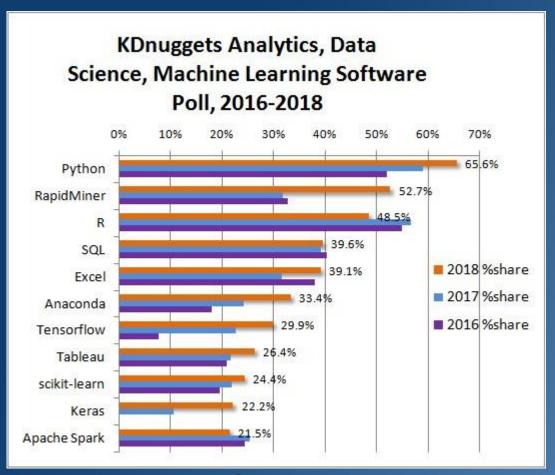
#### Introduction to R



## Available Statistical Packages



#### Statistical Software Used



## Python or R?

Python
King of Data Science
Programming
Languages

R Golden Child of Data Science



2014 DICE TECH SALARY SURVEY AVERAGE SALARY FOR PYTHON PROGRAMMERS IS

\$94,139



2014 DICE TECH SALARY SURVE AVERAGE SALARY FOR R PROGRAMMERS IS

\$115,531

PURPOSE OF EXISTENCE

Python is a general purpose multi-paradigm programming language for data science that has gained wide popularity-because of its syntax

simplicity and operability on different



R is an open source programming language and environment for statistical computing and graphics available on Linux, Windows and Mac.





- NUMPY/SCIPY
- PANDAS
- SCIKIT-LEARN
- STATSMODELS
- MATPLOTLIB

- CARET
- GGVIS,GGPL0T2
- STRINGR
- Z00
- PLYR,DPLYR

USABILITY



Python language makes it easy for programmers to write maintainable, large scale robust code.

translate math to code, in particular for professionals with minimal programming background.

R language has array-oriented syntax making it easier for programmers to

#### **APPLICATIONS**



- WALT DISNEY USES PYTHON
   LANGUAGE TO ENHANCE THE
   SUPREMACY OF THEIR CREATIVE
   PROCESSES.
- DROPBOX IS COMPLETELY WRITTEN IN PYTHON LANGUAGE WHICH NOW HAS CLOSE TO 150 MILLION REGISTERED USERS.
- PYTHON PROGRAMMING IS USED BY MOZILLA FOR EXPLORING THEIR BROAD CODE BASE. MOZILLA RELEASES SEVERAL OPEN SOURCE PACKAGES BUILT USING PYTHON.

**FEATURES** 



OPEN SOURCE

eco-systems.

- BROADNESS
- EFFICIENT
- CAN BE EASILY MASTERED UNDER EXPERT GUIDANCE-READ IT, USE IT WITH EASE
- EXTENSIBLE

- OPEN SOURCE
- ALL-IN-ONE PACKAGE OF A STATISTICAL
- ANALYSIS TOOLKIT
- EXCELLENT CHARTING BENEFITS ROBUST AND VIBRANT ONLINE COMMUNITY
- POWERFUL PACKAGE ECOSYSTEM

FORD USES OPEN SOURCE TOOLS LIKE R PROGRAMMING AND HADOOP FOR DATA DRIVEN DECISION SUPPORT AND STATISTICAL DATA ANALYSIS.

 ZILLOW MAKES USE OF R
 PROGRAMMING TO PROMOTE THE HOUSING PRICES.

INSURANCE GIANT LLOYD'S USES R
LANGUAGE TO CREATE MOTION CHARTS
THAT PROVIDE ANALYSIS REPORTS TO
INVESTORS.

#### Python or R?

 https://www.datacamp.com/community/tut orials/r-or-python-for-data-analysis

#### What is R?

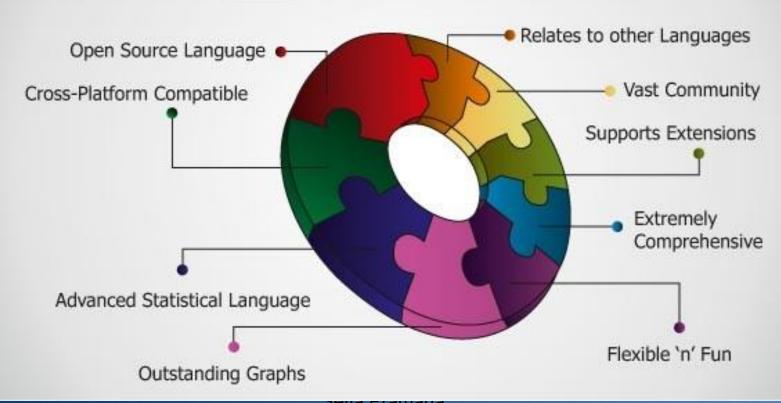
- A language and environment for statistical computing and graphics.
- An integrated suite of software facilities for data manipulation, calculation and graphical display.
- First appeared in 1996 by Prof. Ross Ihaka and Robert Gentleman of the University of Auckland, NZ.
- GNU software -> Free. Similar like S language.
- Open source, maintained and developed by a community of developers.
- Works in Windows, Unix, MacOs

#### R Includes

- Effective data handling and storage facility,
- A suite of operators for calculations on arrays, in particular matrices
- A large, coherent, integrated collection of intermediate tools for data analysis,
- Graphical facilities for data analysis and display either onscreen or on hardcopy
- Well-developed, simple and effective programming language which includes conditionals, loops, user-defined recursive functions and input and output facilities.

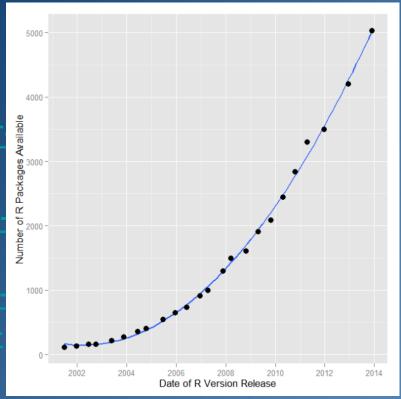
http://www.r-project.org/

#### R Programming Language



## Why R?

- It is not only statistical software but also a language
- 10.000 add-on packages → lots of pre-prepared packages (<a href="http://cran.r">http://cran.r</a> project.org/web/packages/)
- With many applications <a href="http://cran.r">http://cran.r</a>
   <a href="http://www.revolutionanalytics.com/r">http://www.revolutionanalytics.com/r</a>
   <a href="http://cran.r">language-features-applications-and-extensions#thirdparty</a>
- Access to powerful, cutting-edge analytics



## Why R?

 Flexible (complex or standard statistical practices, bayesian modelling, GIS map building, building interactive web applications, building interactive tests, etc. )

We can make our own package and publish it

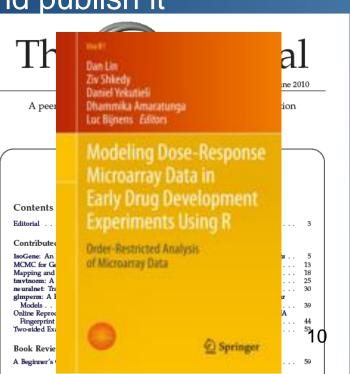
Great Graphics and data visualization

Can be used

 Well Support resources-we

And many m





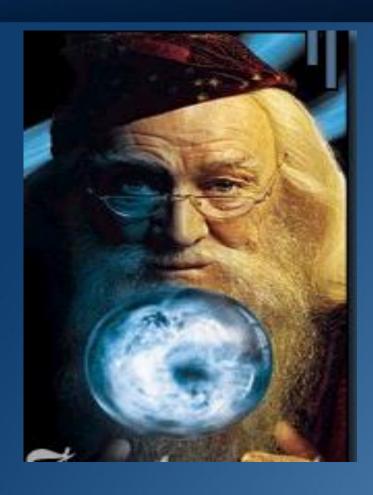
# Why R?

- Can be integrated with other languages (C/C++, Java).
- R can interact with many data sources and other statistical packages (SAS, Stata, SPSS, and Minitab).
- For the high performance computing task  $\rightarrow$  multiple cores, either on a single machine or across a network.

#### But.....

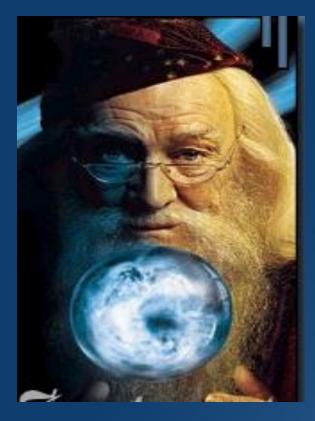
- R has no warranty
- Command Line Interface: difficult for some users.
- Users must learn a new way of thinking about data and data analysis sequence
- That's all ..... I guess

#### WizaRd



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# Learning R





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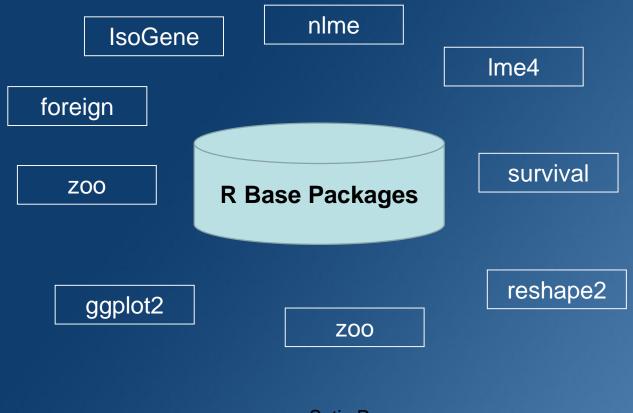
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#### **Companies that use R for Analytics**



# R Library/packages



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# My R Packages

- IsoGene
- IsoGeneGUI
- nea
- neaGUI
- biclustGUI
- OCRME
- More detail: http://setiopramono.wordpress.com/rprogramming/

# Cutting Edge Technologies

#### Finance

- https://cran.r-project.org/web/views/Finance.html
- zoo Provides the most popular format for saving time series objects in R.
- xts Very flexible tools for manipulating time series data sets.
- <u>quantmod</u> Tools for downloading financial data, plotting common charts, and doing technical analysis.
- The <u>QuantTools</u> package offers enhanced quantitative trading and modeling tools.
- The Risk package computes 26 financial risk measures for any continuous distribution

#### **Data Mining**

- Decision trees: rpart, party
- Random forest: randomForest, party
- SVM: e1071, kernlab
- Neural networks: nnet, neuralnet, RSNNS
- Performance evaluation: ROCR
- Data Mining GUI <u>rattle</u>
- etc...
- http://www.rdatamining.com/

#### Social Media

- Text mining: tm
- Topic modelling: topicmodels, lda
- Word cloud: wordcloud
- Facebook: RFacebook
- Twitter data access: twitteR
- Social Network: sna, igraph, RSiena

(http://www.jstatsoft.org/v24/i06/paper)

http://www.r-bloggers.com/an-example-of-social-network-analysis-with-r-using-package-igraph/

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# Parallel Computing

- snow (Simple Network of Workstations) & snowfall for development of parallel R programs.
- multicore parallel processing of R code on machines with multiple cores or CPUs
- More: <a href="http://cran.r-">http://cran.r-</a>

   project.org/web/views/HighPerformanceComputing.html

#### Big Data

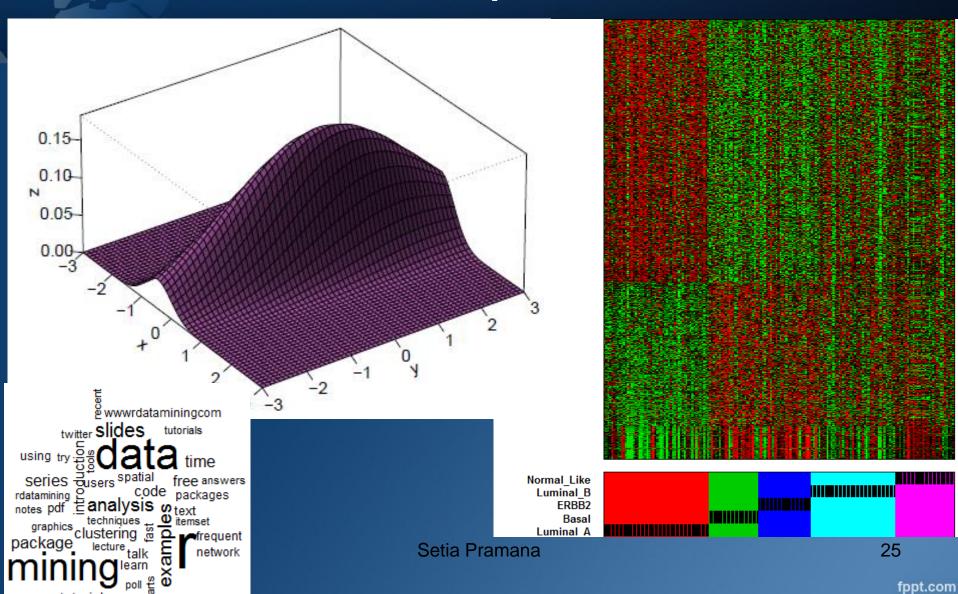
- RHadoop a collection of five R packages that allow users to manage and analyze data with Hadoop, developed by Revolution Analytics
- RHIPE an R and Hadoop Integrated Programming Environment
- More.....

#### R Graphics and Visualization

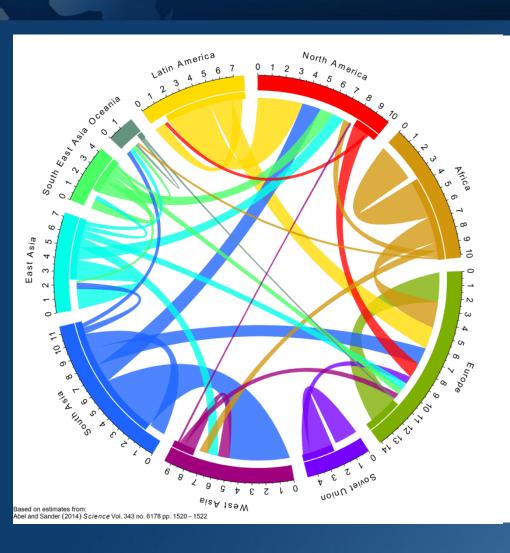
- R provides wide range graphics and visualizations
- Basic Plots: bar plots, basic 3D plots, heatmap.,etc
- Geographic Maps
- Projection Maps
- Social Network Graphs
- Animated graphics and movies (animation)
- Motion Charts (<u>GoogleViz</u>)
- Interactive Graphics (rggobi)
- Image format: BMP, JPEG, PDF, PNG etc...
- More: <a href="https://www.r-graph-gallery.com/">https://www.r-graph-gallery.com/</a>

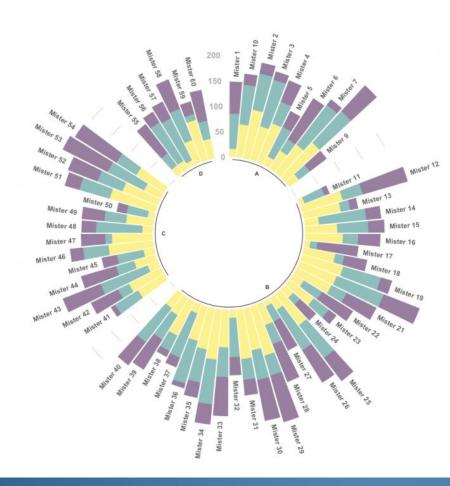
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# R Graphics



# R Graphics





#### R Graphical User Interfaces

- R uses Command line interface and it is preferred for advanced users 

   allows direct control, more accurate, flexible and the analysis is reproducible.
- Requires good knowledge of the language → difficult for beginners or less frequent users.
- R provides tools for building GUIs → RGUI

#### R GUI Projects

- Integrated development environment (IDE)/Script Editors aimed to provide feature-rich environments to edit R scripts and code: Rstudio (www.rstudio.com), and architect (www.Openanalytics.eu)
- Web based application: the Rweb (Banfield, 1999),
   R.Net (<u>www.u.arizona.edu/~ryckman/Net.php</u>),
   or gWidgetsWWW (Verzani, 2012).

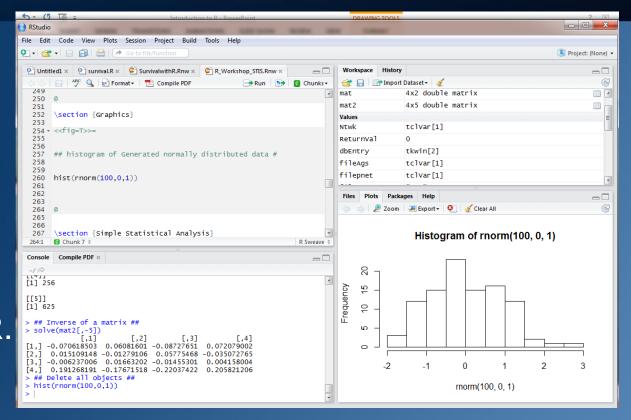
#### R GUI Projects

- Python: OpenMeta-Analyst (Wallace et al, 2012)
- Java: JGR (Java GUI for R), Deducer (Fellows, 2012), and Glotaran (Snellenburg, 2012).
- Php: R-php (http://dssm.unipa.it/R-php/)
- Other extensions connect R to graphical toolboxes for developing menus and dialog boxes: Tcltk, Gtk.

#### R Studio

- Download from Rstudio.com
- Powerfull IDE

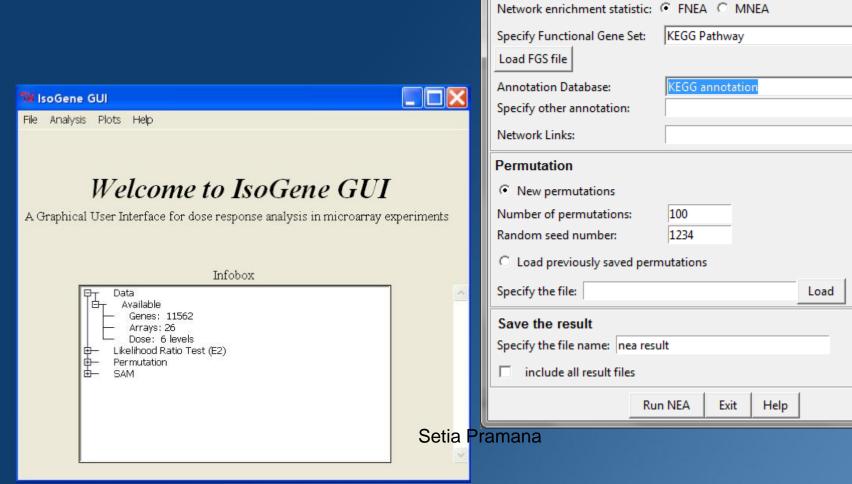
   (Integrated
   Development
   Environment) for R.



# RGUI Developed using tcltk

74 neaGUI

Specify the input: Altered Gene Set:



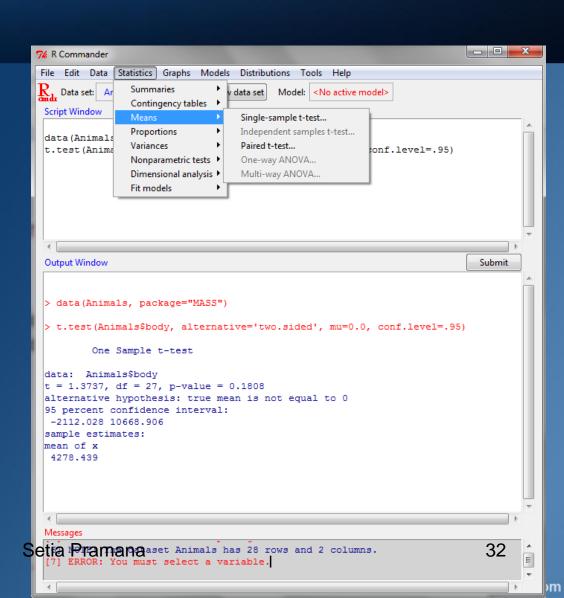
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Browse

Browse

#### RGUI: RCommander

- Rcommander.com
- Helpful for R beginner
- Install inside R



# RGUI: Web Based App

#### WebBUGS

- Conducting Bayesian Statistical Analysis Online
- CombinesOpenBUGS and R

www.webbugs.psychstat.org

```
Welcome JSS » New I Current I Re-run I Copy I Email I Share I All Analyses I Modules I FAQ
Model
Name of analysis Meta-analysis of correlation
                                                                       Email notification 

1. Model: Type or select a model Meta-analysis
                                                          + Help
 model{
   for (i in 1:m){
     z[i] < .5*log((l+r[i])/(l-r[i]))
     pre.phi[i] <- (n[i]-3)*a[i]
     z[i] ~ dnorm(zeta[i], pre.phi[i])
     zeta[i] ~ dnorm(beta, pre.tau)
   beta ~ dnorm(0, 1.0E-6)
   rho <- (exp(2*beta)-1)/((exp(2*beta)+1))
   pre.tau ~ dgamma(.001,.001)
   tau <- 1/pre.tau
Data: Input or select data No + Convert data Help
 list(m = 11, r = c(0.210, 0.252, 0.123, 0.330, 0.400, 0.340, 0.110, 0.147, 0.110, 0.360, 0.138), n =
 c(215,132,309,117,307,1212,175,380,86,74,361), a =
 c(1.0,1.0,1.0,1.0,0.8,1.0,1.0,1.0,1.0,1.0,1.0))
3. Initial values: Multiple sets of initial values are allowed. Convert data Help
 list(beta = 0, pre.tau = 1 )
 list(beta = 1, pre.tau = 1 )
 list(beta = -1, pre.tau = 1)
 Next
WebBUGS Admin » Login I Logout I Profile I Forgot password
```

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#### RGUI: Shiny

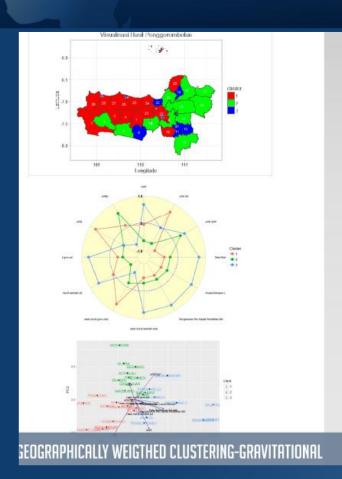
- A new package from Rstudio to build interactive web applications with R.
- Really Easy!
- Build useful web applications with only a few lines of code—no JavaScript required.
- Self learning: <a href="http://shiny.rstudio.com/">http://shiny.rstudio.com/</a>
- http://www.showmeshiny.com/

# Our Recent R Packages

Name	Title	Brief Description	Author	Repository
spatialClust	Spatial Clustering	Clustering analysis with pay attentation on	Imam Habib Pamungkas, Setia	CRAN
		membership via spatial effects	Pramana	
advclust	S4 Object Oriented for	Advance on clustering with fuzzy clustering for	Achmad Fauzi Bagus F, Setia	CRAN
	Advanced Clustering(	overlapping cluster and objects on gray area.	Pramana	
	Fuzzy Clustering and	Cluster Ensemble performs combining several		
	Cluster Ensemble)	result as one robust and stable result.		
RcmdrPlugin.Fuzzy	R commander plugin	Graphical User interface via Rcmdr Plugin for	Achmad Fauzi Bagus F, Setia	CRAN
Clust	for fuzzy clustering	fuzzy clustering analysis	pramana	
MetaheuristicFPA	Metaheuristic with	Optimization of function objectives to get	Amanda Pratama Putra, Margaretha	CRAN
	Flower Pollinantion	global optimum of parameter by using Flower	Ari Anggorowati	
	Algorithm	Pollination Algorithm		
Multiplier	Social Accounting	Graphical User Interface for performing SAM	Tiara Ratna Dewi, Aisyah Fitri	R-Forge
	Matrix and Finansial	(Social Accounting Matrix) and FSAM (Financial	Yuniarshi	
	Social Accounting	Social Accounting Matrix)		
	Matrix			
RcmdrPlugin.PCAR	Robust PCA plugin for	Graphical User Interface for Robust Principal	Monalisa Sipahutar, Setia Pramana	CRAN
obust	Rcmdr	Component Analysis (PCA) with Hubert		
		Algorithm for Dimension Reduction		

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## Our Recent R Packages



### spatialClust

An R Package for Cluster Spatial Data

Available on CRAN:

September 3rd 2016

"spatialClust" - an R package

by Imam Habib Pamungkas, S.S.T and Setia Pramana, Ph.D

## Our Recent R Packages

- Kalingga
- Muria
- C++





ASGARD is a statistics software used to perform geographically weighted regression (GWR). This software was made in 2016 and currently contains some basic GWR functions like GWR, Geographically Weighted Poisson Regression (GWPR), Geographically Weighted Logistic Regression (GWLR), Geographically Weighted Negative-Binomial Regression (GWNBR) and some Assumption Test related to GWR. In addition, ASGARD is also integrated with the map that make it easier for users to performs analysis.

#### **MAIN FEATURES**

Spreadsheet



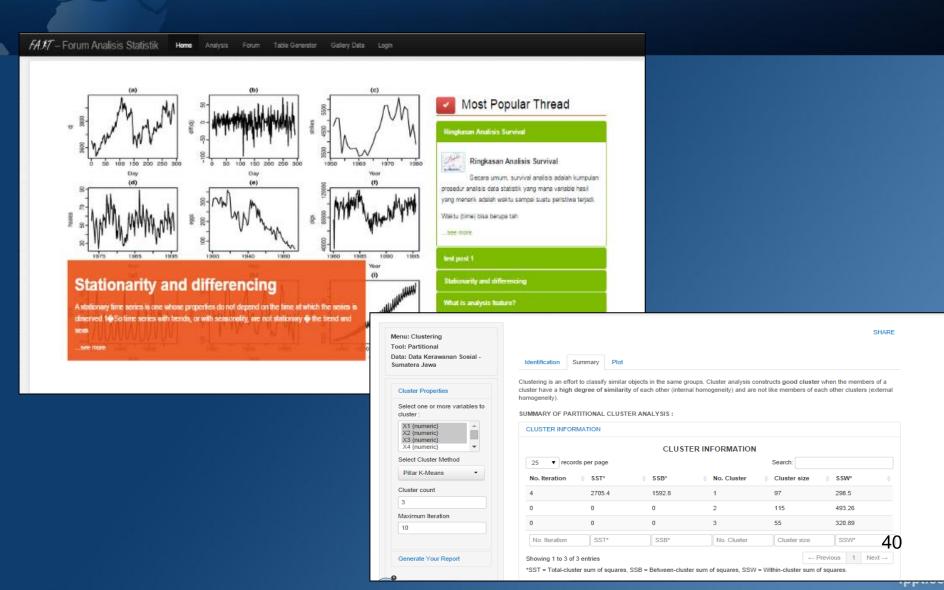
Fairly complete functions

- · GWR
- · GWPR
- · GWLR
- · GWNBR
- · Variance Inflation Factor
- · Breusch-Pagan Test



Map Visualization
Map Visualization can help
users to understand the
circumstances of the
observation area.

## RGUI using Shiny: FAST



## RGUI using C#: Wires

 For Spatial Data Analysis



# RGUI using C#: Wires

💀 File Thematic Analysis Tools

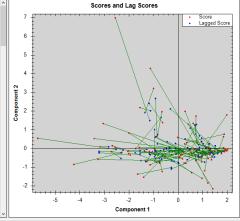
### Features



Data View Variable View Map View Result View						
Exploratory Spatial Data Analysis	Provide calculation of spatial autocorrelation based on Moran's I, Gearcy's C, Local Indicators of Spatial Association (LISA)					
Spatial Weight Matrix	Spatial interactions among observations					
Spatial Clustering	Clustering observation with spatial attributes					
Spatial Regression	Regression analysis with spatial depedency					
Regional Inequality	Inequality analysis especially on poverty subjects					
Spatial Shift Share	Comparing growing rate of several sector based on spatial					
Kriging	Imputation on missing data with spatial attributes					

WIRES - [New Project : "Unsaved"]

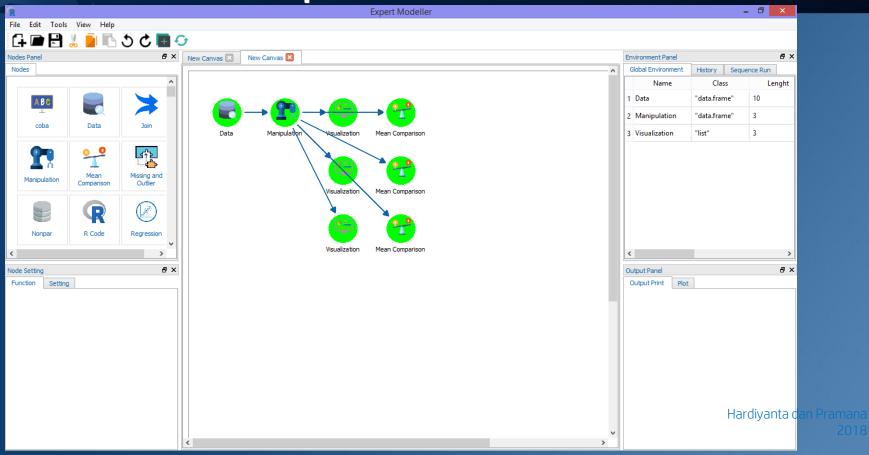
		Score Component 1	Lag Score Component 1	Score Component 2	Lag Score Component 2	Inequality	v	^
١	SELAPARANG	-2.5570	-1.1572	6.9862	1.4920	5.6697	П	
	SUMBAWA	-1.1325	0.8284	4.2860	-0.0731	4.7798	П	
	DOMPU	-3.0534	0.1945	1.3361	-0.1566	3.5745	П	
	WOJA	-3.4202	-0.1159	0.5342	0.0115	3.3454	П	
	PRAYA	-5.7190	-2.5356	0.5513	-0.0462	3.2390	П	
	AIKMEL	-3.2690	-0.2523	-0.5785	-0.6618	3.0178	П	
	MOYO UTARA	1.6801	-0.3151	-0.1405	2.1151	3.0114	П	
	RHEE	1.9859	0.8254	1.7949	-0.3738	2.4597	П	
	SUKAMULIA	0.9716	-0.9446	-1.5866	-0.1341	2.4045	П	
	SELONG	-2.0031	-0.1675	0.8245	-0.6772	2.3716	П	
	SEMBALUN	1.3885	-0.8893	-0.1614	-0.7276	2.3471	П	
	TAMBORA	1.4137	0.4499	-2.1472	-0.0816	2.2794	П	
	KURIPAN	0.6826	-1.5507	-0.0123	-0.2446	2.2453	П	
	SOROMANDI	1.2874	-0.8441	-0.3371	0.2568	2.2127	П	
	PUJUT	-4.2471	-2.3220	-0.8469	-0.2324	2.0208	П	
	RABA	0.2869	0.8763	1.9864	0.0585	2.0160	П	
	MATARAM	-0.8592	-0.9215	0.6684	2.6770	2.0096	П	
	ALAS	0.4113	1.3838	1.3021	-0.4249	1.9820	П	
	GERUNG	-2.0509	-0.0880	-0.1390	-0.3074	1.9701	П	
	GUNUNG SARI	-1.7310	-0.6951	-0.0028	1.6604	1.9594	٦	
	KAYANGAN	0.9773	-0.9436	-0.2941	-0.3153	1.9210	П	
	TARANO	1.2161	-0.5865	-0.2837	-0.0498	1.8177	٦	
	TALDWANG	-0.0186	1.6467	0.5946	-0.0904	1.8007	╛	V



CLASSIFICATION MATRIX

e CCR: 82.6772 %

## R Expert Modeler



## Dynamic Report Generation

Produce documents automatically: pdf, doc, html Packages:

- Sweave
- knitr
- Markdown

### Big Data and R

Data

Cleaning
Filtering
Aggregation

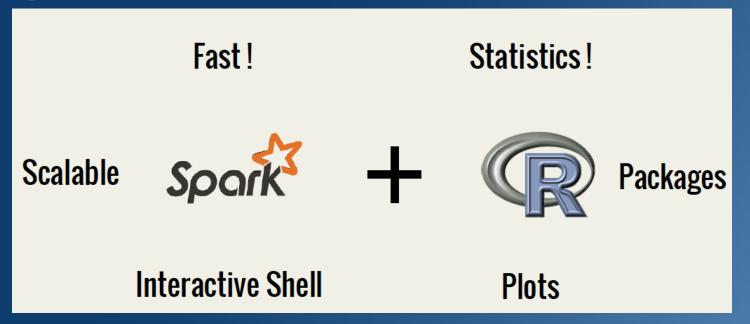
Collect
Subset

Subset

DataFrames
Visualization
Libraries

## Big Data

#### SparkR



SparkR is a language binding that seamlessly integrates R with Spark, and enables native R programs to scale in a distributed setting

#### A Start

"Anter-skiller ins pemierintah geneur mendurung penggunian dan pengenbangan solt-war berbasik com source. E merupakan suatu seharat elakhgus behasik peminograman yan bersalik open source, menevarikan suatu selat yang berdaliya gara dan fisisbel simila melakukan amalisis dala statistik. Saya berhasip selakut main statistik. Atususnya o Ingaungan Bedan Pusat Statistik, saya berhasip selakut main statistik. Atususnya o Ingaungan Bedan Pusat Statistik, saya berhasip bersaliya man statistik. Atususnya yan atusut pengengan begin pengengan yang ligin belajar tertang R dan dasar. Disus ciki perusa yan atusut pengengan dalam pengengan pengengan dalam saya berhasi saya menguat saya saya dalam saya saya dalam saya saya saya saya saya saya berkacimpung di Bedan Pusat Statistik, membuat baku ini mesah dipaham okal pembatanya di

Dr. Suranyanto, Kepala Sodan Pusat Statistis Republik Indonesi

Pengolahan dan anahisi dara talak bisa dikepaskan dari dursa Penelitan. Terlebih lagi pada ora BKS DATA sekarang ini. Sanyak metodatagi yang bisa digunukan sehingga bisa bermanisat bagi dunia penelitan. Salah satu bahasa pempograhan yang benyak digunukan sebanyak termengannan R. Lebak bisa beradaptan dengan cepat, dibutuhkan sebuah BEST PRACTICE untuk mempenggat patoes belajar Busu in nerawatikan sebuah selas antak pembaca benga BEST PRACTICE yang manpu menyalakan penggunaan RLANQUAGE secara benarang dan tosat Busu ini sangat sook buhkan untuk secarang pemulai sekalapan. Bisku ini membalakan penelagan yang kempulaan sebatagan pengahan penggunaan RLANQUAGE secara benarang dan tosat Busu ini sangat sook buhkan untuk secarang pemulai sekalapan. Bisku ini membalakan penelasaan yang kempulaan sebatagan pengahangan pengahan pengahangan pengahangan pengahan pengahan pengahangan pengahangan pengahangan pengahangan pengahan pengahangan pengahangan pengahan pengahan pengahangan pengahan pengahangan pengahangan pengahan pengahangan pengahan pengahangan pengahangan pengahangan pengahan pengahan pengahan pengahangan pengahan pengahan pengahangan pengahan pengahan pengahan pengahan pengahan pengahan pengahangan pengahan p

- Prof. Dr. Eng. Wiscus Johnston, Mensyer Rosel Facultas Ilma Kompuler Universitas

Serbagai laikrya tidang limu yang berindiri kepada matemalika, statistika tak dapat dipelajan secura menyekuruh dengan mentiansa dan mentahani saya. Seleluh menuhami suasi, kicosep perlu praktak dan pengalaman langsung dalam membangun hipotesia, menuham sampling merakod dan mengolah data, modeling, melakukan teol dalasti, untuk mengu hipotesia, membangun confidona interval, sinsulasi dan berbagai hali serkan praktek

sunstrue. Promeis groupe, yang disebutkan di atas terbalikan dan terbalang dengan pelkenthangan teknologi kompulasi dalam terbalang delaata belakangan ni Tikku ni pengalar statistika pada langkat pensulai hingga interrediate, ditutis dengan bela menggunakan R, sebagai fesalitas percolong kompulasi. Keunggulan R sebagai statistikal programming language stopping dengan kotonseciaan bertagai "packaga" statistikal yang sisa palasterandia dan istoporig dengan ketensekaan berbagai padkape stabilika yang asa pukaliforiedia da kumudahan dalam pengdahan data, grafik, dan juga programming siata sifatnya yang opu soorce dan tuk berbuyu, menjadikan buku nu menspunya mba tambah yang balk

- Pengenetan RGUI dan RStudio
   Statistik Deskriptif dan Visuelnusi Data
- Visualisasi dengan ggold2 Statistik Inferensia dan Uji Hipotesis Anahais Keragaman (Anova)

- Anather Regresi den Korelesi Perangraman dengan R dan ilplyr
- Analisa Data dengan Roomis Recirci Locistik

Setia Pramana, Ph.D. Ricky Yordani, M.Stat Robert Kurniawan, M.Si Budi Yuniarto, M.Si

DASAR-DASAR

STATISTIKA Dengan Software R

Konsep dan Aplikasi



IN MEDIA









DASAR-DASAR STATISTIKA Dengan Software R



#### Konsep Serta Implementasi

Kebutuhan akan eksplorasi dan analisis data semakin meningkat beberapa tahun terakhir. Metode eskplorasi dan analisis data juga mulai bergeser ke arah penggunaan data mining dan beberapa algoritma machine learning. Hal ini menderong perubahan kurikulum dan materi yang harus disampaikan dan dikuasai mahasiswa khususnya mahasiswa jurusan statistik. Buku ini sangat saya rekomendesikan baik kepade mahasiswa maupun para penggiar karena buku ini tidak hanya memberikan teori namun juga mengajarkan bagaimana mengapilkasikan teori tersebut dalam contho-contoh prakis. Buku ini juga memberikan keberagaman aplikasi dari data mining dengan tipe data yang berbeda-beda yang dapat diaplikasikan dengan software R.

Dr. Erni Tri Astuti, M.Math - Direktur Politeknik Statistika STIS

R merupakan salah satu alat pengolahan data yang sangat ampuh. Dengan bahasa yang lugas dan "to-the-point", penulis berhasil menyajikan data mining dengan pendekatan praktis menggunakan R. Buku ini merupakan batu pijakan yang sangat berguna buat para aspiring data scientist yang ingin menggeluti bidang data science

Syafri Bahar S.Si., M.Sc., FRM - Vice President of Data Science GOJEK.

#### Bahasan buku ini mencakup:

- 1. Pengantar Data Mining
- 2. Eksplorasi dan Visualisasi Data
- 3. Regresi Linear dan Logistik
- 4. Analisis Komponen Utama
- 5. Multivariate Anova
- 6. Supervised Learning (KNN, Decision Tree, Random Forest, dll)
- 7. Unsupervised Learning (Cluster Analysis)
- 8. Text Mining
- 9. Analisis Sentimen
- 10. Data Mining dalam Bioinformatika



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Harga P. Jawa Rp.

Setia Pramana, **Setia Pramana Budi Yuniarto** Siti Mariyah Ibnu Santoso Rani Nooraeni DATA MINING dengan DATA dengan Konsep Serta Implementasi

## **Book Chapters**

#### Use R!

Dan Lin Ziv Shkedy Daniel Yekutieli Dhammika Amaratunga Luc Bijnens *Editors* 

Modeling Dose-Response Microarray Data in Early Drug Development Experiments Using R

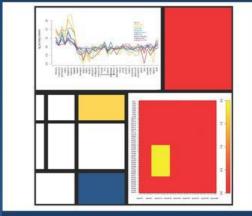
Order-Restricted Analysis of Microarray Data





Chapman & Hall/CRC Biostatistics Series

Applied Biclustering Methods for Big and High-Dimensional Data Using R



edited by Adetayo Kasim
Ziv Shkedy • Sebastian Kaiser
Sepp Hochreiter • Willem Talloen



#### Conclusion

#### If statistics programs/languages were cars...











#### Thank you for your attention!

