

A clinical data mesh for quality improvement and research in healthcare

Mike Hogarth

MD, Clinical Research Information Officer, UC San Diego Health

Tom Covington

CEO of Tag.bio

Mark Mooney

VP Customer Success, Tag.bio

Agenda (50 minutes)

UCSD and Tag.bio history	15 min
What is a Data Mesh?	10 min
Nightingale demo	20 min
Q & A	5 min

UCSD

Mike Hogarth, MD, Clinical Research Information Officer, UC San Diego Health

The problem (use case) we are trying to solve

- Provide clinical data (protected health information - PHI) to UCSD biomedical researchers:
 - Securely
 - Swiftly
 - Simply
 - Standardized
 - Semantically consistent

Data (and analyses) should be FAIR.



Findable

"I know where all
our data is"



Accessible

"I can access any of
the data that I need"



Interoperable

"I use one language
for all my requests"



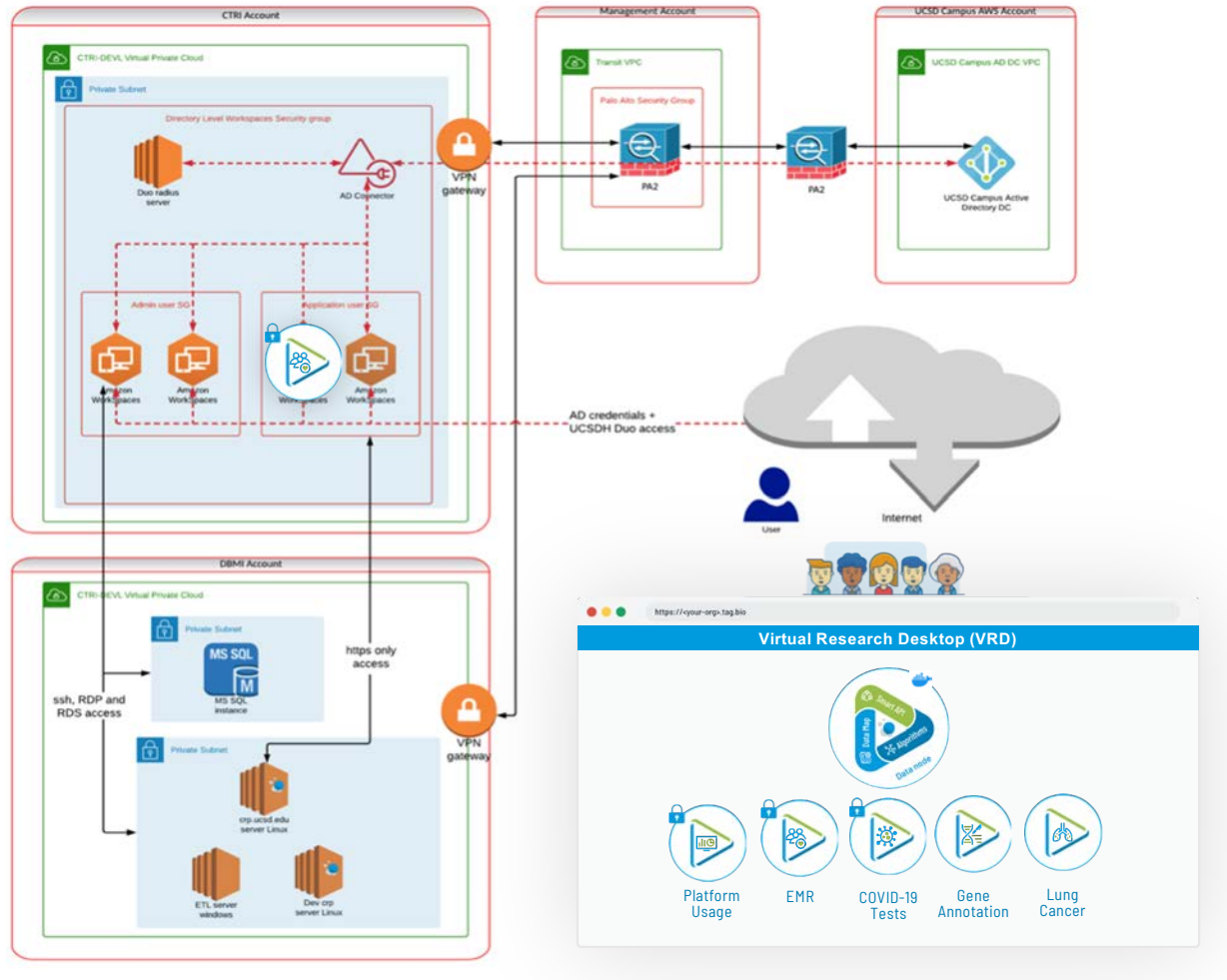
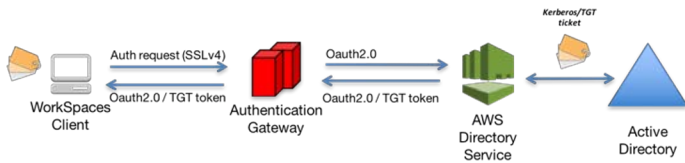
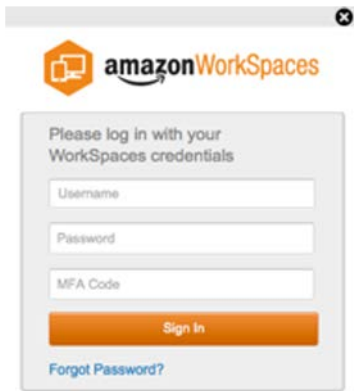
Reusable

"I use the existing data to
answer new questions"

UCSD Health Secure Research Cloud in AWS

- What is it?
 - Integrating **D**ata for **A**nalysis, anonymization, and **S**Haring (iDASH) - v2.0
 - A secure computing environment for sensitive data
 - HIPAA compliant
 - Health system CSO approved for use involving protected health information (PHI)
 - Includes virtual research desktops and VMs in a locked-down AWS VPC without the ability for users to connect to the “outside”
- Why we needed it
 - c2017 - EHR data (PHI) for research routinely given to investigators through a download -- some data ended up shared it with external entities without data use agreements, no visibility into the location/use of the data, the ADCS situation along with ~800 other AWS accounts by UCSD Health staff/faculty without visibility or controls

UCSD health secure research cloud with nodes in a VPC



THE VIRTUAL RESEARCH DESKTOP (VRD)

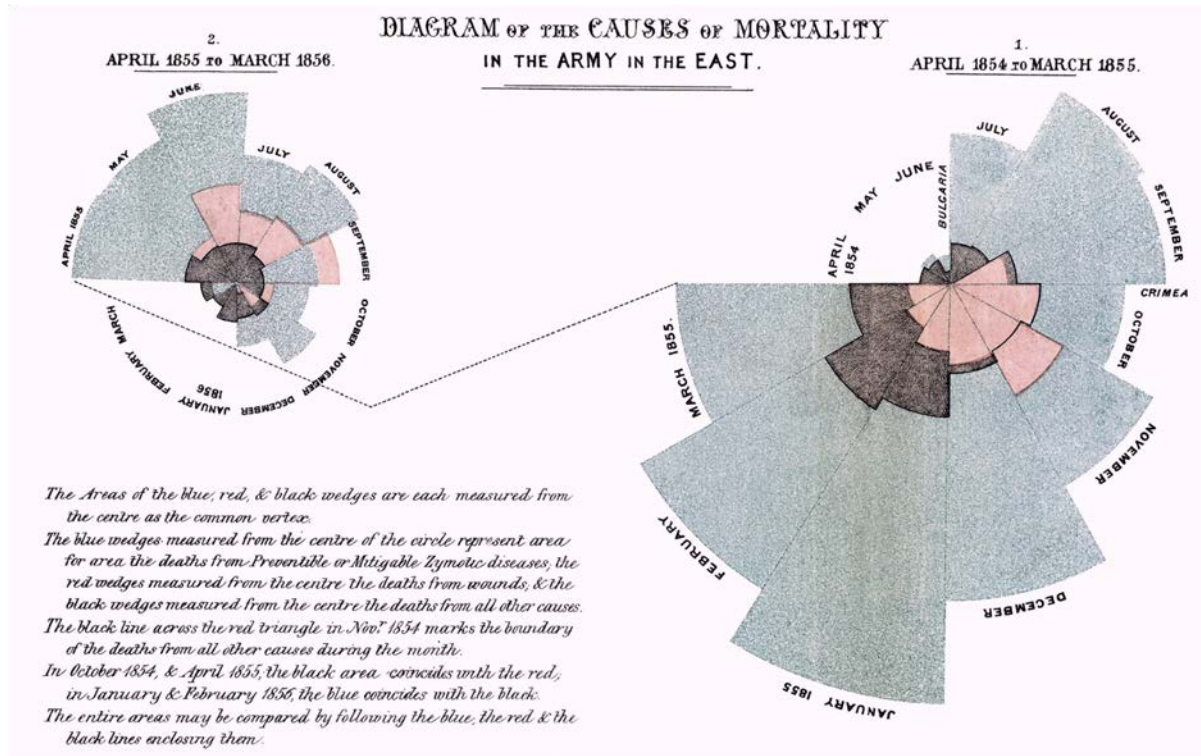
- It is a modified version of the Amazon Web Services (AWS) Windows 10 “Workspace” virtual machine
- Runs in the protected UCSDH Secure Cloud in AWS
 - in the AWS HIPAA environment
 - approved by UCSDH CSO for PHI
- Provisioned with:
 - SPSS
 - R/RStudio
 - Python/PyCharm
 - Java 8 JDK
 - Depending on approval, access to internal databases – ie, UC CORDS
 - tag.bio based access to available databases



UCSD Health Virtual Research Desktop



NIGHTINGALE



Florence Nightingale
OM RRC DStJ



Florence Nightingale, c. 1860

History

Tom Covington, CEO Tag.bio

How did the data mesh platform arise?

- Jesse Paquette (CSO Tag.bio) worked at UCSF Helen Diller, Family Comprehensive Cancer Center (2007-2010)
 - Working with Oncology researchers he realized that enabling them to answer their own questions would speed the turnaround time of question to answer
 - Created an initial software called EGAN (Exploratory Gene Association Networks)
 - Formed Tag.bio in 2014 with Tom Covington (CEO) and built first versions of what were then called Flux Capacitors or FC's but became data nodes.
 - Began projects with UCSF Med Center on billing, encounters and claims data in 2018.
 - Realized that the architecture we were working on was an implementation of a “data mesh” after reading Zhamak Dhegani’s article: [How to Move Beyond a Monolithic Data Lake to a Distributed Data Mesh](#)

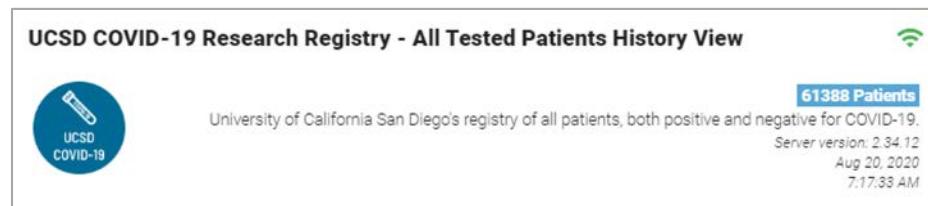
What's The History?

- In January 2020 met Tag.bio at Precision Medicine World Conference
 - Initial discussion about work with UCSF on value based healthcare.
 - Set up a visit to UCSD in February
 - Initiated research collaboration with Mike Hogarth in March



- The Pandemic

- Realized there was an immediate need to make [COVID data accessible](#)
- Built first COVID registries in April



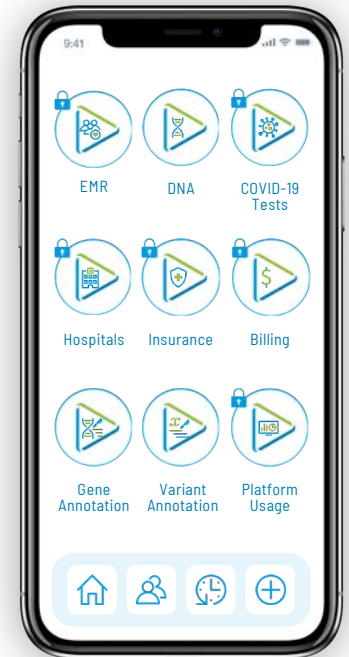
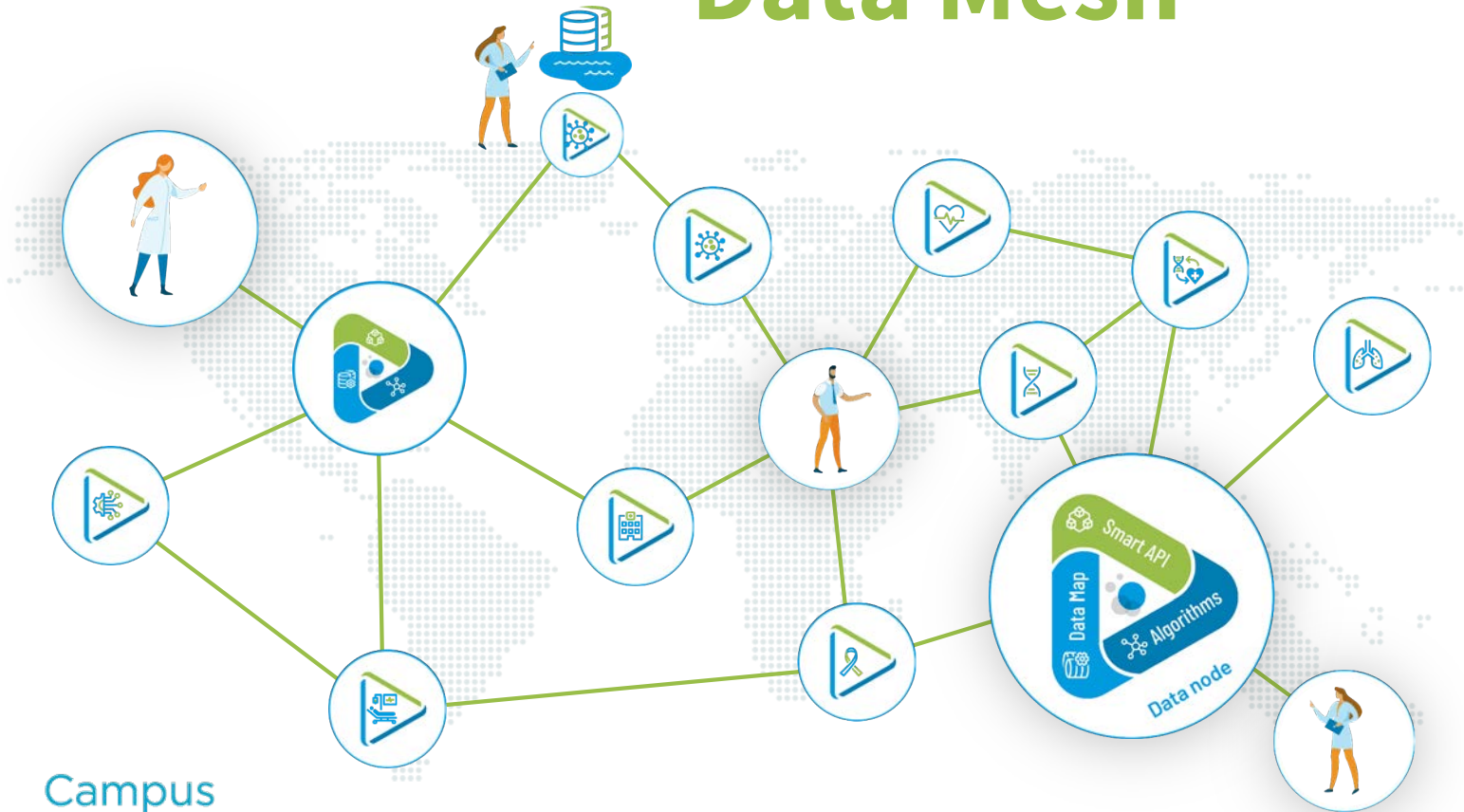
Building a range of patient registries at the present time



What is a Data mesh?

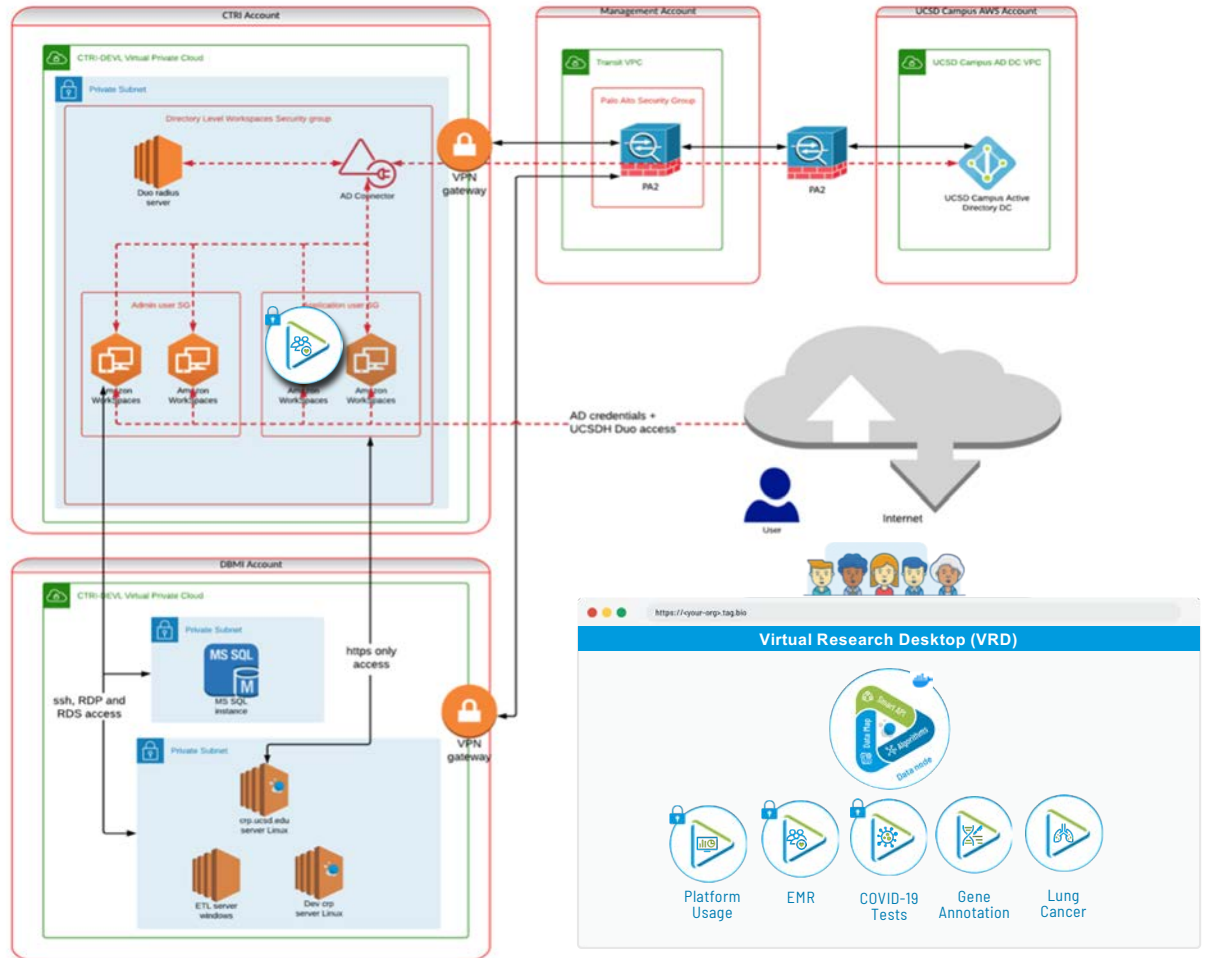
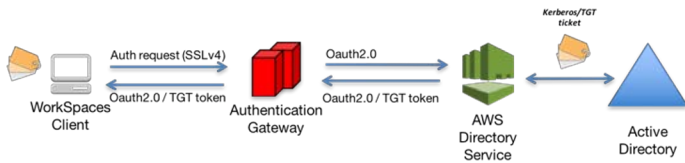
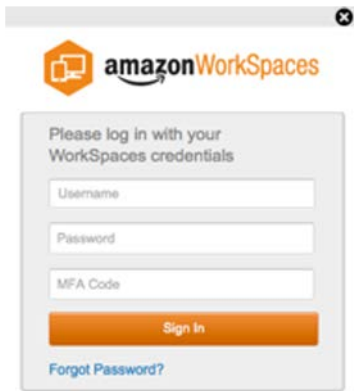
Mark Mooney, VP of Customer Tag.bio

Data nodes deployed and registered in a decentralized Data Mesh

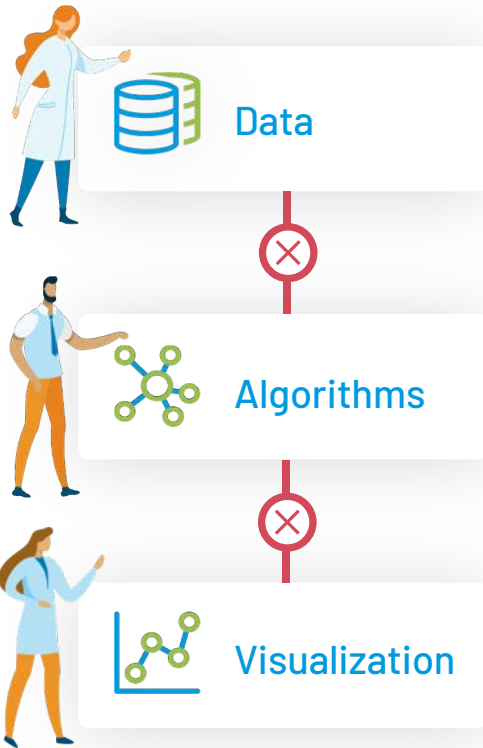


Similar to an app store
or a library of data
products.

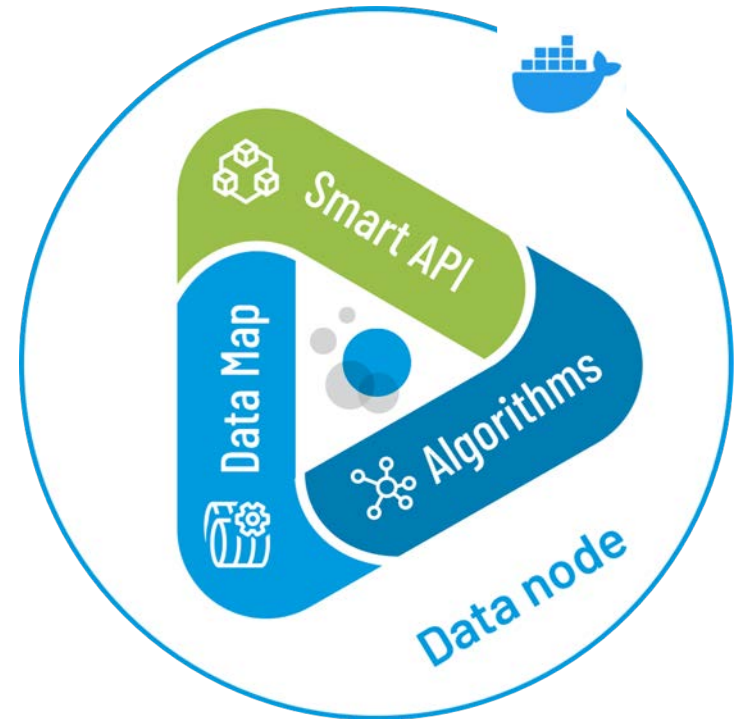
UCSD health secure research cloud with nodes in a VPC



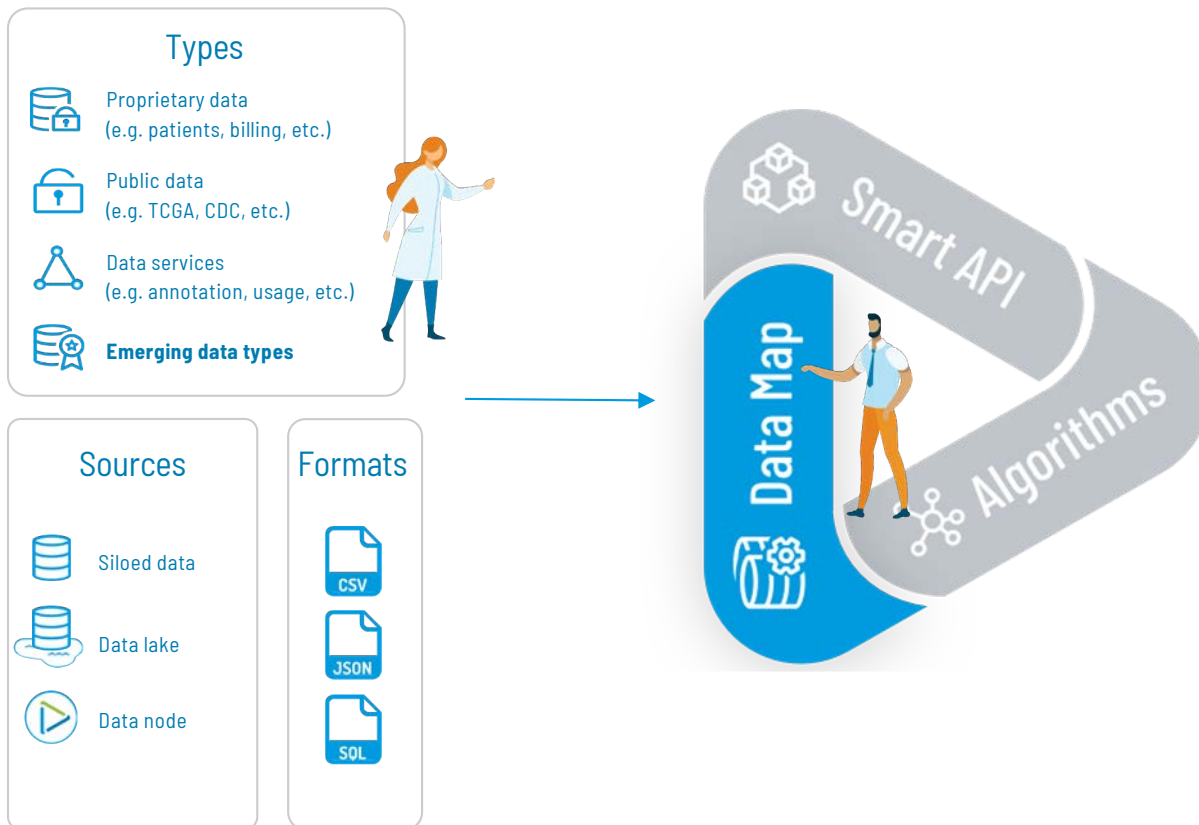
Tying 3 technical components...



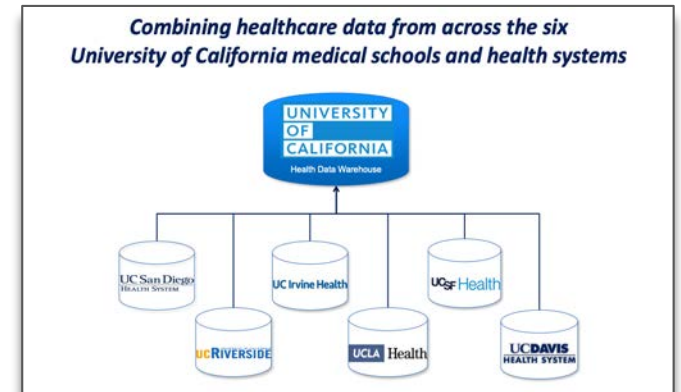
...into a domain-driven data node



NODE: Data Map



UC CORDS COVID-19

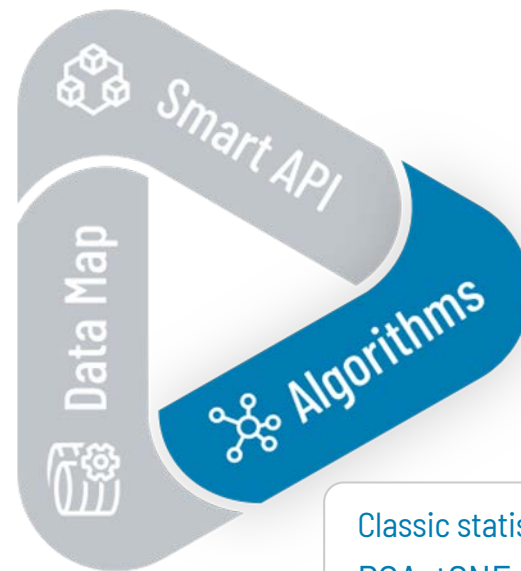


Aug 14 2020

- 175,517 COVID tested patients
- 6,056 COVID+ patients
- all labs, meds, vitals, 29 ICU data elements
- 319,952,837 “data points”



**de-identified data
Ingested in 5 hours**

NODE: Algorithms



Classic statistical methods
PCA, tSNE, UMAP,
t-test, Mann-Whitney,
Hypergeometric,
Cox regression,
Paired analysis over time,
Pathway analysis, etc.

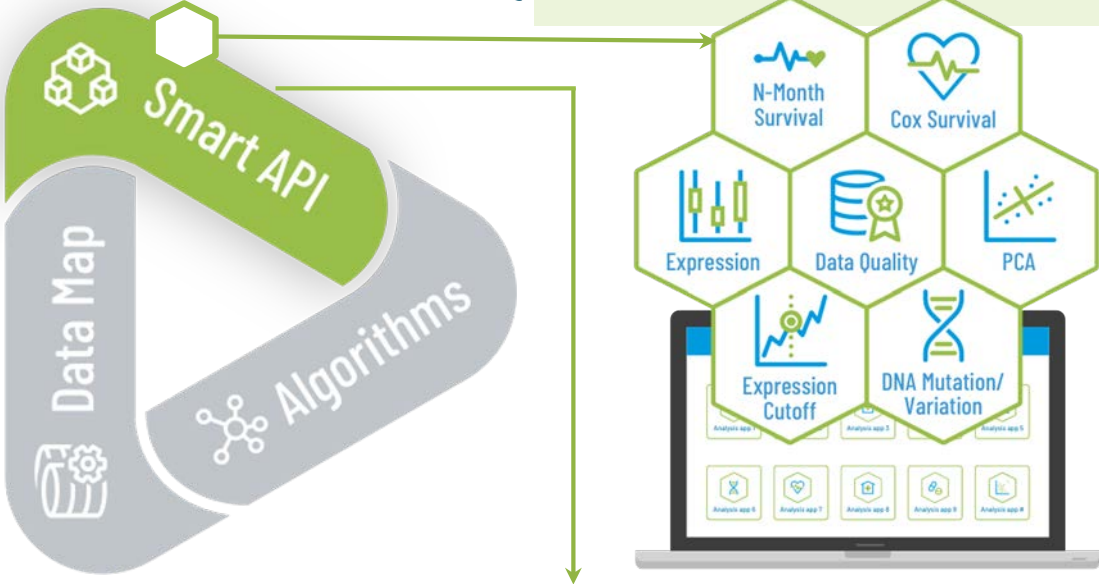
Integration with


 python

Machine Learning / AI

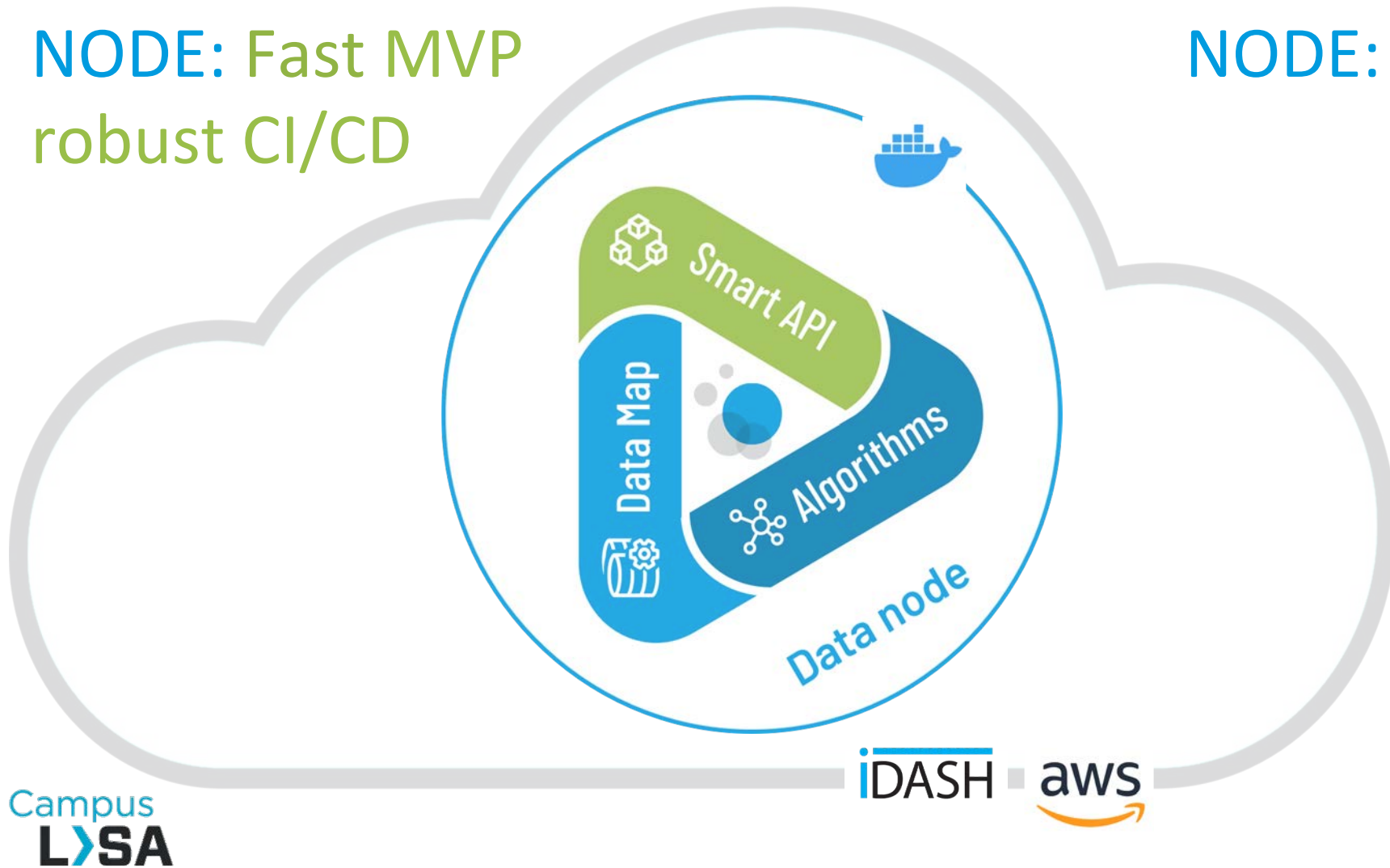
NODE: Smart API/UX

Analysis Apps
Made by the data scientist
Used by the researcher



NODE: Fast MVP
robust CI/CD

NODE: DIY



```
python_elastic_net_cross_validation.json
1  {
2    "protocol_definition": {
3      "name": "elastic_net_crossvalidation",
4      "visible": true,
5      "thumbnail": "https://tag-client-images.s3-us-west-2.amazonaws.com/protocol-thumbnails/fc-topaz/python.png",
6      "title": "Elastic net cross validation",
7      "description": "This protocol performs elastic net cross validation.",
8      "category": "Python plugins",
9      "argument_sets": [
10     "protocols/argument_sets/background_cohort_argument_set.json",
11     "protocols/argument_sets/model_outcome_argument_set.json",
12     "protocols/argument_sets/model_cross_validation_input_argument_set.json",
13     "protocols/argument_sets/elastic_net_cross_validation_parameters_argument_set.json"
14   ],
15   "tags": [
16     "Python",
17     "Elastic net",
18     "Cross validation"
19   ]
20 },
21 "method": "external",
22 "sdk": "python",
23 "plugin": "python/elastic_net_cross_validation.py",
24 "output_type": "html",
25 "background": "protocols/argument_references/background_cohort_reference.json",
26 "analysis_variables": [
27   "protocols/variables/auto/patient_id_collection.json",
28   "protocols/argument_references/model_outcome_variable_reference.json",
29   "protocols/argument_references/model_input_variables_reference.json",
30   "protocols/argument_references/plos_one_model_cv_input_variables_reference.json"
31 ]
32 }
33
```





Nightingale registries

(a de-identified, automated, OMOP data product)

Mark Mooney, VP of Customer Tag.bio

Amazon WorkSpaces

By login this workspace you acknowledge and accept the security warning listed below:
CONFIDENTIALITY NOTICE - The information enclosed within this network may contain Personal Health Information (PHI) and/or Personally identifiable information (PII), which is confidential and the data is subject to HIPAA compliance. Any review, disclosure, copying and distribution of this data outside of this network is strictly prohibited. Also, copying of confidential data to any external mobile storage/device is strictly prohibited.
IMPORTANT REMINDER: You must save your files within your Y: drive. All other data (not stored on the Y: drive) will be permanently deleted.

The Virtual Research Desktop
A joint project by UCSD-ACTRI and UCSD HS Information Services

9:42 AM
8/27/2020

- Google Drive
- Databricks
- Heyler clusters
- tag.bio.data.for_test

- Recycle Bin
- HS-Scout
- Notepad++
- R x64 3.6.1
- Anaconda Prompt (A...)
- IBM SPSS Statistics 26
- pgAdmin 4
- SAS 9.4 (English)
- CTRI RedCap
- JetBrains PyCharm ...
- PUTTY
- tag.bio App
- CTRI Tableau
- Jupyter Notebook ...
- Python IDLE
- WinSCP
- CTRI Velos
- MySQL Workben...
- Python
- nanoschematic
- FileZilla
- Navicat Premium
- R i386 3.6.1

Amazon WorkSpaces

Recycle Bin HS-Scout Notepad++ R x64 3.6.1

Anaconda Prompt (A... IBM SPSS Statistics 26 pgAdmin 4 SAS 9.4 (English)

CTRI RedCap JetBrains PyCharm... PuTTY tag.bio App

CTRI Tableau Jupyter Notebook ... Python IDLE WinSCP

CTRI Velos MySQL Workben... Python

FileZilla Navicat Premium R i386 3.6.1

Sign in

tagbio-ucsd.auth.us-west-2.amazonaws.com

Sign in with your email and password

Email

mark@tag bio

Password

.....

Forgot your password?

Sign in

By Login this workspace you acknowledge and accept the security warning listed below:
work may contain information (PII), which
work, disclosure, strictly prohibited. Also,
strictly prohibited.

All other data (not

Google Drive

Screen Shot 2020-0...42:23 AM

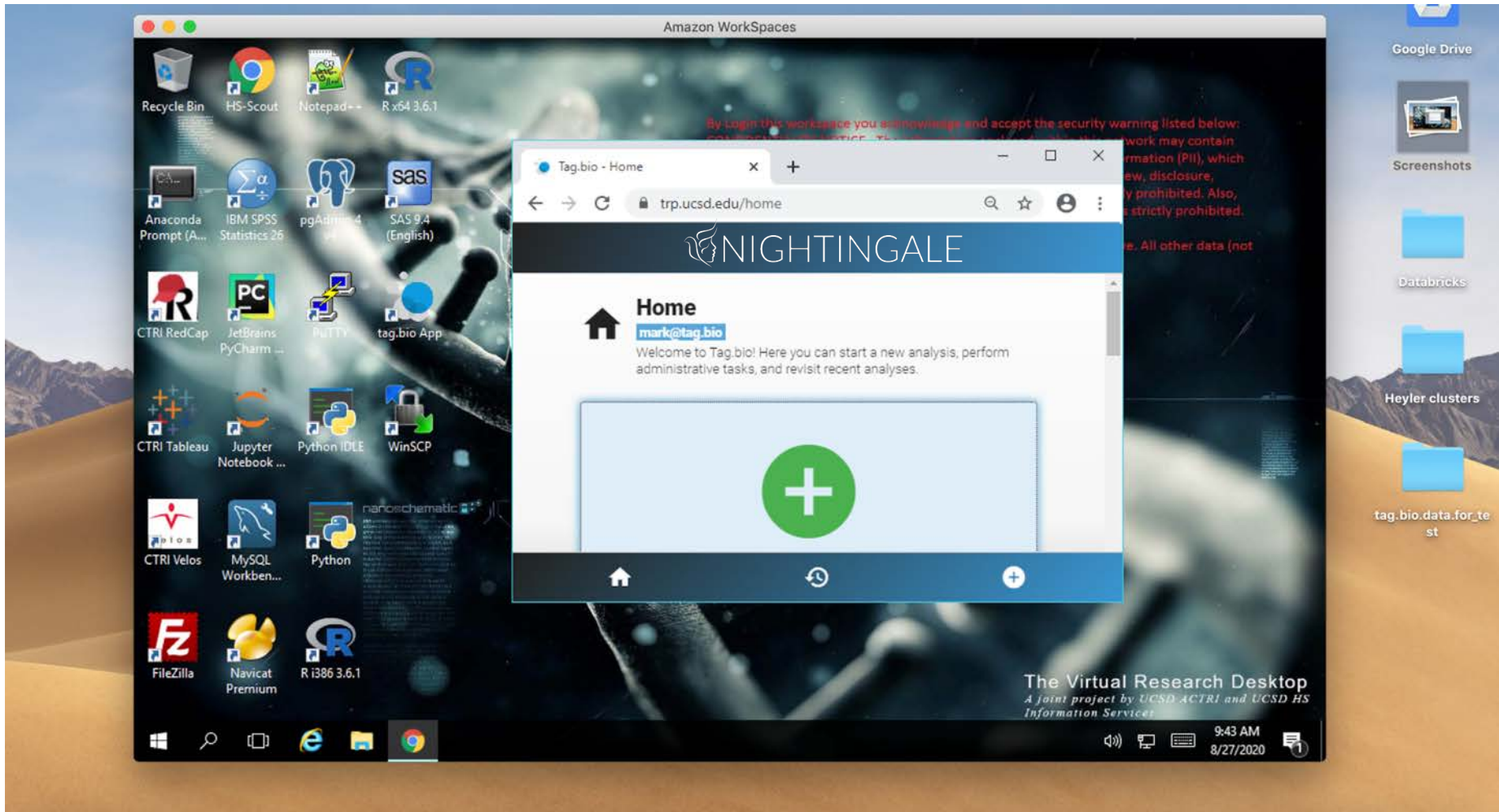
Databricks

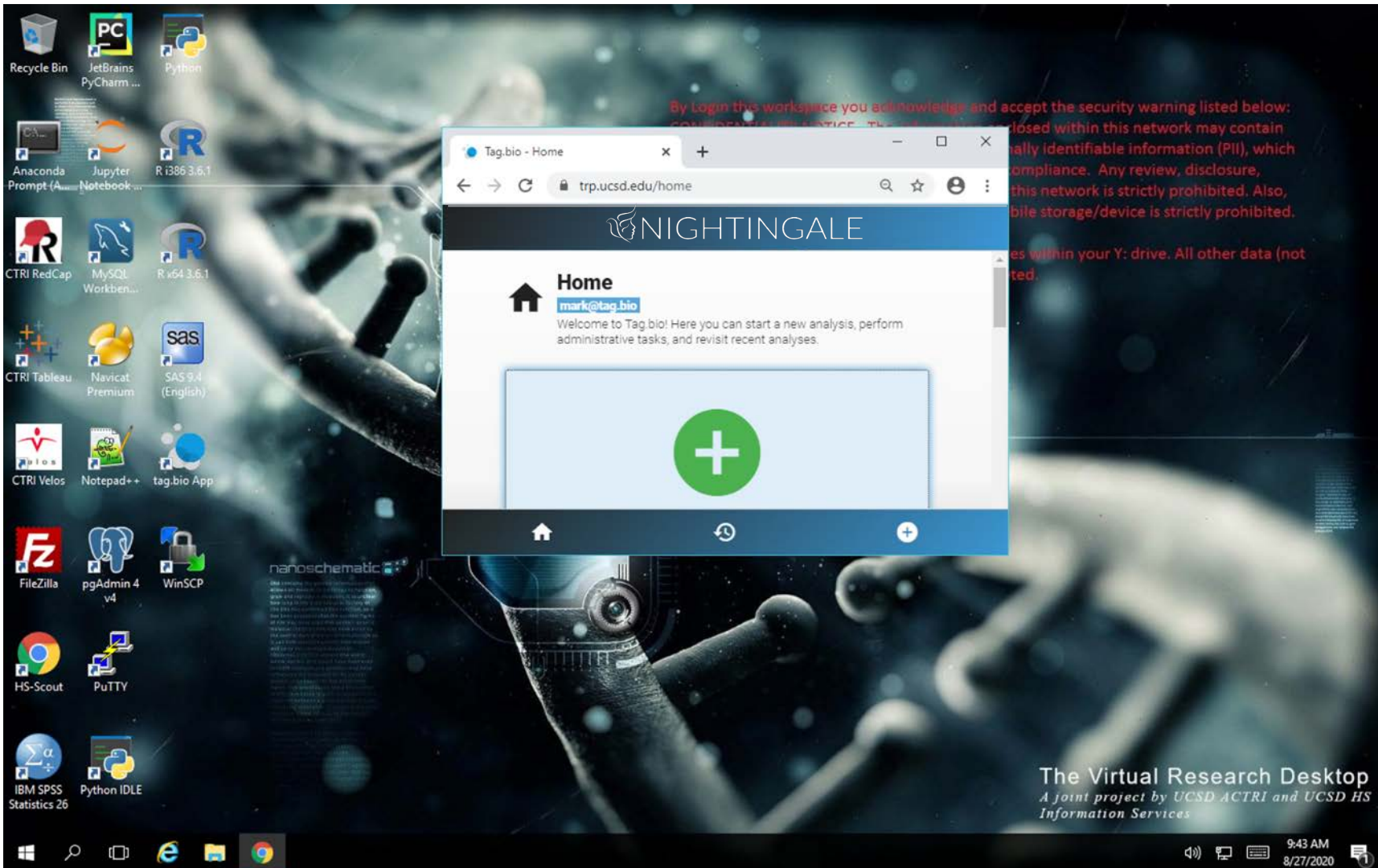
Heyler clusters

tag.bio.data.for_te st

The Virtual Research Desktop
A joint project by UCSD ACTRI and UCSD HS
Information Services

9:42 AM
8/27/2020





By login this workspace you acknowledge and accept the security warning listed below:

...losed within this network may contain
ally identifiable information (PII), which
compliance. Any review, disclosure,
this network is strictly prohibited. Also,
bile storage/device is strictly prohibited.


es within your Y: drive. All other data (not
ted.


The Virtual Research Desktop
A joint project by UCSD ACTRI and UCSD HS
Information Services




Home
mark@tag.bio


Welcome to Tag.bio! Here you can start a new analysis, perform administrative tasks, and revisit recent analyses.


Start a new analysis

 Quick tutorial

Cache enabled

 Tag.admin console

 Sign out

Recent history




Expression UMAP and Clustering

Protocol version: Alpha
Aug 26, 2020
11:22:51 PM

Analysis

Cluster Count: **10**
Dimensions: **3**
Minimum Distance: **0.1**
Remove Genes Without Expression In At Least This Many Samples: **3**
Nearest Neighbors Parameter for UMAP: **15**

 **Notes:**
[Click here to add notes.](#)




Expression UMAP and Clustering

Protocol version: Alpha
Aug 26, 2020
10:12:58 PM

Analysis

Cluster Count: **10**
Dimensions: **3**
Minimum Distance: **0.1**
Remove Genes Without Expression In At Least This Many Samples: **3**
Nearest Neighbors Parameter for UMAP: **15**

 **Notes:**
[Click here to add notes.](#)










Home / Tag.admin
Tag.admin console

Mark@tag.bio

Here you can configure users and datasets.

Users **Datasets** Categories

-  **Gene Annotation**
Deploys gene annotation information from public domain
-  **Head and Neck Cancer (TCGA)**
A dataset with clinical and multi-omics data for 530 head and neck cancer patients (from TCGA).
-  **METABRIC Breast Cancer**
A dataset with clinical and multi-omics data for 1980 breast cancer patients (METABRIC, Nature 2012 & Nat Commun 2016).
-  **Synthetic COVID-19 demo data**
Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.
-  **TCGA Pan-Cancer Atlas [catalyze]**
Combined data from 33 cancer types from the 2018 TCGA Pan Cancer Clinical Data Resource
-  **TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer**
Combined data from 33 cancer types from the 2018 TCGA Pan Cancer Clinical Data Resource
-  **Tag.bio Analysis History**
A dataset containing protocol usage history for all users



Synthetic COVID-19 demo data
Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

Dataset privacy status:

Private Public

Dataset requires authentication:

Requires auth Does not require auth

Dataset tags

[Add tags](#)

Dataset details

Title Synthetic COVID-19 demo data

Singular entity name patient

Plural entity name patients

Description Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

Cloud Provider

Link <https://github.com/synthetichealth/synthea/issues/679>

Users

[+ Add an existing user to this dataset](#) [+ Add all site users to dataset](#)

[Remove all users from dataset](#)

Home / Select a dataset

Select a dataset

After selecting a dataset, you will see a list of available protocols. Protocols are workflows designed to answer questions about that dataset.

UCSD COVID Patient Registry

UCSD COVID-19 Research Registry - All Tested Patients History View



University of California San Diego's registry of all patients, both positive and negative for COVID-19.

61388 Patients

Server version: 2.34.18
Aug 26, 2020
9:02:07 AM

UCSD COVID-19 Research Registry - Positive Patient History View



University of California San Diego's registry of COVID-19 positive patients.

872 Patients

Server version: 2.34.18
Aug 26, 2020
9:02:03 AM

CORDS - UC COVID Patient Registry

UC CORDS Research Registry - All Tested Patients History View



University of California CORDS registry of all patients, both positive and negative for COVID-19.

175517 Patients

Server version: 2.34.18
Aug 26, 2020

Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)



UC CORDS Research Registry - All Tested Patients History View



University of California CORDS registry of all patients, both positive and negative for COVID-19.

175517 Patients
Server version: 2.34.18
Aug 26, 2020 9:02:06 AM

UC CORDS Research Registry - Positive Patient History View



University of California CORDS registry of COVID-19 positive patients.

6056 Patients
Server version: 2.34.18
Aug 26, 2020 9:02:08 AM

Synthetic COVID-19 Patient Data

Synthetic COVID-19 demo data



Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

1835 patients
Server version: 2.34.18
Aug 26, 2020 12:56:18 PM

The Cancer Genome Atlas (TCGA) Datasets

TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer



Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)

Synthetic COVID-19 Patient Data

Synthetic COVID-19 demo data



Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

1835 patients

Server version: 2.34.18
Aug 26, 2020
12:56:18 PM

Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)

The Cancer Genome Atlas (TCGA) Datasets

TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer



Combined data from 33 cancer types from the 2018 TCGA Pan Cancer Clinical Data Resource

10967 samples

Server version: 2.34.18
Aug 27, 2020
7:03:24 AM

METABRIC Breast Cancer



A dataset with clinical and multi-omics data for 1980 breast cancer patients (METABRIC, Nature 2012 & Nat Commun 2016).

1980 patients

Server version: 2.34.18
Aug 26, 2020
7:46:57 PM



Head and Neck Cancer (TCGA)



A dataset with clinical and multi-omics data for 530 head and neck cancer patients (from TCGA).
530 samples
Server version: 2.34.18
Aug 26, 2020 12:55:43 PM

Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)

Services

Tag.bio Analysis History



A dataset containing protocol usage history for all users
268 Users
Server version: 2.34.18
Aug 26, 2020 8:01:35 AM

Gene Annotation



Deploys gene annotation information from public domain
61174 genes
Server version: 2.34.18
Aug 26, 2020 12:56:51 PM

Variant annotation




A dataset with annotation for genomic variants.
3035141 genomic variants

NIGHTINGALE



UC CORDS Research Registry - All Tested Patients History View



University of California CORDS registry of all patients, both positive and negative for COVID-19.

175517 Patients

Server version: 2.34.18
Aug 26, 2020
9:02:06 AM

UC CORDS Research Registry - Positive Patient History View




University of California CORDS registry of COVID-19 positive patients.

6056 Patients

Server version: 2.34.18
Aug 26, 2020
9:02:08 AM

Synthetic COVID-19 Patient Data

Synthetic COVID-19 demo data



Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

1835 patients

Server version: 2.34.18
Aug 26, 2020
12:56:18 PM

The Cancer Genome Atlas (TCGA) Datasets

TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer



Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)



Home / [Select a dataset](#) / Synthetic COVID-19 demo data

Synthetic COVID-19 demo data

1835 patients

Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

[View reference \(new tab\)](#)

Protocols Subjects Run a script

Overview Apps

Overview of Data

Type here to filter protocols

- Comparison
- Download
- Overview
- Specialty
- Summary

COVID-19 Summary Apps

Summary of COVID-19 Positive Patients

Summary of Specific Variables for COVID-19 Positive Patients

Summary of COVID-19 Positive Patients with Pre-Existing Conditions



COVID-19 Comparison Apps

Comparison of COVID-19 Positive Patients

Comparison of Specific Variables for COVID-19 Positive Patients

Comparison of COVID-19 Positive Patients with Pre-Existing Conditions

Type here to filter protocols

- Comparison
- Download
- Overview
- Specialty
- Summary

COVID-19 Specialty Apps

Cox Survival

Cox Survival Using Specific Variables

This protocol allows you to perform cox survival analysis using specific variables on a COVID-19 positive patient cohort that you define.

[Click to configure](#)

Data Download Apps

Patients Data Download



Home / [Select a dataset](#) / Synthetic COVID-19 demo data

Synthetic COVID-19 demo data

1835 patients

Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

[View reference \(new tab\)](#)

Protocols

Subjects

Run a script

Overview Apps

Overview of Data

This protocol provides basic summaries for patient demographics and visit data.

[Click to run](#)

Type here to filter protocols

- Comparison
- Download
- Overview
- Specialty
- Summary

COVID-19 Summary Apps

Summary of COVID-19 Positive Patients



Summary of Specific Variables for COVID-19 Positive Patients



Summary of COVID-19 Positive Patients with Pre-Existing Conditions





Home / [Select a dataset](#) / Synthetic COVID-19 demo data

Synthetic COVID-19 demo data

1835 patients

Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

[View reference \(new tab\)](#)

Protocols

Subjects

Run a script

Overview Apps

Overview of Data

This protocol provides basic summaries for patient demographics and visit data.

Click to run

Type here to filter protocols

- Comparison
- Download
- Overview
- Specialty
- Summary

COVID-19 Summary Apps

Summary of COVID-19 Positive Patients



Summary of Specific Variables for COVID-19 Positive Patients



Summary of COVID-19 Positive Patients with Pre-Existing Conditions



Home / Select a dataset / Synthetic COVID-19 demo data / Overview of Data / Protocol results
Overview of Data
Summary for all patients

Notes:
Click here to add notes.

> Hide menu

Variable collection #1 of 5

Patient

Go to collection

[Patient - Ethnicity](#)

2 results

[Patient - Race](#)

3 results

[Patient - Deceased](#)

2 results

[Patient - Gender](#)

2 results

[Patient - Age](#)

1 results

Patient - Ethnicity

Non-Hispanic

90.0% (1651 / 1835)

Patient - Ethnicity

Hispanic

10.0% (184 / 1835)



Home / Select a dataset / Synthetic COVID-19 demo data

Synthetic COVID-19 demo data

1835 patients

Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.
[View reference \(new tab\)](#)

Protocols Subjects Run a script

Overview Apps

Overview of Data

Type here to filter protocols

- Comparison
- Download
- Overview
- Specialty
- Summary

COVID-19 Summary Apps

Summary of COVID-19 Positive Patients

Summary of Specific Variables for COVID-19 Positive Patients

Summary of COVID-19 Positive Patients with Pre-Existing Conditions



Type here to filter protocols

- Comparison
- Download
- Overview
- Specialty
- Summary

COVID-19 Comparison Apps

Comparison of COVID-19 Positive Patients

This protocol compares clinical outcomes for all COVID-19 positive patients with a defined sub-cohort of COVID-19 positive patients.

[Click to configure](#)

Comparison of Specific Variables for COVID-19 Positive Patients

Comparison of COVID-19 Positive Patients with Pre-Existing Conditions

COVID-19 Specialty Apps

Cox Survival

Cox Survival Using Specific Variables



Home / [Select a dataset](#) / [Synthetic COVID-19 demo data](#) / Comparison of COVID-19 Positive Patients / Configure and run protocol

Comparison of COVID-19 Positive Patients

This protocol compares clinical outcomes for all COVID-19 positive patients with a defined sub-cohort of COVID-19 positive patients.

> Instructions

COVID-19 Patient Details



COVID-19 Positive Cohort

Select additional criteria to further define the COVID-19 positive cohort.

Clear all

COVID-19 Positive cohort

Selected parameters

Sort Results

Sort attribute: **Tag.score**

Sort direction (default >): **>**

Define a maximum number of results to view across all analyzed variables: **2500**

Collections of Variables to Analyze



Data from Entire Patient Record to Analyze

Select data to analyze.

Clear all

Outcomes recorded only after COVID positive status

Visit collections

Patient-related collections

Activity collections

Examination collections

Cohort builder

Visit Details

Patient Details

Clear all

Gender

FEMALE

Select all

FEMALE

MALE

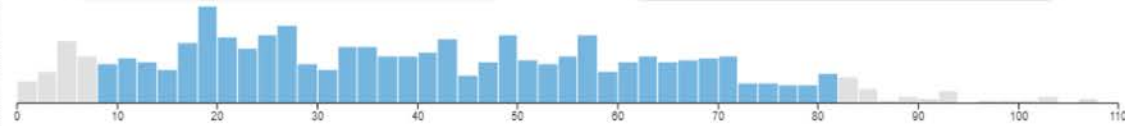
Ethnicity

Race

Age range

40

80



412 patients

Cancel

Save & use

Cohort builder

Please specify a name for this cohort:

f-40 to 80

Selected parameters

Patient Details

Gender: **FEMALE**
Minimum age: **40**
Maximum age: **80**

412 patients

Back

Cancel

Use now

Save

Home / Select a dataset / Synthetic COVID-19 demo data / Comparison of COVID-19 Positive Patients / Configure and run protocol

Comparison of COVID-19 Positive Patients

This protocol compares clinical outcomes for all COVID-19 positive patients with a defined sub-cohort of COVID-19 positive patients.

> Instructions

COVID-19 Patient Details

COVID-19 Positive Cohort

Select additional criteria to further define the COVID-19 positive cohort.

COVID-19 Positive cohort: **f-40 to 80**

Selected parameters

COVID-19 Positive Cohort
COVID-19 Positive cohort: **f-40 to 80**

Sort Results
Sort attribute: **Tag_score**
Sort direction (default >): **>**

Define a maximum number of results to view across all analyzed variables.: **2500**

Collections of Variables to Analyze

Data from Entire Patient Record to Analyze

Select data to analyze.

Outcomes recorded only after COVID positive status

Select all

- Condition - After COVID Positive Diagnosis
- Drug - After COVID Positive Diagnosis
- Measurement - After COVID Positive Diagnosis
- Observation - After COVID Positive Diagnosis
- Procedure - After COVID Positive Diagnosis



Home / Select a dataset / Synthetic COVID-19 demo data / Comparison of COVID-19 Positive Patients / Configure and run protocol

Comparison of COVID-19 Positive Patients

This protocol compares clinical outcomes for all COVID-19 positive patients with a defined sub-cohort of COVID-19 positive patients.

> Instructions

COVID-19 Patient Details

COVID-19 Positive Cohort

Select additional criteria to further define the COVID-19 positive cohort.

Clear all

COVID-19 Positive cohort **f-40 to 80**

[Rebuild cohort](#) [Use saved cohort](#)

Collections of Variables to Analyze

Data from Entire Patient Record to Analyze

Select data to analyze.

Clear all

Outcomes recorded only after COVID positive status **Multiple values**

Select all

- Condition - After COVID Positive Diagnosis
- Drug - After COVID Positive Diagnosis
- Measurement - After COVID Positive Diagnosis
- Observation - After COVID Positive Diagnosis
- Procedure - After COVID Positive Diagnosis

Selected parameters

COVID-19 Positive Cohort
COVID-19 Positive cohort: **f-40 to 80**

Data from Entire Patient Record to Analyze
Outcomes recorded only after COVID positive status.
Condition - After COVID Positive Diagnosis
Observation - After COVID Positive Diagnosis
Measurement - After COVID Positive Diagnosis

Sort Results
Sort attribute: **Tag_score**
Sort direction (default >): **>**

Define a maximum number of results to view across all analyzed variables.: **2500**

[Run protocol](#)

Comparison of COVID-19 Positive Patients

This protocol compares clinical outcomes for all COVID-19 positive patients with a defined sub-cohort of COVID-19 positive patients.

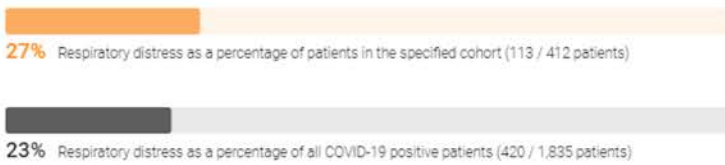
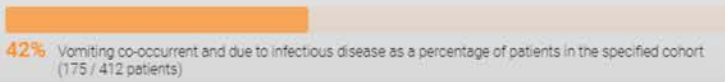
Notes:
[Click here to add notes.](#)

> | Hide menu

Variable collection #2 of 3

Condition - After COVID Positive Diagnosis

Type here to filter 21 results

<input type="checkbox"/>	tag score 4.8 p = 0.00831	Condition - After COVID Positive Diagnosis Respiratory distress Higher than expected	→	🔗
				
<input type="checkbox"/>	tag score 4.2 p = 0.0149	Condition - After COVID Positive Diagnosis Vomiting co-occurrent and due to infectious disease Higher than expected	→	🔗
				

Selected parameters

COVID-19 Positive Cohort
COVID-19 Positive cohort: [Multiple values](#)

Data from Entire Patient Record to Analyze
Outcomes recorded only after COVID positive status:
[Condition - After COVID Positive Diagnosis](#)
[Observation - After COVID Positive Diagnosis](#)
[Measurement - After COVID Positive Diagnosis](#)

Sort Results
Sort attribute: [Tag score](#)
Sort direction (default >): [▶](#)
Define a maximum number of results to view across all analyzed variables: [2500](#)

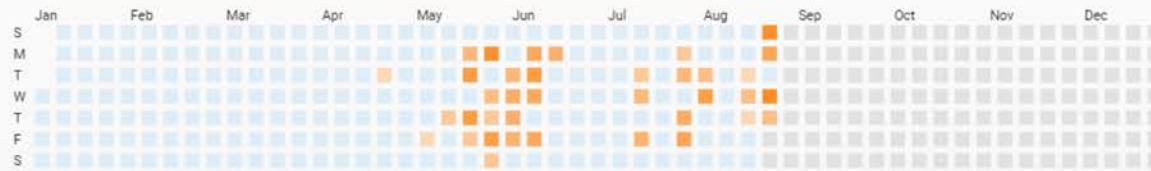


Home / History
History
mark@tag.bio

All of your prior analyses, arranged by date. Also available are your favorite analyses and analyses that have been shared with you.

Timeline Shared Favorites

2020



August

(82 events)

27	(3) August 27, 2020
26	(26) August 26, 2020
24	(9) August 24, 2020
23	(24) August 23, 2020
22	(1) August 22, 2020

2020



August

(82 events)

27 (3) August 27, 2020 ^

Synthetic COVID-19 demo data
Comparison of COVID-19 Positive Patients
Protocol version: Alpha
Aug 27, 2020
9:53:40 AM

Notes:
Click here to add notes.

Analysis
COVID-19 Positive cohort: [Untitled cohort](#)
Define a maximum number of results to view across all analyzed variables: [2500](#)
Outcomes recorded only after COVID positive status: [Condition - After COVID Positive Diagnosis](#), [Observation - After COVID Positive Diagnosis](#), [Measurement - After COVID Positive Diagnosis](#)
Sort attribute: [Tag.score](#)
Sort direction (default >): [>](#)

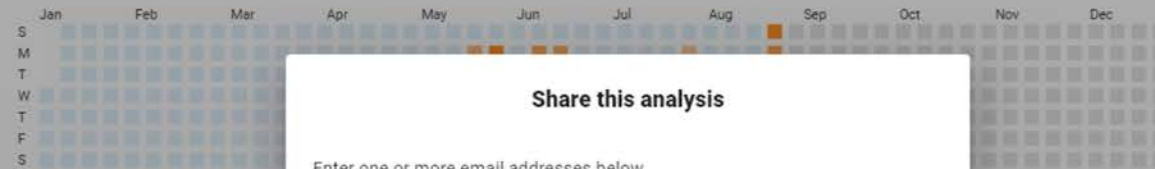
[Refresh](#) [Share](#) [Star](#)

Synthetic COVID-19 demo data Cohort

NIGHTINGALE

Timeline Shared Favorites

2020



August

27

Synthetic COVID-19 demo
Comparison of CO
Protocol version: Alpha
Aug 27, 2020
9:53:40 AM

Notes:

This is interesting because these patients seem to have a higher incidence of respiratory distress.

(82 events)

(3) August 27, 2020 ^

Analysis

COVID-19 Positive cohort: [Untitled cohort](#)
across all analyzed variables: [2500](#)
Condition - After COVID Positive
Measurement - After COVID
Positive Diagnosis
Sort attribute: [Tag_score](#)
Sort direction (default): [>](#)

Share this analysis

Enter one or more email addresses below.

Could you look at this comparison and give me your opinion?

Share

Cancel

All of your prior analyses, arranged by date. Also available are your favorite analyses and analyses that have been shared with you.

Timeline Shared Favorites

Analyses and cohorts All shared 10 per page



Synthetic COVID-19 demo data
Comparison of COVID-19 Positive Patients

Protocol version: Alpha
Aug 27, 2020
9:53:40 AM

Analysis

COVID-19 Positive cohort: **Untitled cohort**
Define a maximum number of results to view across all analyzed variables: **2500**
Outcomes recorded only after COVID positive status: **Condition - After COVID Positive Diagnosis, Observation - After COVID Positive Diagnosis, Measurement - After COVID Positive Diagnosis**
Sort attribute: **Tag.score**
Sort direction (default >): **>**

Notes:

This is interesting because these patients seem to have a higher incidence of respiratory distress



Expression UMAP and Clustering

Protocol version: Alpha
Aug 26, 2020
10:12:20 PM

Analysis

Target Cohort: **Top 3 cancer type by number**
Cluster Count: **10**
Dimensions: **3**
Minimum Distance: **0.1**
Remove Genes Without Expression In At Least This Many Samples: **3**
Nearest Neighbors Parameter for UMAP: **15**

Notes:



Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

1835 patients

Server version: 2.34.18
Aug 26, 2020
12:56:18 PM

Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)

The Cancer Genome Atlas (TCGA) Datasets

TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer



Combined data from 33 cancer types from the 2018 TCGA Pan Cancer Clinical Data Resource

10967 samples

Server version: 2.34.18
Aug 27, 2020
7:03:24 AM

METABRIC Breast Cancer



A dataset with clinical and multi-omics data for 1980 breast cancer patients (METABRIC, Nature 2012 & Nat Commun 2016).

1980 patients

Server version: 2.34.18
Aug 26, 2020
7:46:57 PM

Head and Neck Cancer (TCGA)



A dataset with clinical and multi-omics data for 530 head and neck cancer patients (from TCGA).

530 samples

Server version: 2.34.18



Home / [Select a dataset](#) / TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer
TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer
10967 samples
Combined data from 33 cancer types from the 2018 TCGA Pan Cancer Clinical Data Resource

Protocols Subjects Run a script

Exploratory Protocols

Gene expression UMAP and clustering

This protocol allows you to perform UMAP embedding for selected samples and selected genes, followed by clustering with k-means or DBSCAN

[Click to configure](#)

Cox Survival



Mutation Profile




Download a Slice



Characterize cohort



Expression Profile



Type here to filter protocols

- Characterize cohort
- Clustering
- Download
- Expression
- Mutation
- Signature
- Summary
- Survival



[Home](#) / [Select a dataset](#) / [TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer](#) / [Gene expression UMAP and clustering](#) / [Configure and run protocol](#)

Gene expression UMAP and clustering

This protocol allows you to perform UMAP embedding for selected samples and selected genes, followed by clustering with k-means or DBSCAN

> Instructions

- [Background cohort](#) v
- [Gene subset](#) v
- [Low gene expression filter](#) v
- [Dimension reduction parameters](#) v
- [Clustering parameters](#) v

Selected parameters

Low gene expression filter
Remove genes without expression in at least this many samples:

Dimension reduction parameters
Nearest neighbors parameter for UMAP:
Number of dimensions to produce in projection:

Clustering parameters
Clustering method:
Number of clusters to produce:
DBSCAN radius:

[Run protocol](#)

Tag.bio - Gene expression UMAP x +

trp.ucsd.edu/fc-pan-can/umap/config

Cohort builder

- Demographics
- Cancer
- Tumor event
- Patient and sample IDs
- Survival
- Tissue
- Histology
- Stage
- Immune subtypes
- Copy number variants
- Metastasis

10967 samples Cancel Save & use

Cohort builder

Demographics

Cancer

Clear all

Cancer type

Use these checkboxes to reduce the background cohort to only subjects from selected Cancer type variables.

- Select all
- Invasive Breast Carcinoma 1084 samples
 - Non-Small Cell Lung Cancer 1053 samples
 - Colorectal Adenocarcinoma 594 samples
 - Glioblastoma 592 samples
 - Endometrial Carcinoma 586 samples
 - Ovarian Epithelial Tumor 585 samples
 - Head and Neck Squamous Cell Carcinoma 523 samples
 - Esophagogastric Adenocarcinoma 514 samples
 - Diffuse Glioma 513 samples
 - Renal Clear Cell Carcinoma 512 samples

... 10 / 35 options shown - use the filter above to search.

10967 samples

Cancel

Save & use



[Home](#) / [Select a dataset](#) / [TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer](#) / [Gene expression UMAP and clustering](#) / [Configure and run protocol](#)

Gene expression UMAP and clustering

This protocol allows you to perform UMAP embedding for selected samples and selected genes, followed by clustering with k-means or DBSCAN

> Instructions

- Background cohort
- Gene subset
- Low gene expression filter
- Dimension reduction parameters
- Clustering parameters

Selected parameters

Low gene expression filter
Remove genes without expression in at least this many samples: **3**

Dimension reduction parameters
Nearest neighbors parameter for UMAP: **15**
Number of dimensions to produce in projection: **5**

Clustering parameters
Clustering method: **k-means**
Number of clusters to produce: **10**
DBSCAN radius: **100**

Run protocol

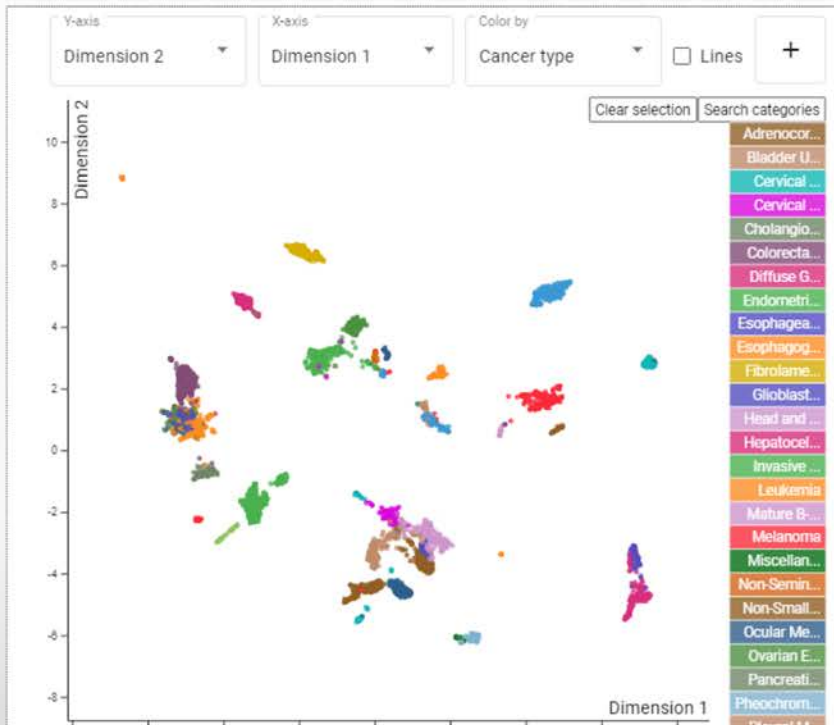
Home / Select a dataset / TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer / Gene expression UMAP and clustering / Protocol results

TCGA pan-cancer gene expression UMAP and clustering

This protocol analyzed (10,967 samples) using UMAP embedding, followed by clustering.

Notes:
[Click here to add notes.](#)

>| Hide menu



Follow-up actions

- Build cohort
- Differential expression
- Characterize selection

Selected parameters

- Low gene expression filter**
Remove genes without expression in at least this many samples: **3**
- Dimension reduction parameters**
Nearest neighbors parameter for UMAP: **15**
Number of dimensions to produce in projection: **5**
- Clustering parameters**
Clustering method: **k-means**
Number of clusters to produce: **10**
DBSCAN radius: **100**



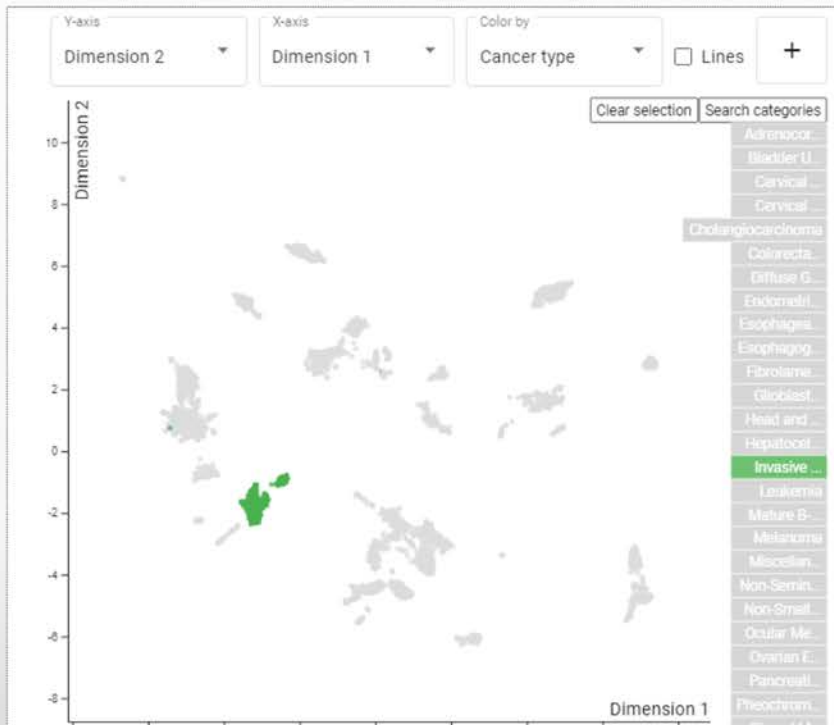
Home / Select a dataset / TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer / Gene expression UMAP and clustering / Protocol results

TCGA pan-cancer gene expression UMAP and clustering

This protocol analyzed (10,967 samples) using UMAP embedding, followed by clustering.

Notes:
[Click here to add notes.](#)

> Hide menu



Follow-up actions

- Build cohort
- Differential expression
- Characterize selection

Selected parameters

Low gene expression filter
Remove genes without expression in at least this many samples: **3**

Dimension reduction parameters
Nearest neighbors parameter for UMAP: **15**
Number of dimensions to produce in projection: **5**

Clustering parameters
Clustering method: **k-means**
Number of clusters to produce: **10**
DBSCAN radius: **100**

NIGHTINGALE

Home / Select a dataset / TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer / Gene expression UMAP and clustering / Protocol results
TCGA pan-cancer gene expression UMAP and clustering
This protocol analyzed (10,967 samples) using UMAP embedding, followed by clustering.

Notes:
[Click here to add notes.](#)

> Hide menu

Y-axis X-axis Color by

Scatterplot cohort

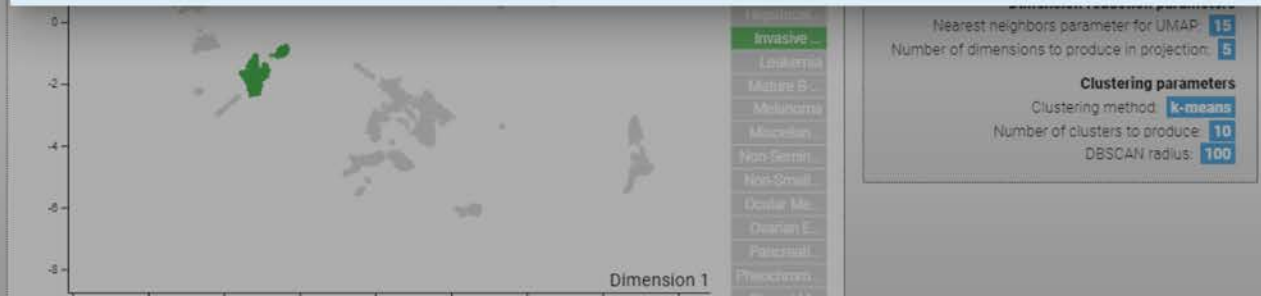
Please specify a name for this cohort:

Inv Brst

Cancer type: **Invasive Breast Carcinoma**

1084 samples

[Cancel](#) [Save cohort](#)



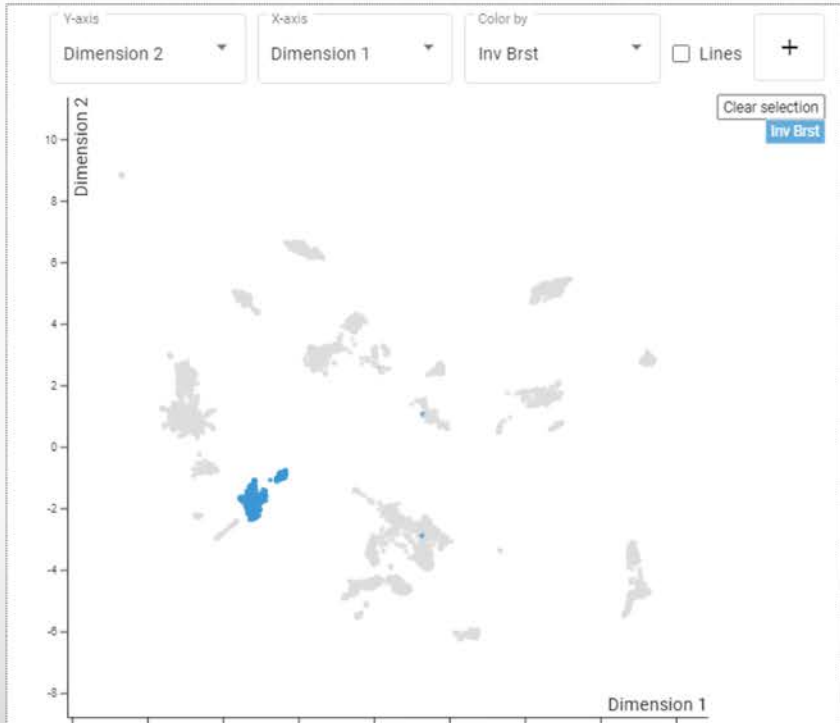
Home / Select a dataset / TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer / Gene expression UMAP and clustering / Protocol results

TCGA pan-cancer gene expression UMAP and clustering

This protocol analyzed (10,967 samples) using UMAP embedding, followed by clustering.

Notes:
[Click here to add notes.](#)

>| Hide menu



Refresh, Grid, PDF, Share, Star icons

Follow-up actions

- Build cohort
- Differential expression
- Characterize selection

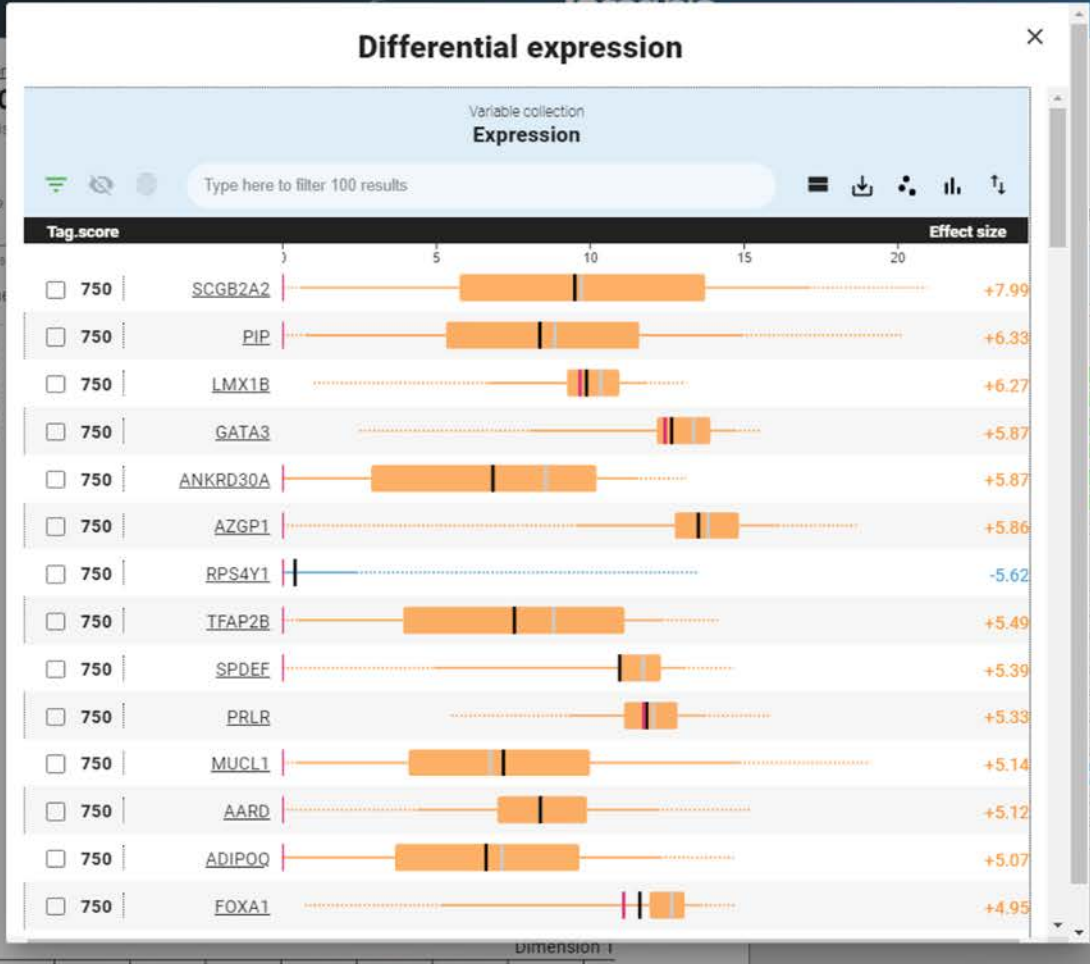
Selected parameters

Low gene expression filter
Remove genes without expression in at least this many samples: **3**

Dimension reduction parameters
Nearest neighbors parameter for UMAP: **15**
Number of dimensions to produce in projection: **5**

Clustering parameters
Clustering method: **k-means**
Number of clusters to produce: **10**
DBSCAN radius: **100**





Differential expression

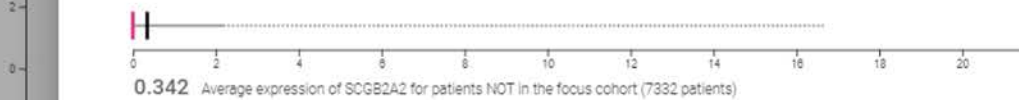
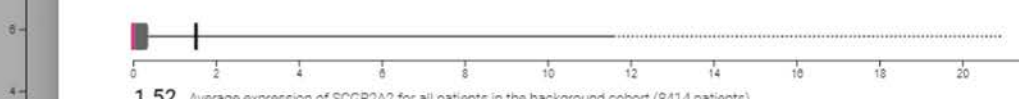
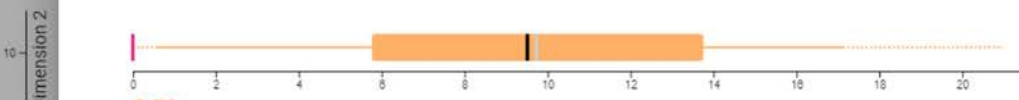
Variable collection
Expression

View results in compact list

Type here to filter 100 results

tag score
750
p = 0

Expression
SCGB2A2
Higher than expected



tag score
750
p = 0

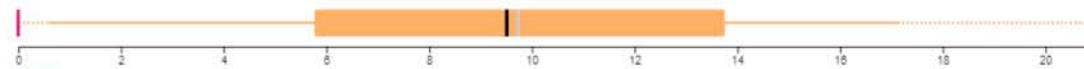
Expression
PIP
Higher than expected



SCGB2A2

Figure Drill down Annotation

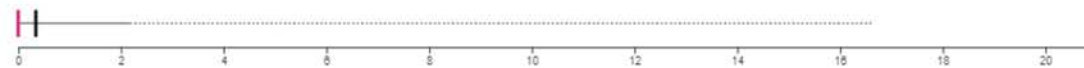
tag score **750** Expression **SCGB2A2**
 $p = 0$ **Higher than expected**



9.51 Average expression of SCGB2A2 for patients in the focus cohort (1082 patients)



1.52 Average expression of SCGB2A2 for all patients in the background cohort (8414 patients)



0.342 Average expression of SCGB2A2 for patients NOT in the focus cohort (7332 patients)

SCGB2A2

Figure Drill down Annotation

Annotation

Chromosome 11
Cytoband 11q12.3
Ensembl RNA ID ENST00000227918.3, ENST00000525380.1
Ensembl gene ID ENSG00000110484
Ensembl protein ID ENSP00000227918.2, ENSP00000431997.1
GO PubMed 25416956, 21873635
GO biological process GO:0030521: androgen receptor signaling pathway, GO:0008150: biological_process
GO cellular component GO:0005615: extracellular space, GO:0005575: cellular_component
GO molecular function GO:0003674: molecular_function, GO:0005515: protein binding
Gene ID 4250
Gene name synonyms mammaglobin A
Gene symbol SCGB2A2
Gene synonym UGB2, MGB1, PSBP1
Gene type protein-coding
GeneBank accession AF015224
HGNC previous symbol MGB1, PSBP1
HGNC symbol SCGB2A2
HGNC synonym MGC71974, UGB2
Locus group protein-coding gene
Locus type gene with protein product
Modification date 2019/10/12
Mouse genome database ID MGI:3780828
Orientation Positive strand
Other database ID HGNC:HGNC:7050, MIM:605562, Ensembl:ENSG00000110484
Other gene designation prostatic steroid binding protein 1, mammaglobin-A, mammaglobin 1
PubMed ID 17192791, 18251583, 27477018, 25416956, 21411781, 21976532, 15489334, 22994369, 17653857, 22897908, 26276775, 16110760, 22963676, 24823311, 20586026, 17071045, 21744998, 18846421, 16203799, 20092039, ... (44 more)
Refseq RNA XM_005274005.3, NM_002411.4
Refseq gene SCGB2A2

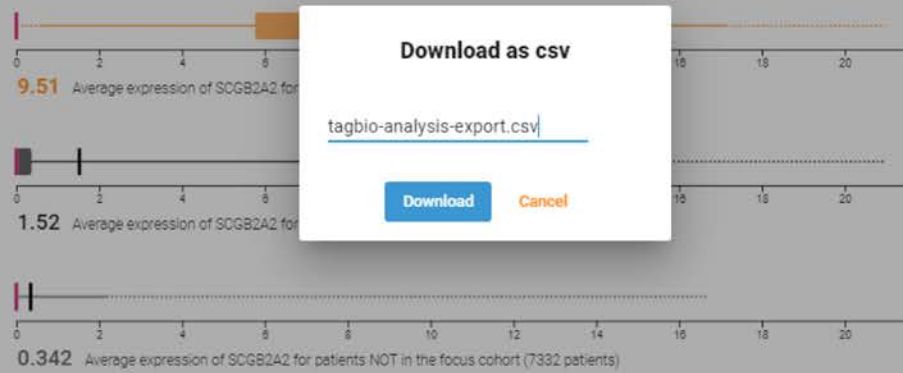
Differential expression

Variable collection
Expression

Type here to filter 100 results

tag score
750
p = 0

Expression
SCGB2A2
Higher than expected



Download as csv

tagbio-analysis-export.csv

Download

Cancel

tag score
750
p = 0

Expression
PIP
Higher than expected

dimension 1



Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.
Server version: 2.34.18
Aug 26, 2020
12:56:18 PM

1835 patients

The Cancer Genome Atlas (TCGA) Datasets

TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer



Combined data from 33 cancer types from the 2018 TCGA Pan Cancer Clinical Data Resource
Server version: 2.34.18
Aug 27, 2020
7:03:24 AM

10967 samples

METABRIC Breast Cancer



A dataset with clinical and multi-omics data for 1980 breast cancer patients (METABRIC, Nature 2012 & Nat Commun 2016).
Server version: 2.34.18
Aug 26, 2020
7:46:57 PM

1980 patients

Head and Neck Cancer (TCGA)



A dataset with clinical and multi-omics data for 530 head and neck cancer patients (from TCGA).
Server version: 2.34.18

530 samples

Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)

Home / Select a dataset

Select a dataset

After selecting a dataset, you will see a list of available protocols. Protocols are workflows designed to answer questions about that dataset.

UCSD COVID Patient Registry

UCSD COVID-19 Research Registry - All Tested Patients History View



University of California San Diego's registry of all patients, both positive and negative for COVID-19.

61388 Patients

Server version: 2.34.18
Aug 26, 2020
9:02:07 AM

UCSD COVID-19 Research Registry - Positive Patient History View



University of California San Diego's registry of COVID-19 positive patients.

872 Patients

Server version: 2.34.18
Aug 26, 2020
9:02:03 AM

CORDS - UC COVID Patient Registry

UC CORDS Research Registry - All Tested Patients History View



University of California CORDS registry of all patients, both positive and negative for COVID-19.

175517 Patients

Server version: 2.34.18
Aug 26, 2020

Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)



UC CORDS Research Registry - Positive Patient History View



University of California CORDS registry of COVID-19 positive patients.

6056 Patients

Server version: 2.34.18
Aug 26, 2020
9:02:08 AM



Synthetic COVID-19 Patient Data

Synthetic COVID-19 demo data



Using synthetic, OMOP mapped, COVID 19 data to enable analysis demonstration and review.

1835 patients

Server version: 2.34.18
Aug 26, 2020
12:56:18 PM



The Cancer Genome Atlas (TCGA) Datasets

TCGA Pan-Cancer Atlas and the Immune Landscape of Cancer



Combined data from 33 cancer types from the 2018 TCGA Pan Cancer Clinical Data Resource

10967 samples

Server version: 2.34.18
Aug 27, 2020
7:03:24 AM



Type here to filter datasets

- CORDS - UC COVID Patient Registry (2)
- UCSD COVID Patient Registry (2)
- Services (3)
- Synthetic COVID-19 Patient Data (1)
- The Cancer Genome Atlas (TCGA) Datasets (4)

Summary

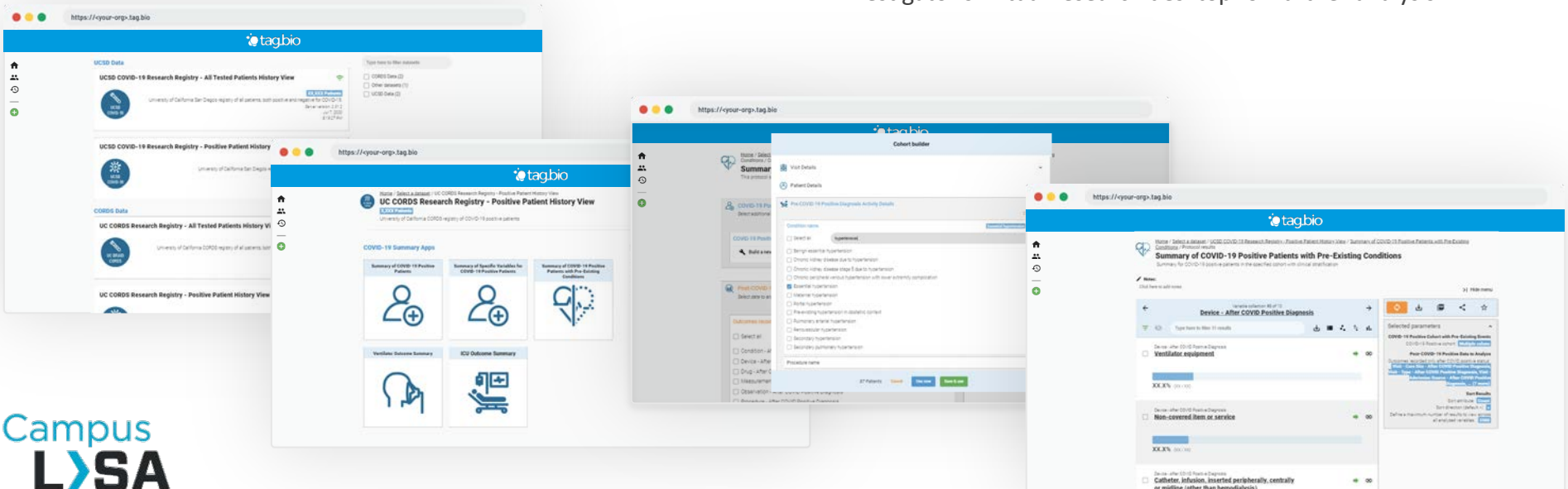
Mike Hogarth MD, Clinical Research Information Officer, UC San Diego Health



NIGHTINGALE

A tool for data exploration and analysis

- We have installed the tag.bio system in our research cloud and it has access to data sets in our 'secure data commons database'
- The Nightingale portal provides population level access and ability to perform analysis
- A user can 'slice' the cohort and select specific analyses (demographic, survival, comparison between cohorts)
- Planned, pending approval, provide 'download' of limited data set (LDS) row-level data from selected data set into the investigator's virtual research desktop for further analysis



The screenshots illustrate the following features of the tag.bio system:

- UCSD COVID-19 Research Registry - All Tested Patients History View:** A dashboard showing patient history with filters for COVID-19 Data, Other Studies, and UCSD Data.
- UC CORDS Research Registry - Positive Patient History View:** A dashboard for UC CORDS research registry with COVID-19 Summary Apps for Positive Patients, Specific Variables for COVID-19 Positive Patients, and Positive Patients with Pre-Existing Conditions.
- Cohort builder:** An interface for building cohorts by selecting conditions such as 'Diabetes', 'Hypertension', 'Chronic kidney disease stage 3-4', etc.
- Patient Details:** A view showing detailed information for a specific patient, including their name and various clinical data points.
- Summary of COVID-19 Positive Patients with Pre-Existing Conditions:** A dashboard providing a summary of patients with pre-existing conditions, including filters for 'Ventilator equipment' and 'Device after COVID Positive Diagnosis'.

Help us evolve the mesh

- What other registries should be available?
- How would you like to query them?
- Are there public data sources you would like to see here?
- Could we use the mesh for other data sources?

Please contact Mike Hogarth at mihogarth@health.ucsd.edu with suggestions or comments.

Thank You!

Questions?

Next presentation

Come see our next UC TECH Presentation 9/03:

Email Overload: Practical Tools for Influencing Email Volume in the Age of Telecommuting

Are you overwhelmed by the number of emails you receive daily? Has email management become a burdensome core task that monopolizes your time? When volume exceeds 200+ emails a day, generic email tips & tricks for email management simply won't cut it. This session will go beyond email platform use to focus on email management from a behavior modification and process improvement perspective. We will cover practical tools and strategies for actively managing virtual work and interactions with your co-workers more effectively, giving you the ability to actually influence the volume of emails you receive.

Speaker:

Loralyn Cross, Office of Research Affairs, UC San Diego

Reference slides

Enabling doctors to provide instant answers

9 years of billing and encounter data

- All inpatient and outpatient data in a combined dataset

→ Over **2,000 analyses** performed by value improvement physicians in the past year

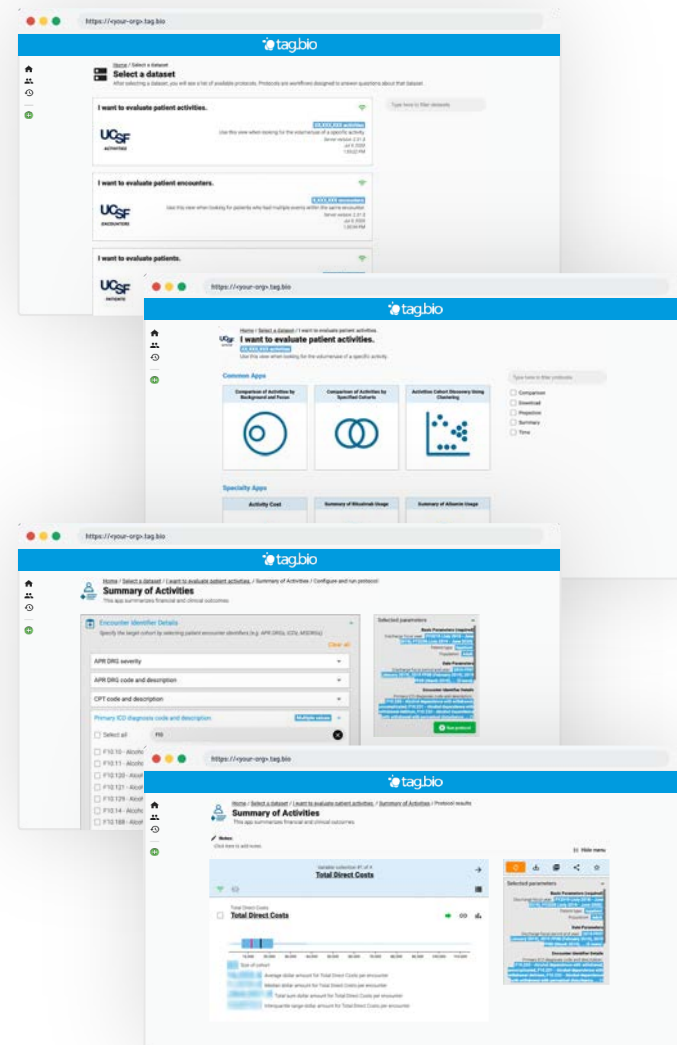
“The ability to have this kind of **on-demand information** completely **changes the culture**. I can’t imagine doing my job without the Tag.bio platform.”

– Jahan Fahimi, Director of Value Improvement at UCSF Health

Campus
LSA



Jahan Fahimi, MD, PhD,
Associate Professor of Emergency Medicine,
Director of Value Improvement at UCSF Health



What does this enable?

Data

Development

Collaboration

Node

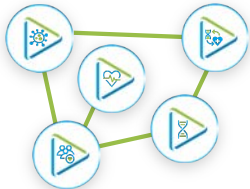


Is a Data Product
Domain-specific analysis
Immutable data and transient node
Deploy anywhere

Build a rapid Data Product
Iterative dev cycle
Integrate other functions (R, Python, ML)

SMART API
Secure data
Secure deploy

Mesh

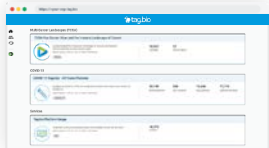


Many Nodes, many data types
Node functional diversity
Distributed analyses
Network effect on data value

Transfer apps between nodes
Federated functionality
No down time
An ecosystem of nodes

Distributed querying
Centralized analysis
Public/Private nodes

Portal



Publish data with analyses
Track analyses through history
Create COHORT/UDAT
Reference & Annotation nodes

Rapidly populated by an admin
Cohorts into Nodes
Transactional Nodes
Usage allows evolution of mesh

Reproducible, replayable analyses
Share analyses
Versioned resources
De-silo analysis types

