

Xavier Capdepon - Data Scientist

Bio:

Master in Urban Engineering (Hydraulic & Fluid mechanics) Master in Corporate Finance Actuarial Candidate ASA/CAS (passed 2 exams)

NYC Data Science Fellow: Bootcamp #2 – June to August 2015
R, Python, Data Mining, Machine Learning, Hadoop, Spark
Portfolio of 5 projects in Python, R, Spark and Machine learning

ACADEMY

Projects' blogs:

http://blog.nycdatascience.com/author/chabir/

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https://www.linkedin.com/in/564738960482746278596

Project Guidelines:

Time to delivery:

7 days initially (it took 13+ days including 1.5 days to install spark locally...)

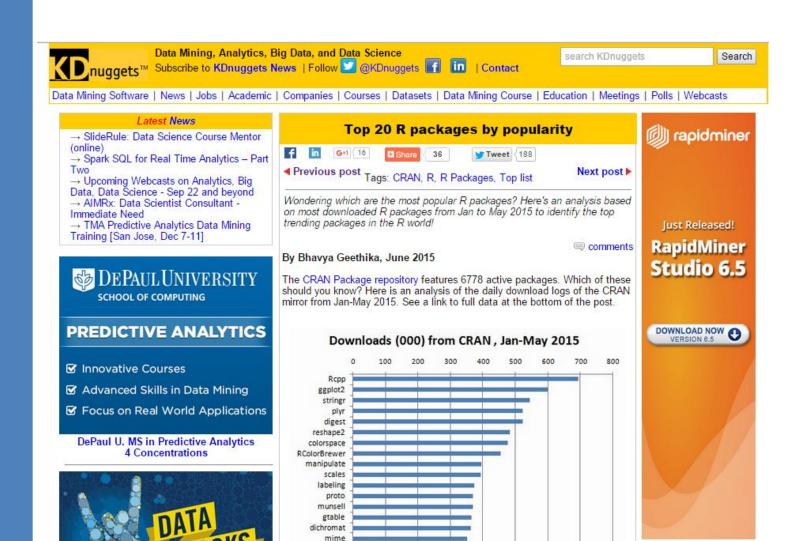
Advises:

"You need to deliver a visualization on the due date. You need to rescale your project accordingly."

"It is fine not to build the most efficient code as long as the code works."

"You need to have a story to tell with your visualization."

Jason, NYC Data Science Academy's Teacher



Origin of the project:

Source: http://www.kdnuggets.com/2015/06/top-20-r-packages.html

RCurl

The capabilities of R are extended through user-created packages, which, primarily, allow specialized statistical techniques and graphical devices.

Any R user is consistently downloading additional packages on its computer and these packages often depend on other packages that also need to be downloaded as a consequence of the targeted package.

```
RStudio
File Edit Code View
                   Plots Session
                               Build
                                     Debug Tools
Go to file/function
              Links × Nodes × Links001 ×
                                              Nodes001 ×
 network.R ×

☐ Source on Save Q / → ☐
       '#31a354','#74c476','#a1d99b','#c7e9c0','#756bb1','#9e9ac8','#bcbddc','#dadaeb'
      '#636363','#969696','#bdbdbd','#d9d9d9','#637939','#8ca252','#b5cf6b','#cedb9c
  40
       '#8c6d31','#bd9e39','#e7ba52', '#e7cb94'])
  41
            ...domain(d3.range(0,28))",bounded = TRUE)
  42
  43
      Links5001 = read.csv('./Matrix_Links5001',header=TRUE)
  44
      NodesS001 = read.csv('./Matrix_NodesS001',header=TRUE)
  45
  46
       (Top Level) $
  44:1
                                                                                 R Script 

 Console ~/nycdatascience/Dev/Spark/ 🖒
 trying URL 'https://cran.rstudio.com/bin/windows/contrib/3.2/mlearning_1.0-0.zip'
 Content type 'application/zip' length 72610 bytes (70 KB)
 downloaded 70 KB
 trying URL 'https://cran.rstudio.com/bin/windows/contrib/3.2/filehash_2.3.zip'
 Content type 'application/zip' length 267656 bytes (261 KB)
 downloaded 261 KB
trying URL 'https://cran.rstudio.com/bin/windows/contrib/3.2/zooimage_3.0-5.zip'
Content type 'application/zip' length 2579435 bytes (2.5 MB)
 downloaded 2.5 MB
 package 'numDeriv' successfully unpacked and MD5 sums checked
 package 'lava' successfully unpacked and MD5 sums checked
package 'prodlim' successfully unpacked and MD5 sums checked
package 'svGUI' successfully unpacked and MD5 sums checked
 package 'ipred' successfully unpacked and MD5 sums checked
package 'syMisc' successfully unpacked and MD5 sums checked
 package 'svDialogs' successfully unpacked and MD5 sums checked
 package 'mlearning' successfully unpacked and MD5 sums checked
package 'filehash' successfully unpacked and MD5 sums checked
package 'zooimage' successfully unpacked and MD5 sums checked
The downloaded binary packages are in
        C:\Users\Owner\AppData\Local\Temp\RtmpktvvP2\downloaded_packages
```



CRAN package download logs

These log files contain all hits to http://cran.rstudio.com/ related to packages. The raw log files have been parsed into CSV a

Daily package downloads

- Oct 2012: 2012-10-01, 2012-10-02, 2012-10-03, 2012-10-04, 2012-10-05, 2012-10-06, 2012-10-07, 2012-10-08, 201
 15, 2012-10-16, 2012-10-17, 2012-10-18, 2012-10-19, 2012-10-20, 2012-10-21, 2012-10-22, 2012-10-23, 2012-10-2
 2012-10-31
- Nov 2012: 2012-11-01, 2012-11-02, 2012-11-03, 2012-11-04, 2012-11-05, 2012-11-06, 2012-11-07, 2012-11-08, 2012-11-16, 2012-11-17, 2012-11-18, 2012-11-19, 2012-11-20, 2012-11-21, 2012-11-22, 2012-11-23, 2012-11-2
- Dec 2012: 2012-12-01, 2012-12-02, 2012-12-03, 2012-12-04, 2012-12-05, 2012-12-06, 2012-12-07, 2012-12-08, 201
 15, 2012-12-16, 2012-12-17, 2012-12-18, 2012-12-19, 2012-12-20, 2012-12-21, 2012-12-22, 2012-12-23, 2012-12-2
 2012-12-31
- Jan 2013: 2013-01-01, 2013-01-02, 2013-01-03, 2013-01-04, 2013-01-05, 2013-01-06, 2013-01-07, 2013-01-08, 201
 15, 2013-01-16, 2013-01-17, 2013-01-18, 2013-01-19, 2013-01-20, 2013-01-21, 2013-01-22, 2013-01-23, 2013-01-2
 2013-01-31
- Feb 2013: 2013-02-01, 2013-02-02, 2013-02-03, 2013-02-04, 2013-02-05, 2013-02-06, 2013-02-07, 2013-02-08, 201
 15, 2013-02-16, 2013-02-17, 2013-02-18, 2013-02-19, 2013-02-20, 2013-02-21, 2013-02-22, 2013-02-23, 2013-02-2
- Mar 2013: 2013-03-01, 2013-03-02, 2013-03-03, 2013-03-04, 2013-03-05, 2013-03-06, 2013-03-07, 2013-03-08, 2013-03-16, 2013-03-17, 2013-03-18, 2013-03-19, 2013-03-20, 2013-03-21, 2013-03-22, 2013-03-23, 2013-03-22, 2013-03-23
- Apr 2013: 2013-04-01, 2013-04-02, 2013-04-03, 2013-04-04, 2013-04-05, 2013-04-06, 2013-04-07, 2013-04-08, 201
 15, 2013-04-16, 2013-04-17, 2013-04-18, 2013-04-19, 2013-04-20, 2013-04-21, 2013-04-22, 2013-04-23, 2013-04-2
- May 2013: 2013-05-01, 2013-05-02, 2013-05-03, 2013-05-04, 2013-05-05, 2013-05-06, 2013-05-07, 2013-05-08, 20 15, 2013-05-16, 2013-05-17, 2013-05-18, 2013-05-19, 2013-05-20, 2013-05-21, 2013-05-22, 2013-05-23, 2013-05-2 2013-05-31

Package download logs:

Source: http://cran-logs.rstudio.com/

Log Processing using the depend/import matrix

Extract relevant information from package download logs

Log Screen:

```
In [122]:
          import gzip
          with gzip.open('data/2012-10-03.csv.gz', 'rb') as f:
              log_content = pd.read_csv(f)
```

In [123]: log_content[:10]

Out[123]:

	date	time	size	r_version	r_arch	r_os	package	version	country	ip_id
0	2012-10-03	01:51:54	167303	2.15.1	x86_64	linux-gnu	formatR	0.6	US	1
1	2012-10-03	01:51:54	435497	2.15.1	x86_64	linux-gnu	knitr	0.8	US	1
2	2012-10-03	01:51:53	11150	2.15.1	x86_64	linux-gnu	evaluate	0.4.2	US	1
3	2012-10-03	01:23:01	4977	2.14.1	x86_64	linux-gnu	knn	1.1	US	2
4	2012-10-03	07:41:05	337101	2.15.1	x86_64	linux-gnu	colorspace	1.1-1	US	3
5	2012-10-03	07:40:41	574454	2.15.1	x86_64	linux-gnu	Hmisc	3.9-3	US	3
6	2012-10-03	07:39:59	364811	2.15.1	x86_64	linux-gnu	lattice	0.20-10	US	3
7	2012-10-03	07:37:43	2094445	2.15.1	x86_64	linux-gnu	mosaic	0.6-2	US	3
8	2012-10-03	07:41:05	712307	2.15.1	x86_64	linux-gnu	vcd	1.2-13	US	3
9	2012-10-03	07:42:10	325683	2.15.1	x86_64	linux-gnu	abd	0.2-4	US	3

Proposed methodology:

```
a. IP_ID[k] downloaded the packages {a, b, c, d, e, f} during a period of 24 hours
```

```
b. It happens that package "b" depends on {c, d, e, g}
```

```
=> IP_ID[k] downloaded the <u>"root"</u> packages: {a, b}
```

Then,

```
c. aggregate all "root" packages: {..., (a,b), ...}
```

d. Analysis of the list of root packages to determine the most downloaded ones:

```
Counter({a: k1, b:k2, ...}
```



Α3

Available CRAN Packages By Name

<u>ABCDEFGHIJKLMNOPQRSTUVWXYZ</u>

Cran website:

7000+ packages

Webscraping using Python and Spark

CRAN
Mirrors
What's new?
Task Views

Task Views Search

About R

R Homepage The R Journal

Software
R Sources
R Binaries
Packages
Other

Documentation
Manuals

FAQs Contributed Predictive Models

<u>abbyyR</u> Access to Abbyy Optical Character Recognition

(OCR) API

<u>abc</u> Tools for Approximate Bayesian Computation (ABC)

<u>ABCanalysis</u> Computed ABC Analysis

abc.data Data Only: Tools for Approximate Bayesian

Computation (ABC)

abcdeFBA ABCDE FBA: A-Biologist-Can-Do-Everything of

Flux Balance Analysis with this package

Accurate, Adaptable, and Accessible Error Metrics for

ABCoptim Implementation of Artificial Bee Colony (ABC)

Optimization

<u>abcrf</u> Approximate Bayesian Computation via Random

Forests

<u>abctools</u> Tools for ABC Analyses

 abd
 The Analysis of Biological Data

 abf2
 Load Gap-Free Axon ABF2 Files

 abind
 Combine Multidimensional Arrays

<u>abn</u> Data Modelling with Additive Bayesian Networks <u>abundant</u> Abundant regression and high-dimensional principal

fitted components

acc Processes Accelerometer Data

<u>accelerometry</u> Functions for Processing Minute-to-Minute

Accelerometer Data

<u>AcceptanceSampling</u> Creation and Evaluation of Acceptance Sampling

Source: https://cran.r-project.org/web/packages/available_packages_by_name.html

ggplot2: An Implementation of the Grammar of Graphics

An implementation of the grammar of graphics in R. It combines the advantages of both base and lattice graphics; conditioning and shared axes are handled automatically, and you can still build up a plot ster. implements a sophisticated multidimensional conditioning system and a consistent interface to map data to aesthetic attributes. See http://ggplot2.org for more information, documentation and examples.

Version: 1.0.1

Depends: R (> 2.14), stats, methods

Imports: plyr ($\geq 1.7.1$), digest, grid, gtable ($\geq 0.1.1$), reshape2, scales ($\geq 0.2.3$), proto, MASS quantreg, Hmisc, mapproj, maps, hexbin, maptools, multcomp, nlme, testthat, knitr, mgcv Suggests:

Enhances:

2015-03-17 Published:

Author: Hadley Wickham [aut, cre], Winston Chang [aut] Hadley Wickham <h.wickham at gmail.com> Maintainer: https://github.com/hadley/ggplot2/issues BugReports:

GPL-2 License:

URL: http://ggplot2.org, https://github.com/hadley/ggplot2

NeedsCompilation: no

Citation: ggplot2 citation info Materials: README NEWS In views: Graphics, Phylogenetics

CRAN checks: ggplot2 results

Downloadsi

ggplot2.pdf Reference manual:

Contributing to ggplot2 development Vignettes:

ggplot2 release process ggplot2 1.0.1.tar.gz

r-devel: ggplot2 1.0.1.zip, r-release: ggplot2 1.0.1.zip, r-oldrel: ggplot2 1.0.1.zip Windows binaries:

OS X Snow Leopard binaries: r-release: ggplot2 1.0.1.tgz, r-oldrel: ggplot2 1.0.1.tgz

OS X Mavericks binaries: r-release: ggplot2 1.0.1.tgz

ggplot2 archive Old sources:

Reverse dependencies:

Package source:

Reverse depends: alphahull, AmpliconDuo, acristic, apsimr, argas, bde, benchmark, biomod2, bootnet, brms, caret, catenary, chemosensors, CINOEDV, cjoint, ClimClass, climwin, clustrd, coefplot, confor Deducer, DepthProc, dfexplore, diffeR, dMod, dotwhisker, dslice, dtwclust, DynNom, earlywarnings, eeptools, ESGtoolkit, fbroc, fishmove, frequarcoord, gapmap, GenCAT, gettingtoth ggswissmaps, ggtern, ggthemes, GOplot, gpmap, granovaGG, gsDesign, GSE, Hmisc, hyperSpec, idm, ifaTools, interplot, learnstats, likeLTD, likert, lmms, localgauss, Isbclust, MCMC.C meteogRam, MissingDataGUI, MIXFIM, mixOmics, mlr, mlxR, mosaic, MRMR, multilevelPSA, ncappc, NeatMap, mullabor, orgR, OriGen, OutbreakTools, PairedData, PASWR2, paw pequod, perry, perspectev, PhaseType, pid, pipe, design, pitchRx, PKgraph, PKreport, pointRes, PopED, popgraph, PPtreeViz, precintcon, prevR, PRISMA, profileR, ProgGUInR, PSAb radiant, RAM, randomizeR, Rcell, RomdrPlugin, KMggplot2, rfPermute, RGraphics, RIGHT, RJafroc, rms, robustHD, rorutadis, rotations, rplos, RSA, RSDA, rstan, Rz, SciencesPo, sea SmarterPoland, SMF15, snht, soc.ca, sparkTable, SparseFactorAnalysis, sparsereg, spcosa, spikeSlabGAM, spoccutils, sprm, statebins, SWMPr, synthpop, tcR, tdr, timeline, TriMatch, Tr varian, vdg, waffle, walkr, xkcd, zooaRch

Reverse imports:

ACDm, adegenet, alm, ANOM, antitrust, asremlPlus, asVPC, BACA, backShift, bamdit, BBEST, bcrm, bdscale, bdvis, BioStatR, blowtorch, bmmix, breakpoint, broman, BTSPAS, capit choroplethr, choroplethr. Admin1, classify, classyfire, clhs, clifro, CommT, complmrob, confidence, cooccur, cosmoPhotoz, cplm, cutoffR, dcmr, DescribeDisplay, DFIT, diveRsi dynsury, EasyHTMLReport, EcoGenetics, edgar, EffectLiteR, ega, egcm, emil, EpiDynamics, erer, evolog, extracat, ez, ezsim, FAOSTAT, fheatmap, FinCal, forestFloor, fSRM, G2Sd ggenealogy, ggExtra, ggparallel, ggRandomForests, ggsubplot, gitter, glycanr, googlesheets, GraphPCA, greport, growcurves, growfunctions, hierarchicalDS, HighDimOut, HistDAWass, InformationValue, Integrated/M, intsvy, kdetrees, kobe, Idatuning, Ilama, ImerTest, LocFDRPois, Isl, mapDK, marked, marketeR, marmap, MAVIS, MaxentVariableSelection, merTools microbenchmark, micromap, mizer, Mobilize, morse, multiDimBio, MultiMeta, myTAI, netgen, networkreporting, NeuralNetTools, ngramr, NMF, NORRRM, oaxaca, OpasnetUtils, opti partialAR, patPRO, performanceEstimation, plot2groups, PlotPrjNetworks, plotROC, pmc, pogit, PopGenReport, poppr, predictmeans, PReMiuM, pRF, primerTree, proteomics, pscore, c rAltmetric, randomUniformForest, rbison, rddtools, RDS, refund, refund shiny, repijson, repra, reproducer, rfigshare, rfisheries, RFmarkerDetector, rgbif, rinat, rnoaa, RobustEM, robust rvertnet, rWBclimate, rwirelesscom, saeSim, SCGLR, scmamp, sdmvspecies, SemiParBIVProbit, SensMixed, SeqFeatR, sgd, shinystan, sidier, simPH, SimReg, SixSigma, siPlot, smoof, stem, structSSI, strvalidator, survMisc, SurvRank, sValues, TcGSA, tigerstats, TreatmentSelection, treeclim, treemap, TSMining, tvm, UpSetR, USAboundaries, vdmR, viridis, vmsbase,

Reverse suggests: abctools, abd, archetypes, archivist, ARPobservation, automap, bbmle, BCEA, bcp, binom, biogas, biogram, BlandAltmanLeh, broom, cate, cda, checkmate, choroplethrMaps, chron, clere cycleRtools, days, data table, days, days, data table, days, days,

Source: https://cran.r-project.org/web/packages/ggplot2/index.html

Programming in 3 steps:

- 1. Build Matrix of dependencies
- 2. Download all logs
- 3. Process all records to extract the "root" packages

Numbers associated with this project:

- 1. 7055 packages => 7055 webpages to scrap
- 2. Dependency matrix: $7055 \times 7055 => 49 + Million$ elements to determine
- 3. 150 days of package log to download for a size of 2.5 GB
- 4. Every log is about 300,000 lines x 10 columns
 - => 45+ Million line items to process

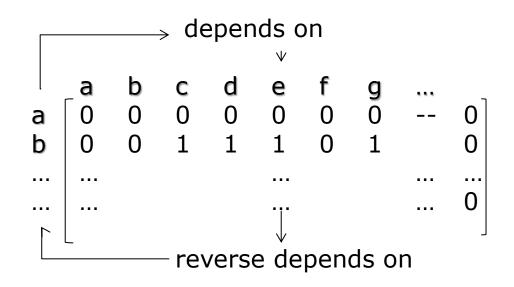
1. Script steps:

- A. List of all packages
- B. Build 2x Dictionaries: index -> name & name-> index: reduce memory and file size
- C. Web-scraping & Regular expression to grab the "depends", "imports", "reverse depends", "reverse imports" information
- D. Dependency matrix construction

How does the matrix construction works?

- 1. Package "a" doesn't depends on any other packages
- 2. Package "b" depends on packages {c, d, e, g}

Matrix Size: 7055x7055



2. "Sparse Matrix":

Simplification of the matrix construction: "Sparse Matrix"

- 1. Package "a" doesn't depends on any other packages
- 2. Package "b" depends on packages {c, d, e, g}

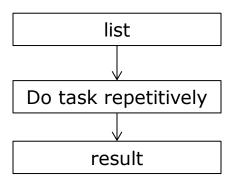
```
## dummy matrix (index(a) = 0, index(b)=1)
rows = [1,1,1,1,...,n] #sources
cols = [2,3,4,6,...,k] #targets
data = [1,1,1,1,...,1]
```

Sparse Matrix is not a mathematical concept but a computer science concept for matrix where most of the element are zeros.

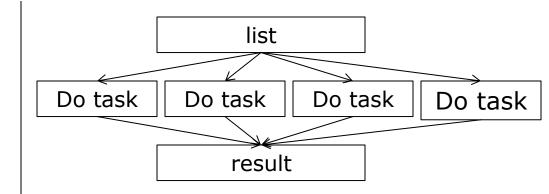
```
# Build a full matrix using coo_matrix scipy package
from scipy.sparse import coo_matrix
Full_matrix = coo_matrix((data, (row, col)), shape=(7055, 7055)).toarray()
#Retrieve the dependant packages index:
col_index = set(Full_matrix[1704].nonzero()[0])
```

3. Python versus Spark

<u>Basic concept of</u> <u>Python vs Python + Spark:</u>



for k in list: do task



```
list_RDD = sc.parallelize(list)
result =
list_RDD.map(task_fct).collect()
```

4. Results

Matrix construction by web-scraping of the 7,055 pages:

- Size of "depends" dependancy matrix: 14,196 elements
- Size of "reverse" dependancy matrix: 14,458 elements
 - > sparse matrix length: 28,654 elements
 - > coo_matrix
 - >>> sparse matrix final: 14,435 elements

Time to process:

- 40 min on Spark on the .82 server with 7 processors after 11pm
- Calculated approx. 8 hours with my personal computer

5. Findings:

A. 3 Most dependent R packages:

Vmsbase: GUI Tools to Process, Analyze and Plot Fishe	ries Data 27
PopGenReport: A Simple Framework to Analyse Popula	ation
Genetic Data	23
RAM: R for Amplicon-Sequencing-Based Microbial-Ecolo	gy 23
	(depends on # packages)

B. 3 most reverse dependent R packages:

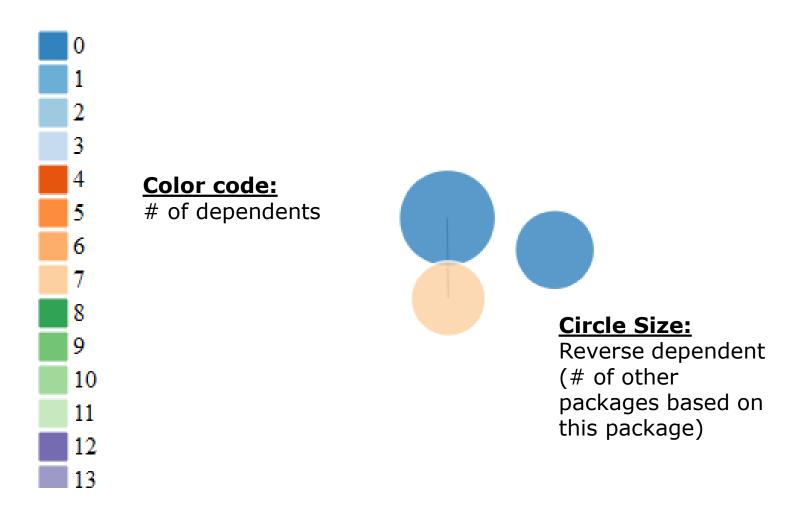
MASS: Support Functions and Datasets for Venables and Ripley's	
Modern Applied Statistic with S	679
Rcpp: Seamless R and C++ Integration	416
ggplot2: An Implementation of the Grammar of Graphics	351

(# other packages depends this package)

C. Longest path between R packages:

12 packages

6. Visualization

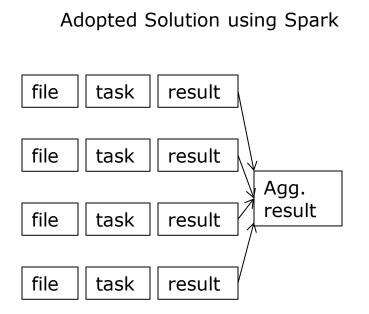


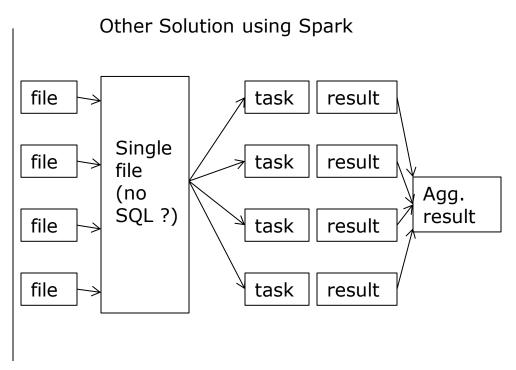
Visualization in R networkD3 library (modification of color panel in Java script)

```
In [ ]:
       # Before running, update url log full paths file.
       ### FINAL SCRIPT FOR SPARK TO DOWNLOAD LOG FILES
       #from pyspark import SparkContext
       #sc = SparkContext(master='local[7]', appName = 'learnSpark')
       import numpy as np
       from bs4 import BeautifulSoup
       import requests
       import re
       import csv
       # fonction to download and save the log files / ready for parallelisation:
       import urllib
       def download log(url log):
           path with log name = './data/'+ re.sub('(http:\/\/cran-logs.rstudio.com\/[0-9]+\/)','',url log)
           urllib.urlretrieve(url_log, path_with_log_name)
       url_log_full_paths = [line.strip() for line in open("url_log_full_paths.txt", 'r')]
       print 'Spark started'
       doc log= sc.parallelize(url log full paths[1003:1007]) #1004:1054
       doc log.map(download log).collect()
       print 'Spark finished'
```

1. Process the logs

- 1. Construct a unique ID = IP+Date
- 2. List all packages downloaded by unique ID
- 3. Save "root" packages by using the dependency matrix





2. Results

Jan to May 2015:

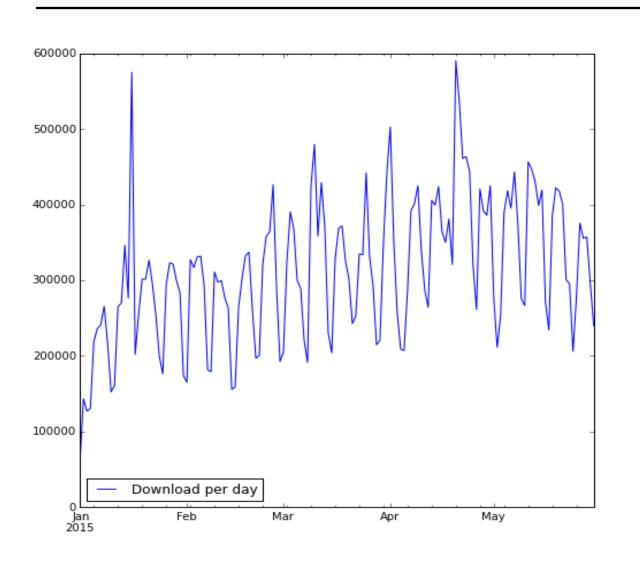
- 46,944,117 lines items to process
- Took 5 to 9 hours using Spark 10 cpu overnight

Results:

- "Root" package list: 18,716,714 (100MB)

Trick: all scripts are processed and are saving result using the package indexes to reduce file sizes and process time.

3. Finding #1: Download per day



Note:

Y2012 logs contains about 100 downloads / day

Vs

Y2015 logs contains about 300,000 downloads / day

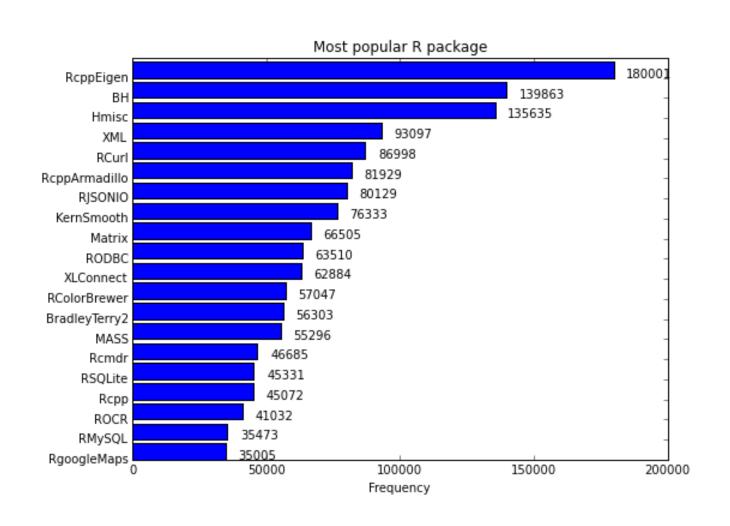
3. Finding #2: "CRAC" package

"CRAC", Cosmology R Analysis Code Package, developed by our excellent teacher Jason (Jiayi Liu).

The "CRAC" has been downloaded 1,423 times between January and May 2015

"CRAC" is ranked 1,170th according to the present methodology.

4. The most popular R packages



Script Testing is really time consuming !!

The testing took much more time than anticipated because:

- The CRAN website is updated every night (the package count changes by +/- 20 per day)
- The package authors have a tendency to increase the number of package functionalities by increasing the package dependencies.

Skepticism about my methodology:

- I used only $1^{\rm st}$ degree of dependency: I shall redo the calculation by increasing the degree of dependency.
- Time difference between the R "day time" and foreign R users
 inaccuracy of the unique ID (day+IP)
- Old package in the logs are not referenced anymore by the Cran website