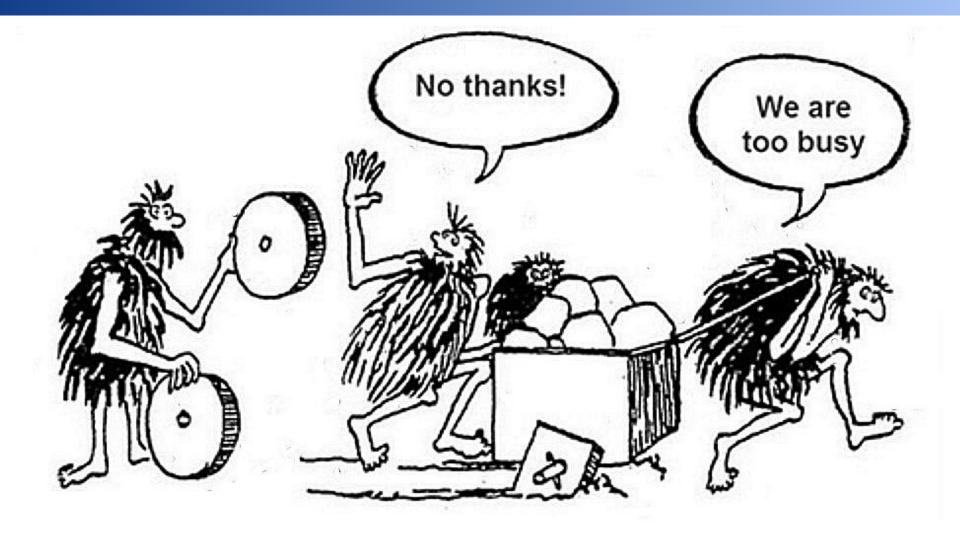
# Collaborating at Scale: Managing an Enterprise Analytical Computing Ecosystem

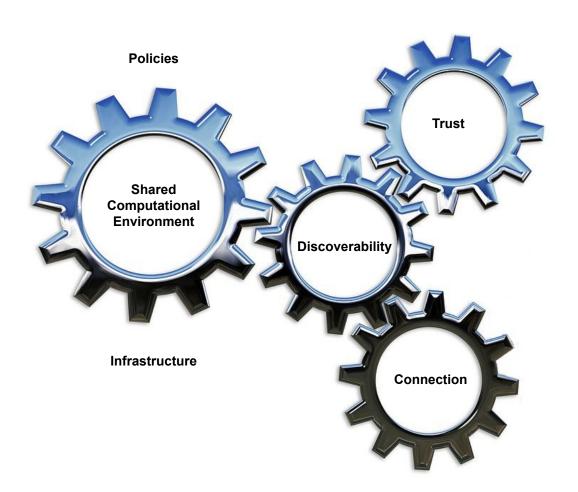
R/Pharma
August 22, 2019
Rena Yang

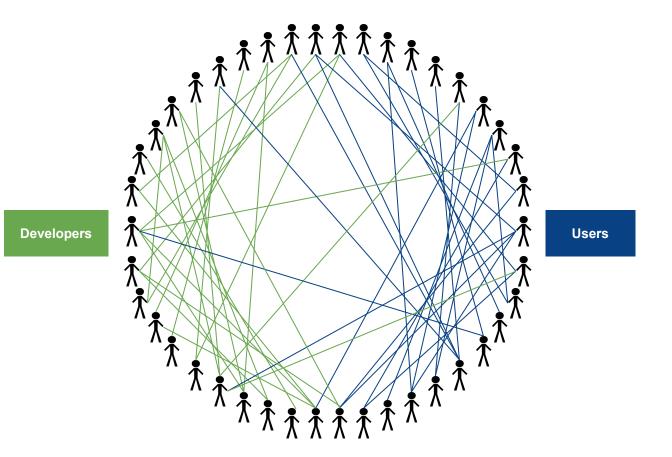


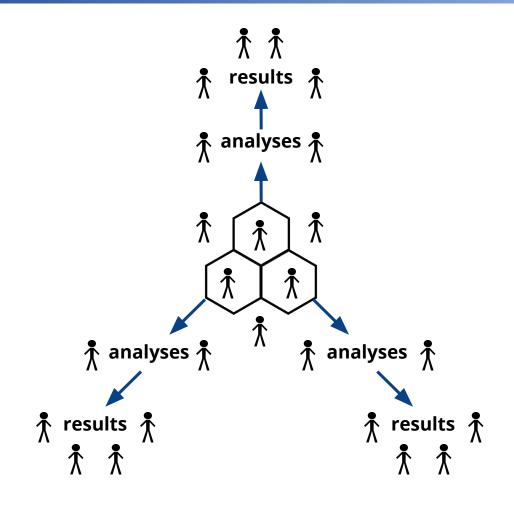












#### **Building Blocks**

- Package Publishing Portal
  - Helps users and developers to discover functionality
- Development Hub
  - Provides transparency to build trust
- > Shared, Unified Analytical Computing Environments
  - Increases trust that functionality will work together
  - Facilitates collaboration around results
- User Analytics Data
  - Connects package developers with users
  - Connects users who share common tools and interests

#### **Publication Portal**

# Publication Portal

Package Landing Page Package Documentation



#### **Publication Portal**

#### **Build details**

Show 10 ¢ entries								Search:	
Package Name ↓≟	Last Attempt Version	Last Attempt Status	Last Attempt Date	Last Built Version	Last Built Status	Last Built Date	Maintainer ↓↑	Coverage	Build † History ↓↑
ExpressionPlotCorePages	0.33.7	up-to-date	2019-08- 20 19:46:35	0.33.4	check warning(s)	2019- 05-25 20:22:11	Ball testing the trade process	89.7 %	Build log
ExpressionPlotGenomicPlots	0.2.10	up-to-date	2019-08- 20 19:46:35	0.2.10	check warning(s)	2019- 04-19 12:22:59	The Court of the C	81.95 %	Build log
ExpressionPlotGenotype	0.1.32	up-to-date	2019-08- 20 19:46:35	0.1.32	check warning(s)	2019- 04-19 12:22:59	Ball Tradition Tradition Reprint core	68.73 %	Build log
ExpressionPlotHttpRequest	0.1.7	up-to-date	2019-08- 20 19:46:35	0.1.7	check warning(s)	2019- 04-19 12:22:59	The field of the latest and	85.91 %	Build log
ExpressionPlotImportHTqPCR	0.6.43	up-to-date	2019-08- 20 19:46:35	0.6.43	check warning(s)	2019- 04-19 12:22:59		96.45 %	Build log
ExpressionPlotImportMicroarray	1.2.77	up-to-date	2019-08- 20 19:46:35	1.2.77	check warning(s)	2019- 04-22 14:57:59	her had an increasing on on	92.89 %	Build log
ExpressionPlotImportRNASeq	0.99.120	up-to-date	2019-08- 20 19:46:35	0.99.120	check warning(s)	2019- 05-02 19:12:37		95.43 %	Build log
ExpressionPlotInstall	0.2.30	up-to-date	2019-08- 20 19:46:35	0.2.30	check warning(s)	2019- 05-16 21:22:38	1000	44.84 %	Build log
ExpressionPlotLoadAffy	0.1.2	up-to-date	2019-08- 20 19:46:35	0.1.2	check warning(s)	2019- 04-19 12:22:59	terrore terroriya ar	81.54 %	Build log
ExpressionPlotLoadAgilent	0.3.2	up-to-date	2019-08- 20 19:46:35	0.3.2	check note(s)	2019- 04-19 12:22:59	The residence of the second	84.31 %	Build log

#### **Package Landing Page**

#### gp.sa.diff: Testing for Differential Events over Lots of Features

Provides methods to test for differential events between samples in 'omics datasets containing many features. This includes differential expression for RNA-seq or microarray data, differential binding for ChIP-seq data, differential abundance for mass cytometry, differential interactions for Hi-C data, etc.

GRAN Release: GRANtst

Build status: check note(s)

Test Coverage: 93.65 %

Authors: Aaron Lun [cre, aut]

Maintainer: Aaron Lun luna@gene.com

#### Installation

To install this package, start R and enter:

source("http://restst.gene.com/gran/getGRAN-tst.R")

library(GRANtst)

install\_packages("gp.sa.diff", type="source")

#### **Details**

Package	gp.sa.diff
Version	0.99.27
Date	2019-08-13
Title	Testing for Differential Events over Lots of Features
Description	Provides methods to test for differential events between samples in 'omics datasets containing many features. This includes differential expression for RNA-seq or microarray data, differential binding for ChIP-seq data, differential abundance for mass cytometry, differential interactions for Hi-C data, etc.



#### **Package Documentation**

#### Package 'gp.sa.diff'

August 13, 2019

**Version** 0.99.27

Date 2019-08-13

Title Testing for Differential Events over Lots of Features

**Description** Provides methods to test for differential events between samples in 'omics datasets containing many features. This includes differential expression for RNA-seq or microarray data, differential binding for ChIP-seq data, differential abundance for mass cytometry, differential interactions for Hi-C data, etc.

License Genentech, Inc.

Depends SummarizedExperiment,

Imports methods, gp.sa.core, S4Vectors, limma, edgeR

**Suggests** stats, BiocStyle, BiocGenerics, airway, affy, arrays, testthat, knitr, rmarkdown, DESeq2

VignetteBuilder knitr

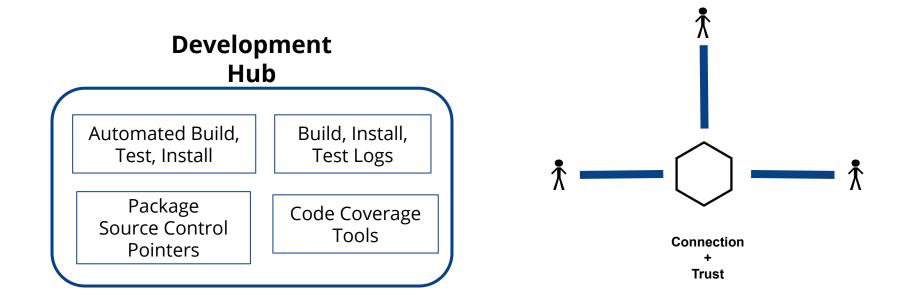
RoxygenNote 6.1.1

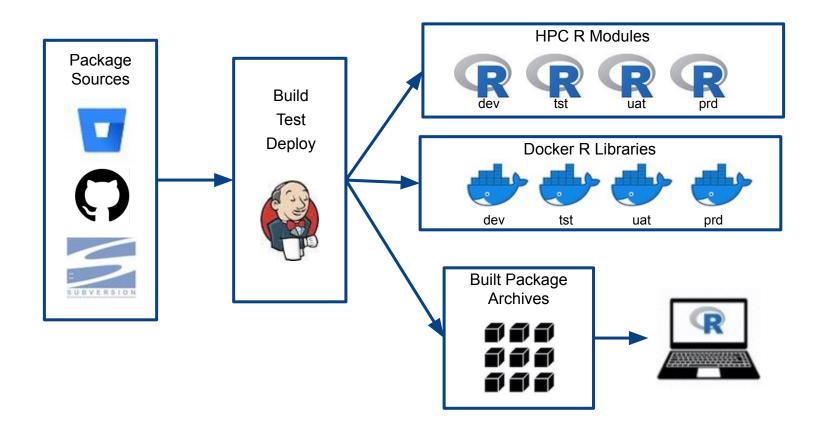
NeedsCompilation no

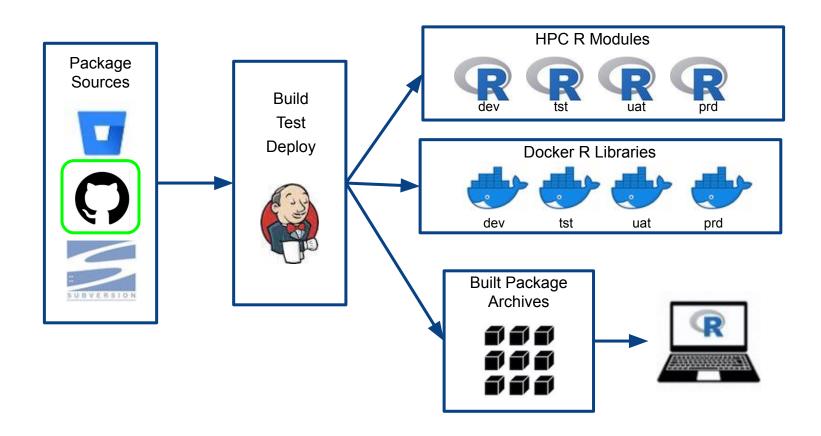
Author Aaron Lun [cre, aut]

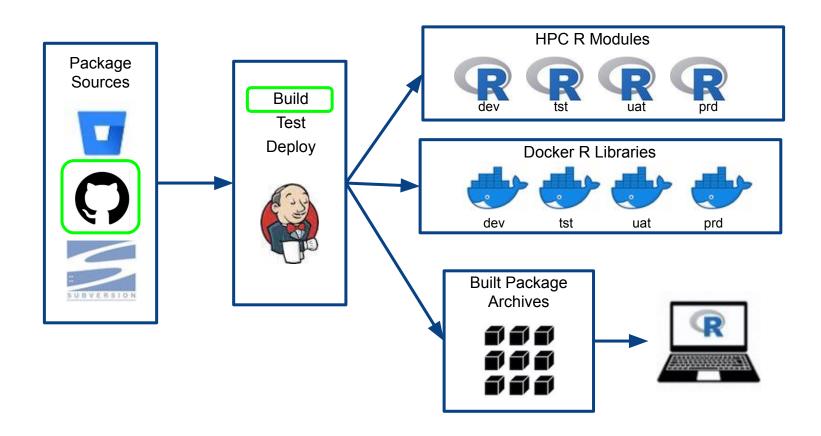
Maintainer Aaron Lun < luna@gene.com>

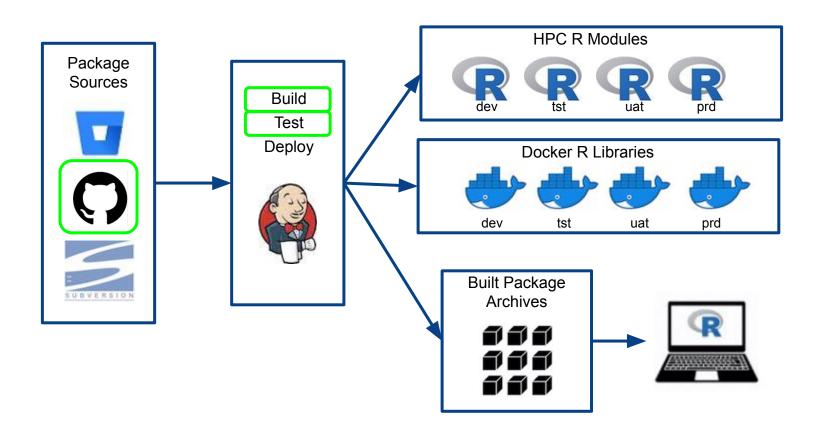
#### **Development Hub**

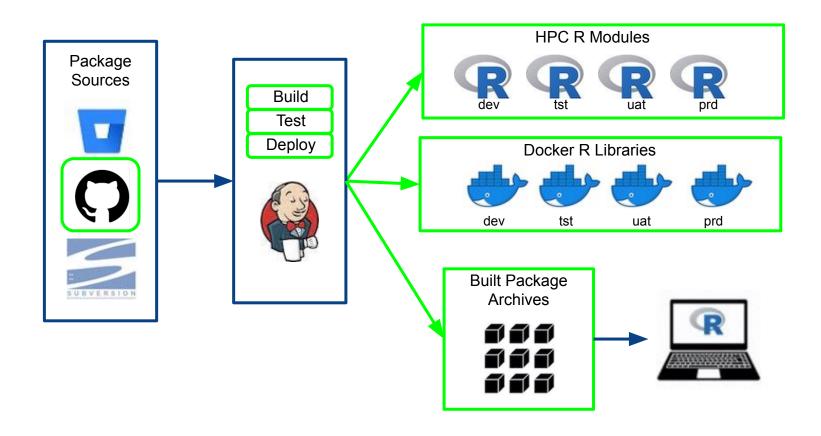


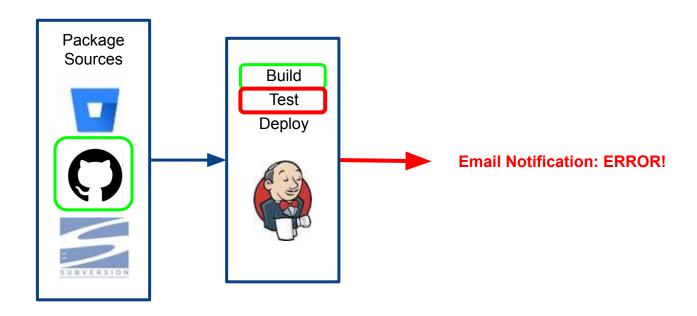












#### **Build, Test, Install Logs**

```
* checking installed package size ... OK
* checking package directory ... OK
* checking 'build' directory ... OK
* checking DESCRIPTION meta-information ... WARNING
Non-standard license specification:
  Genentech, Inc.
Standardizable: FALSE
* checking top-level files ... OK
* checking for left-over files ... OK
* checking index information ... OK
* checking package subdirectories ... OK
* checking R files for non-ASCII characters ... OK
* checking R files for syntax errors ... OK
* checking whether the package can be loaded ... OK
* checking whether the package can be loaded with stated dependencies ... OK
* checking whether the package can be unloaded cleanly ... OK
* checking whether the namespace can be loaded with stated dependencies ... OK
* checking whether the namespace can be unloaded cleanly ... OK
* checking loading without being on the library search path ... OK
* checking dependencies in R code ... OK
* checking S3 generic/method consistency ... OK
* checking replacement functions ... OK
* checking foreign function calls ... OK
* checking R code for possible problems ... OK
* checking Rd files ... OK
* checking Rd metadata ... OK
* checking Rd cross-references ... OK
* checking for missing documentation entries ... OK
* checking for code/documentation mismatches ... OK
* checking Rd \usage sections ... OK
* checking Rd contents ... OK
* checking for unstated dependencies in examples ... OK
* checking installed files from 'inst/doc' ... OK
* checking files in 'vignettes' ... OK
* checking examples ... OK
* checking for unstated dependencies in 'tests' ... OK
* checking tests ...
* checking for unstated dependencies in vignettes ... OK
* checking package vignettes in 'inst/doc' ... OK
* checking running R code from vignettes ...
   'userquide.Rmd' using 'UTF-8' ... OK
* checking re-building of vignette outputs ... SKIPPED
* checking PDF version of manual ... OK
* DONE
Status: 1 WARNING
```

#### **Package Source Control Pointers**

#### **Build manifest for GRANtst**

**‡** entries

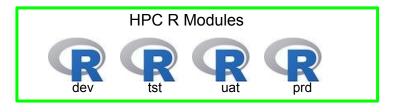
					Coulon
Package Name	ŢŢ	SCM Repo	SCM Type 11	Branch ↓↑	Package Subdirectory in SCM Repo
DataSetDB		ssh://git@====/bncb_r_packages/datasetdb.git	git	master	datasetdb
drusilla		ssh://git@/divos/drusilla.git	git	master	
DT.iTCGA		http://www.projects/iTCGA/trunk/plumbing/DT.iTCGA/	svn	trunk	
ecg		ssh://git@/bncb_r_packages/germlineecg.git	git	devel	ecg
EnsemblRest		https://gmbecker/EnsemblRest	git	master	
EPLog		ssh://git@/ep/r.git	git	devel	./packages/EPLog/
EventPredGnr		https://www.length.com/Rpackages/EventPredGnr.git	git	master	
eventTrack		https://windaman.com/rufiback/eventTrack.git	git	master	
ExpressionCore		ssh://git@/ep/r.git	git	devel	packages/ExpressionCore
ExpressionCoreDB		ssh://git@/ep/r.git	git	devel	packages/ExpressionCoreDB

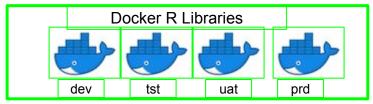
#### **Test Code Coverage**

#### ExpressionPlotImportRNASeq coverage - 95.43%

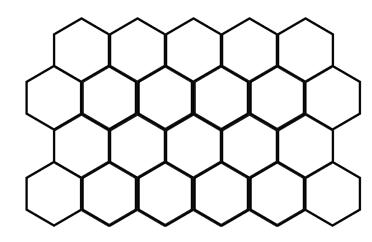
Files	Source							
	File	$\stackrel{\triangle}{\triangledown}$	Lines	Relevant	Covered	Missed	Hits / Line 🍦	Coverage
R/ep.ren	normalize.rnaseq.R		41	15	13	2	1	86.67%
R/add.d	ata.from.DESeqDataSet.R		283	71	64	7	909	90.14%
R/estima	ate.dispersions.R		89	32	29	3	75	90.62%
R/calcul	ate.mannwhitney.changes.R		201	78	71	7	138	91.03%
R/calcul	ate.rpkms.R		53	14	13	1	397	92.86%
R/norma	alize.R		108	48	45	3	168	93.75%
R/calculate.voomlimma.changes.R			321	111	106	5	190	95.50%
R/calculate.changes.for.sumexp.R			449	144	138	6	479	95.83%
R/ExpressionPlotProject.pileup.R			341	86	84	2	839	97.67%
R/add.comps.for.rnaseq.R			173	63	63	0	387	100.00%
R/add.data.from.cds.R			123	32	32	0	388	100.00%
R/analyze.cds.R			142	30	30	0	251	100.00%

#### **Shared Unified Computing Environments**

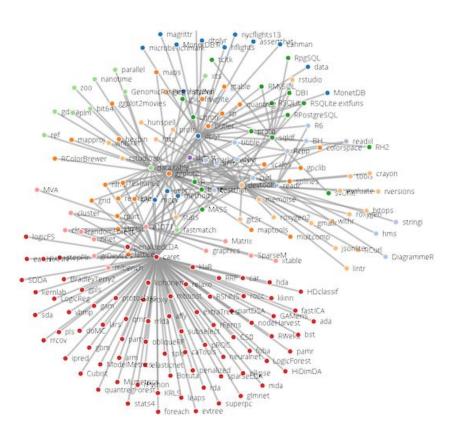




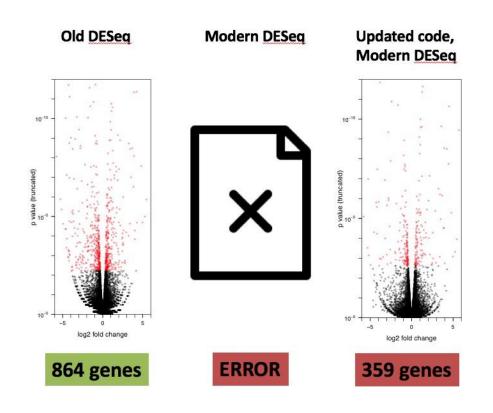




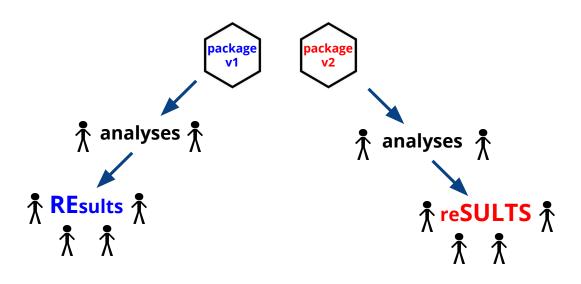
#### **Package Ecosystem**



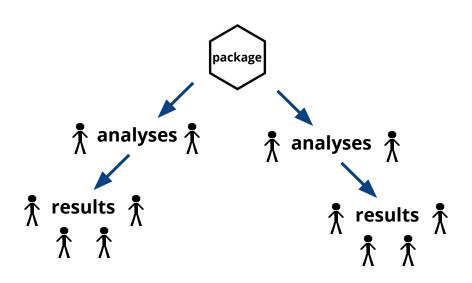
## **Comparability**



#### **Collaborating With Results**



#### **Collaborating With Results**



## **Collaborating With Results Through Time**

sessionInfo() +

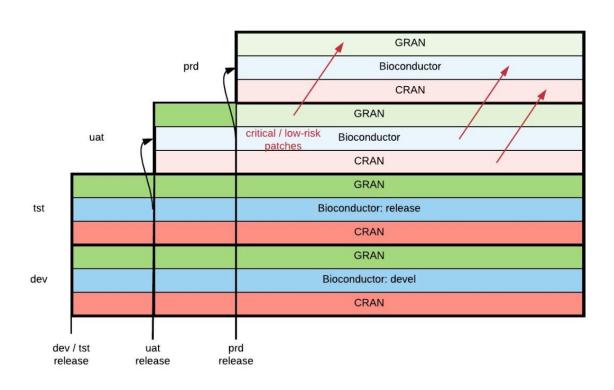




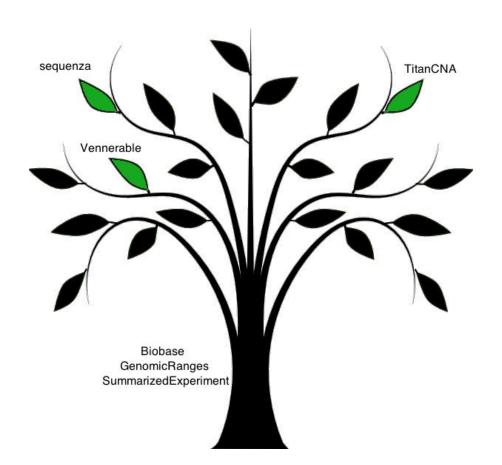
#### **Balance**



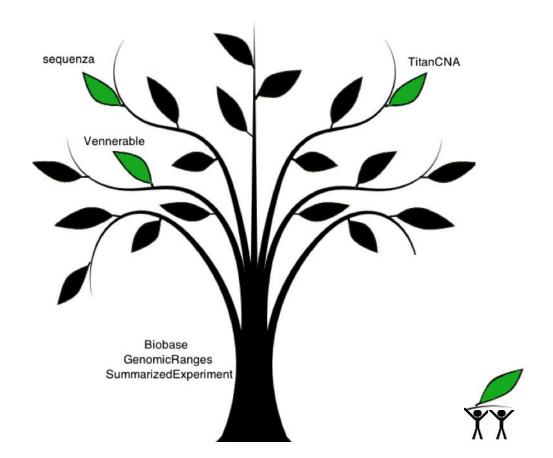
# **Bounding Risk**



#### **Leafy Update Policy for Production**



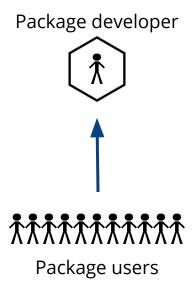
## **Leafy Update Policy for Production**

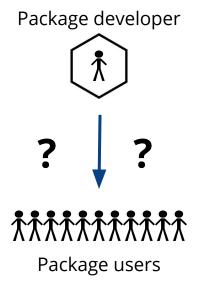




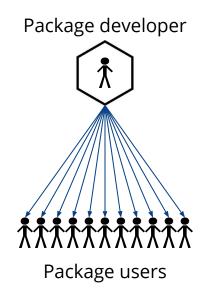
## **User Analytics**

datetime	user	host	R version	package	package version
2019-08-08 16:14:58	user1	host1	R-3.6.0-Bioc-3.9-prd	package1	1.1.11
2019-08-08 16:12:01	user	host1	R-3.6.0-Bioc-3.9-prd	package2	0.18.5
2019-08-06 07:29:33	user2	host2	R-3.6.0-Bioc-3.10-dev	package3	0.2.4





user	package
user1	mypackage
user2	mypackage
user3	mypackage







#### Frequently bought together



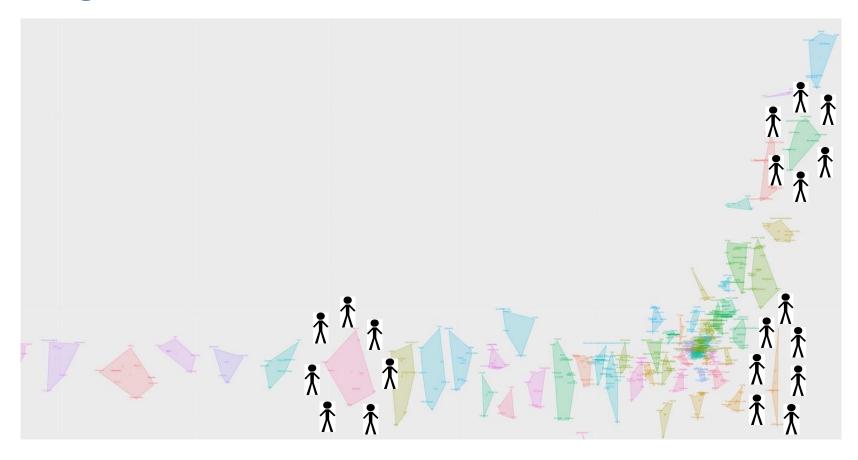
Total price: \$17.93

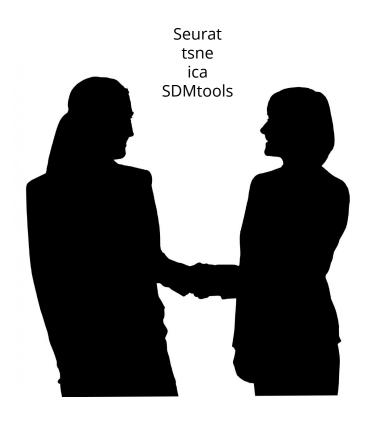
Add all three to Cart

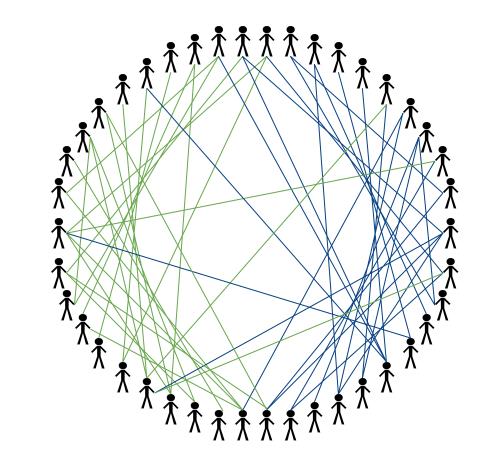
Add all three to List

Frequently loaded together

Seurat tsne ica SDMTools







#### **Acknowledgements**

- Michael Lawrence
- ➤ Gabe Becker
- Dinaker Kulkarni
- Henryk Poplawski
- Valerie Obenchain

- Betty Chou
- Jim Fitzgerald
- Allison Vuong
- Kiran Mukhyala
- Pete Haverty

# **Thank You!**