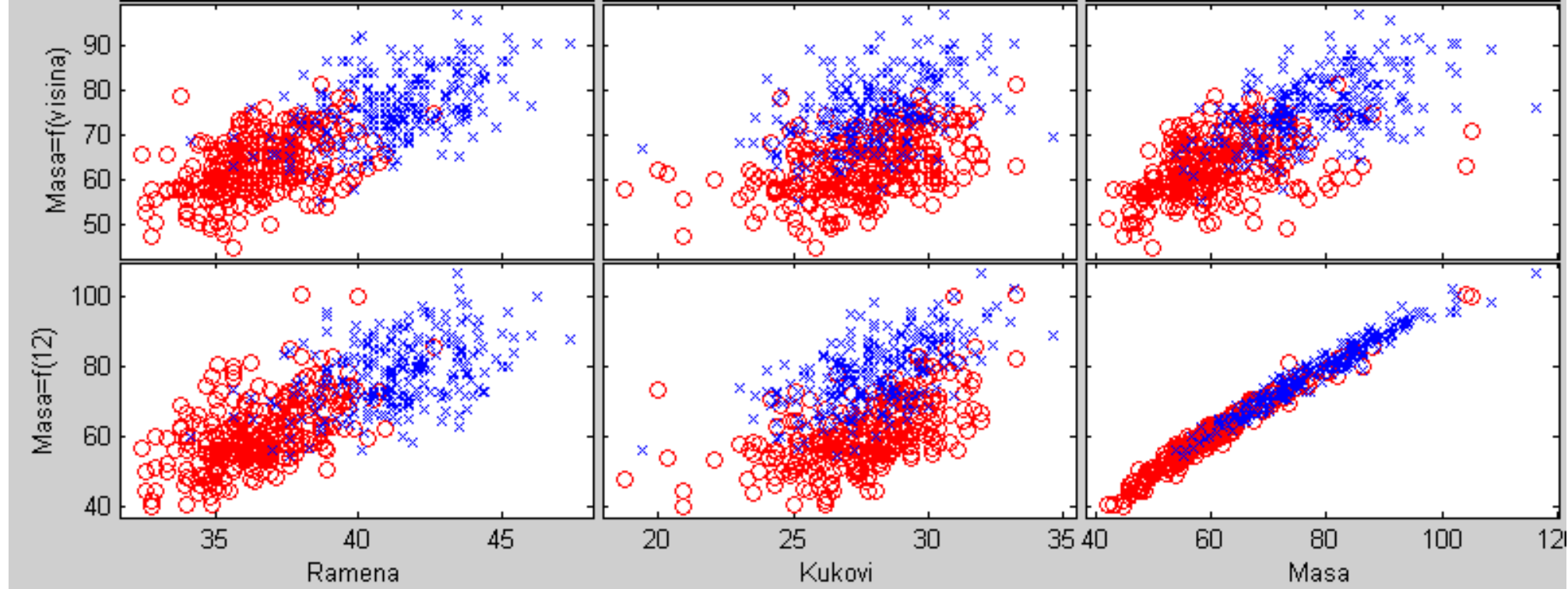
Predictor	Coef	StDev	T	P
Constant	-120.214	2.489	-48.31	0.000
Shoulder Girth	0.07813	0.02979	2.62	0.009
Chest Girth	0.19785	0.03569	5.54	0.000
Waist Girth	0.34042	0.02438	13.96	0.000
Navel Girth	0.00117	0.02291	0.05	0.959
Hip Girth	0.24040	0.04334	5.55	0.000
Thigh Girth	0.31414	0.05148	6.10	0.000
Flexed Bicep	0.05468	0.08526	0.64	0.522
Forearm Girth	0.5321	0.1371	3.88	0.000
Knee Girth	0.30126	0.07740	3.89	0.000
Calf Maximum	0.40387	0.07005	5.77	0.000
Ankle Minimum	-0.00963	0.09992	-0.10	0.923
Wrist Minimum	-0.1180	0.1959	-0.60	0.547
Height	0.32816	0.01560	21.03	0.000

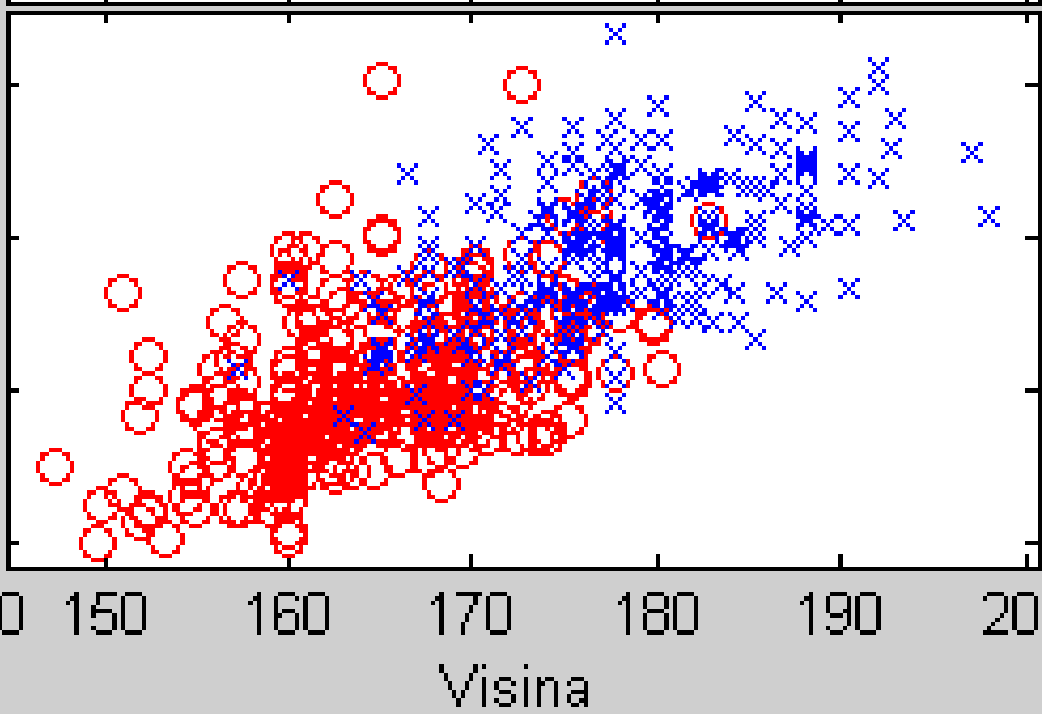
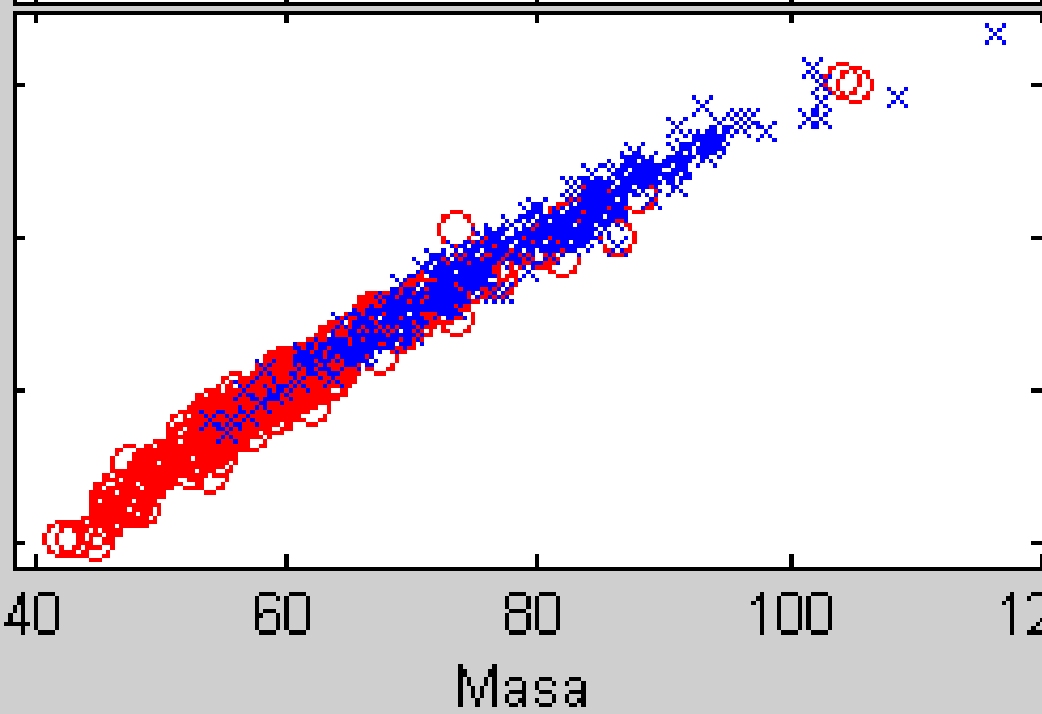
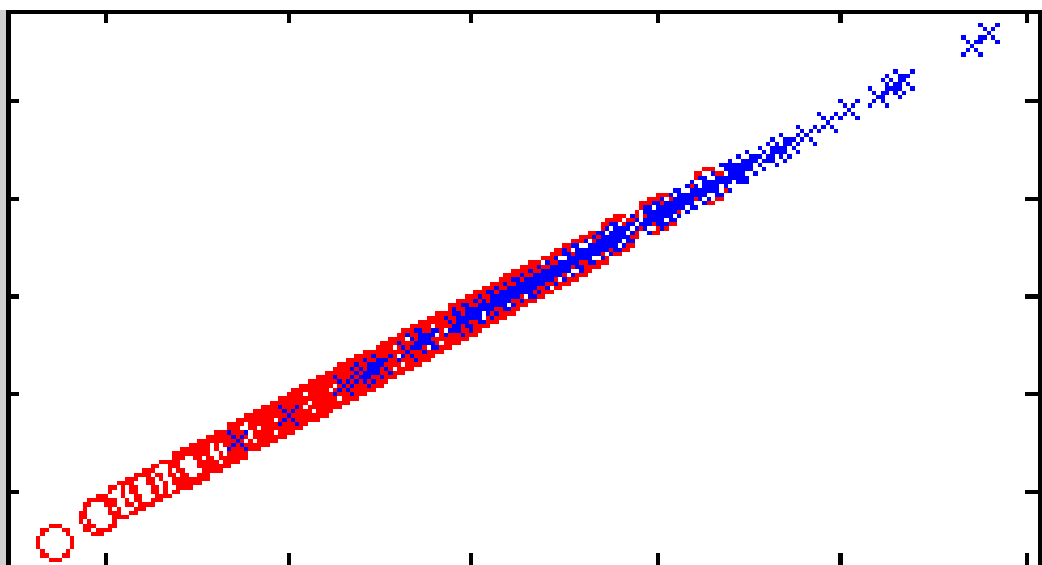
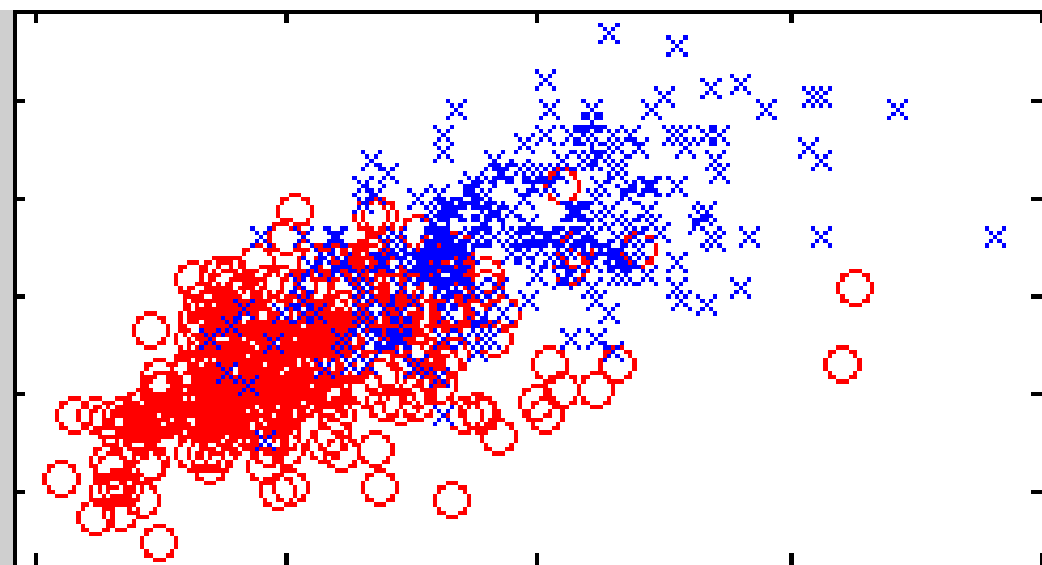
S = 2.204

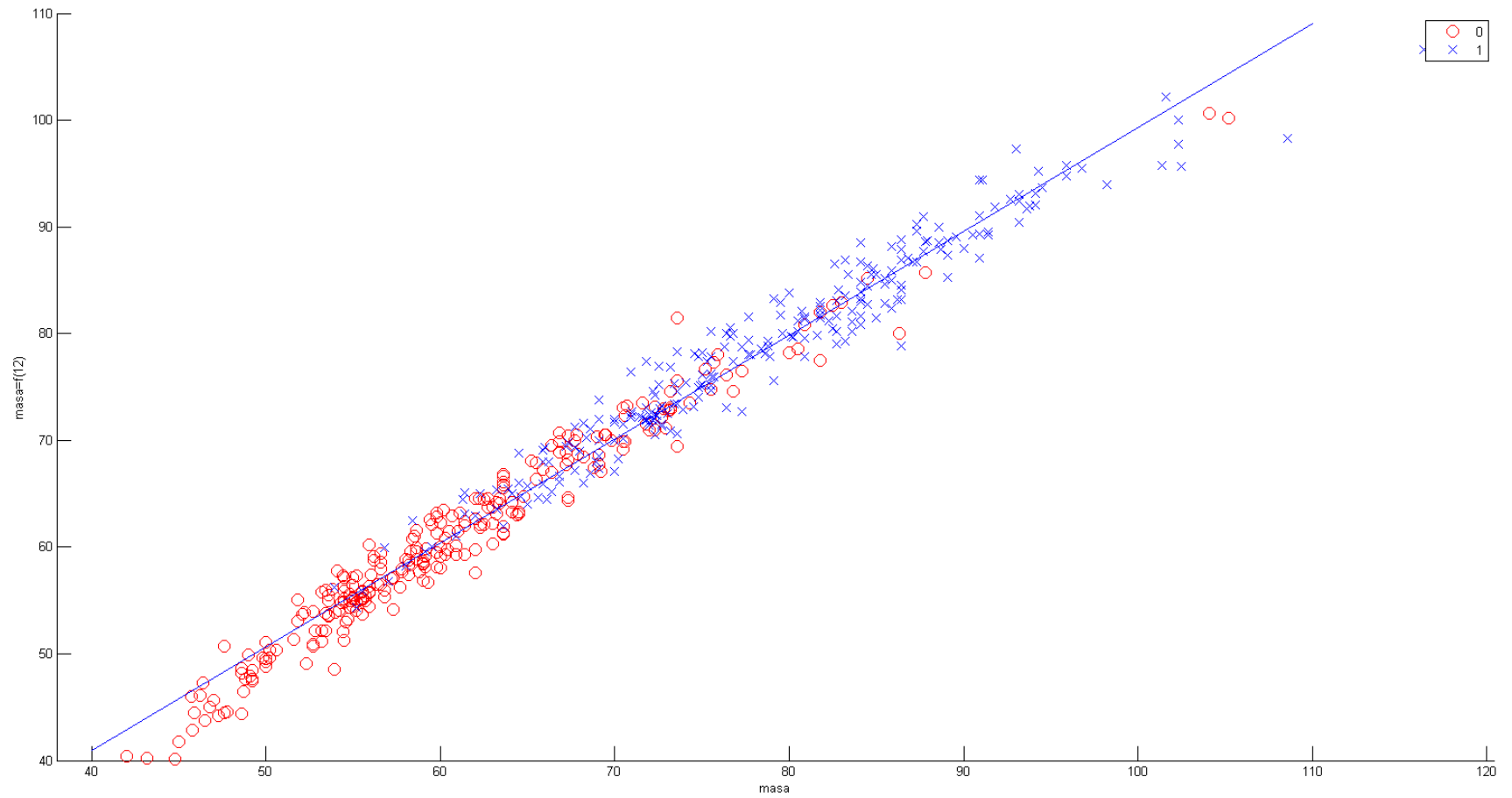
R-Sq = 97.3%

R-Sq(adj) = 97.3%





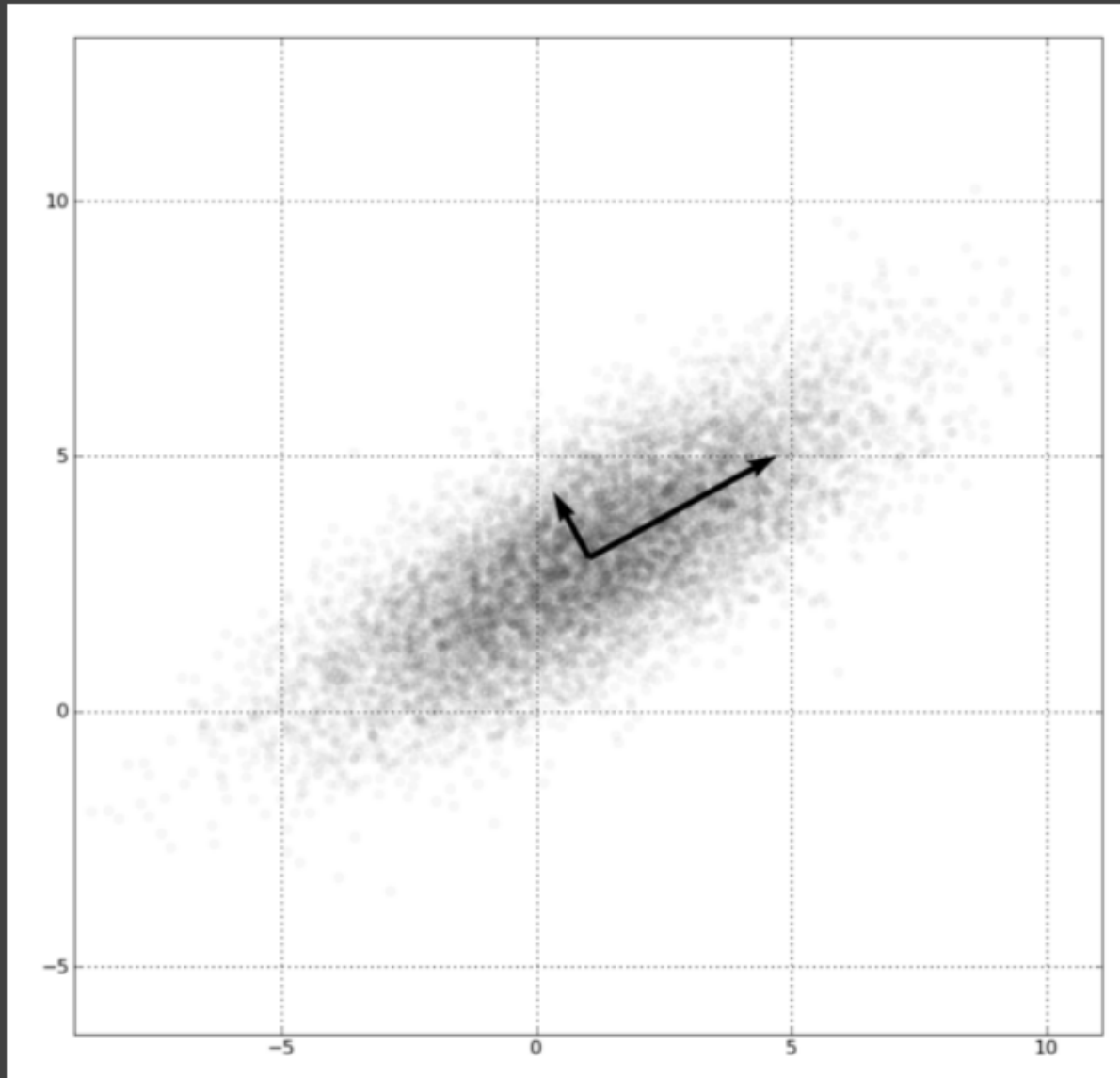




Dimensionality reduction

- Feature selection
- Feature extraction

Principal Components Analysis



1. Mean-center the data.
2. Find \perp basis vectors that maximize the data variance.
3. Plot the data using the top vectors.

Data Exploration

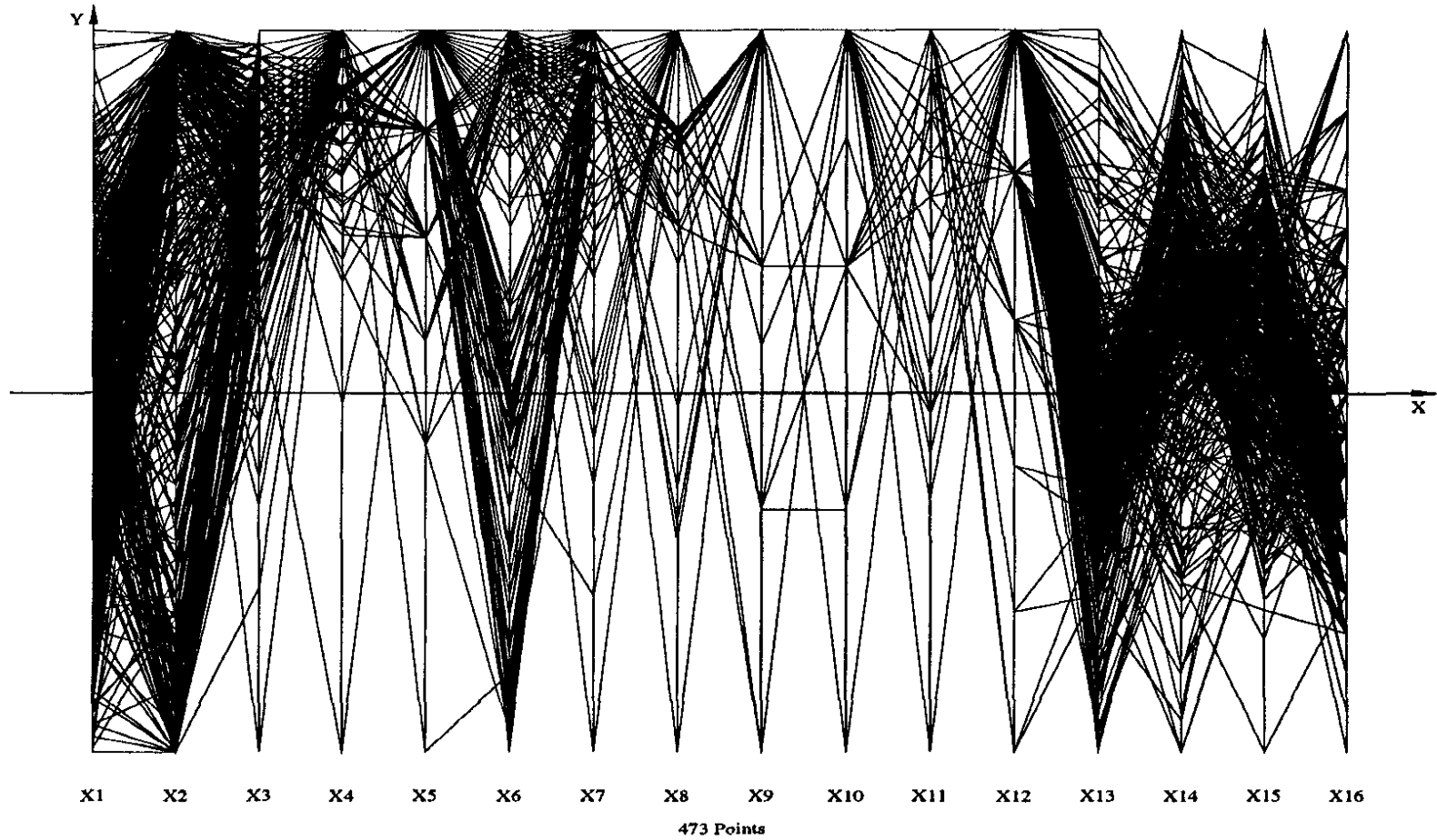


Figure 1: The full dataset consisting of 473 batches

The Multidimensional Detective (Alfred Inselberg)

- *„The display of multivariate datasets in parallel coordinates, transforms the search for relations among the variables into a 2-D pattern recognition problem.“*
- The Dataset:
- Production data for 473 batches of a VLSI chip
 - 16 process parameters:
 - X1: The yield: % of produced chips that are useful
 - X2: The quality of the produced chips (speed)
 - X3 ... X12: 10 types of defects (zero defects shown at top)
 - X13 ... X16: 4 physical parameters
- The Objective:
 - Raise the yield (X1) and maintain high quality (X2)

Production data for 473 batches of a VLSI chip

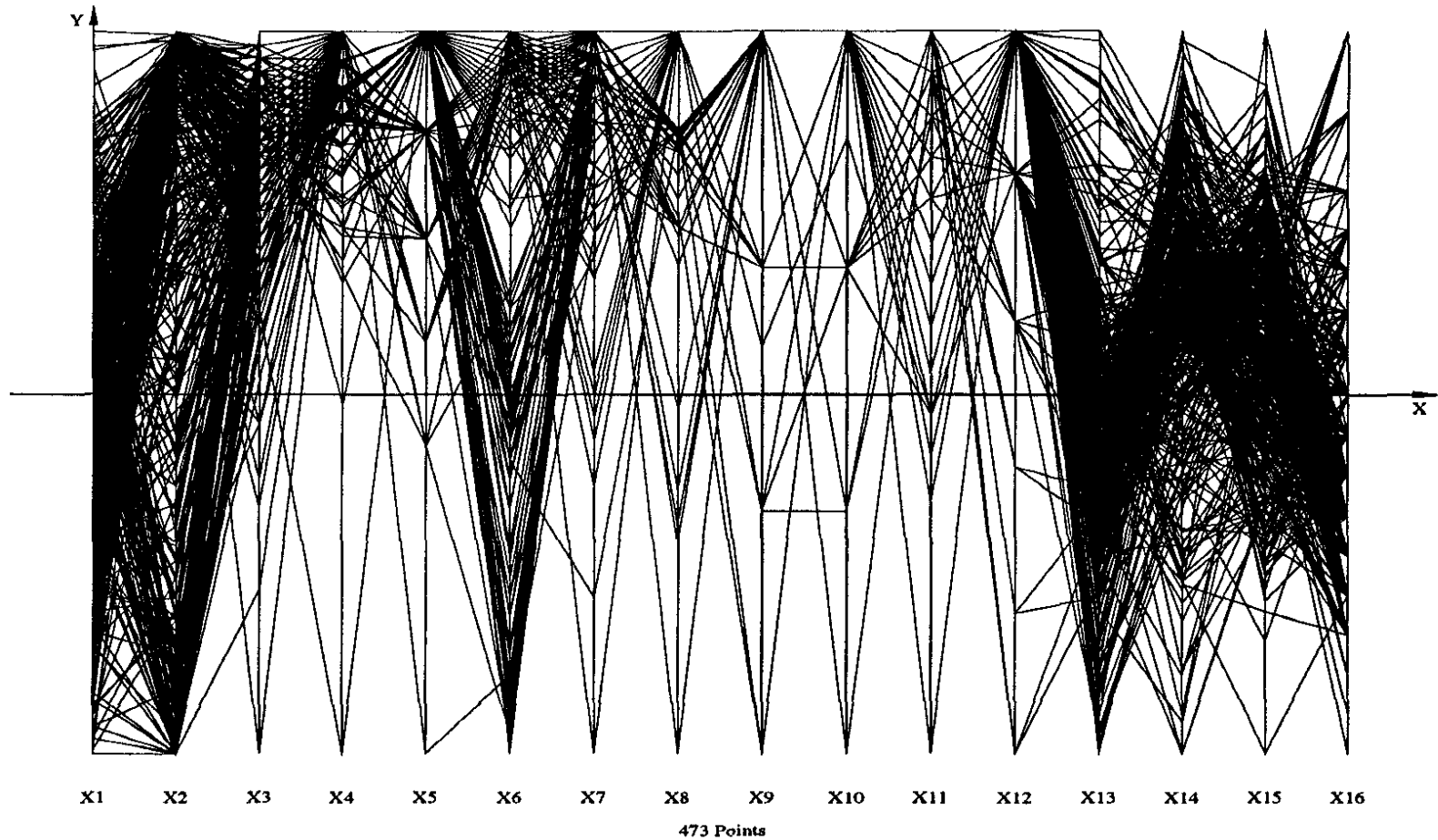


Figure 1: The full dataset consisting of 473 batches

Filtering - searching for high value of x_1 and x_2

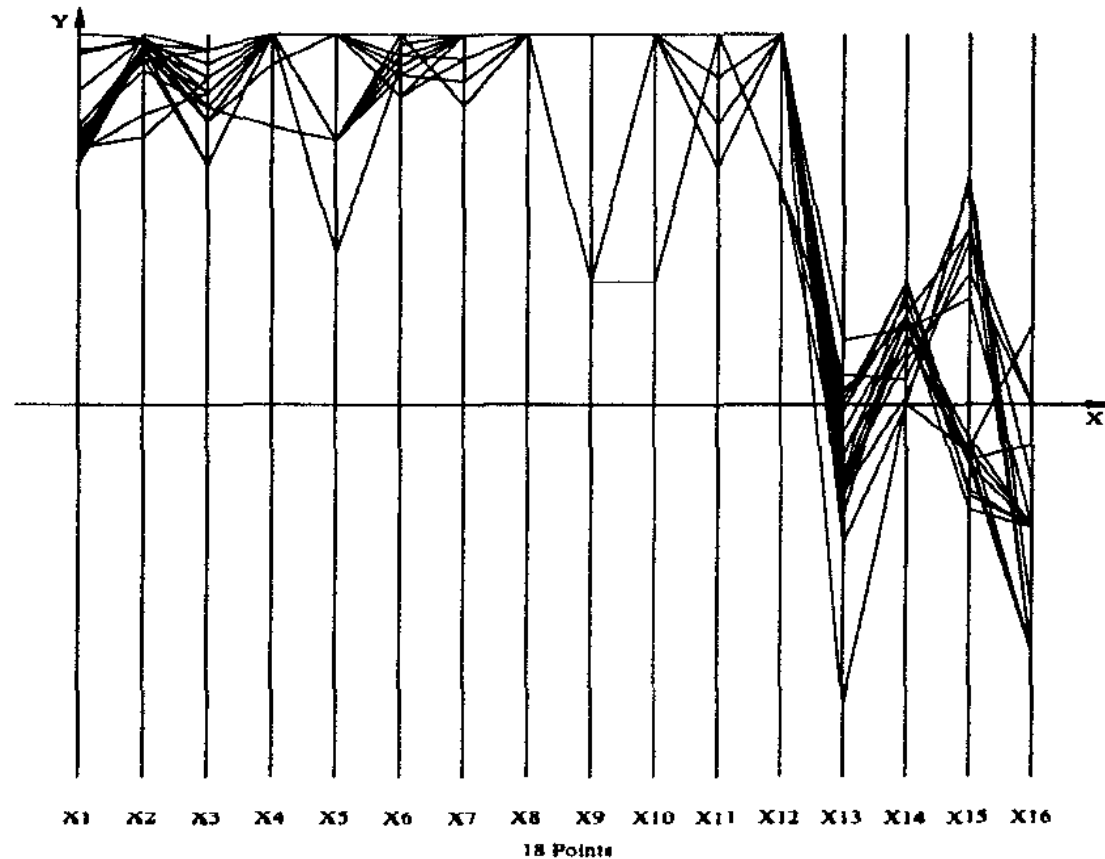


Figure 2: The batches high in Yield, X_1 , and Quality, X_2 .

Without the deffect batches (9/10)

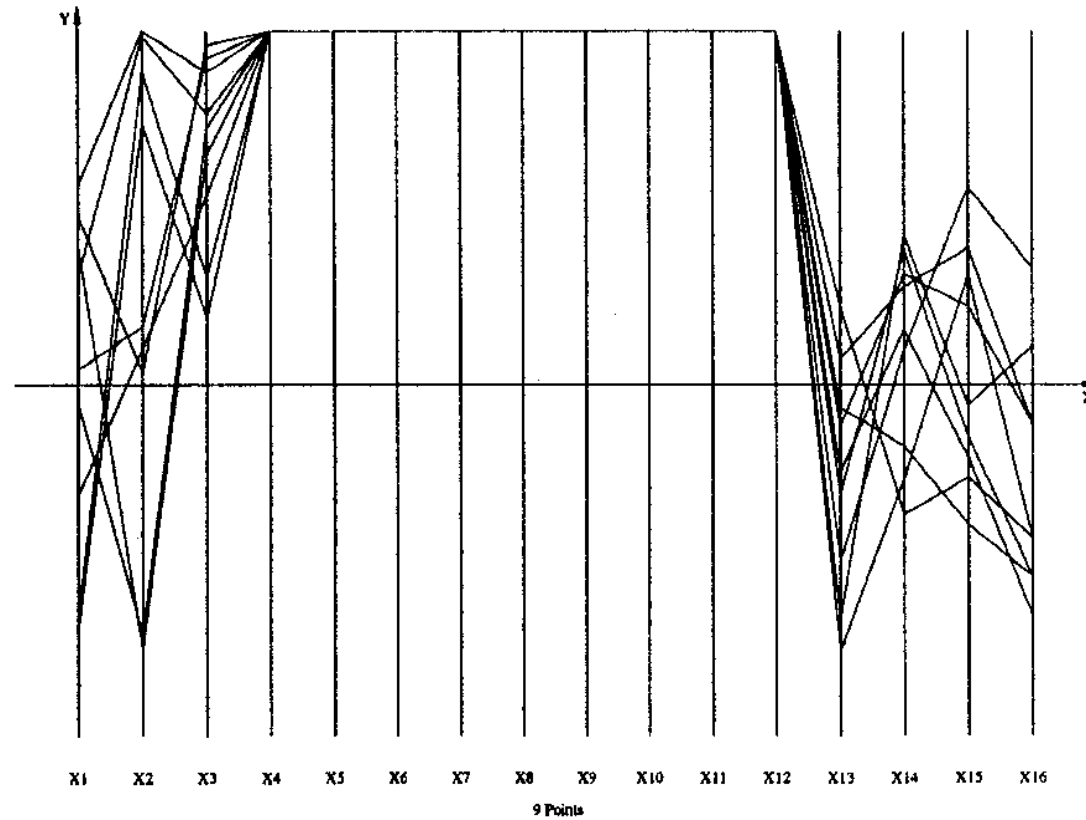


Figure 3: The batches with zero in 9 out of the ten defect types.

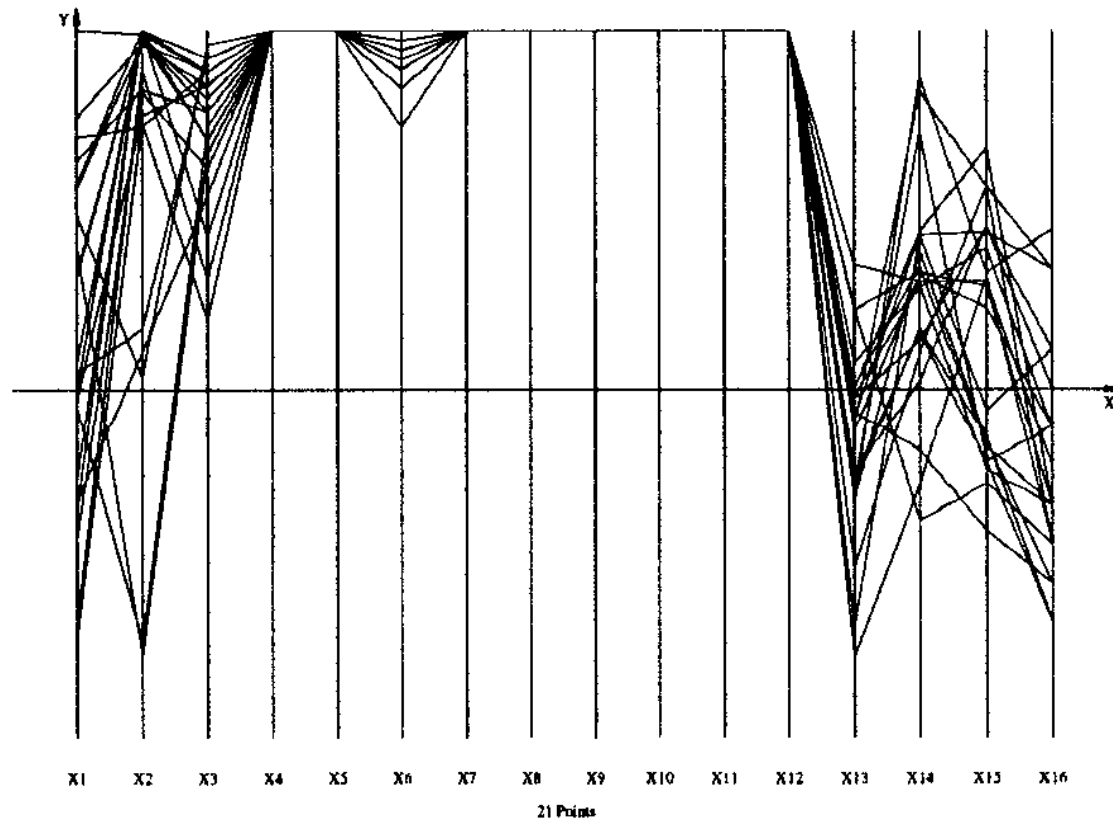


Figure 4: The batches with zero in 8 out of the ten defect types.

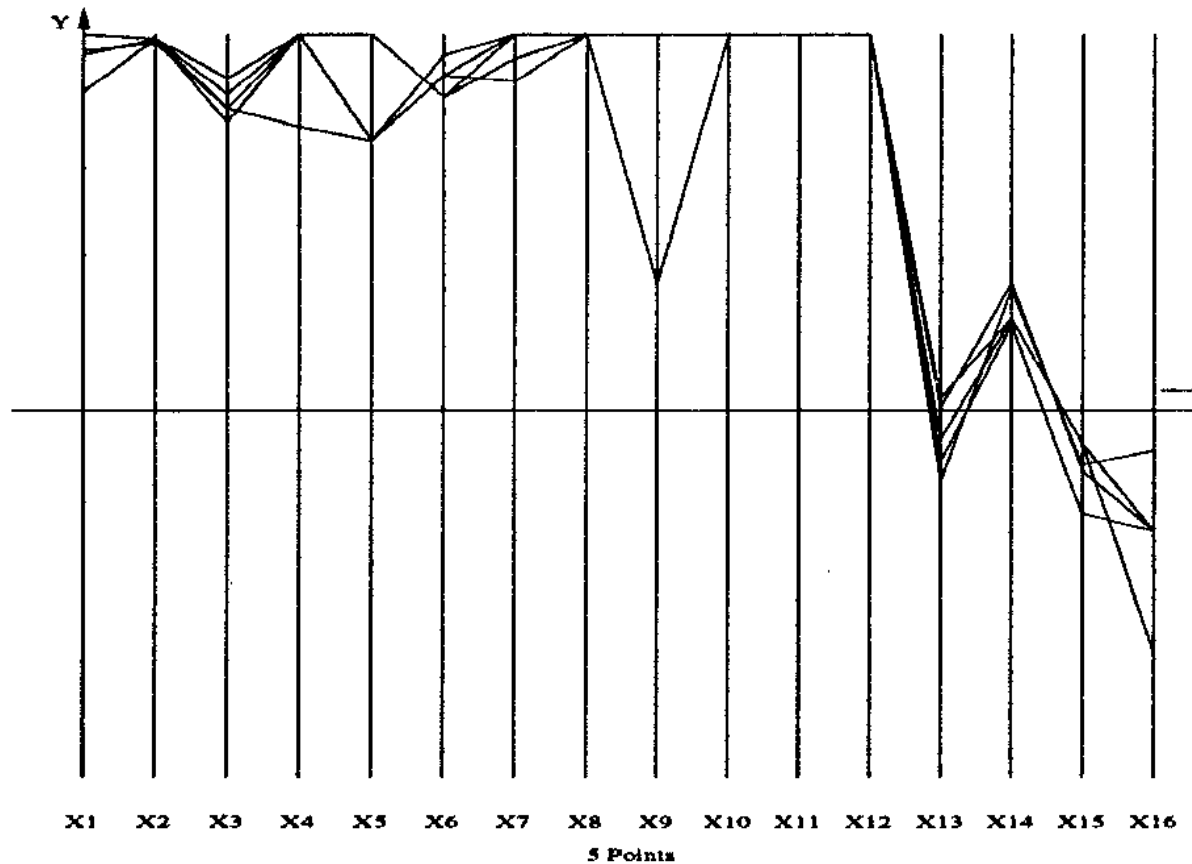


Figure 6: Batches with the highest Yields do not have the lowest defects in X3 and X6.

Reported crime in Alabama

Year	Population	Property crime rate	Burglary rate	Larceny-theft rate	Motor vehicle theft rate
2004	4525375 4029.3	987 2732.4 309.9			
2005	4548327 3900	955.8 2656 289			
2006	4599030 3937	968.9 2645.1 322.9			
2007	4627851 3974.9	980.2 2687 307.7			
2008	4661900 4081.9	1080.7 2712.6 288.6			

Reported crime in Alaska

Year	Population	Property crime rate	Burglary rate	Larceny-theft rate	Motor vehicle theft rate
2004	657755 3370.9	573.6 2456.7 340.6			
2005	663253 3615	622.8 2601 391			
2006	670053 3582	615.2 2588.5 378.3			
2007	683478 3373.9	538.9 2480 355.1			
2008	686293 2928.3	470.9 2219.9 237.5			

Reported crime in Arizona

Year	Population	Property crime rate	Burglary rate	Larceny-theft rate	Motor vehicle theft rate
2004	5739879 5073.3	991 3118.7 963.5			
2005	5953007 4827	946.2 2958 922			
2006	6166318 4741.6	953 2874.1 914.4			
2007	6338755 4502.6	935.4 2780.5 786.7			
2008	6500180 4087.3	894.2 2605.3 587.8			

Reported crime in Arkansas

Year	Population	Property crime rate	Burglary rate	Larceny-theft rate	Motor vehicle theft rate
2004	2750000 4033.1	1096.4 2699.7 237			
2005	2775708 4068	1085.1 2720 262			
2006	2810872 4021.6	1154.4 2596.7 270.4			
2007	2834797 3945.5	1124.4 2574.6 246.5			
2008	2855390 3843.7	1182.7 2433.4 227.6			

Reported crime in California

Year	Population	Property crime rate	Burglary rate	Larceny-theft rate	Motor vehicle theft rate
2004	35842038	3423.9 686.1 2033.1 704.8			
2005	36154147	3321 692.9 1915 712			
2006	36457549	3175.2 676.9 1831.5 666.8			
2007	36553215	3032.6 648.4 1784.1 600.2			
2008	36756666	2940.3 646.8 1769.8 523.8			

Reported crime in Colorado

Year	Population	Property crime rate	Burglary rate	Larceny-theft rate	Motor vehicle theft rate
2004	4601821 3918.5	717.3 2679.5 521.6			

Wrangler: Interactive Visual Specification of Data Transformation Scripts

[blog](#) [wrangle](#) [feedback](#)

DataWrangler^{alpha}

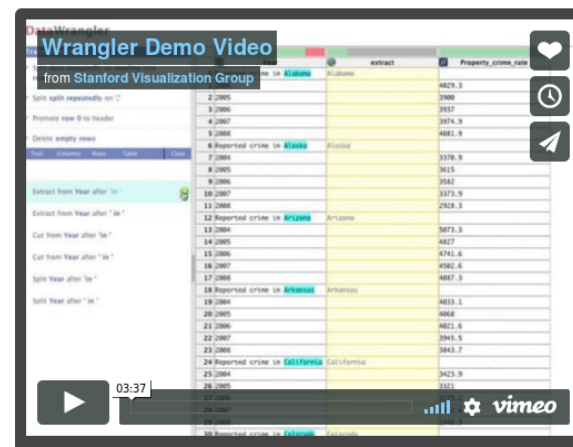
Wrangler is an interactive tool for data cleaning and transformation. Spend less time formatting and more time analyzing your data.

UPDATE: The Stanford/Berkeley Wrangler research project is complete, and the software is no longer actively supported. Instead, we have started a commercial venture, [Trifacta](#). For the most recent version of the tool, see the free [Trifacta Wrangler](#).

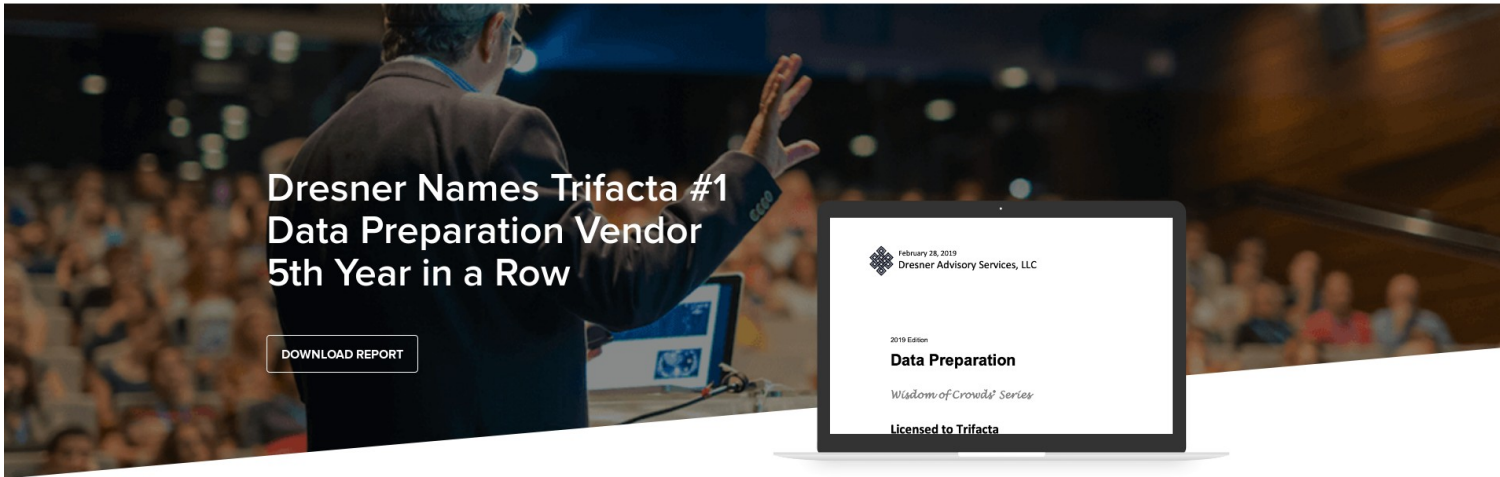
Why wrangle?

- Too much time is spent manipulating data just to get analysis and visualization tools to read it. Wrangler is designed to accelerate this process: spend less time fighting with your data and more time learning from it.
- Wrangler allows interactive transformation of messy, real-world data into the data tables analysis tools expect. Export data for use in Excel, R, Tableau, Protovis, ...
- Want to learn more about Wrangler's design? Take a look at our [research paper](#).
- Wrangler is still a work-in-progress. Please share your [feedback](#) and [feature requests](#)!

TRY IT NOW



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Thousands of Companies Wrangle with Trifacta

Here is the value they are creating

<p>Reduce the complexity of working with data</p> <p> NationBuilder</p> <p>wrangles voter registration data</p>	<p>Accelerate time-to-analysis for your teams</p> <p> DEUTSCHE BÖRSE GROUP</p> <p>wrangles stock exchange data</p>	<p>Align IT and business teams around data and analytics</p> <p> Malwarebytes</p> <p>wrangles marketing data</p>	<p>Discover new patterns & unexpected opportunities to drive success</p> <p> gsk</p> <p>wrangles disease clinical trial data</p>
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SEE ALL CUSTOMERS

Data Preparation: An Enterprise Imperative

Our ability to solve big problems depends on seeing patterns in the data we collect. But data today comes in many shapes and sizes—and it's changing all the time.

Too often, the messy process of pulling it together prevents us from uncovering patterns and realizing untapped potential.

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Ease-of-Use



Chart Typologies

Excel, Many Eyes, Google Charts

Visual Analysis Grammars

VizQL, ggplot2

Visualization Grammars

Protovis, D3.js

Component Architectures

Prefuse, Flare, Improvise, VTK

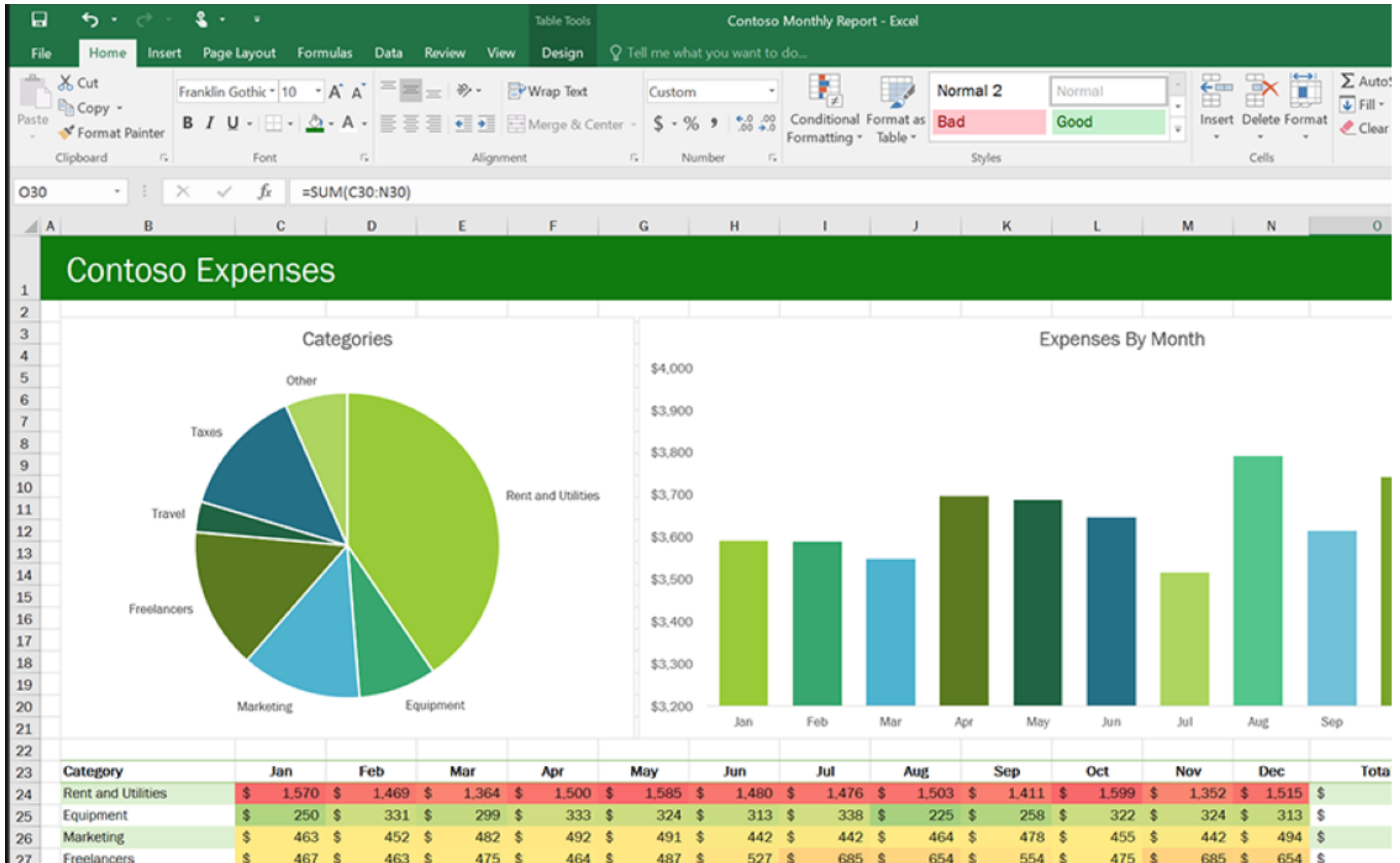
Graphics APIs

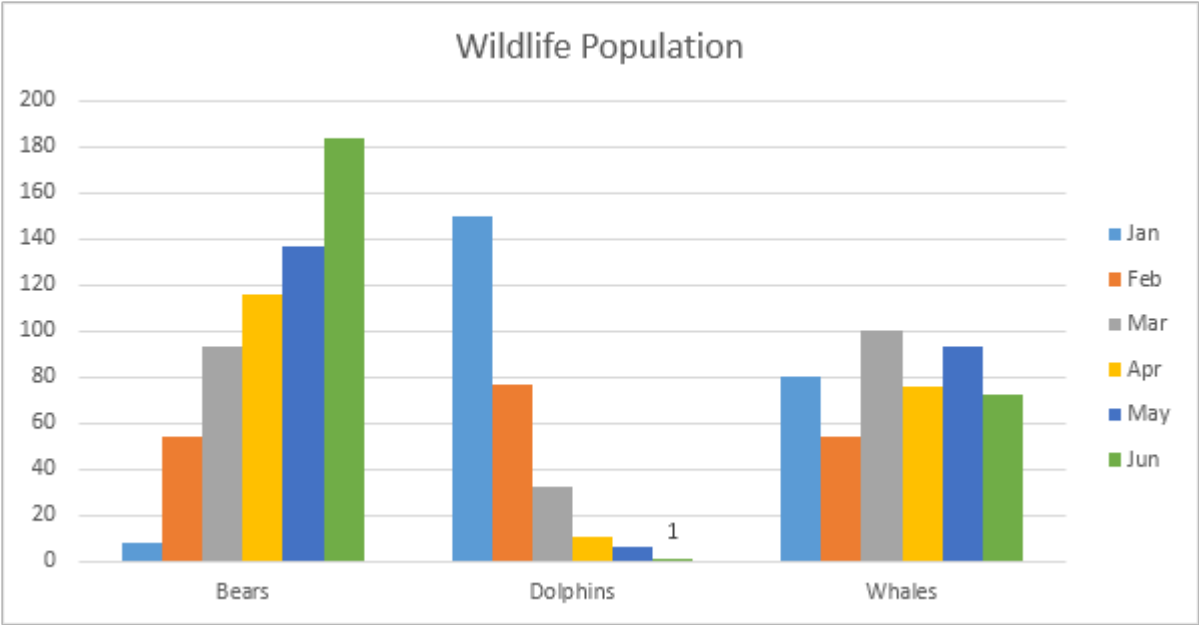
Processing, OpenGL, Java2D

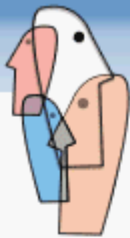
Expressiveness



Excel







An experiment brought to you by IBM Research and the IBM Cognos software group

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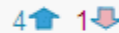
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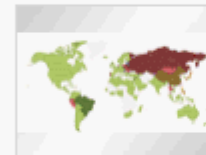
Thursday June 28 2007, 03:53 PM
Social Network Monthly Visitors (April 2007)



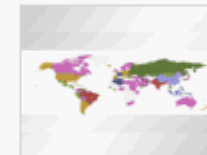
Tuesday June 2 2009, 03:42 PM
World Map of Social Networks (June 2009)



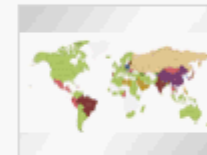
Tuesday June 12 2007, 11:33 PM
Ivan's friends



Friday December 18 2009, 04:33 AM
World Map of Social Networks (dec 2009) www.vincos.it



Monday December 17 2007, 10:23 AM
Social networks popularity world map



Tuesday June 2 2009, 05:37 PM
DISTRIBUCIÓN MUNDIAL DE LAS PRINCIPALES REDES SOCIALES EN JUNIO



Wednesday January 28 2009, 02:37 PM
Old New Testament Social Network



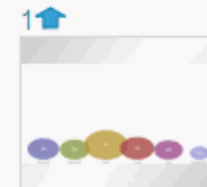
Saturday August 7 2010, 02:32 PM
Social Network Size by Registered Users



Wednesday May 19 2010, 01:44 PM
Social Media



Tuesday September 14 2010, 09:33 PM
When Baltimore Joined Twitter



Sunday November 14 2010, 08:54 PM
Restrição a redes sociais



Sunday May 31 2009, 04:44 AM
News Blogs Dominated By A Few Startups

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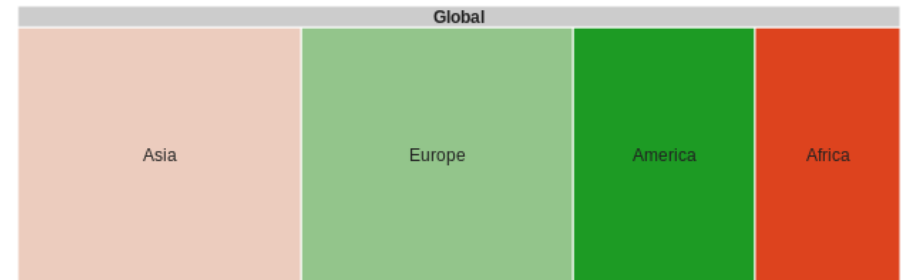
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Ease-of-Use



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Excel, Many Eyes, Google Charts

Visual Analysis Grammars

VizQL, ggplot2

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Component Architectures

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Graphics APIs

Processing, OpenGL, Java2D

Expressiveness



VizQL™ (Tableau)

- *Natively visual and therefore faster*
- *At the heart of Tableau is a proprietary technology that makes interactive data visualization an integral part of understanding data.*
- *A traditional analysis tool forces you to analyze data in rows and columns, choose a subset of your data to present, organize that data into a table, then create a chart from that table.*
- *VizQL skips those steps and creates a visual representation of your data right away, giving you visual feedback as you analyze.*
- *As a result you get a much deeper understanding of your data and can work much faster than conventional methods—up to 100 times faster.*

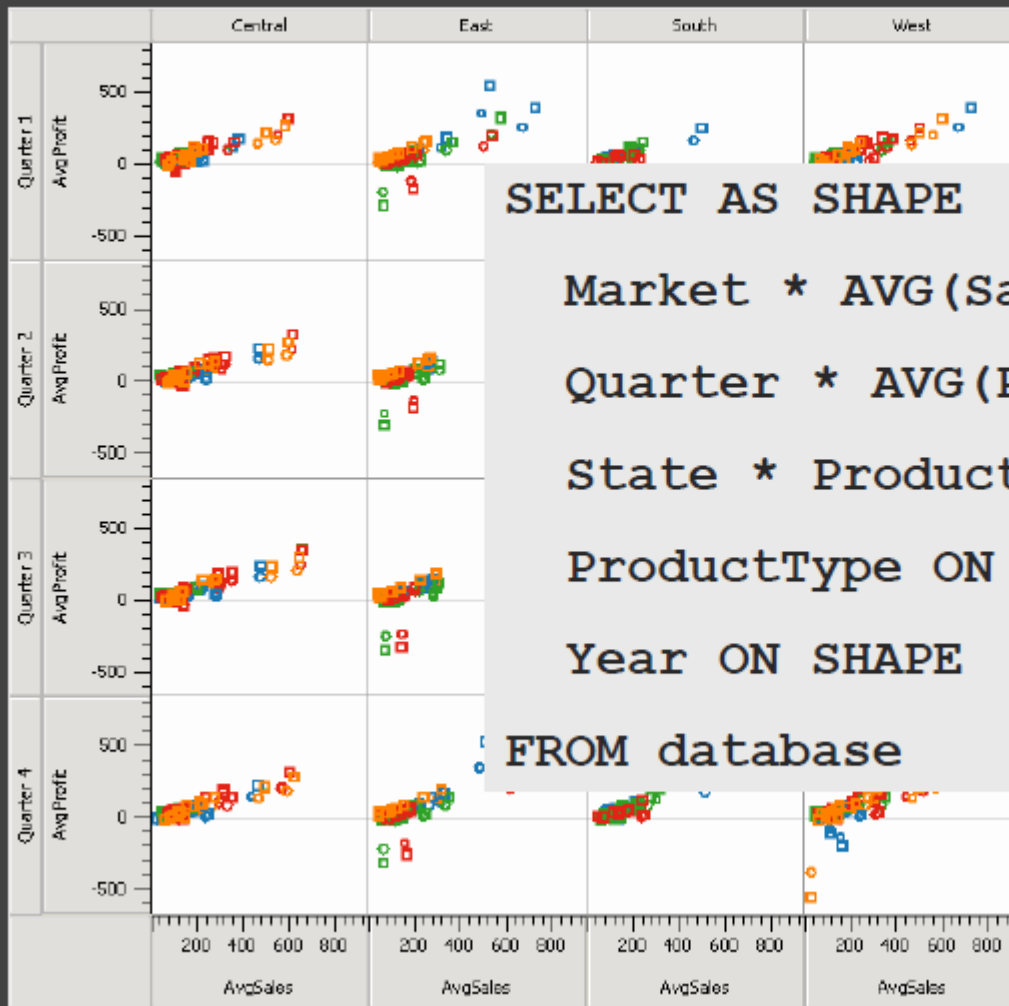
VizQL™ (Tableau)

Volatile Year for Technology: 2009



VizQL™ (Tableau)

Visual Query Language (VizQL)



```
SELECT AS SHAPE
```

```
Market * AVG(Sales) ON COLS
```

```
Quarter * AVG(Profit) ON ROWS
```

```
State * Product IN PANES
```

```
ProductType ON COLOR
```

```
Year ON SHAPE
```

```
FROM database
```

ggplot2

- *ggplot2 is a system for declaratively creating graphics, based on The Grammar of Graphics.*
- *You provide the data, tell ggplot2 how to map variables to aesthetics, what graphical primitives to use, and it takes care of the details.*

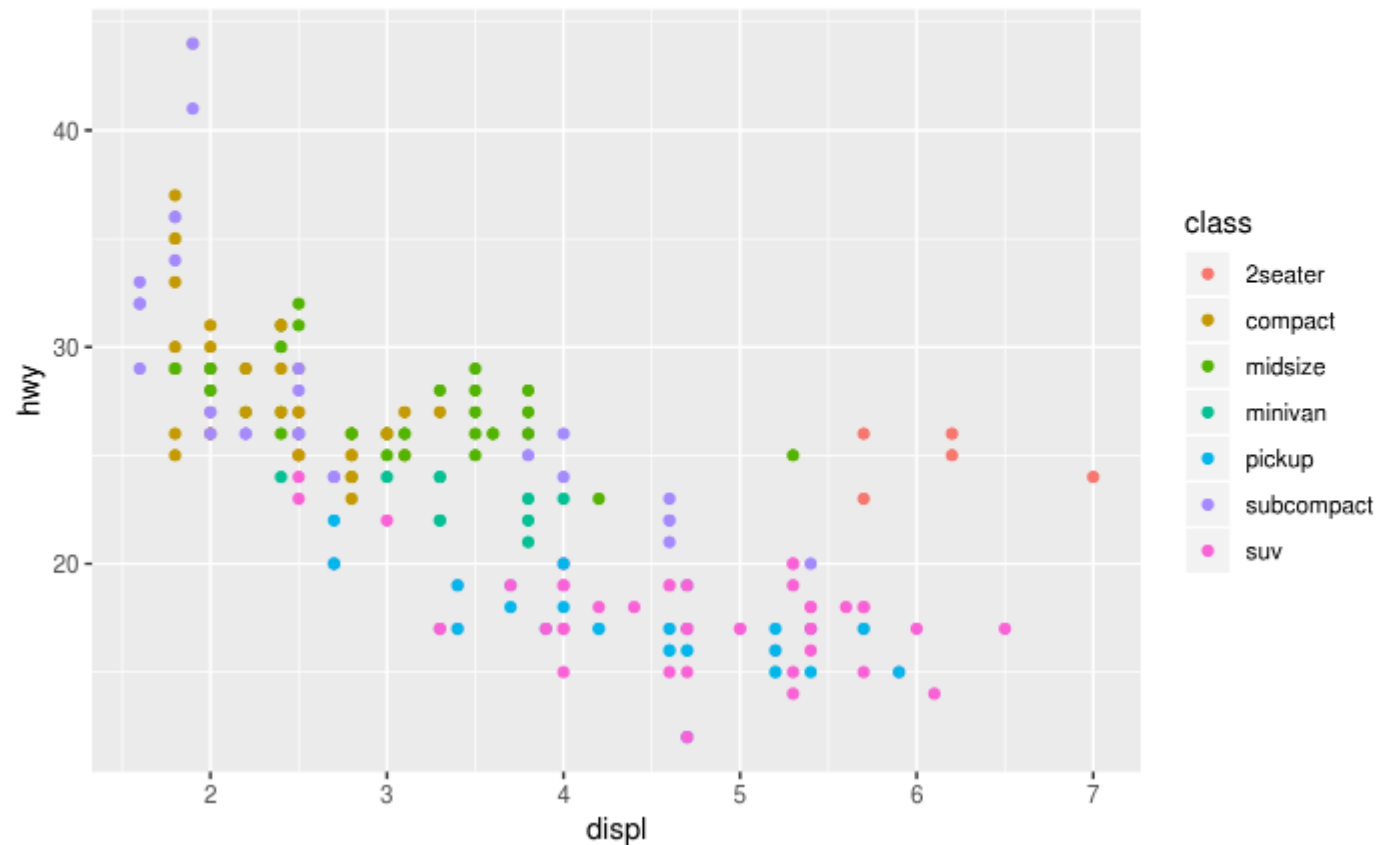
ggplot2

- *Usage*
 - *It's hard to succinctly describe how ggplot2 works because it embodies a deep philosophy of visualisation.*
 - *However, in most cases you start with ggplot(), supply a dataset and aesthetic mapping (with aes()).*
 - *You then add on layers (like geom_point() or geom_histogram()), scales (like scale_colour_brewer()), faceting specifications (like facet_wrap()) and coordinate systems (like coord_flip()).*

ggplot2

```
library(ggplot2)
```

```
ggplot(mpg, aes(displ, hwy, colour = class)) +  
  geom_point()
```



Ease-of-Use



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Protovis

A graphical approach to visualization

- *Protovis composes custom views of data with simple marks such as bars and dots.*
- *Unlike low-level graphics libraries that quickly become tedious for visualization, Protovis defines marks through dynamic properties that encode data, allowing inheritance, scales and layouts to simplify construction.*

Protovis

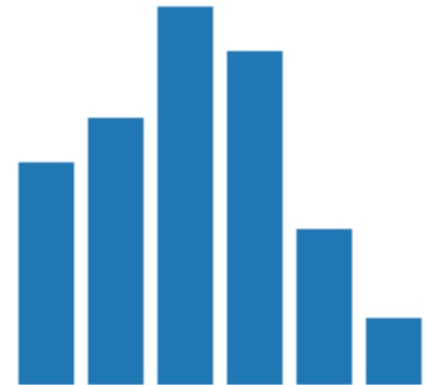
Getting Started

How does Protovis work? Consider this bar chart, which visually encodes an array of numbers with height:

```
var vis = new pv.Panel()
    .width(150)
    .height(150);

vis.add(pv.Bar)
    .data([1, 1.2, 1.7, 1.5, .7, .3])
    .width(20)
    .height(function(d) d * 80)
    .bottom(0)
    .left(function() this.index * 25);

vis.render();
```

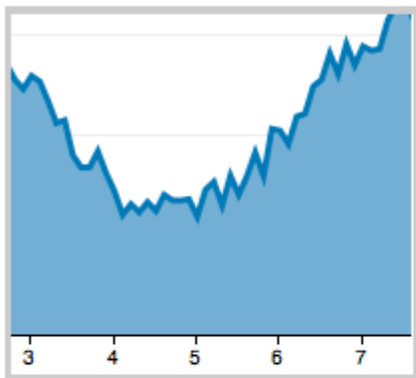


This blue bar is rendered once per number, mapping the data to height using a little function ($d * 80$). Thus, a *mark* represents a set of graphical elements that share data and visual encodings. Although marks are simple by themselves, you can combine them in interesting ways to make [rich, interactive](#) visualizations.

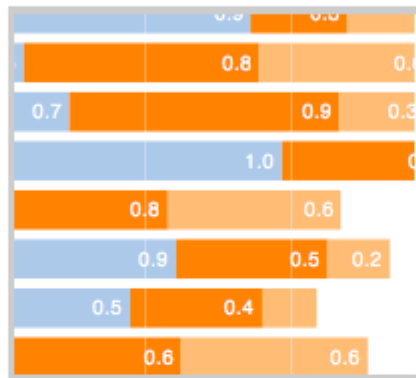
Protovis

Conventional

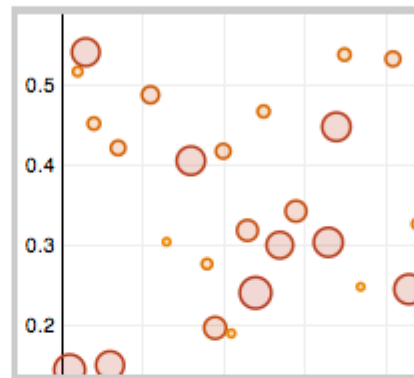
While Protovis is designed for custom visualization, it is still easy to create many standard chart types. These simpler examples serve as an introduction to the language, demonstrating key abstractions such as quantitative and ordinal scales, while hinting at more advanced features, including [stack layout](#).



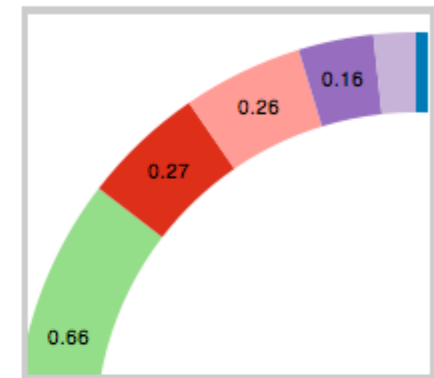
Area Charts



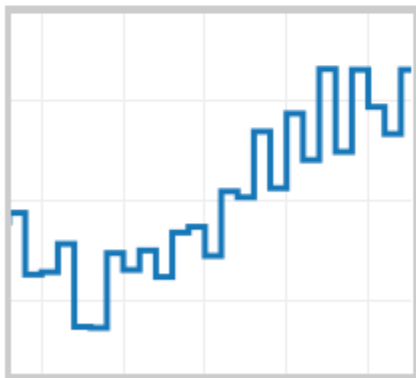
Bar & Column Charts



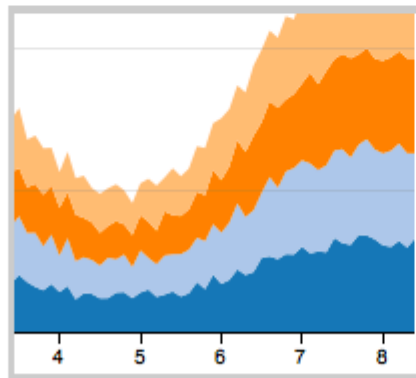
Scatterplots



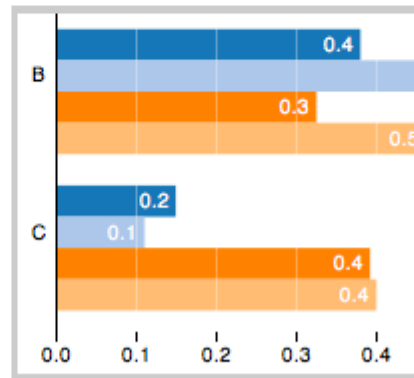
Pie & Donut Charts



Line & Step Charts



Stacked Charts

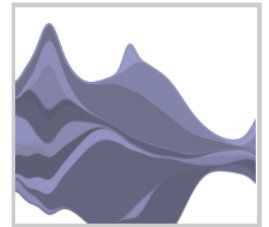
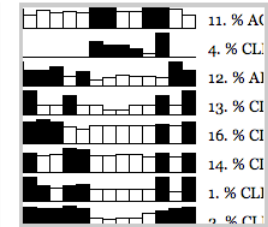
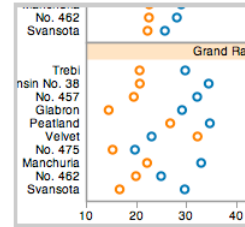
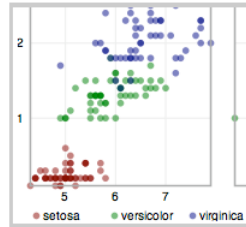


Grouped Charts

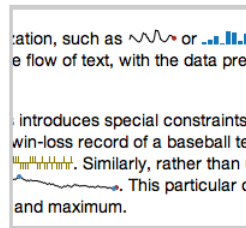
Protovis

Custom

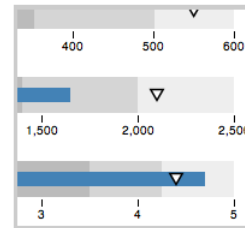
Many charting libraries provide stock chart designs, but offer only limited customization; Protovis excels at custom visualization design through a concise representation and precise control over graphical marks. These examples, including a few recreations of unusual historical designs, demonstrate the language's expressiveness.



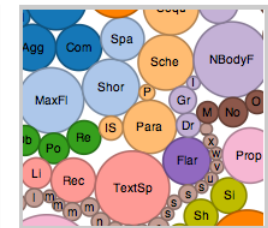
Anderson's Flowers



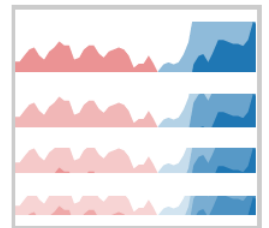
Becker's Barley



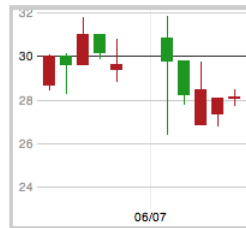
Bertin's Hotel



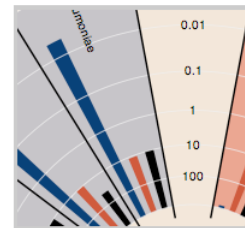
Streamgraphs



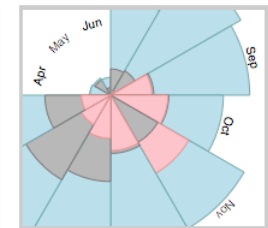
Sparklines



Bullet Charts



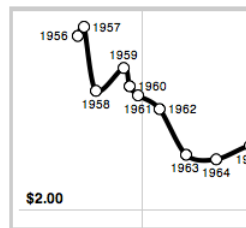
Bubble Charts



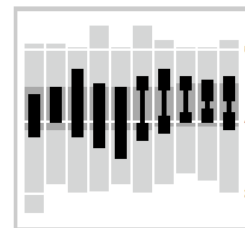
Sizing the Horizon



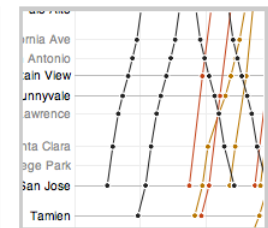
Candlestick Charts



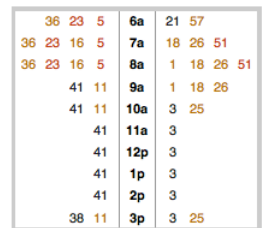
Burtin's Antibiotics



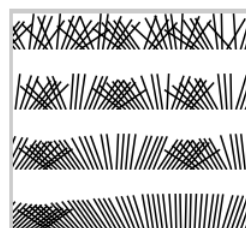
Nightingale's Rose



Playfair's Wheat



Gas & Driving



Seattle Weather



Marey's Trains



Stemplots

Merge Sort



D3.js

Data-Driven Documents

- D3.js is a JavaScript library for manipulating documents based on data. D3 helps you bring data to life using HTML, SVG, and CSS. D3's emphasis on web standards gives you the full capabilities of modern browsers without tying yourself to a proprietary framework, combining powerful visualization*

[Overview](#) [Examples](#) [Documentation](#) [API](#) [Source](#)



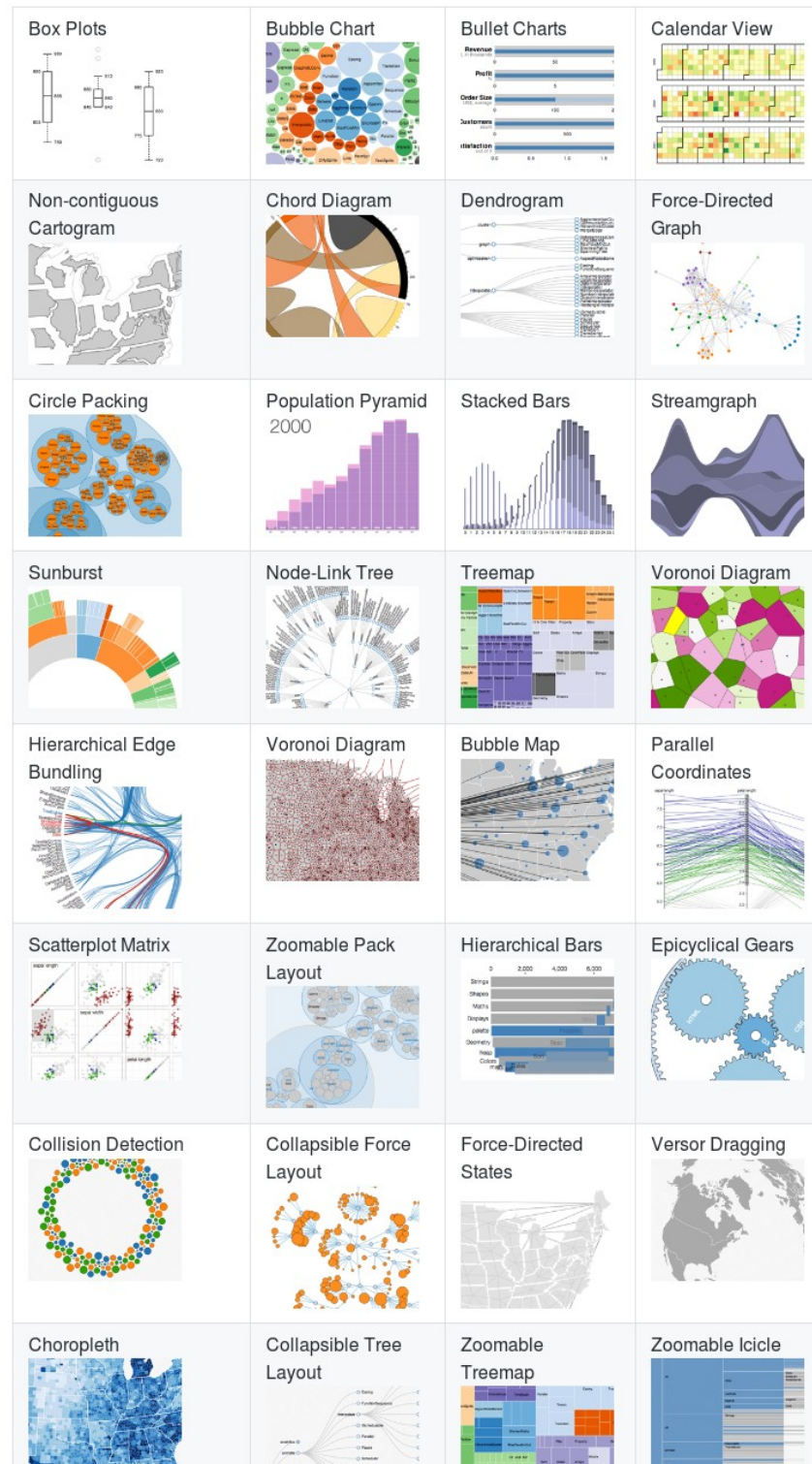
Fork me on GitHub



Like visualization and creative coding? Try interactive JavaScript notebooks in **Observable!**

D3.js

Visual Index



Data-Driven Documents

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- [Voronoi Diagrams](#)
- [Zooming](#)

Translations (Unofficial)

Ease-of-Use



Chart Typologies

Excel, Many Eyes, Google Charts

Visual Analysis Grammars

VizQL, ggplot2

Visualization Grammars

Protovis, D3.js

Component Architectures

Prefuse, Flare, Improvise, VTK

Graphics APIs

Processing, OpenGL, Java2D

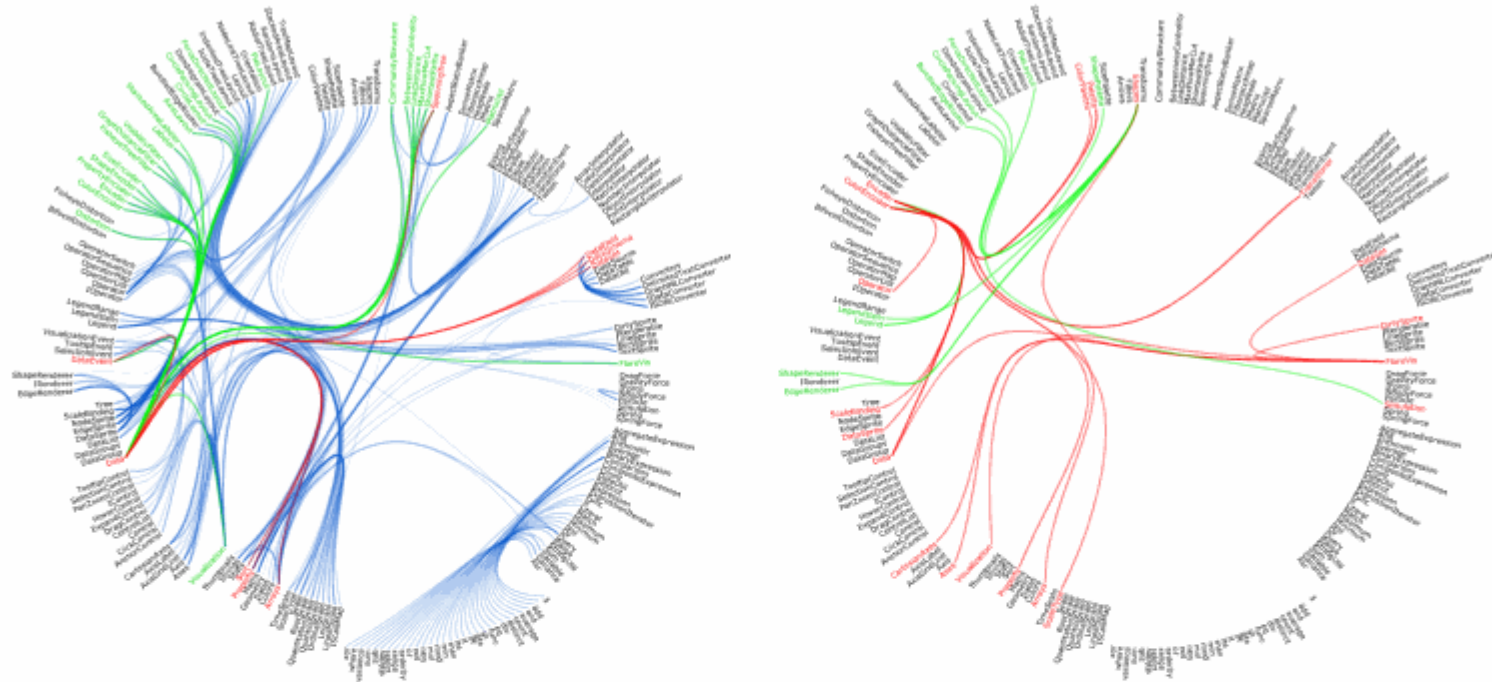
Expressiveness



Prefuse

- *Prefuse is a Java-based toolkit for building interactive information visualization applications. It supports a rich set of features for data modeling, visualization and interaction. It provides optimized data structures for tables, graphs, and trees, a host of layout and visual encoding techniques, and support for animation, dynamic queries, integrated search, and database connectivity.*
-
- *Prefuse uses the Java 2D graphics library, and is easily integrated into Swing applications or Java applets. Prefuse is licensed under the terms of a BSD license, and can be used freely for commercial and non-commercial purposes.*

flare DATA VISUALIZATION FOR THE WEB



Flare makes it easy to create interactive data visualizations.

Flare is an ActionScript library for creating visualizations that run in the Adobe Flash Player. From basic charts and graphs to complex interactive graphics, the toolkit supports data management, visual encoding, animation, and interaction techniques. Even better, flare features a modular design that lets developers create customized visualization techniques without having to reinvent the wheel.

View the [demos](#) and [sample applications](#) to see a few of the visualizations that flare makes it easy to build.

To begin making your own visualizations, [download flare](#) and work through the [tutorial](#). You should also get familiar with the [API documentation](#). Need more help? Visit the [help forum](#) (you'll need a [SourceForge](#) login to post).

Flare is open-source software released under a [BSD license](#), meaning it can be freely deployed and modified (and even sold for \$\$). Flare's design was adapted from its predecessor [prefuse](#), a visualization toolkit for Java.



Flare Demos

DOWNLOAD

Flare Alpha
Released 2009.01.24
Source .ZIP (1.2mb)

Development Version
github.com/prefuse/Flare

TOOLS



Improvise

Exploratory visualization based on multiple coordinated views is a rapidly growing area of information visualization. Ideally, users would be able to explore their data by switching freely between building and browsing in a flexible, integrated, interactive graphical environment that requires little or no programming skill to use. However, the possibilities for displaying data across multiple views depends on the flexibility of coordination, the expressiveness of graphical encoding, and the ability of users to comprehend the structure of their visualizations as they work. As a result, exploration has been limited in practice to a small fraction of useful visualizations.



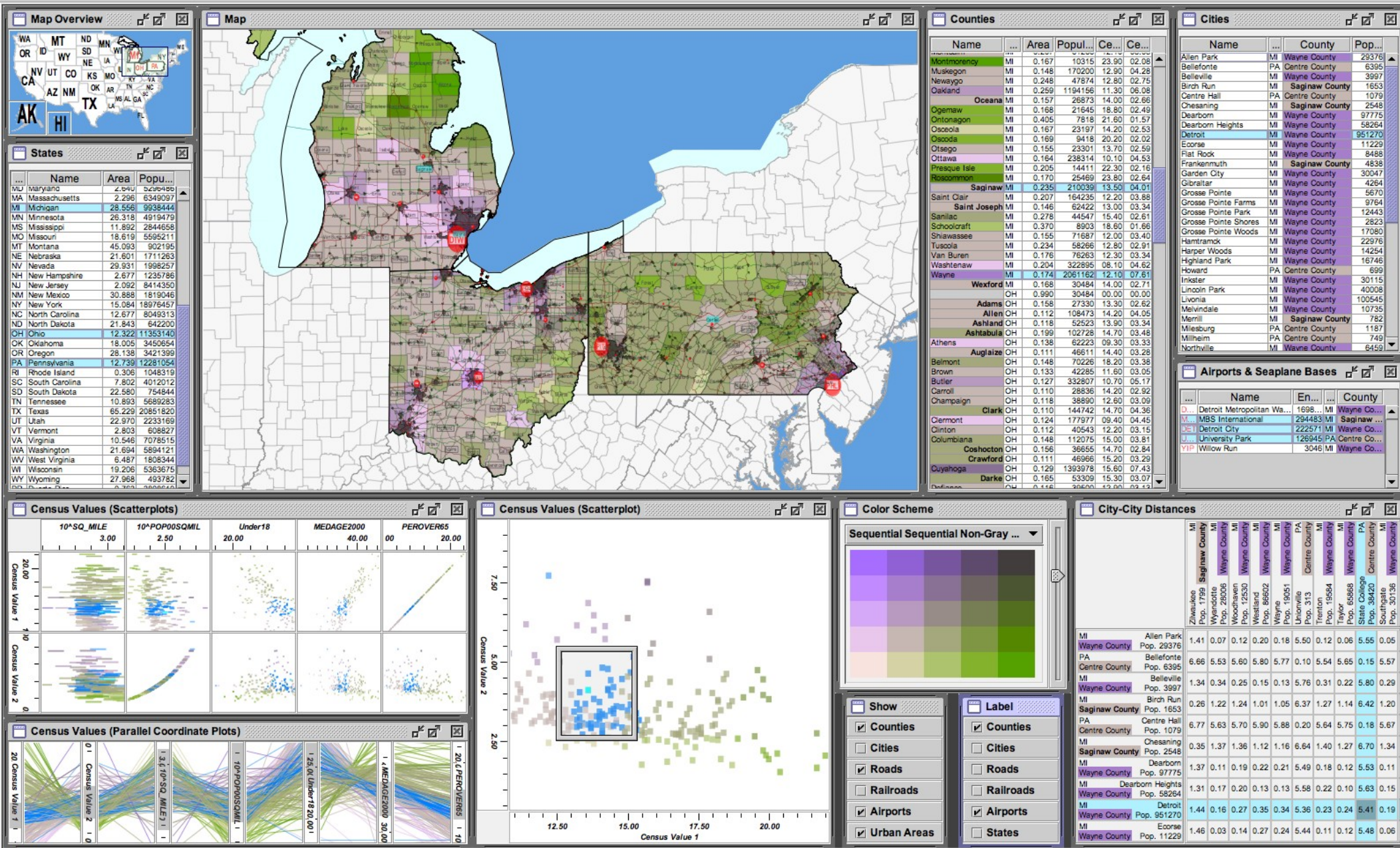
Improvise is a fully-implemented Java software [architecture](#) and user interface that enables users to build and browse highly-coordinated visualizations interactively. By coupling a shared-object [coordination model](#) with a declarative [visual query language](#), users gain precise control over how navigation and selection affects the appearance of data across multiple views, using a potentially infinite number of variations on well-known [coordination patterns](#) such as synchronized scrolling, overview+detail, brushing, drill-down, and semantic zoom.

Improvise has been used to build [numerous visualizations](#) for exploring information including election results, particle trajectories, network loads, music collections, the chemical elements, and even the dynamic coordination structure of its own visualizations in situ. This last technique—[integrated metavisualization](#)—is unique to Improvise.



Improvise

File Edit Misc Base Meta Help

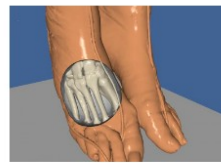


Untitled

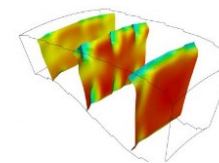
VTK – Visualization Toolkit

- *The Visualization Toolkit (VTK) is open source software for manipulating and displaying scientific data.*
- *It comes with state-of-the-art tools for 3D rendering, a suite of widgets for 3D interaction, and extensive 2D plotting capability.*
- *VTK is part of Kitware’s collection of supported platforms for software development.*
- *The platform is used worldwide in commercial applications, as well as in research and development.*

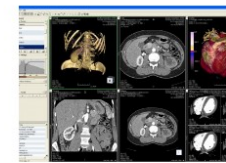
VTK



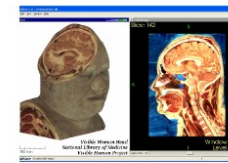
full_womanFoot
CT scan from the visible woman dataset. An isosurface of the skin is clipped with a sphere to reveal the underlying bone structure.
Author: Original visualization author Bill Lorensen.



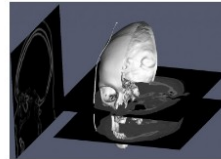
full_warpComb
Visualization the combustion process in a segment of an annular combustor. The combustor is where fuel and air is burned in a gas turbine.
Author: VTK Textbook (Schroeder, Martin, Lorensen et al.)



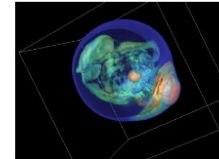
full_VVC30_CTA_Kidney_Cardiac_05_03_06
Volume rendering and CT display of a human torso, with emphasis on the kidney.



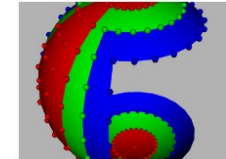
full_VolViewVW
Volume rendering and image display from the visible woman dataset.



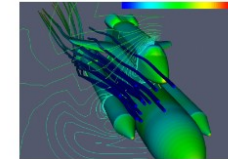
full_VisibleWoman
Volume rendering and image display from the visible woman dataset.



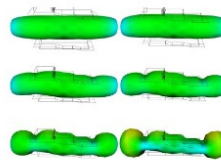
full_supernova
Volume rendering of a supernova delineating the rapid, unsaturated, nonlinear growth of a long-wavelength, (l=1,2 mode instability) which may have ramifications for the supernova mechanism, energetics, and dynamics and phenomenology.
Dataset Courtesy of the Terascale Supernova Initiative (TSI)



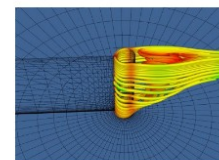
full_SphereInPieces
Processing a dataset in parallel. The different colors indicate on which processor id the data was processed.



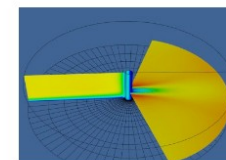
full_shuttle
Fluid flow around the space shuttle. Coloring of the data corresponds to flow density at that point.



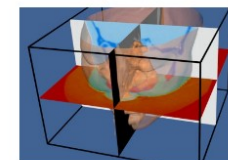
full_plate52
An animation of a plastic blow molding process. A hot balloon of plastic is shaped by moving molds at the same time the balloon is inflated.



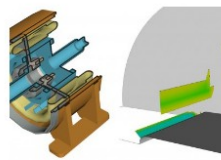
full_plate50
The flow of fluid (LOx) around a tube is described using streamtubes.



full_plate49
Data in the vicinity of fluid flow (LOx) around a tube.



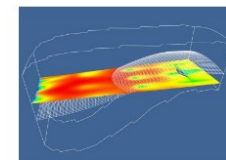
full_plate46
Visualizing a CT scan of the human head using an isosurface of the skin, and cross-sectional planes through the data.



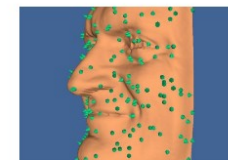
full_plate41
full_plate40bottom
An isosurface of a pine root from an MRI image sequence.



full_plate40bottom
An isosurface of a pine root from an MRI image sequence.



full_plate39
Visualization the combustion process in a segment of an annular combustor. The combustor is where fuel and air is burned in a gas turbine.



full_plate34
Glyphing a polygonal model of a human face to indicate the direction of surface normals.

Ease-of-Use



Chart Typologies

Excel, Many Eyes, Google Charts

Visual Analysis Grammars

VizQL, ggplot2

Visualization Grammars

Protovis, D3.js

Component Architectures

Prefuse, Flare, Improvise, VTK

Graphics APIs

Processing, OpenGL, Java2D

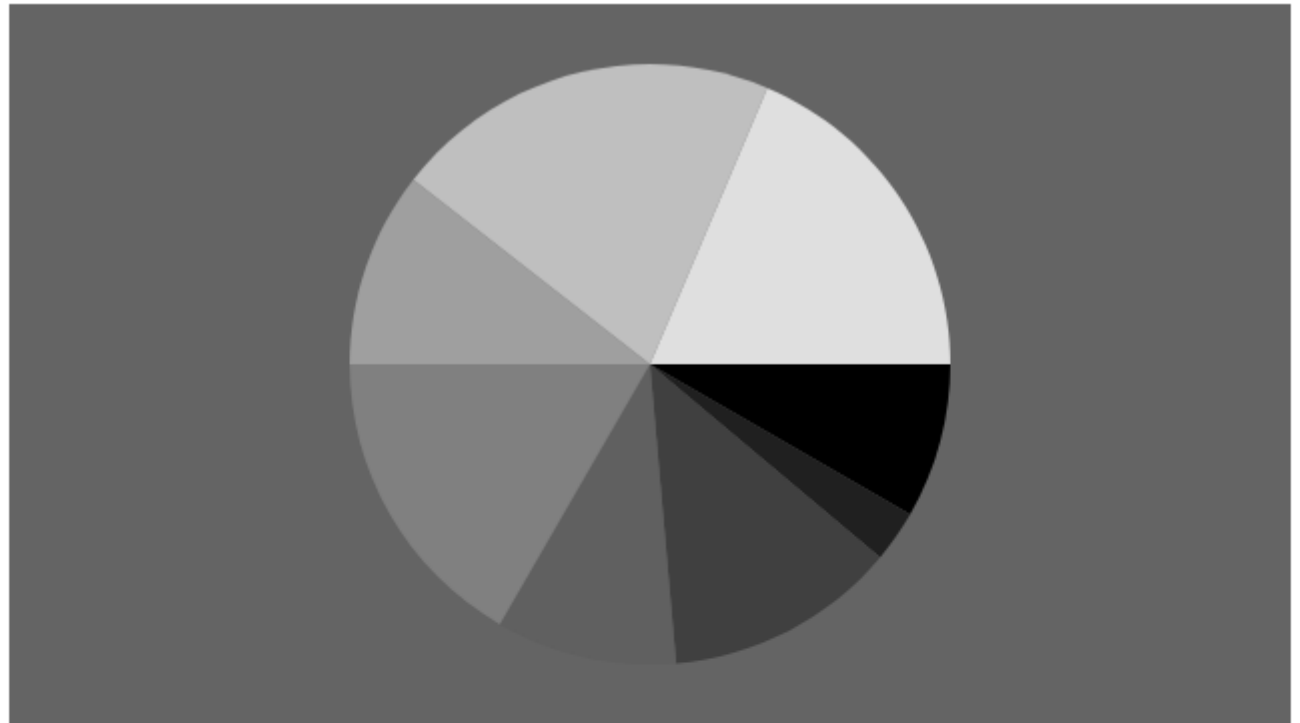
Expressiveness



Processing

- *Processing is a flexible software sketchbook and a language for learning how to code within the context of the visual arts.*

Processing



Pie Chart

Uses the `arc()` function to generate a pie chart from the data stored in an array.

```
int[] angles = { 30, 10, 45, 35, 60, 38, 75, 67 };

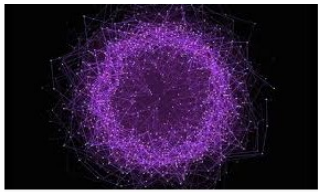
void setup() {
  size(640, 360);
  noStroke();
  noLoop(); // Run once and stop
}

void draw() {
  background(100);
  pieChart(300, angles);
}

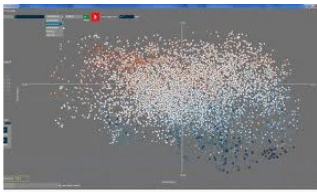
void pieChart(float diameter, int[] data) {
  float lastAngle = 0;
  for (int i = 0; i < data.length; i++) {
    float gray = map(i, 0, data.length, 0, 255);
    fill(gray);
    arc(width/2, height/2, diameter, diameter, lastAngle, lastAngle+radians(data[i]));
    lastAngle += radians(data[i]);
  }
}
```



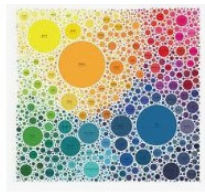

Processing tutorial: Overview of data visualization
youtube.com



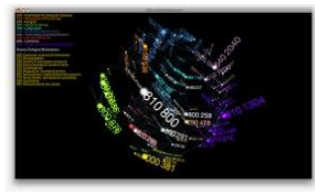
Processing Sound Visualization - YouTube
youtube.com



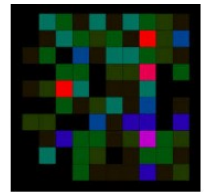
Clinical Data Visualization with Processing - YouTube
youtube.com



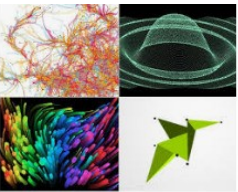
XML/Data Visualization Queue
forum.processing.org



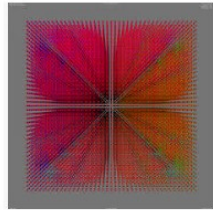
3D Data Visualization Via Processing & OpenGL
pinterest.com



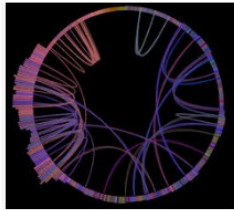
Data visualization tutorial
flowingdata.com



JavaScript Visualization Framework
hackernoon.com



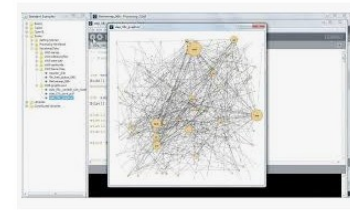
Minecraft type engine for a data visualization
forum.processing.org



processing visualization examples
pinterest.com



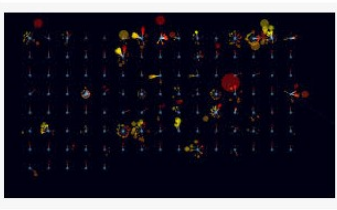
Books | Processing.org
processing.org



Processing: Interactive Data Visualization
linkedin.com



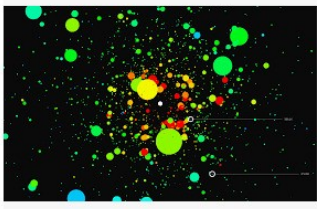
Processing.js Example
wildirwoods.wordpress.com



Visualizing Pressible [Processing]: Blog Clusters & ...
creativeapplications.net



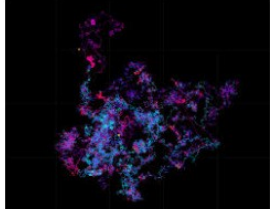
Processing Abstract Visualization — Stock Photos
depositphotos.com



Data in an Alien Context: Kepler Visualization
blog.blprnt.com



Cadın Batrack
cadınbatrack.com



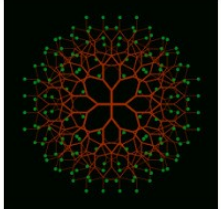
Bitalizer [Processing]: Visualizing 0s and 1s
creativeapplications.net



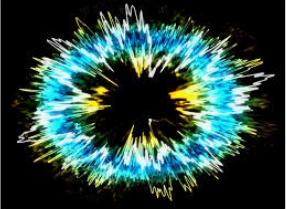
Data Visualization Archives - Michelle Chandra
michellechandra.com



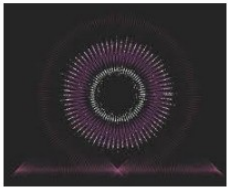
Processing Abstract Visualization
dreamstime.com



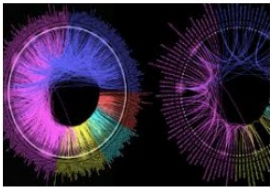
Pulse: A Biometric Data Visualization
jennykang.me



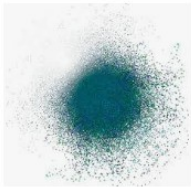
Processing Audio Visualization (PAV)
skpdvdd.github.io



ICM Week 9: Final Project Proposal
1023.io



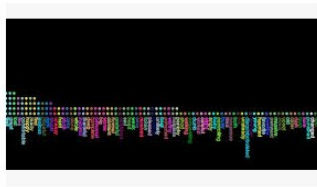
Visualization and Data processing | Do
researchgate.net



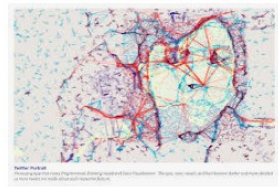
Processing Music Visualization
behance.net



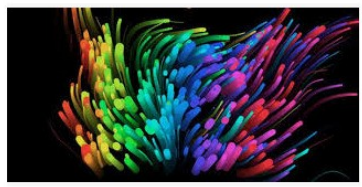
Because it's Friday: Exploring Zipcodes
blog.revolutionanalytics.com



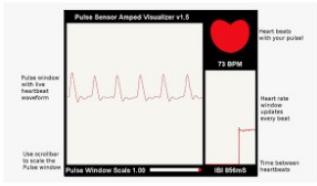
Processing and Data Visualization with Jer
matthewhealy.net



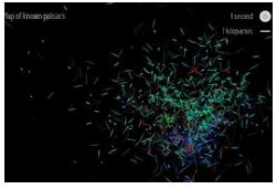
Processing — Alyssa Marie
alyssa-reyes-portfolio.squarespace.com



Processing.js - Port of the Processing Visualization
pinterest.com



Processing Visualization App - World Famous
pulsesensor.com



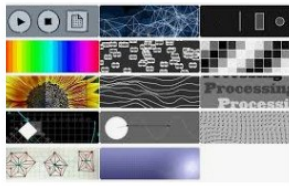
Pulsar Visualization, Laura Kogler's Portfolio
laurakogler.net



processing visualization interaction 1
youtube.com



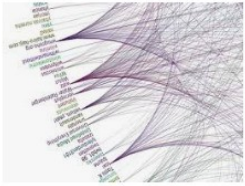
Visual analysis of geocoding
researchgate.net



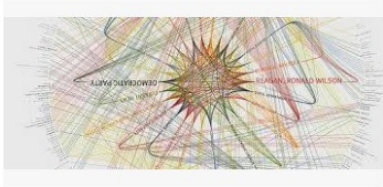
Dynamic, Lightweight Visualization
blog.codinghorror.com



nick lally art, geography, software
nicklally.com



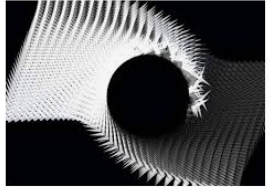
visualcomplexity.com | Visualizing Complexity
visualcomplexity.com



Selected Works | blprnt
blog.blprnt.com



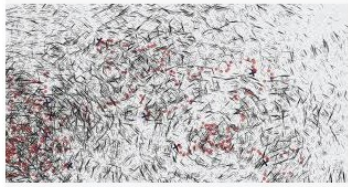
How do I get Processing to do
stackoverflow.com



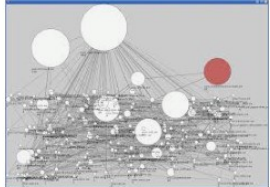
Music visualization with Processing
youtube.com



Sound Data Visualization Fractal
shutterstock.com



Visualizing Fontane's 'Brücke am Tay'
creativeapplications.net



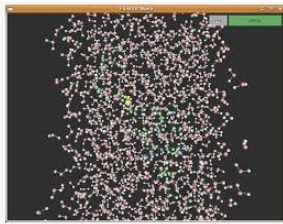
Visualizing web site interlinkage using
peterkrantz.com



Processing.org
processing.org

OpenGL

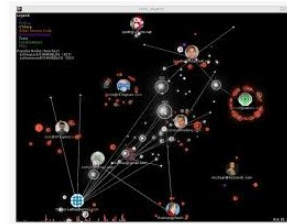
- *OpenGL is the premier environment for developing portable, interactive 2D and 3D graphics applications.*
- *Since its introduction in 1992, OpenGL has become the industry's most widely used and supported 2D and 3D graphics application programming interface (API), bringing thousands of applications to a wide variety of computer platforms.*
- *OpenGL fosters innovation and speeds application development by incorporating a broad set of rendering, texture mapping, special effects, and other powerful visualization functions.*
- *Developers can leverage the power of OpenGL across all popular desktop and workstation platforms, ensuring wide application deployment.*



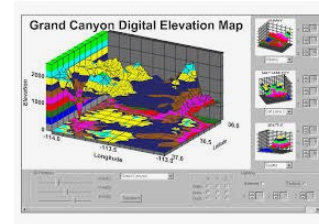
OpenGL Visualization of Molecular Dynamics
researchgate.net



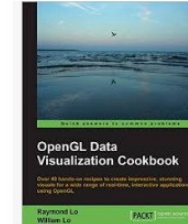
jReality: 3D Visualization Library with
geeks3d.com



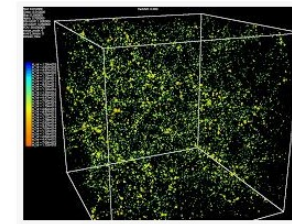
java - Codeswarm software project visualization
unix.stackexchange.com



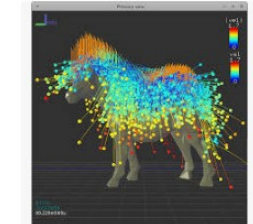
MFC OpenGL 3D Charting, OpenGL Data Visualization
quinn-curtis.com



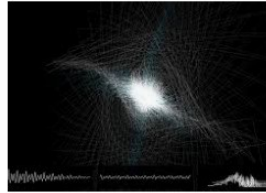
OpenGL Data Visualization Cookbook
scholar.harvard.edu



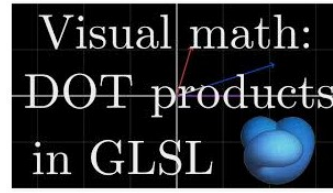
Cosmological Simulations
users.utu.fi



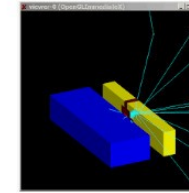
Visualization — Woo 1.0+rev4305-...
woodem.org



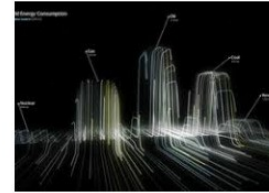
Sound Visualization with OpenGL
ccrma.stanford.edu



Coding a visualization of dot products in OpenGL
youtube.com



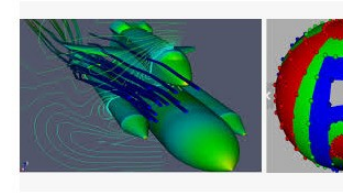
Geant4 Vis Tutorial using t...
conferences.fnal.gov



Marcin Ignac : opengl projects
marcignac.com



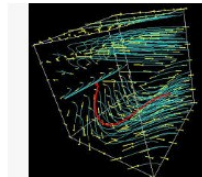
OpenGL Data Visualization Cookbook
amazon.com



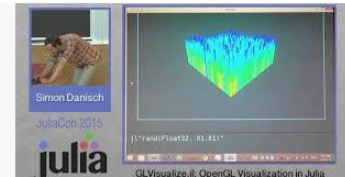
EGL Eye: OpenGL Visualization without an X Server
devblogs.nvidia.com



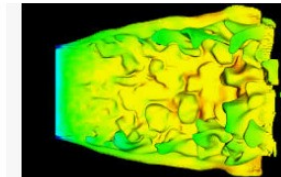
3D Data Visualization Via Processing & OpenGL
pinterest.com



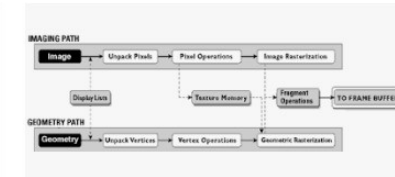
CS 453 / 553 Home Page
eecs.oregonstate.edu



Simon Danisch: GLVisualize.jl - OpenGL visualization in Julia
youtube.com



svPerfGL - Scientific Visualization on OpenGL G...
dav.lbl.gov



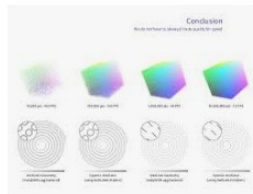
OpenGL Overview
opengl.org



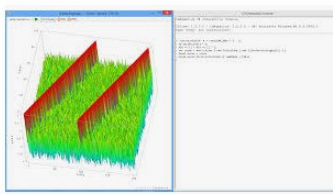
Python & OpenGL for Scientific Visualization
labri.fr



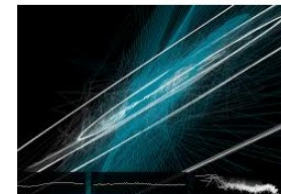
GitHub - VIRGIL175/sound-visualizer: OpenGL visualization
github.com



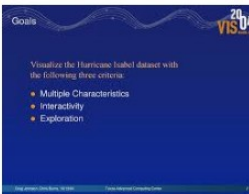
Modern OpenGL scientific visualization
slideshare.net



C# for 3D visualizations and Plotting in .NET - The ...
inumerics.net



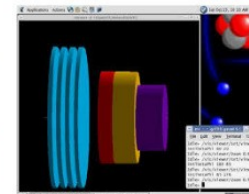
Sound Visualization with OpenGL
ccrma.stanford.edu



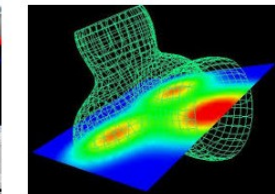
OpenGL Visualization of Hurricane Is...
slideplayer.com



RetroArch 1.3.6 - OpenGL Music visualization...
youtube.com



OpenGL-visualization of the facility ...
researchgate.net



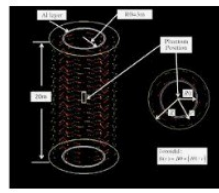
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eecs.oregonstate.edu



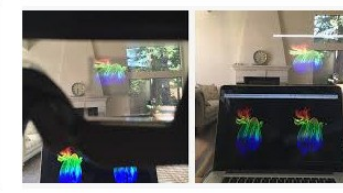
Processing Audio Visualization ...
skpvdtd.github.io



The World's Best Photos of opengl and visualizer ...
hiveminer.com



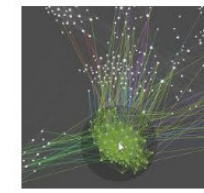
Configuration of toroidal fields i...
researchgate.net



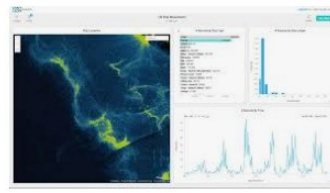
Rendering Stereoscopic 3D Models using OpenGL...
hub.packtpub.com



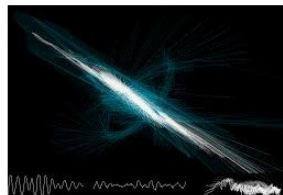
Sound Visualization with OpenGL
ccrma.stanford.edu



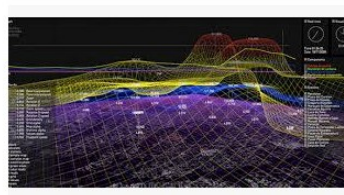
Features
gephi.org



Pro Tip: Linking OpenGL for Server-Side Rendering...
devblogs.nvidia.com



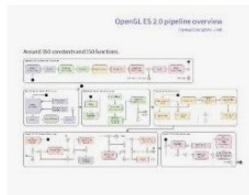
Sound Visualization with OpenGL
ccrma.stanford.edu



victoria vina | htmaa
fab.cba.mit.edu



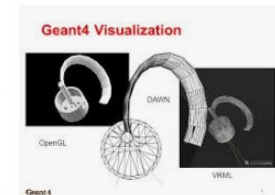
Redway3D OpenGL Graphics Benchmark
geeks3d.com



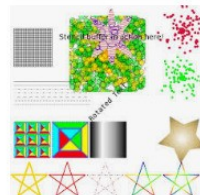
Modern OpenGL scientific visualization
slideshare.net



Audio Visualization with OpenGL C++ - YouTube
youtube.com



Geant4 Visualization 1 OpenGL DAW...
slideplayer.com



Visualization Library: OpenGL
visualizationlibrary.org

Java2D

- *The Java 2D API provides two-dimensional graphics, text, and imaging capabilities for Java programs through extensions to the Abstract Windowing Toolkit (AWT).*
- *This comprehensive rendering package supports line art, text, and images in a flexible, full-featured framework for developing richer user interfaces, sophisticated drawing programs, and image editors.*
- *Java 2D objects exist on a plane called user coordinate space, or just user space.*
- *When objects are rendered on a screen or a printer, user space coordinates are transformed to device space coordinates.*

Interactive Data Exploration

Tableau, *Lyra, Polestar, Voyager*

Graphical
Interfaces

Visual Analysis Grammars

VizQL, ggplot2, *Vega-Lite*

Declarative
Languages

Visualization Grammars

Protovis, D3.js, *Vega*

Component Architectures

Prefuse, Flare, Improvise, VTK

Programming
Toolkits

Graphics APIs

Processing, OpenGL, Java2D

Tableau

Tableau is business intelligence software that helps people see and understand their data.



Fast Analytics

Connect and visualize your data in minutes. Tableau is 10 to 100x faster than existing solutions.



Ease of Use

Anyone can analyze data with intuitive drag & drop products. No programming, just insight.



Big Data, Any Data

From spreadsheets to databases to Hadoop to cloud services, explore any data.



Smart Dashboards

Combine multiple views of data to get richer insight. Best practices of data visualization are baked right in.



Update Automatically

Get the freshest data with a live connection to your data or get automatic updates on a schedule you define.



Share in Seconds

Publish a dashboard with a few clicks to share it live on the web and on mobile devices.

Tableau

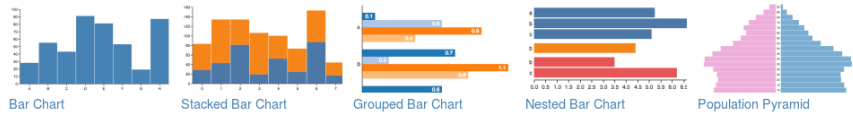


Vega

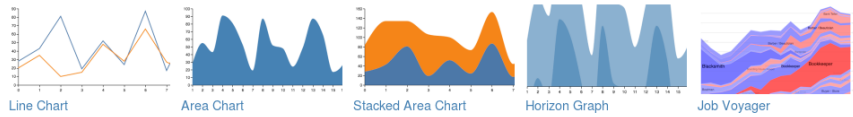
- Vega is a visualization grammar, a declarative language for creating, saving, and sharing interactive visualization designs.
- With Vega, you can describe the visual appearance and interactive behavior of a visualization in a JSON format, and generate web-based views using Canvas or SVG.

Example Gallery

Bar Charts



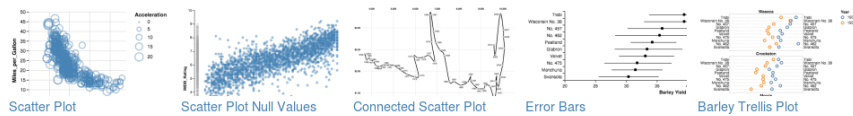
Line & Area Charts



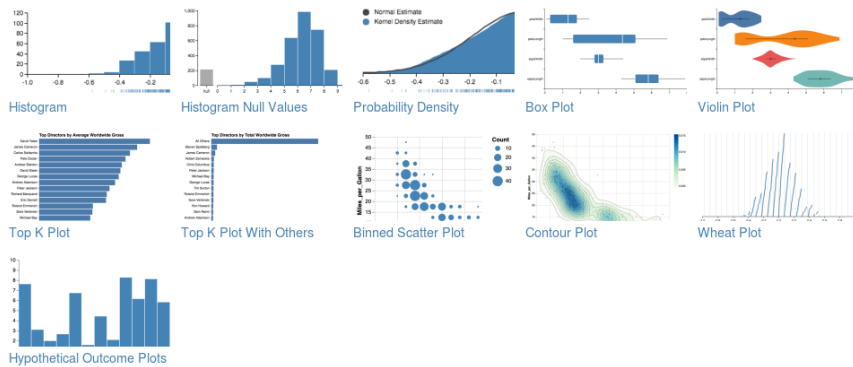
Circular Charts



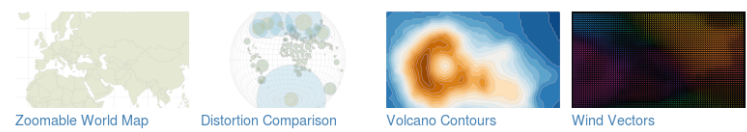
Dot & Scatter Plots



Distributions

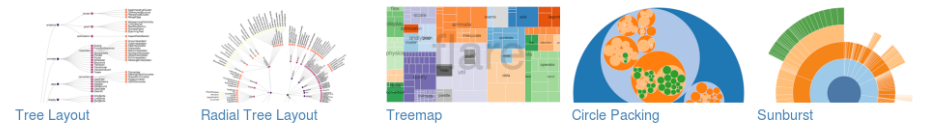


Geographic Maps

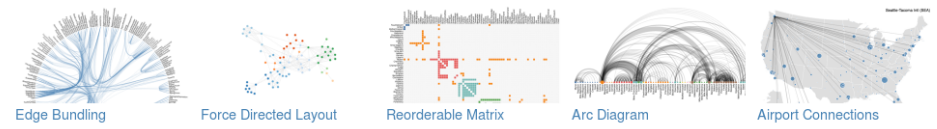


Vega

Tree Diagrams



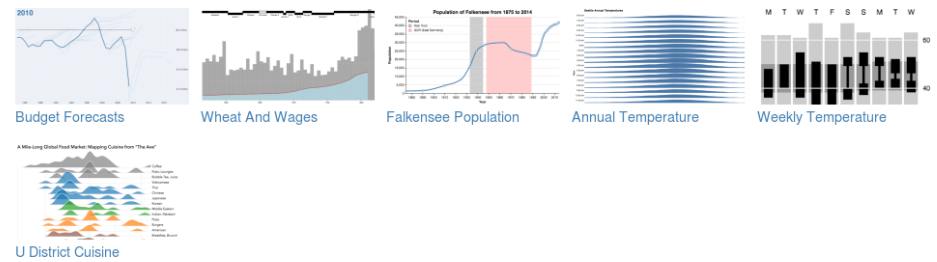
Network Diagrams



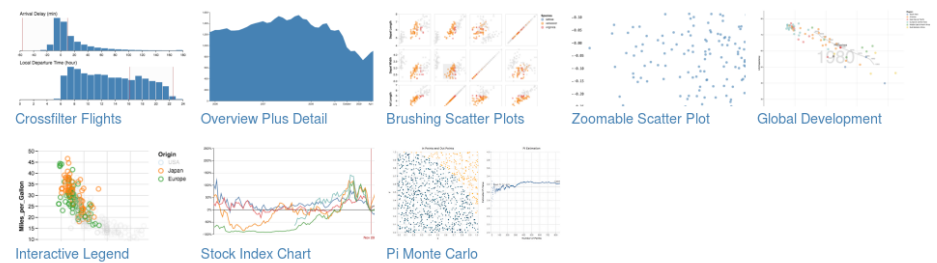
Other Chart Types



Custom Visual Designs



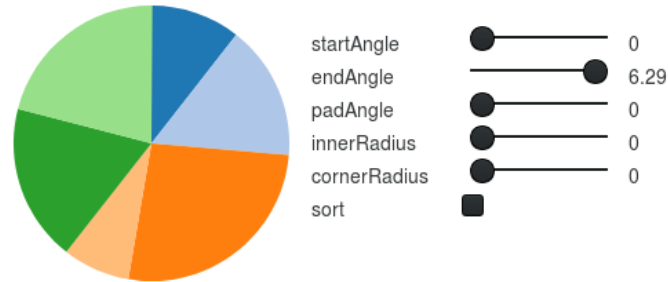
Interaction Techniques



Vega

Pie Chart Example

A pie chart encodes proportional differences among a set of numeric values as the angular extent and area of a circular slice.



[View in Online Vega Editor](#)

Vega JSON Specification <>

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{
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        {"id": 2, "field": 6},
        {"id": 3, "field": 10}
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    }
  ]
}
```


Polestar

- PoleStar is Tableau-style User Interface for visual analysis, building on top of Vega-Lite.

„This project is an alpha software. We are working on improving its code and documentation.“

„WE NO LONGER PLAN TO MAINTAIN THIS PROJECT. PLEASE FOLLOW THE NEW VERSION OF VOYAGER WHICH SUPPORTS ALL INTERACTIONS IN POLESTAR“

Voyager 2

- *Voyager 2 is a data exploration tool that blends manual and automated chart specification.*
- *Voyager 2 combines PoleStar, a traditional chart specification tool inspired by Tableau and Polaris (research project that led to the birth of Tableau), with two partial chart specification interfaces:*
 - (1) wildcards let users specify multiple charts in parallel,*
 - (2) related views suggest visualizations relevant to the currently specified chart.*
- *With Voyager 2, we aim to help analysts engage in both breadth-oriented exploration and depth-oriented question answering.*

Conferences and Journals

- **Conferences**

- <https://www.eurovis.org/> EuroVis – Eurographics Conference on Visualization
- ieevis.org IEEE Information Visualization (InfoVis)
- IEEE Conference on Visual Analytics Science and Technology IEEE Visual Analytics Science and Technology (VAST)
- InfoVis IEEE Scientific Visualization (SciVis)
- <https://sigchi.org/conferences/conference-history/chi/> CHI – Conference on Human Factors in Computing Systems

- **Journals**

- <https://ieeexplore.ieee.org/xpl/aboutJournal.jsp?punumber=2945> IEEE transactions on visualization and computer graphics
- <https://journals.sagepub.com/home/ivi> SAGE journals: Information Visualization
- <https://onlinelibrary.wiley.com/journal/14678659> Computer Graphics Forum
- <https://ieeexplore.ieee.org/xpl/aboutJournal.jsp?punumber=38> IEEE Computer Graphics and Applications
- <https://www.springer.com/engineering/mechanics/journal/12650> Springer: Journal of Visualization

Useful links

- *Hanspeter Pfister (Data Visualization @Harvard)*
 - <http://www.cs171.org>
- *Jeffrey Heer (Data Visualization @University of Washington)*
 - <https://courses.cs.washington.edu/courses/cse512/19sp/>
 - <https://homes.cs.washington.edu/~jheer/>
 - <http://idl.cs.washington.edu/> (UW Interactive Data Lab)
- *Mike Bostock (Creator of D3.js)*
 - <https://d3js.org/>
- *Edward Tufte (pioneer in the field of data visualization)*
 - <https://www.edwardtufte.com>

Data Sources

Data.gov

Census.gov

Dataverse Network

Climate Data Sources

Climate Station Records

CDC Data (Disease Control and Prevention)

World Bank Catalog

Free SVG Maps

UK Office for National Statistics

StateMaster

Quandl