Cancer Genomics Cloud & R: Find, Access, and Analyze Petabyte-Scale Cancer Genomic Data on the Cloud

Nan Xiao Seven Bridges



TCGA IS A TREMENDOUS GIFT TO THE CANCER RESEARCH COMMUNITY ...



More than 11,000 cases representing 33 cancer types



UNDERSTANDING TCGA DATASET

- Multiple Samples per Case
- Multiple Analyses per Sample
- Rich metadata: barcodes, UUIDs, XMLs...



Nature Genetics 45, 1113-1120 (2013)





As the amount and diversity of data increases, it becomes more difficult to learn from them.





The CGC aims to provide a collaborative environment where researchers can take advantage of co-localized public data (like TCGA) and public tools; but also recombine these with their private data and tools.

sevenbridges is an R/Bioconductor package offering easier programmatic access to CGC.



supported platforms.

bioconductor.org		Ċ	D
		Search:	
Install	Help	Developers At	bout
		Documentation »	
years		 Package <u>vignettes</u> and man <u>Workflows</u> for learning and <u>Course and conference</u> man <u>Videos</u>. Community <u>resources</u> and <i>R</i> / <u>CRAN</u> packages and <u>document</u> 	inuals. d use. aterial. <u>tutorials</u> . <u>umentation</u>
uilder in R			
s Cloud to other Seven Bride	ges	Support » Please read the posting guide	e. Post

The sevenbridges package offers:

- Complete R API client for CGC/Seven Bridges API
- Common Workflow Language Tool Interface
- Task monitoring / Batch tasks support
- and many helper functions/utilities in R.



first commit tenafei committed on Dec 15, 2015

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2015



downloads top 20%

2017

PROJECT MANAGEMENT

	☐ cgc.sbgenomics.com Č						0 +
Projects - Data - Public Apps	Public projects 👻				A -	• • •	nanx 👻
demo-brca		Dashboard	Files Apps	Tasks Interact	tive Analysis	Settings	Notes
Description		Members				Email notific	cations
 Welcome to your new project! Projects are the core building blocks of the CGC Platform. Each distinct scientific investigation, serving as a container for its data results. Projects are shared only by designated project member Within your project, you can: Start exploring TCGA dataset straight away Install your tools on the CGC and create workflows Upload your own private data and analyze it along with TCC Collaborate securely with other researchers Please record the details of your project here, such as its aims any other ideas that you'd like to share with your project member of each pipeline execution you run on the CGC are leaged on the project member of each pipeline execution you run on the CGC are leaged on the pipeline execution you run on the CGC are leaged on the pipeline execution you run on the CGC are leaged on the pipeline execution you run on the CGC are leaged on the pipeline execution you run on the CGC are leaged on the pipeline execution you run on the CGC are leaged and the pipeline execution you run on the CGC are leaged and the pipeline execution you run on the CGC are leaged and the pipeline execution you run on the CGC are leaged and the pipeline execution you run on the CGC are leaged and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and an execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the CGC are leaded and the pipeline execution you run on the pipeline executio	ch project corresponds to a ita, analysis pipelines, and ers. GA data s, experimental context, and bers. Remember that details	Image: Name Composition of the provided and					
You can also use markdown here to add formatting to your note	tes.	Tasks		View all	Search		Q
Good luck with your research! If you get stuck, take a look at the The Seven Bridges CGC Team	he Knowledge Center	0/1 DESeq2 run - 01-13-17 15:17:35 Submitted by nanx · Jan. 13, 2017 10:18					

PROJECT MANAGEMENT VIA API

library("sevenbridges")

```
# Create Auth object
a = Auth(platform = "cgc", token = "your_token")
# List project and details
a$project(owner = "user")
a$project(detail = TRUE)
# Get billing group ID
bid = a$billing()$id
# Create new project
a$project_new("brca_test", bid,
              description = "BRCA Test")
# Add member to project
m = a$project(id = "demo/brca_test")$
     member_add(username = "new_user")
```

FIND DATA ON CGC

MORE THAN ONE PETABYTE OF TCGA DATA AT YOUR FINGERTIPS



Information NOT unique to an individual.

- de-identified clinical data
- gene expression data
- copy number alterations
- epigenetic data



Information that IS unique to an individual.

- primary sequencing data
- raw & processed SNP6 array data
- raw exon array data
- mutation calls for an individual





CGC DATA BROWSER

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• Query metadata

Add files to project



SPARQL QUERY

```
library("SPARQL")
query = "
prefix rdfs: <http://www.w3.org/2000/01/rdf-schema#>
prefix tcga: <https://www.sbgenomics.com/ontologies/2014/11/tcga#>
select distinct ?case ?sample ?file_name ?path ?xs_label ?subtype_label
where
 ?case a tcga:Case .
 ?case tcga:hasDiseaseType ?disease_type .
 ?disease_type rdfs:label 'Lung Adenocarcinoma' .
 • • •
qd = SPARQL(endpoint, query)
df = qd$results
head(df)
```

endpoint = "https://opensparql.sbgenomics.com/blazegraph/namespace/tcga_metadata_kb/sparql"

DATASETSAPI

```
term = list(
    "entity" = "cases",
    "hasSample" = list(
        "hasSampleType" = "Primary Tumor",
        "hasPortion" = list(
            "hasPortionNumber" = 11
        ),
    "hasNewTumorEvent" = list(
        "hasNewTumorAnatomicSite" = c("Liver", "Pancreas"),
        "hasNewTumorEventType" = list(
            "filter" = list(
                "contains" = "Recurrence"
a$api(path = "query", body = term, method = "POST")
```

ADD & ANNOTATE DATA

UPLOAD YOUR DATA

GGC Uploader (GUI)

- Command Line Uploader
- FTP / HTTP / S3 Volume
- API

Add files to Thyroid_tumor_normal

Public reference files	How to upload files from your com	nutar						
My files	now to upload mes nom your com	puter						
Import from	We offer a standalone uploading client as a convenient way computer to Cancer Genomics Cloud.							
Case Explorer and Data Browser	Cancer Genomics Cloud Uploader is a flexible, fast and set started and stopped at your convenience and accommodat	Cancer Genomics Cloud Uploader is a flexible, fast and secure client that installs on your local computer, can be started and stopped at your convenience and accommodates to a wide range of network topologies.						
My computer								
Cluster or workstation	Installing the unleader on Mac OS V			need it for Windows or				
FTP or HTTP server	Instailing the uploader on Mac OS X							
Projects	Note: Cancer Genomics Cloud Uploader works on OS X 10.4 or newer. If you have an older version of OS X, please use the command-line uploader instead.							
٩	1. Download	2. Install	3. Run					
▲ TCGA Braf_tumor_normal	Click the button below to download the installer. Double-	Drag and drop the Uploader icon to	Locate the Upload	ler in your Applications folder. Right-				
■ TCGA) testing_api	click the downloaded .dmg file to open it.	the Applications folder.	and select "Open"	', then "Open" again.				
test project	Cancer Genomics Cloud Uploader		FAVORITES					
TCGA fusion	Mac OS X		Applic	ations p 2 Corport Contractor				
● TCGA)QuickStart		Cancer Genomics Cloud Applications Uploader.app	Dovunice	Cloud Uploader.app				
opendata only	For more information on configuring and using the Uploade	er, please consult our User Guide.						



UPLOADA FILEVIA API

```
myfile = "file_path.fastq"
p = a$project(id = "demo/tcga-demo")
# Load `.meta` for the file by default
p$upload(myfile, overwrite = TRUE)
# Pass metadata manually
p$upload(myfile, overwrite = TRUE,
         metadata = list(library_id = "test_id",
                         platform = "Illumina x11"))
```

```
# Rename file
p$upload(myfile, overwrite = TRUE,
         metadata = list(library_id = "new_id")
         name = "sample_new_name.fastq")
```

UPLOAD FILES / FOLDERS

Upload a folder

dirpath = "path_to_dir" list.files(dirpath) p\$upload(dirpath, overwrite = TRUE)

Upload a list of files

dirpath = "path_to_dir" myfiles = list.files(dirpath, recursive = TRUE, full.names = TRUE) p\$upload(myfiles, overwrite = TRUE)

ANNOTATE FILES VIA API

```
# Locate a sample BAM file in project
p = a$project(id = "demo/tcga-demo")
fl = p$file("sample.bam", exact = TRUE)
```

```
# Show tags for single file
fl$tag()
```

```
# Add new tags
fl$add_tag("new year new tag")
```

```
# Set tags to overwrite existing
x = list("this", "is", 2017)
fl$set_tag(x)
```

```
# Set metadata
fl$meta()
fl$set_meta()
```

UPLOAD MANIFEST FILE (DEFINES METADATA OF FILES)

attach all metadata except "bad_field" and "sample_id"

p\$upload(manifest_file = "~/manifest.csv", overwrite = TRUE, subset = score < 0.5, <u>select</u> = -c(bad_field, sample_id))



ANALYZETHE DATA

Run an analysis immediately, with ~230 tools and workflows on the CGC today.



RUNNING ANALYSIS TASKS

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- Additio	nal metadata 🚱									

No files selected



DESeq2 analysis summary 🚱	No value
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Collected outputs 🚱	No value
DESeq2 analysis results 🚱	No value
A plot of dispersion estimates 🚱	No value

COPY APPS & RUNTASKS

```
# List public apps
a$app(visibility = "public")
# Copy an app to project
aid = a$public_app()[[1]]$id
a$copy_app(aid, project = pid, name = "new_app_name")
# Add & run new tasks
tsk = p$task_add(name
                            = "new_task",
                 description = "new task",
                            = "demo/tcga-demo/rna-seq-alignment-star/0",
                 app
                 inputs = list(...))
tsk$run()
tsk$abort()
```

RUNTASKS IN BATCH MODE

# Batch by items		
tsk = p\$ <mark>task_add</mark> (nam	ne =	"RN
des	scription =	"RN
app	b =	rna
bat	tch =	bat
inp	outs =	lis

# Batch by metadata		
<pre>tsk = p\$task_add(name</pre>	=	"RN
description	=	"RN
арр	=	rna
batch	=	bat

inputs = list(...))

```
A DE Report Batch 1",
A DE Analysis Report",
_app$id,
ch(input = "bamfiles"),
t(...))
```

CONTAINERS + CWL MAKES IT EASY TO PUT NEW TOOLS ON THE CGC... AND OTHER PLACES.





COMMON WORKFLOW LANGUAGE





reproducible computational workflows.

COMMON WORKFLOW LANGUAGE

Specification for describing scalable, portable and



FOR DEVELOPERS, THIS MEANS...

- Easier and faster to deploy your tools.
- Write once, runs everywhere, regardless of operating system/infrastructure.



CWLTOOL: INPUTS, OUTPUTS, AND PARAMETERS



"description": "Aligns reads to a reference"

"documentAuthor": "kaushikghose@sbgenomics.com",

reference (required) Reference bam reads (required) aligner test bam fastq



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WRITE CWL WITH WEB IDE

BUILD CWLTOOLS WITH R

GETTING STARTED

- Try sevenbridges package from Bioconductor
- docker pull sevenbridges/sevenbridges-r
- Pull requests: github.com/sbg/sevenbridges-r



DOCUMENTATION

https://sbg.github.io/sevenbridges-r/



sevenbridges

Reference

Articles N

Vignette reference version 1.5.5

All vignettes

- Complete Guide for Seven Bridges API R Client
- Describe and Execute CWL Tools/Workflows in R
- Master Tutorial: Use R for Cancer Genomics Cloud
- Find Data on CGC via Data Exploerer, SPARQL, and Datasets API
- Creating Your Docker Container and Command Line Interface (with docopt)
- IDE Container: RStudio Server, Shiny Server, and More

sbg.github.io	Ċ	0 +
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R Client lows in R mics Cloud PARQL, and Datasets API mmand Line Interface (with docop rver, and More

NEED MORE RESOURCES?

- in cloud computing & storage before |an 16:
- <u>https://datascience.nih.gov/commons</u>
- <u>https://www.commons-credit-portal.org/</u>

Apply to NIHCommons Credits Pilot for new opportunities



MORE ON CANCER GENOMICS CLOUD AND SEVEN BRIDGES PLATFORMS

www.cancergenomicscloud.org

www.sevenbridges.com/tcga

www.sevenbridges.com





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