in Actuarial Science a brief overview

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http://freakonometrics.hypotheses.org/





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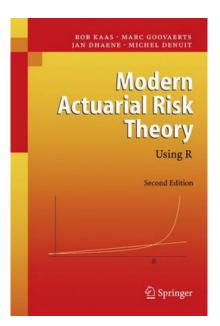
Agenda

- Introduction to R
- Why R in actuarial science?
- Actuarial science?
- A vector-based language
- A large number of packages and libraries for predictive models
- Working with (large) databases in R
- A language to plot graphs
- Reproducibility issues
- Comparing R with other statistical softwares
- R in the insurance industry and amongst statistical researchers
- R versus MsExcel Matlab, SAS, SPSS, etc
- The R community
- Conclusion (?)

R

"R (and S) is the 'lingua franca' of data analysis and statistical computing, used in academia, climate research, computer science, bioinformatics, pharmaceutical industry, customer analytics, data mining, finance and by some insurers. Apart from being stable, fast, always up-to-date and very versatile, the chief advantage of R is that it is available to everyone free of charge. It has extensive and powerful graphics abilities, and is developing rapidly, being the statistical tool of choice in many academic environments."

Appendix A The 'R' in Modern ART



A brief history of R

R is based on the S statistical programming language developed by Joe Chambers at Bell labs in the 80's



R is an open-source implementation of the S language, developed by Robert Gentlemn and Ross Ihaka

actuarial science?

- students in actuarial programs
- researchers in actuarial science
- actuaries in insurance companies (or consulting firms, or financial institutions, etc)

Using a vector-based language for life contingencies

A life table is a vector

> TD[39:52,]			> TV[39:52,]
	Age	Lx	Age Lx
39	38	95237	38 97753
40	39	94997	39 97648
41	40	94746	40 97534
42	41	94476	41 97413
43	42	94182	42 97282
44	43	93868	43 97138
45	44	93515	44 96981
46	45	93133	45 96810
47	46	92727	46 96622
48	47	92295	47 96424
49	48	91833	48 96218
50	49	91332	49 95995
51	50	90778	50 95752
52	51	90171	51 95488

TABLE L

_							
AGES par années,	felon M. Halley	N'ayant pas eu la pet. vérole	Ayant e ia pet, véro	per. vére	de ia de ia de pet. véro t pendant e. chaq. an	des mort	maladies
°	1300	1300	0				
	1000	896	104	137	17,1	17,1	283
2	855	685	170	99	12,4	29,5	133
3	798	571	227	78	9.7	39,2	47
4	760	485	275	66	8,3	47.5	30
5	732	416	316	56	7,0	54.5	21
6	710	359	351	48	6,0	60,5	16
7	692	311	381	42	5,2	65.7	12,8
- 8	680	272	408	36	4.5	70,2	7.5
9_	670	2 37	433	32	4,0	74,2	6
10	661	208	453	28	3,5	77.7	5,5
11	653	182	471	24,4	3,0	80,7	5
12	646	160	486	21,4	2,7	83,4	4,3
13	640	140	500	18,7	2,3	85,7	3.7
14	634	123	211	16,6	2,1	87,8	3.9
15	628	108	520	14.4	8, 1	89,6	4,2
16	622	94	528	12,6	1,6	91,2	4,4
17	616	8 3	533	11,0	1,4	92,6	4,6
18	610	72	538	9,7	1,2	93,8	4.8
19	604	63	541	8,4	1,0	94,8	5
20	598	56	542	7,4	0,9	95.7	5,1
21	592	48,5	543	6,5	0,8	96,5	5,2
2.2	586	42,5	543	5,6	0.7	97,2	5.3
2 3	579	37	542	5,0	0,6	97,8	6,4
24	572	32.4	540	4,4	0,5	98,3	6,5

Using a vector-based language for life contingencies

If age $x \in \mathbb{N}_*$, define $\mathbf{P} = [kp_x]$, and p[k,x] corresponds to kp_x .

The (curtate) expectation of life defined as

$$e_x = \mathbb{E}(K_x) = \sum_{k=1}^{\infty} k \cdot {}_{k|1} q_x = \sum_{k=1}^{\infty} {}_k p_x$$

and we can compute $e = [e_x]$ using

- > life.exp = function(x){sum(p[1:nrow(p),x])}
- > e = Vectorize(life.exp)(1:m)

The expected present value (or actuarial value) of a temporary life annuity-due is

$$\ddot{a}_{x:\overline{n}} = \sum_{k=0}^{n-1} \nu^k \cdot {}_k p_x = \frac{1 - A_{x:\overline{n}}}{1 - \nu}$$

Using a vector-based language for life contingencies

and we can define $\mathbf{A} = [\ddot{a}_{x:\overline{n}}]$ as

```
> for(j in 1:(m-1)){ adot[,j]<-cumsum(1/(1+i)^(0:(m-1))*c(1,p[1:(m-1),j])) }
```

Define similarly the expected present value of a term insurance

$$A_{x:\overline{n}|}^{1} = \sum_{k=0}^{n-1} \nu^{k+1} \cdot {}_{k|} q_{x}$$

and the associated matrix $\mathbf{A} = [A_{x:\overline{n}}^1]$ as

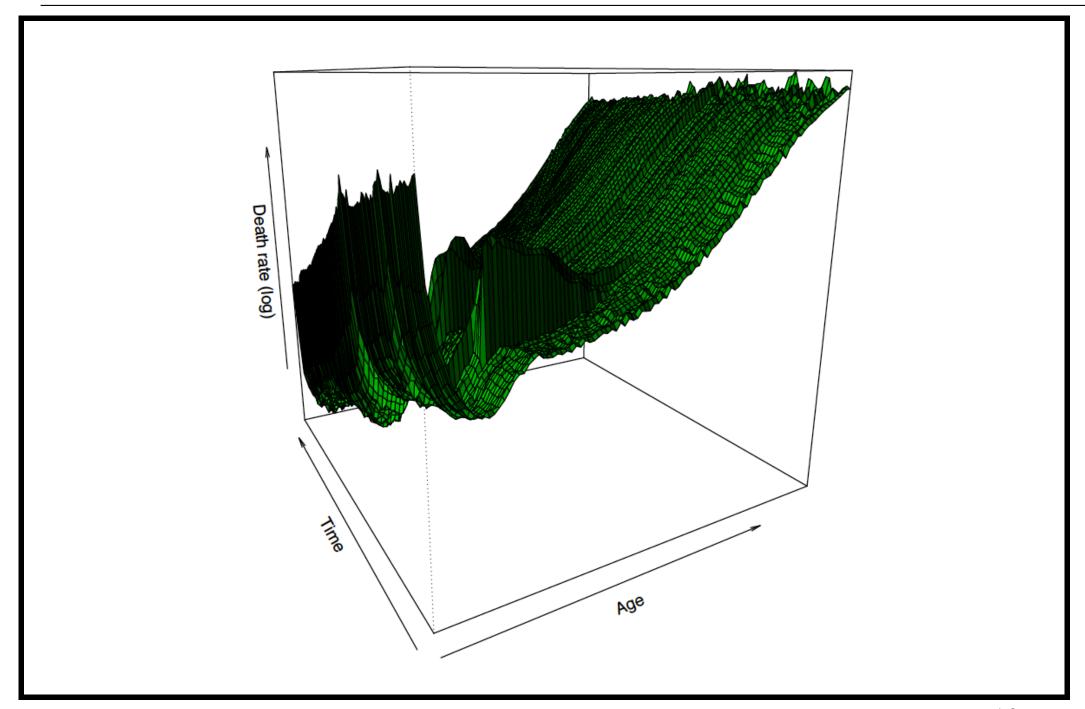
> for(j in 1:(m-1)){ A[,j]<-cumsum(1/(1+i)^(1:m)*d[,j]) }</pre>

Remark: See also Giorgio Alfredo Spedicatos lifecontingencies package, and functions pxt, Axn, Exn, etc.

Life table $L = [L_x]$ is no longer a matrix (function of age x) but a matrix $L = [L_{x,t}]$ function of the date t.

```
> t(DTF)[1:10,1:10]
                                          1905
    1899
          1900
                1901
                       1902
                             1903
                                    1904
                                                 1906
                                                       1907
                                                              1908
   64039 61635 56421 53321 52573 54947 50720 53734 47255 46997
   12119 11293 10293 10616 10251 10514
                                          9340 10262 10104
                                                              9517
    6983
          6091
                5853
                       5734
                             5673
                                          5028
                                                 5232
                                    5494
                                                       4477
                                                              4094
    4329
          3953
                3748
                       3654
                             3382
                                    3283
                                          3294
                                                 3262
                                                       2912
                                                              2721
          3063
                             2500
                                                 2505
    3220
                2936
                       2710
                                    2360
                                          2381
                                                       2213
                                                              2078
                             1932
    2284
          2149
                2172
                       2020
                                    1770
                                          1788
                                                 1782
                                                              1751
5
                                                       1789
                                    1433
6
    1834
          1836
                 1761
                       1651
                             1664
                                           1448
                                                 1517
                                                       1428
                                                              1328
    1475
          1534
                1493
                       1420
                             1353
                                    1228
                                           1259
                                                 1250
                                                       1204
                                                              1108
8
    1353
          1358
                 1255
                       1229
                             1251
                                    1169
                                           1132
                                                 1134
                                                        1083
                                                               961
    1175
          1225
                 1154
                       1008
                             1089
                                     981
                                          1027
                                                 1025
                                                        957
                                                               885
```

Similarly, define the force of mortality matrix $\boldsymbol{\mu} = [\mu_{x,t}]$



Assume - as in Lee & Carter (1992) model - that

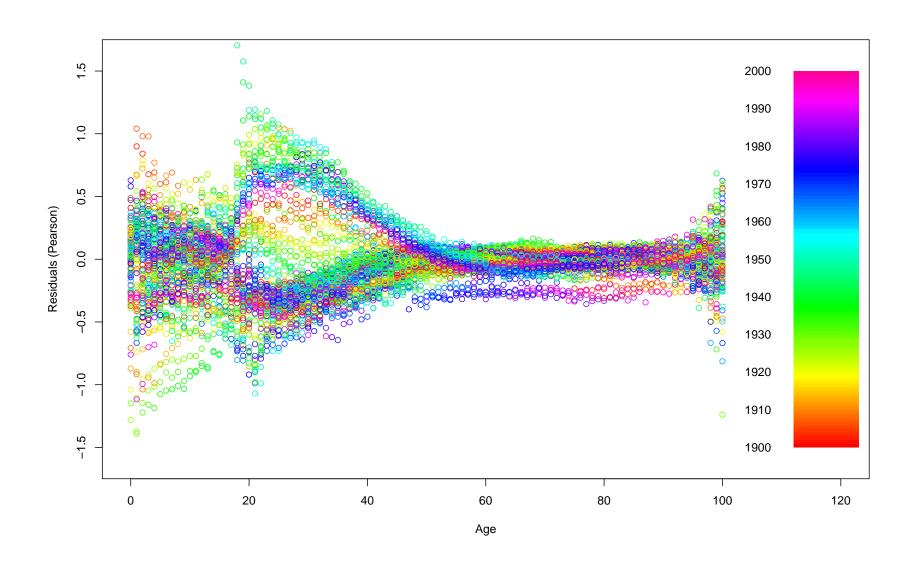
$$\log \mu_{x,t} = \alpha_x + \beta_x \cdot \kappa_t + \varepsilon_{x,t},$$

with some i.i.d. noise $\varepsilon_{x,t}$.

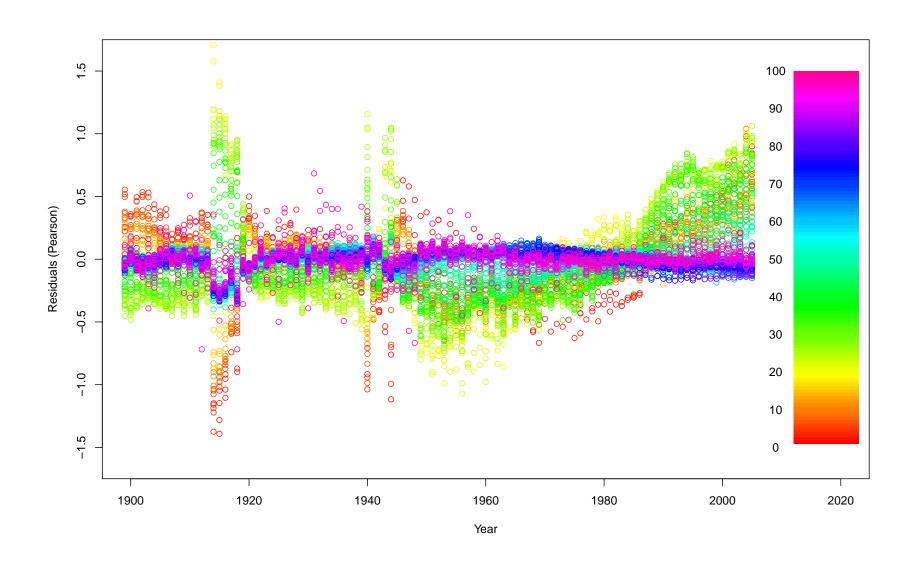
Package demography can be used to fit a Lee-Carter model,

- > library(demography)
- > MUH =matrix(DEATH\$Male/EXPOSURE\$Male,nL,nC)
- > POPH=matrix(EXPOSURE\$Male,nL,nC)
- > BASEH <- demogdata(data=MUH, pop=POPH, ages=AGE, years=YEAR, type="mortality",
- + label="France", name="Hommes", lambda=1)
- > RES=residuals(LCH, "pearson")





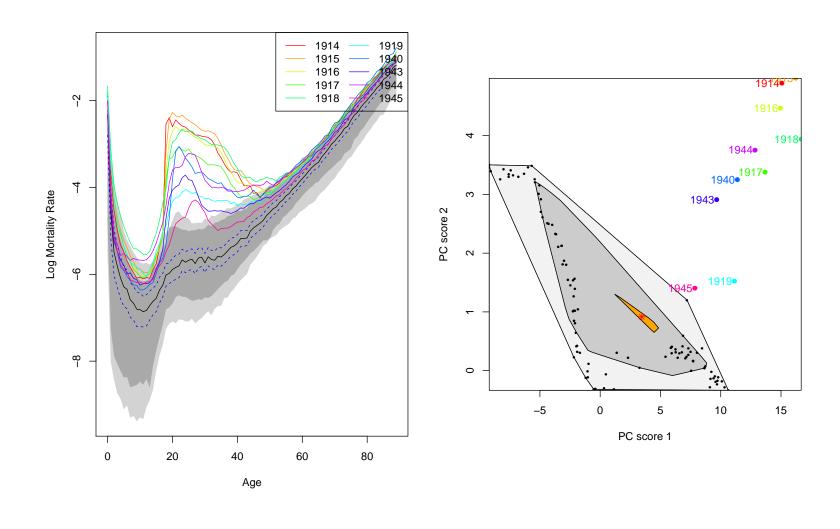




One can consider more advanced functions to study mortality, e.g. bagplots, since $\mu_{x,t}$ is a functional time series,

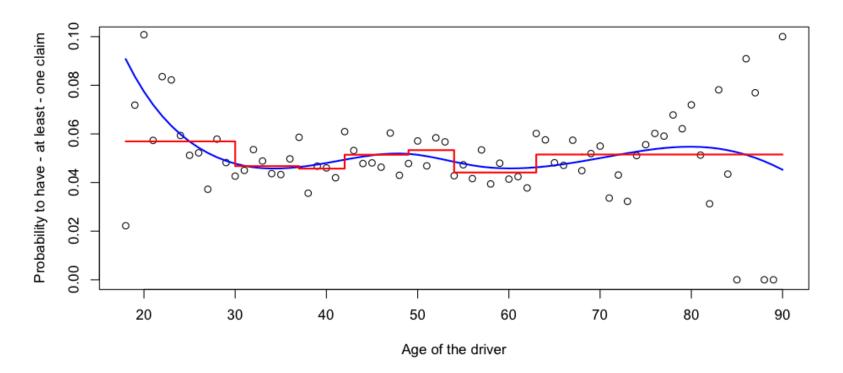
```
> library(rainbow)
> MUH=fts(x = AGE[1:90], y = log(MUH), xname = "Age",yname = "Log Mortality Rate")
> fboxplot(data = MUHF, plot.type = "functional", type = "bag")
> fboxplot(data = MUHF, plot.type = "bivariate", type = "bag")
```

Source: http://robjhyndman.com/



Predictive models in actuarial science

```
> TREE = tree((nbr>0)~ageconducteur,data=sinistres,split="gini",mincut = 1)
> age = data.frame(ageconducteur=18:90)
> y1 = predict(TREE,age)
> reg = glm((nbr>0)~bs(ageconducteur),data=sinistres,family="binomial")
> y = predict(reg,age,type="response")
```



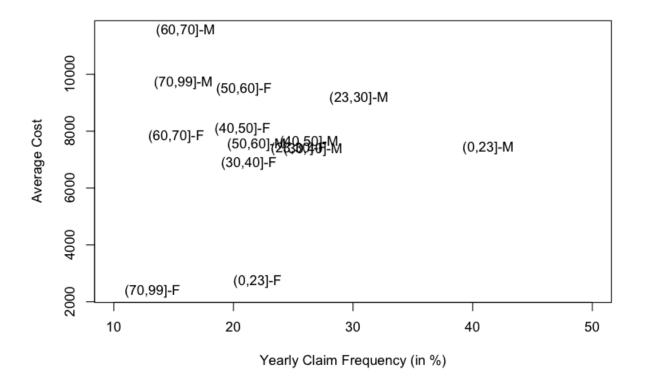
Working with databases

```
> baseCOUT = read.table("http://freakonometrics.free.fr/baseCOUT.csv",
 sep=";",header=TRUE,encoding="latin1")
> tail(baseCOUT,4)
    numeropol debut_pol fin_pol freq_paiement langue type_prof alimentation type_ter
6512
        87291 2002-10-16 2003-01-22
                                       mensuel
                                                   A Professeur
                                                                 Vegetarien
6513 87301 2002-10-01 2003-09-30
                                                   A Technicien
                                                                Vegetarien
                                       mensuel
6514 87417 2002-10-24 2003-10-21
                                       mensuel
                                                   F Technicien
                                                                 Vegetalien
                                                                                emi
6515 88128 2003-01-17 2004-01-16
                                       mensuel
                                                   F
                                                         Avocat
                                                                 Vegetarien
                                                                                emi
           utilisation presence_alarme marque_voiture sexe exposition age duree_permis a
6512 Travail-occasionnel
                                              FOR.D
                                                      M 0.2684932 47
                                  oui
                                                                                9
6513
                Loisir
                                             HONDA
                                                      M 0.9972603 44
                                  oui
6514 Travail-occasionnel
                                         VOLKSWAGEN F 0.9917808 23
                                 non
6515
                Loisir
                                              FIAT F 0.9972603 23
                                 non
```

Working with databases

```
> str(baseCOUT)
'data.frame':
             6515 obs. of 18 variables:
 $ numeropol : int 6 27 27 76 76 87 105 139 145 145 ...
 $ debut_pol : Factor w/ 2223 levels "1995-02-06", "1995-03-01", ...: 2 415 1030 1018
           : Factor w/ 2252 levels "1995-09-22","1995-10-04",..: 15 281 1097 108
 $ fin_pol
 $ freq_paiement : Factor w/ 2 levels "annuel", "mensuel": 1 2 2 2 2 2 2 1 2 2 ...
           : Factor w/ 2 levels "A", "F": 1 2 2 2 2 2 2 2 2 ...
 $ langue
 $ type_prof : Factor w/ 10 levels "Actuaire", "Autre", ...: 10 10 10 10 6 10 6 10
 $ alimentation : Factor w/ 3 levels "Carnivore", "Vegetalien", ...: 1 1 1 1 1 3 1 3 1 3
 $ type_territoire: Factor w/ 3 levels "Rural", "Semi-urbain", ..: 3 2 2 3 3 2 3 2 2 2 .
 $ utilisation
                 : Factor w/ 3 levels "Loisir", "Travail-occasionnel", ...: 2 2 2 2 2 2 2
 $ presence_alarme: Factor w/ 2 levels "non", "oui": 2 2 1 1 1 1 1 2 2 2 ...
 $ marque_voiture : Factor w/ 30 levels "ALFA ROMEO", "AUDI", ...: 19 11 11 9 9 29 29
                 : Factor w/ 2 levels "F", "M": 2 2 2 1 1 2 1 2 2 2 ...
 $ sexe
 $ exposition : num 0.995 0.244 1 1 0.997 ...
             : int 42 51 53 42 44 47 37 43 32 32 ...
 $ age
 $ duree_permis : int 21 22 24 21 23 18 16 24 12 12 ...
 $ age_vehicule
                : int 19 24 16 15 15 14 20 23 16 16 ...
 $ coutsin
                 : num 280 814 137 609 18687 ...
```

Working with databases



Working with MSExcel folders

On a Windows platform, it is possible to use the ODBConnectExcel function of the library(RODBC). The

first step is to connect the file, using

```
> sheet = "c:\\Documents and Settings\\user\\excelsheet.xls"
```

- > connection = odbcConnectExcel(sheet)
- > spreadsheet = sqlTables(connection)

Here, spreadsheet\$TABLE_NAME will return sheet names. Then, we can make a SQL request

```
> query = paste("SELECT * FROM", spreadsheet$TABLE_NAME[1], sep=" ")
```

> result = sqlQuery(connection,query)

Remark: An alternative, available to all platform, is to use the read.xls function of the library(gdata).

Working with large databases

It is possible to read zipped files (even online ones)

```
> import.zip = function(file){
+ temp = tempfile()
+ download.file(file,temp);
+ read.table(unz(temp, "baseFREQ.csv"), sep="; ", header=TRUE, encoding="latin1")}
> system.time(import.zip("http://freakonometrics.free.fr/baseFREQ.csv.zip"))
trying URL 'http://freakonometrics.free.fr/baseFREQ.csv.zip'
Content type 'application/zip' length 692655 bytes (676 Kb)
opened URL
downloaded 676 Kb
  user system elapsed
     0.762
                 0.029
                        4.578
> system.time(read.table("http://freakonometrics.free.fr/baseFREQ.csv",
+ sep=";",header=TRUE,encoding="latin1"))
  user system elapsed
     0.591
                 0.072
                        9.277
```

Working with large databases

It is possible to import only some parts of a large database, e.g. specific colums ...

```
> mycols = rep("NULL", 18)
> mycols[c(1,4,5,12,13,14,18)] < - NA
> baseCOUTsubC = read.table("http://freakonometrics.free.fr/baseCOUT.csv",
 colClasses = mycols,sep=";",header=TRUE,encoding="latin1")
> head(baseCOUTsubC,4)
 numeropol freq_paiement langue sexe exposition age
                                                    coutsin
         6
                 annuel
                            A M 0.9945205 42
                                                   279.5839
        27
                mensuel
                            F M 0.2438356 51
                                                   814.1677
        27
                            F M 1.0000000 53
                                                   136.8634
                mensuel
                            F F 1.0000000 42
        76
                                                   608,7267
                mensuel
```

Working with large databases

... or specific raws in the dataset

```
> baseCOUTsubCR = read.table("http://freakonometrics.free.fr/baseCOUT.csv",
  colClasses = mycols, sep=";", header=TRUE, encoding="latin1", nrows=100)
> tail(baseCOUTsubCR,4)
   numeropol freq_paiement langue sexe exposition age
                                                     coutsin
        1193
97
                  mensuel
                                   F 0.9972603 55 265.0621
98
        1204
                  mensuel
                               F F 0.9972603 38 9547.7267
                              F M 1.0000000 40 442.7267
99
        1231
                  mensuel
                               F F 0.6767123 48 179.1925
100
        1245
                   annuel
```

Remark: With library(colbycol) read big text files column by column.

Working with huge databases

Problem: Poisson regression, with 150 million observations, 70 degrees of freedom

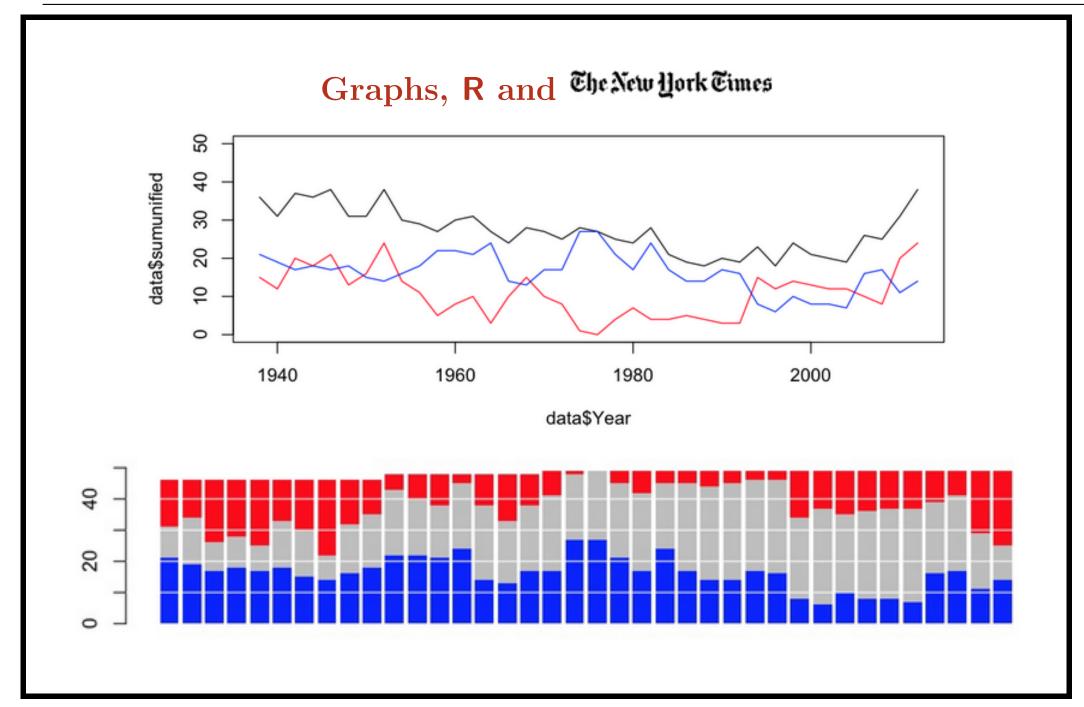
- Proc GENMOD in SAS (16-core Sun Server) takes around 5 hours
- installing a Hadoop cluster takes around 15 hours
- (standard) R on a 250Gb server, still running after 3 days,
- Use of RevoScaleR package in R, 5.7 minutes (same output as SAS)

Source: http://www.inside-r.org/blogs/2012/10/25/allstate-compares-sas-hadoop-and-r-big-data-insurance-models

Graphs, R and The New york Times

'If you can picture it in your head, chances are good that you can make it work in R. R makes it easy to read data, generate lines and points, and place them where you want them. Its very flexible and super quick. When youve only got two or three hours until deadline, R can be brilliant." Amanda Cox, a graphics editor at the New York Times. "R is particularly valuable in deadline situations when data is scant and time is precious.".

Source: http://chartsnthings.tumblr.com/post/36978271916/r-tutorial-simple-charts

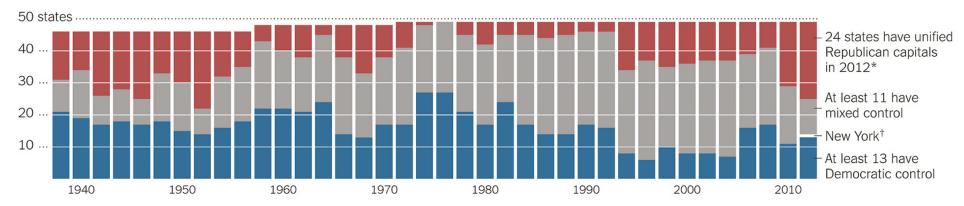


Graphs, R and The New york Times

State Government Control Since 1938

There are now more state capitals dominated by a single party — where one party controls the legislature and the governor's office — than at any time since 1952.



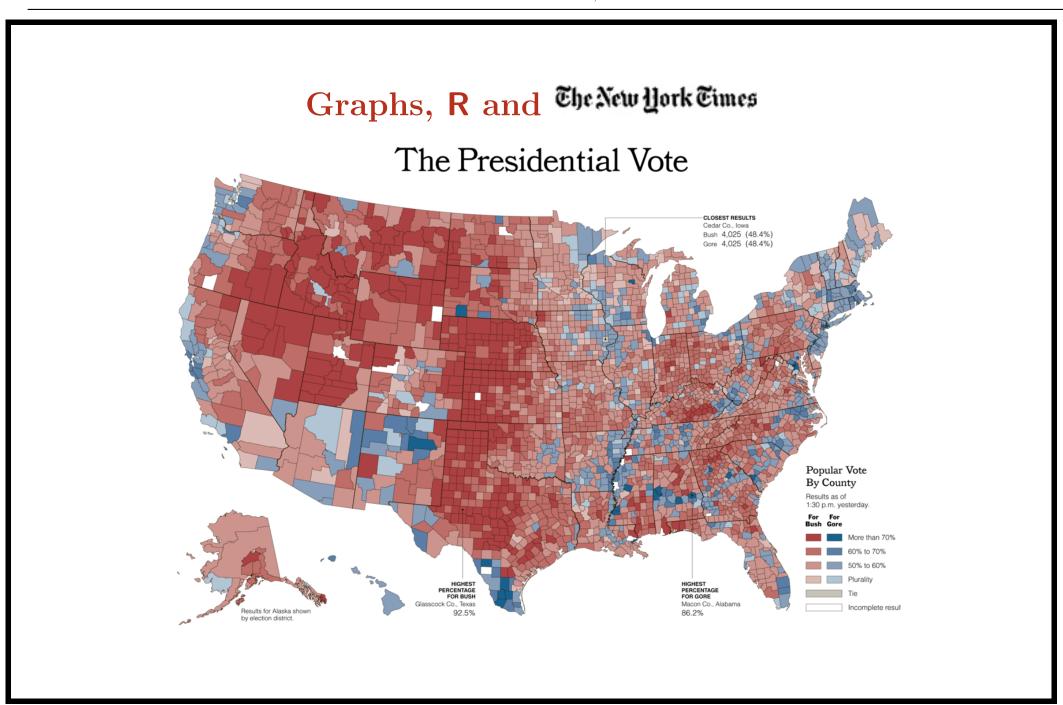


^{*} Virginia is counted as unified Republican because its State Senate is tied and its tiebreaker, the lieutenant governor, is a Republican.

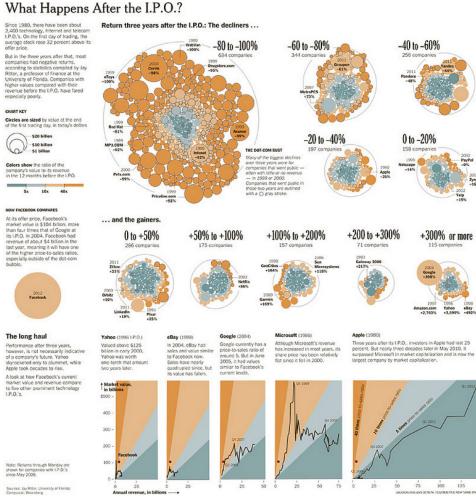
Source: National Conference of State Legislatures

THE NEW YORK TIMES

[†] Early results appeared to show that New York had unified Democratic control, but votes are still being counted in many races.



Graphs, R and The New york Times



Published: August 10, 2012











Passing Patterns of the U.S.'s Top Playmakers

Below, passing patterns from three U.S. players at every stage of the women's Olympic soccer tournament. In Thursday's gold medal match, the U.S. put pressure on Japan, hoping to cancel out its opponent's usual strong ball possession. Related Article »



ROUND ROBIN POOL vs. France U.S. Won, 4-2 vs. Colombia Won, 3-0

vs. North Korea Won, 1-0

QUARTERFINALS vs. New Zealand Won, 2-0

SEMIFINALS vs. Canada Won, 4-3 (OT)

FINAL vs. Japan Won, 2-1

Graphs in actuarial communication

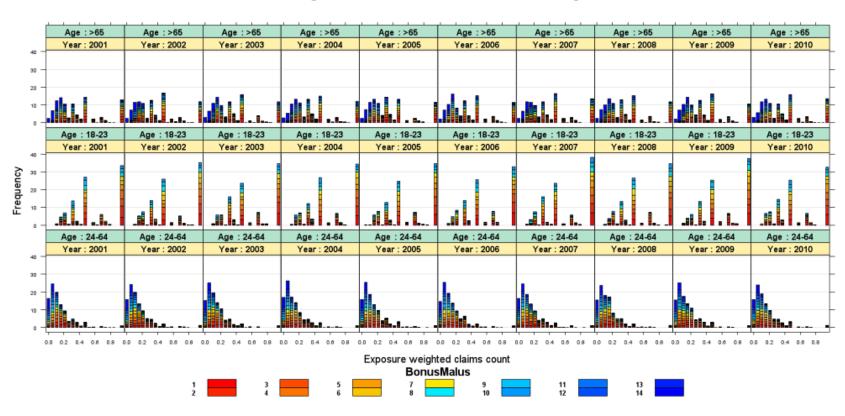
"Its not just about producing graphics for publication. Its about playing around and making a bunch of graphics that help you explore your data. This kind of graphical analysis is a really useful way to help you understand what youre dealing with, because if you cant see it, you cant really understand it. But when you start graphing it out, you can really see what youve got." Peter Aldhous, San Francisco bureau chief of New Scientist magazine.

"The commercial insurance underwriting process was rigorous but also quite subjective and based on intuition. R enables us to communicate our analytic results in appealing and innovative ways to non-technical audiences through rapid development lifecycles. R helps us show our clients how they can improve their processes and effectiveness by enabling our consultants to conduct analyses efficiently". John Lucker, team of advanced analytics professionals at Deloitte Consulting Principal.

see also Gelman (2011).

Graphs in actuarial communication

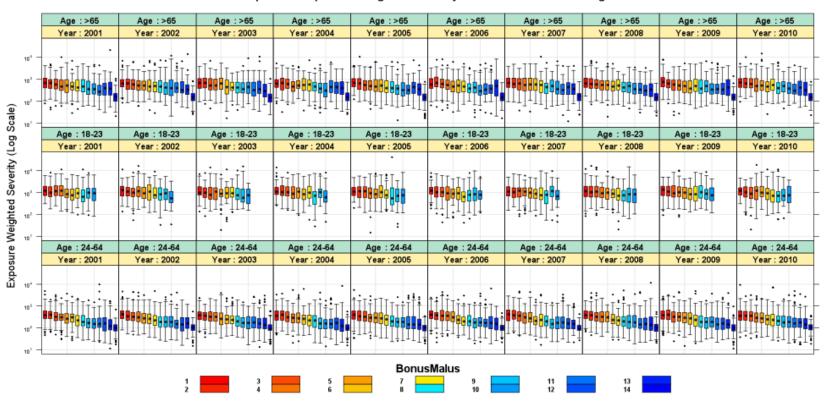
Histogram of claim counts with BonusMalus and Age



Source: http://www.londonr.org/Presentations/RInActuarialAnalysis.pptx, data from Kaas et al. (2001)

Graphs in actuarial communication

Boxplots of exposure weighted severity with BonusMalus and Age



Source: http://www.londonr.org/Presentations/RInActuarialAnalysis.pptx, data from Kaas et al. (2001)

Reproducibility issues

"Commonly research involving scientific computations are reproducible in principle, but not in practice. The published documents are merely the advertisement of scholarship whereas the computer programs, input data, parameter values, etc. embody the scholarship itself. Consequently authors are usually unable to reproduce their own work after a few months or years."

Schwab et al. (2000)

"The goal of reproducible research is to tie specific instructions to data analysis and experimental data so that scholarship can be recreated, better understood and verified."

Source: http://cran.open-source-solution.org/web/views/ReproducibleResearch.html

Reproducibility issues

Repeatability of published microarray gene expression analyses

John P A Ioannidis^{1–3}, David B Allison⁴, Catherine A Ball⁵, Issa Coulibaly⁴, Xiangqin Cui⁴, Aedín C Culhane^{6,7}, Mario Falchi^{8,9}, Cesare Furlanello¹⁰, Laurence Game¹¹, Giuseppe Jurman¹⁰, Jon Mangion¹¹, Tapan Mehta⁴, Michael Nitzberg⁵, Grier P Page^{4,12}, Enrico Petretto^{11,13} & Vera van Noort¹⁴

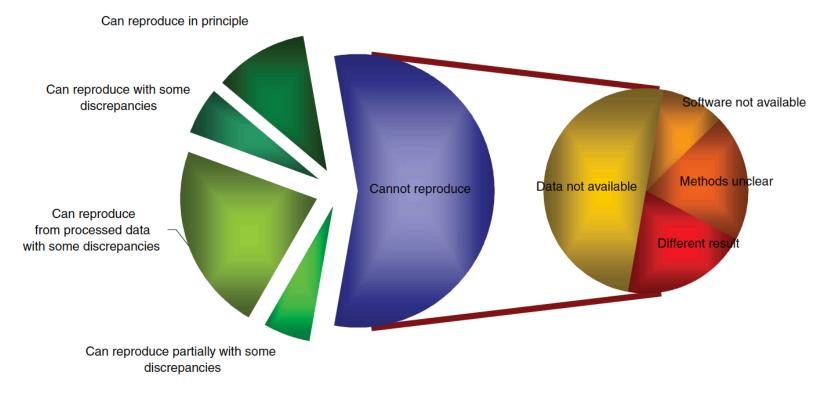


Figure 1 Summary of the efforts to replicate the published analyses.

R versus other (statistical) softwares

"The power of the language R lies with its functions for statistical modelling, data analysis and graphics; its ability to read and write data from various data sources; as well as the opportunity to embed R in excel or other languages like VBA. In the way SAS is good for data manipulations, R is superior for modelling and graphical output"

Source: http://www.actuaries.org.uk/system/files/documents/pdf/actuarial-toolkit.pdf

R versus other (statistical) softwares

SAS PC: \$6,000 per seat - server: \$28,000 per processor

Matlab \$2,150 (commercial)

Excel

SPSS SPSS \$ 4,975

EVIEWS \$ 1,075 (commercial)

RATS RATS \$ 500

Gauss -

STata

(S-PLUS® 6)

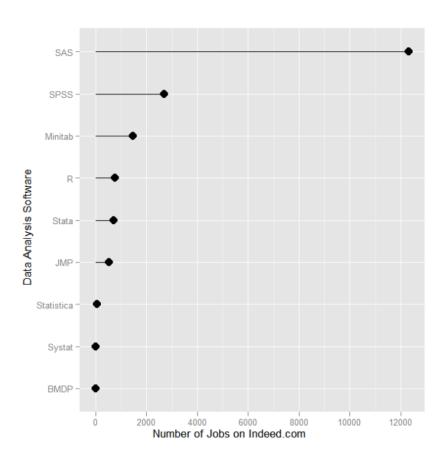
Stata \$1,195 (commercial)

S-Plus \$ 2,399 per year

Source: http://en.wikipedia.org/wiki/Comparison_of_statistical_packages

R in the non-academic world

What software skills are employers seeking?





From 2011, Asia Capital Reinsurance Group (ACR) uses R to Solve Big Data Challenges

Source: http://www.reuters.com/article/2011/07/21/idUS133061+21-Jul-2011+BW20110721



From 2011, Lloyd's uses motion charts created with R to provide analysis to investors.

Source: http://blog.revolutionanalytics.com/2011/07/r-visualizes-lloyds.html

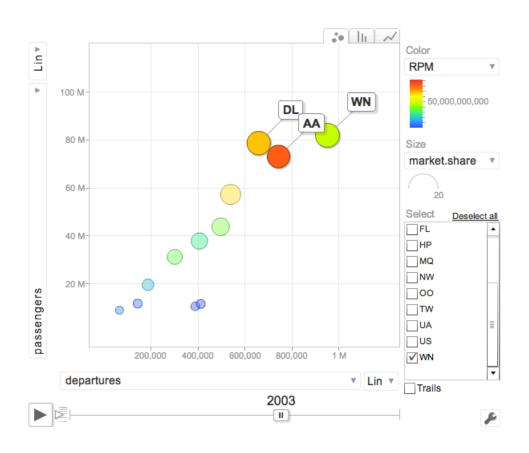


This tweet is longer than the R code in my blog post to make a Hans Rosling-style motion chart with googleVis.

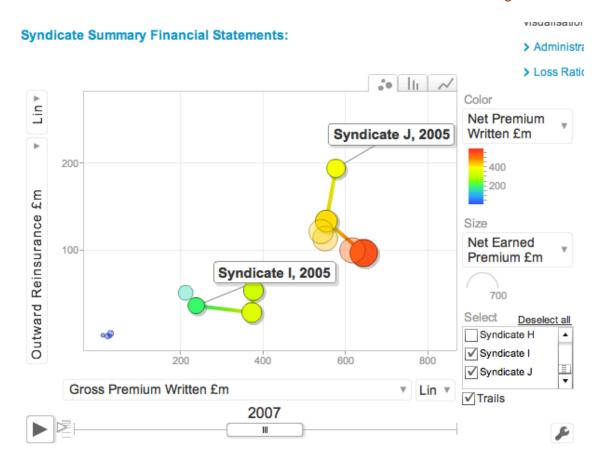
http://ow.ly/5F4Zl #rstats

4 hours ago via HootSuite 😭 Favorite 13 Retweet 👆 Reply

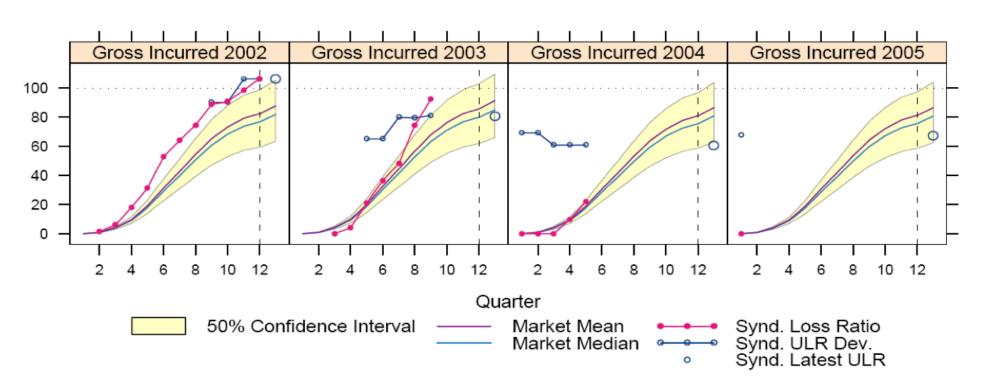
Source: http://www.revolutionanalytics.com/what-is-open-source-r/companies-using-r.php



Source: http://jeffreybreen.wordpress.com/2011/07/14/r-one-liners-googlevis/



 $\textbf{Source}: \ \mathsf{http://jeffreybreen.wordpress.com/2011/07/14/r-one-liners-googlevis/normalised of the property of the propert$



Source: http://lamages.blogspot.ca/2011/09/r-and-insurance.html, i.e. Markus Gesmann's blog

Popularity of R versus other languages

as at January 2013,

Transparent Language Popularity TIOBE Programming Community Index

1.	C	17.780%
	_	

- 2. Java 15.031%
- 8. Python 4.409%
- 12. R 1.183%
- 22. Matlab 0.627%
- 27. SAS 0.530%

1. C 17.855%

- 2. Java 17.417%
- 7. Visual Basic 4.749%
- 8. Python 4.749%
- 17. Matlab 0.641%
- 23. SAS 0.571%
- 26. R 0.444%

Source: http://lang-index.sourceforge.net/
Source: http://www.tiobe.com/index.php/

Popularity of R versus other languages

as at January 2013, tags

7	
	stackoverflow

C++ 399,323

Java 348,418

Python 154,647

R 21,818

Matlab 14,580

SAS 899

Cross	Validated

R 3,008

Matlab 210

SAS 187

Stata 153

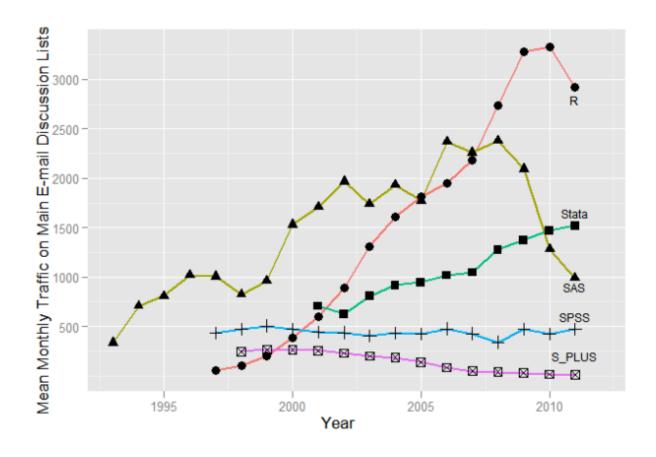
Java 26

 $\textbf{Source}: \texttt{http://stackoverflow.com/tags?tab=popular} \qquad \textbf{Source}: \texttt{http://www.tiobe.com/index.php/source}: \texttt$

```
mathematical-statistics
                    hypothesis-testing
                                             homework
         statistical-significance mean
                                                   probability
                                         distributions
            multiple-comparisons
                                                           standard-deviation
                     nonparametric
  correlation
                                                   binomial
         repeated-measures
                                       sampling
                                                         variance
                      experiment-design normal-distribution
          anova
                                                               confidence-interval
            factor-analysis
                                                    estimation
 mixed-model multivariate-analysis
                                                          bootstrap
                                          poisson
                                              maximum-likelihood
                                                              optimization
                      generalized-linear-model
                                                          matlab
                               data-transformation
                categorical-data
                                           data-mining
                                                              algorithms
                    multiple-regression
                                                   clustering
                                       modeling
                multilevel-analysis
                                                               neural-networks
                            model-selection
logistic-regression
                      logistic
                                             classification
                                    cross-validation
                                                      machine-learning
                         survival
                                             dataset text-mining
            bayesian
                                 predictive-models
                regression
                             time-series
                                       forecasting
```

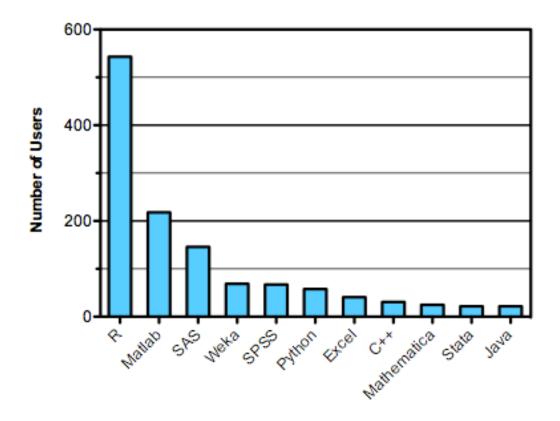
Source: http://meta.stats.stackexchange.com/questions/1467/tag-map-for-crossvalidated

Plot of listserv discussion traffic by year (through December 31, 2011)



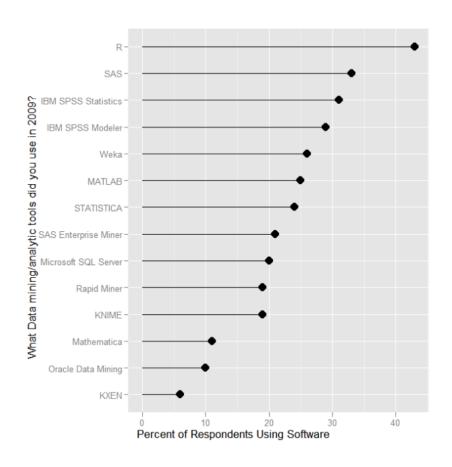
 $\textbf{Source} \,:\, \mathsf{http}://\mathsf{r4stats.com/articles/popularity}/$

Software used by competitors on Kaggle

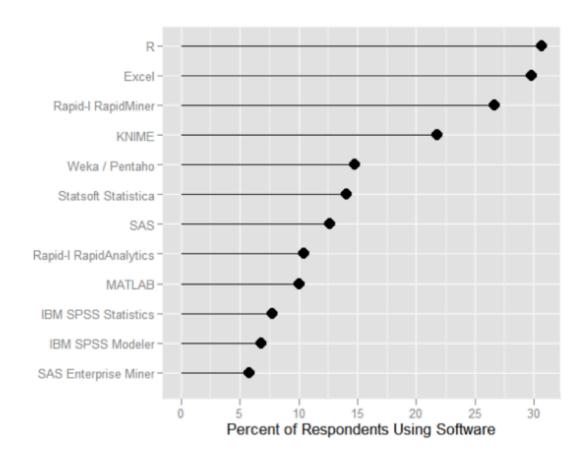


Source: http://r4stats.com/articles/popularity/ and http://www.kaggle.com/wiki/Software

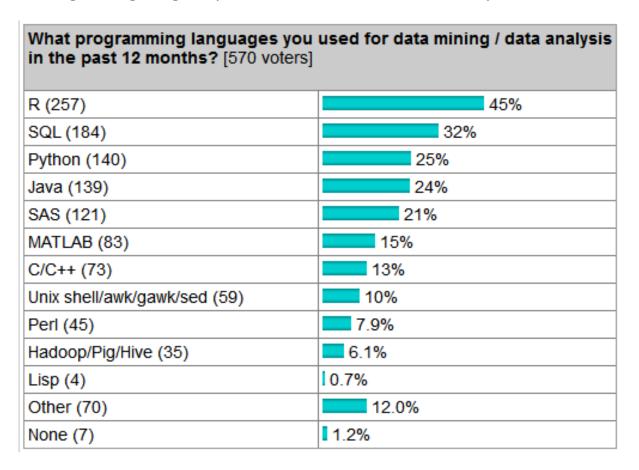
Data mining/analytic tools reported in use on Rexer Analytics survey, 2009.



"What programming languages you used for data analysis in the past 12 months?"

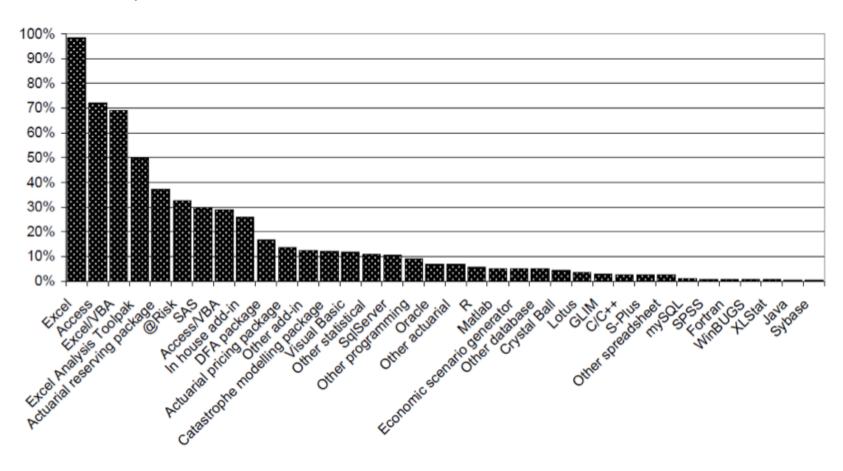


"What programming languages you used for data analysis?"



R versus other 'statistical' softwares, for actuaries

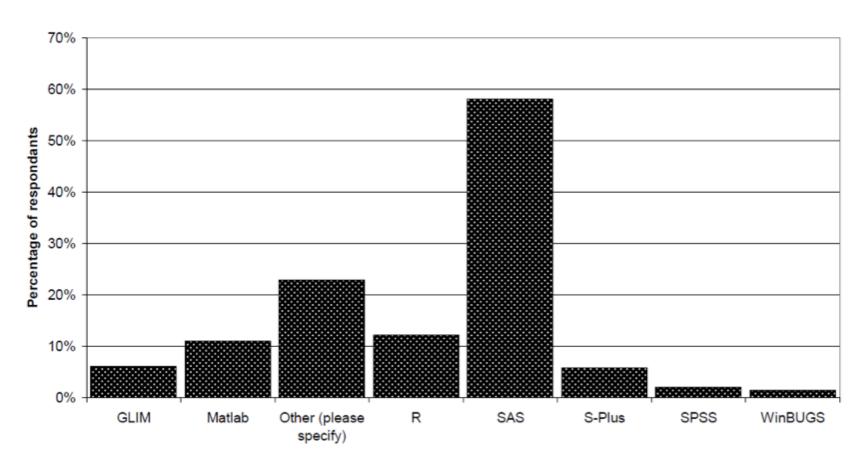
Softwares used by UK actuaries, and CAS actuaries



Source: : http://www.palisade.com/downloads/pdf/Pryor.pdf

R versus other statistical softwares, for actuaries

Statistical softwares used by UK actuaries, and CAS actuaries



Source: : http://www.palisade.com/downloads/pdf/Pryor.pdf

The R community, forums, blogs, books

"I can't think of any programming language that has such an incredible community of users. If you have a question, you can get it answered quickly by leaders in the field. That means very little downtime." Mike King, Quantitative Analyst, Bank of America.

"The most powerful reason for using R is the community" Glenn Meyers, in the Actuarial Review.

"The great beauty of R is that you can modify it to do all sorts of things. And you have a lot of prepackaged stuff thats already available, so youre standing on the shoulders of giants", Hal Varian, chief economist at Google.

Source: : http://www.nytimes.com/2009/01/07/technology/business-computing/07program.html

R

R news and tutorials contributed by 425 R bloggers (as at Jan. 2013)

Source: : http://www.r-bloggers.com/

R versus other softwares used in actuarial science

SAS is a commercial software developed by the SAS Institute;

- it includes well-validated statistical algorithms,
- licensing is expensive
- new statistical methods might be incorporated only after a significant lag
- it includes data management tools, and is undertaken using row by row (observation-level) operations

(see Kleinman & Horton (2010) for more details)

Matlab better programming environment (e.g. better documentation, better debuggers, better object browser), can be without doing any programming. It is a commercial software, there are more integrated add-ons and more support (but one has to pay for it). R is stronger for statistic.

To define a vector, the common syntax is v=[0,1,2], then we use v(2).

Consider the smoothing function in Matlab,

```
[f,df,gcv,sse,penmat,y2cmat] = smooth_basis(argvals, y, fdparobj)
```

(see chapter 2 in Ramsay, Hooker & Graves (2009) for more details)

R is a free, open-source software, developed by R development core team, and people from the R community.

- programming environment for data analysis
- statisticians often release R functions to implement their work concurrently with publication
- R is a vector-based language, where columns (variables) are manipulated To define a vector, the common syntax is v=c(0,1,2), then we use v[2] Consider the smoothing function in Matlab,

```
smoothlist = smooth.basis(argvals, y, fdparobj)
```

i.e. the output is a single object (a list, the counterpart of struct objects in Matlab)

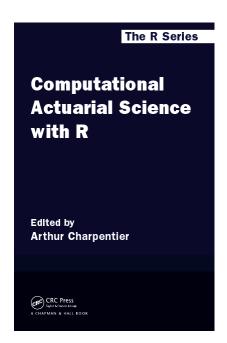
Take-home message

"The best thing about R is that it was developed by statisticians."

The worst thing about R is that it was developed by statisticians."

Bo Cowgill, Google





To go further...

forthcoming book on Computational Actuarial Science