

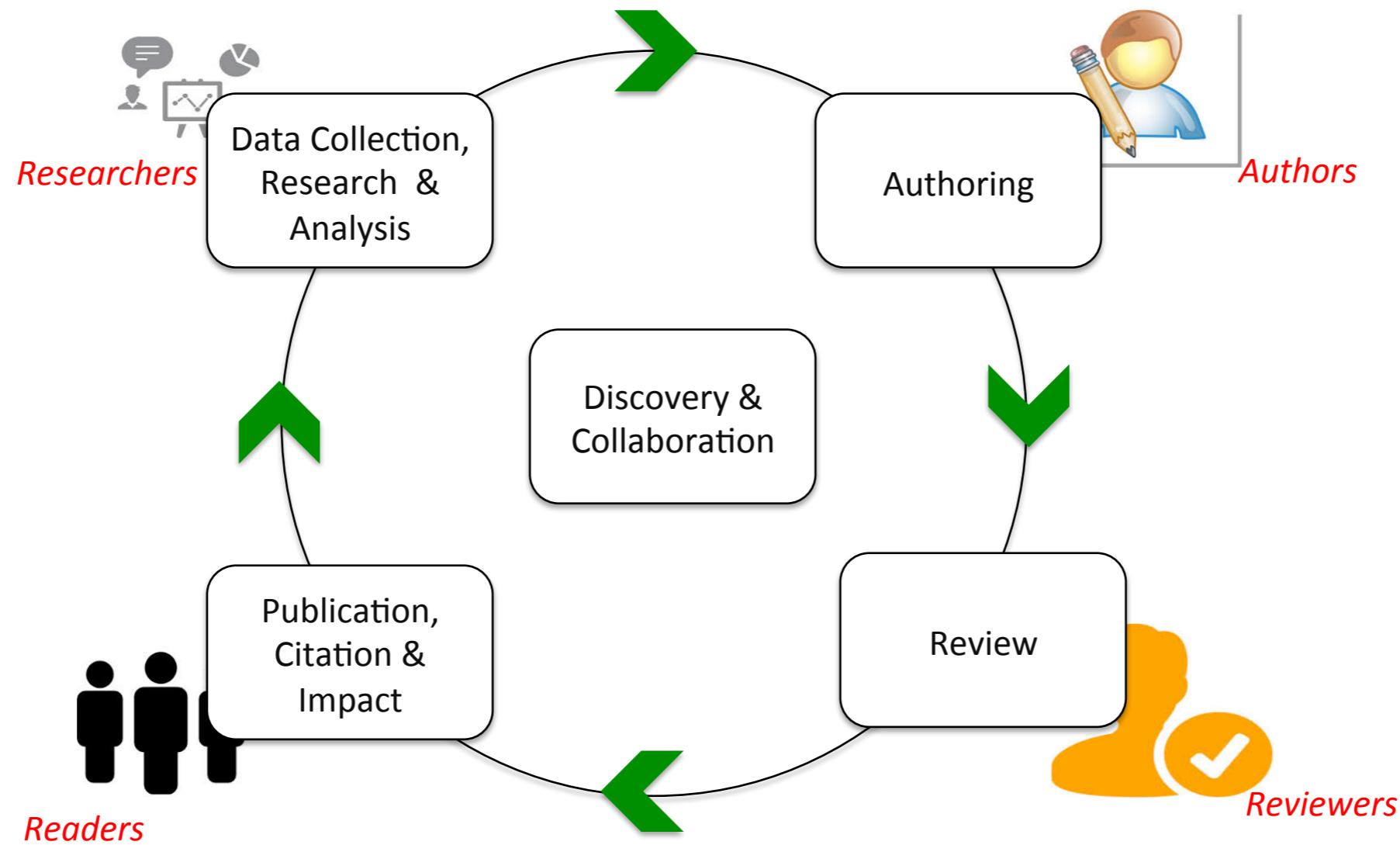


# Science Dataspaces for Data Management and Reproducibility

**Tanu Malik, Ian Foster, Kyle Chard  
Jonathan Goodall, Scott Peckham, Joseph Baker, Mike Gurnis**

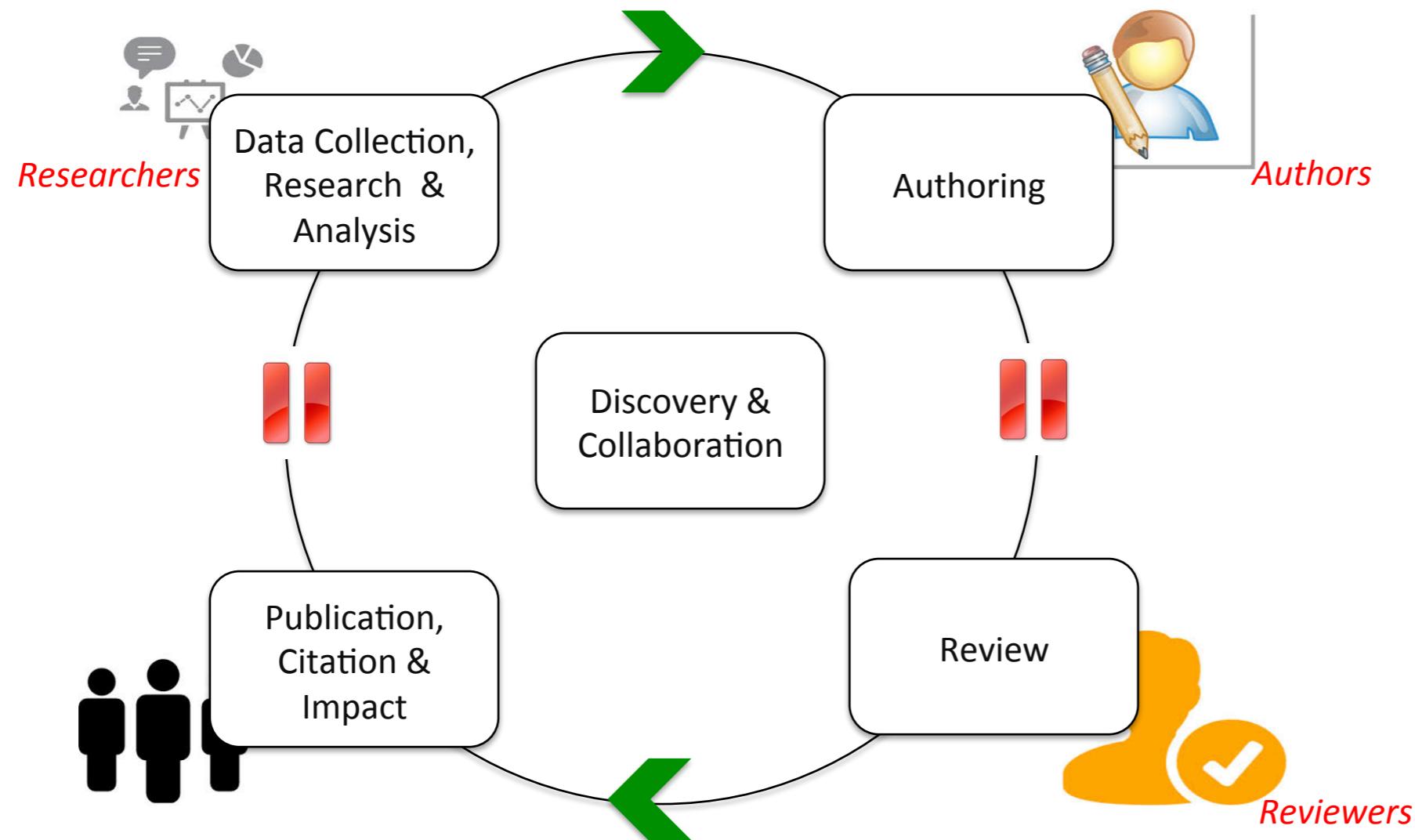


# The scientific method is self-correcting

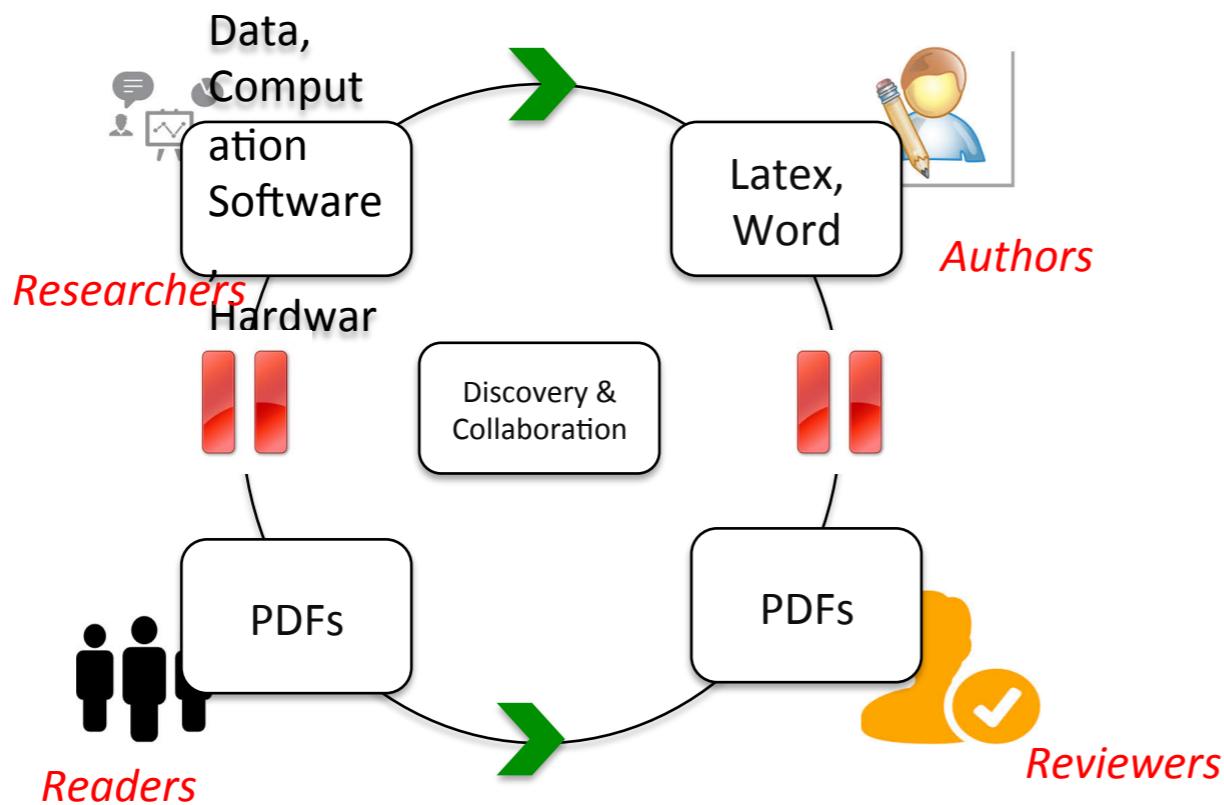




# But...Scientific Publishing is Not



# Computational Scientific Publishing is Broken



Computational science inputs are not linked with outputs.

- *Inputs:* Large quantities of data, complex data manipulation and/or numerical simulation use of large and often distributed software stacks, etc. (software, data, execution, environment)
- *Outputs:* Research papers (text-based, non-interactive)



# Encourage Open-X

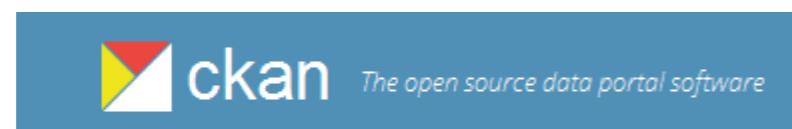
- X = access/code/data/design/standard
- Use the Internet and be more social



Dropbox



figshare  
credit for all your research



altmetrics

# Two examples of Open-X



Share  
with  
collaborators



Share publicly  
and  
get social credit



- Why aren't Github + DropBox sufficient for data management and reproducibility?

# Shared Github Repo

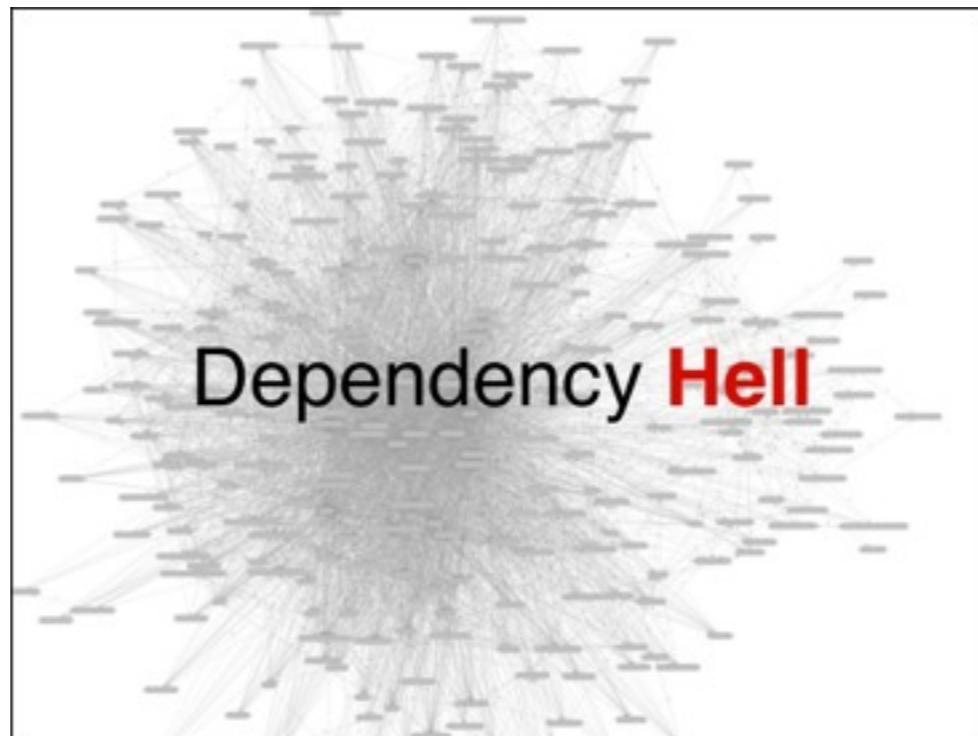
The screenshot shows a GitHub repository page. At the top, there's a navigation bar with links for 'Pull requests', 'Issues', and 'Gist'. Below the navigation bar, the repository name 'uva-hydroinformatics-lab / VIC\_Pre-Processing\_Rules' is displayed, along with statistics: 4 watches, 0 stars, and 0 forks. The main content area is titled 'Preprocessing Rules' and shows a summary bar with 62 commits, 1 branch, 0 releases, and 1 contributor. Below this, there are buttons for 'Branch: master', 'New pull request', and links for 'New file', 'Find file', and 'HTTPS'. A download link for 'Download ZIP' is also present. The main list displays files and their details:

File	Description	Last Commit
.gitattributes	Added .gitattributes & .gitignore files	2 months ago
.gitignore	Added .gitattributes & .gitignore files	2 months ago
Main_Shell_Script.scr	Shell script	2 months ago
combine_wind	combine_wind.c	2 months ago
combine_wind.c	Combine_wind.c	2 months ago
convertPrcp.cpp	convertPrcp.cpp	2 months ago
convertTmax.cpp	Source code	2 months ago
convertTmin.cpp	source code	2 months ago
convert_tif_ascii.py	convert_tif_ascii.py	2 months ago
create_LDAS_soil_nearest.c	source code	2 months ago
create_LDAS_veg_param.c	shell script	2 months ago
oet orism.c	Source code	2 months ago



# Missing Dependencies

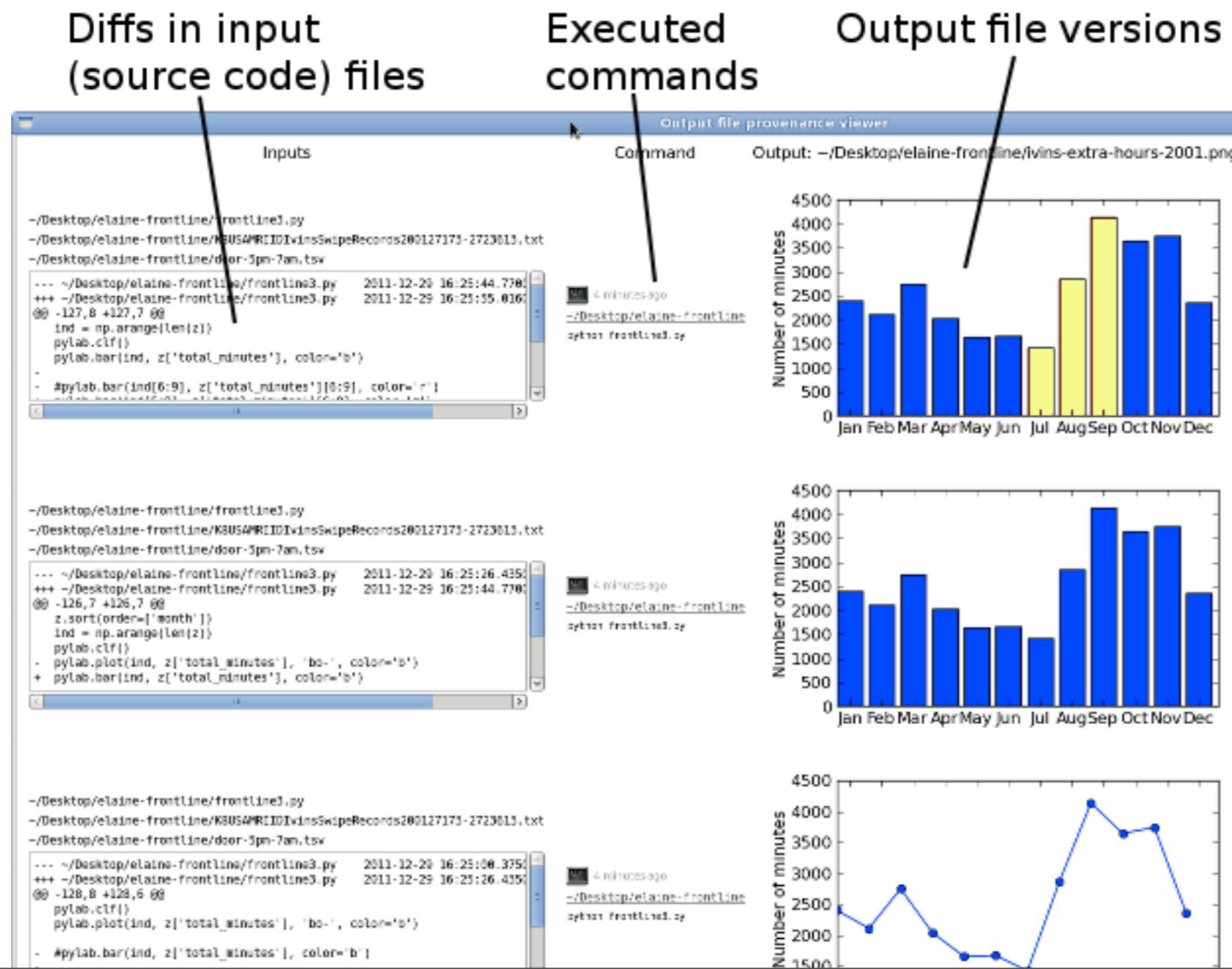
- Has the author shared everything, including code, data, and environment?
- Will this code, if downloaded, run in my computational environment?





# Missing Lineage

- Which version of the data produced this result?





# Missing Context

- What was I thinking when I produced this result?
    - Looking some documentation
    - Web-pages visited
    - Bash commands run
    - Associated tags





# SciDataspace

Personalized, Shareable Dataspace  
for  
Data Management and Reproducibility



GeoDataspace

[Log In](#) | [Sign Up](#)



GeoDataspace

The GeoDataspace framework assists scientists and communities to create and maintain collections of geounits that pertain to a specific research project. To create and use GeoDataspace, please sign up and download the client.



# GeoDataspace client



- Git and DropBox-like Python client for Linux and Mac OS X
  - annotate
    - provide semantic annotations
  - package
    - code, data, environment into Docker containers
  - track
    - tracks provenance of the scientific program

# Start the client

# GDClient



# Available Commands

# Annotate

# Track 1

# Package

# GeoDataspace Tools

Tool	Repeatability Feature	Users
SPADE <sup>1</sup>	Provenance (V)	*
CDE <sup>2</sup>	Packaging (P)	*
PTU <sup>3</sup>	P+V	
<b>SciDataspace<sup>4</sup></b>	<b>P+V+Usability</b>	<b>Geoscience</b> <b>NSF EarthCube</b>
PTU-NFS <sup>5</sup>	P'+V' (in Network File System)	DOE High-Energy Physics
LDV: Light-weight Database Virtualization <sup>6</sup>	P'+V' (in databases)	Urban Science

1. <https://github.com/ashish-gehani/SPADE>

2. <http://www.pgbovine.net/cde.html>

3. <https://gitlab.com/quanpt/provenance-to-use>

4. <https://bitbucket.org/tanum/scids-client>

# Preserved in GeoDataspace

The screenshot shows the GeoDataspace web interface. At the top, there's a blue header bar with the GeoDataspace logo and the text "Manage geounits | tanum". Below the header, there's a navigation bar with links for "manage geounits", "transfer geounits", and "dashboard".

The main content area displays a list of "GeoDataspaces". One dataset, "Dataset1", is expanded to show its contents. The dataset details are as follows:

- Created: 2014-09-24
- Owner: [utanum](#)
- Label:
- Overview | Tags | Sharing | Files | Packages | Commands

The "Files" tab is selected, showing a file tree structure:

- bin
- etc
- home
  - ubuntu
    - .cache
    - .config
    - default
    - monthlySoilMoistureEcohydro.csv** (highlighted with a blue selection bar)
    - run\_psp\_vic\_soilmoisture.scr
    - run\_psp\_vic\_soilmoisture.scr.cde
    - spatiotempSoilMoistureEcohydro.csv
    - spatiotempdatabase.py
    - spatiotempdatabase.pyc
    - uploadToS3.py
    - vicSoilMoistureEcohydro.pdf
    - vic\_calc\_mnth\_mc.py
    - vic\_monthly\_soilmoisture.py
    - vic\_soil\_moisture.py
  - lib
  - lib64
  - usr

Below the file tree, there's another dataset entry:

  - Created: 2014-09-24
  - Owner: [utanum](#)
  - Label:
  - test 2

At the bottom of the page, there are two links: "local.gl.com/datasets/index.html#" and "14-09-30 ★ oo test again".

A large black arrow points from the word "Edit" to the "Edit" link located next to the "X" icon in the Dataset1 interface.



# Manipulate Geounits

Save

Graph

Packages

- bin
- etc
- home
  - ubuntu
    - .cache
    - .config
    - default
    - monthlySoilMoistureEcohydro.csv
    - run\_psp\_vic\_soilmoisture.scr
    - run\_psp\_vic\_soilmoisture.scr.cde
    - spatiotempSoilMoistureEcohydro.csv
    - spatiotempdatabase.py
    - spatiotempdatabase.pyc
    - uploadToS3.py
    - vicSoilMoistureEcohydro.pdf
    - vic\_calc\_mnth\_mc.py
    - vic\_monthly\_soilmoisture.py
    - vic\_soil\_moisture.py
  - lib
  - lib64
  - usr

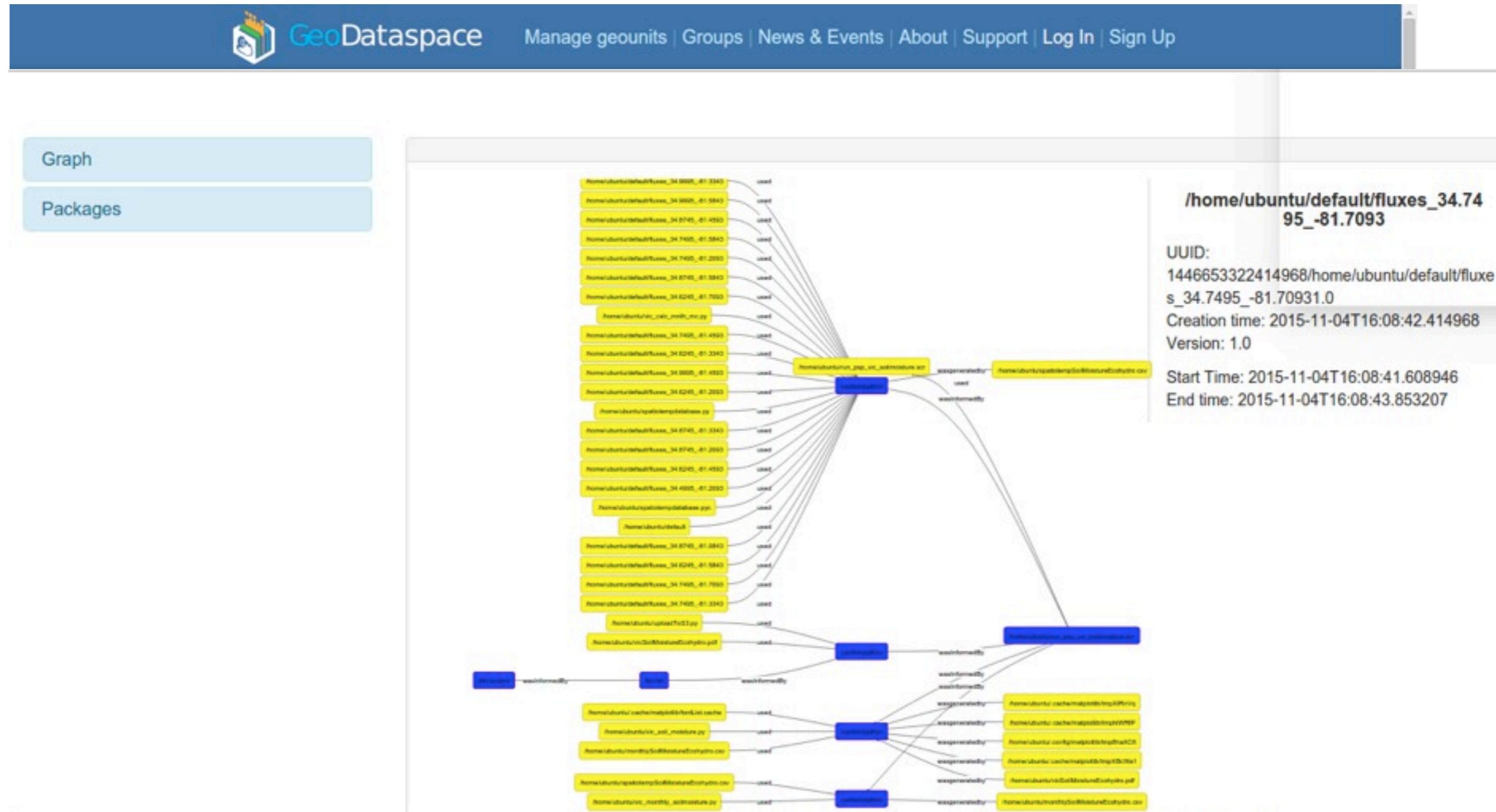
/home/karthik/Desktop/Extra\_Files/FLP/Tanu/Packages\_tmp/667c7d58b2fb1fae46bd92ab75333f34743718ec/cde-package/cde-root/home/ubuntu/monthlySoilMoistureEcohydro.csv

98	MC,200601,0.23,0.24,0.28
99	MC,200602,0.22,0.23,0.29
100	MC,200603,0.20,0.21,0.27
101	MC,200604,0.19,0.19,0.23
102	MC,200605,0.21,0.20,0.18
103	MC,200606,0.21,0.21,0.15
104	MC,200607,0.20,0.20,0.13
105	MC,200608,0.21,0.20,0.11
106	MC,200609,0.21,0.23,0.16
107	MC,200610,0.28,0.21,0.14
108	MC,200611,0.23,0.24,0.19
109	MC,200612,0.21,0.22,0.24
110	MC,200701,0.23,0.24,0.29
111	MC,200702,0.22,0.23,0.31
112	MC,200703,0.21,0.22,0.32
113	MC,200704,0.21,0.21,0.27
114	MC,200705,0.19,0.21,0.22
115	MC,200706,0.20,0.17,0.15
116	MC,200707,0.20,0.17,0.12
117	MC,200708,0.16,0.13,0.10
118	MC,200709,0.18,0.14,0.10
119	MC,200710,0.18,0.14,0.09
120	MC,200711,0.18,0.17,0.10
121	MC,200712,0.21,0.20,0.10
122	

Shell Access:

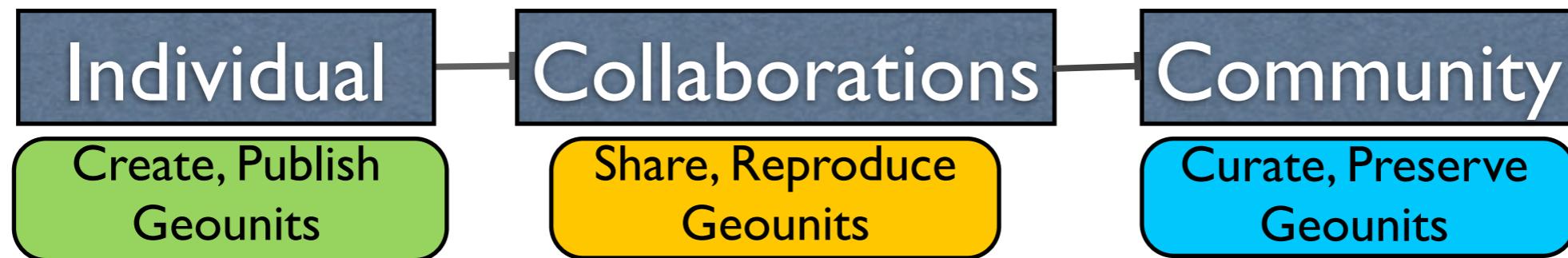
```
karthik@murray:~$  
karthik@murray:~$
```

# Track the workflow

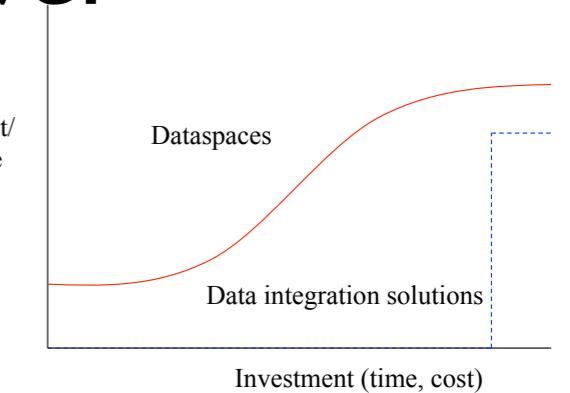




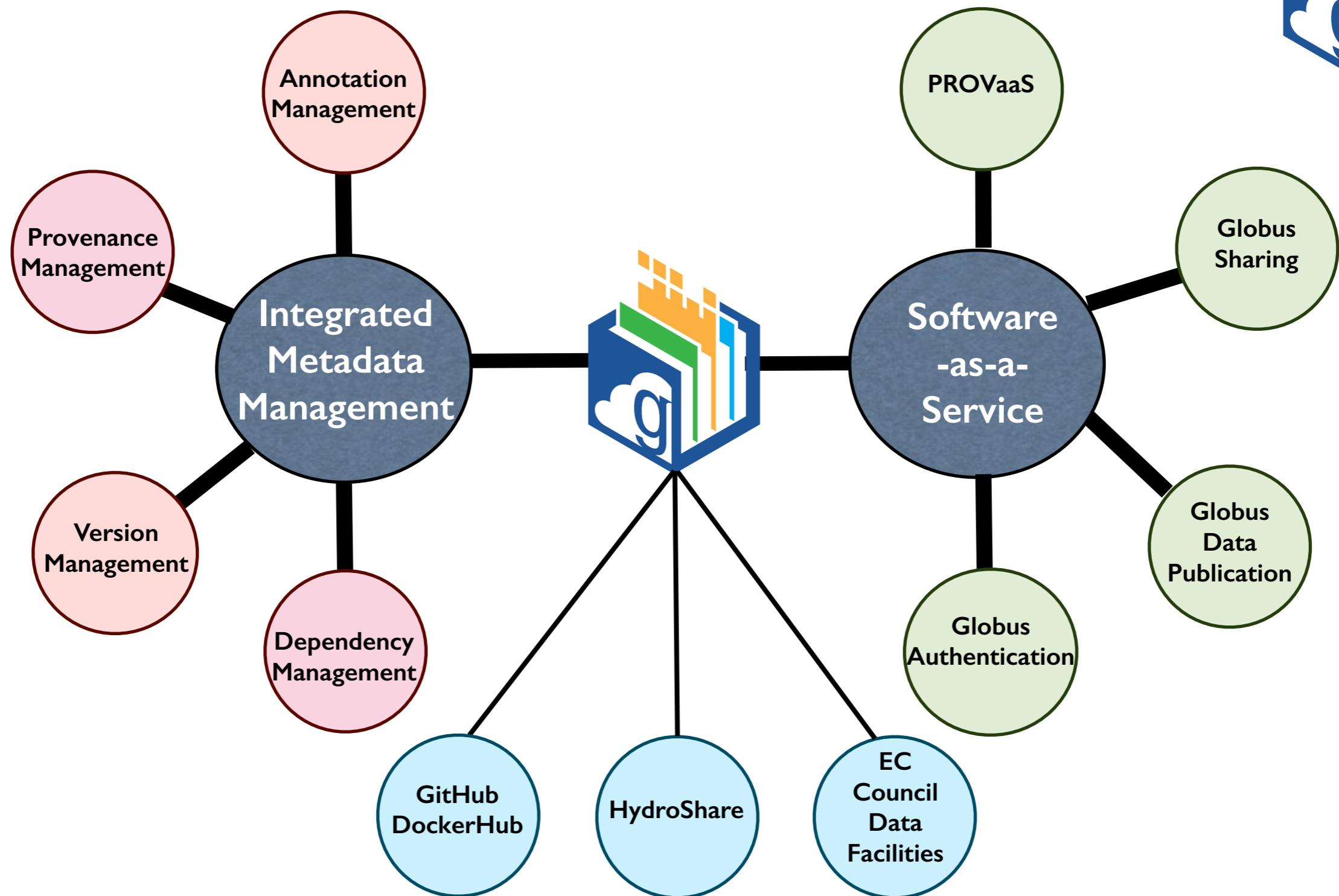
# Preserved in a Dataspace



- Cloud-hosted Dataspace that can be shared with the collaboration with the help of services, and becomes standardized over time.



# GeoDataspace Architecture





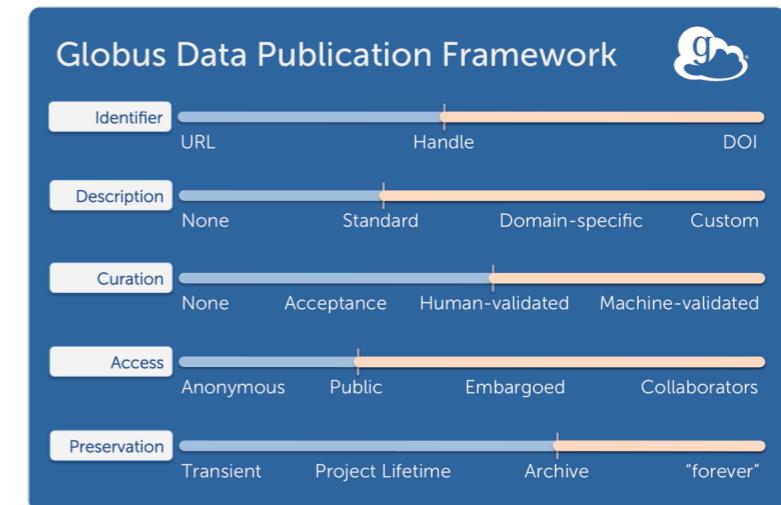
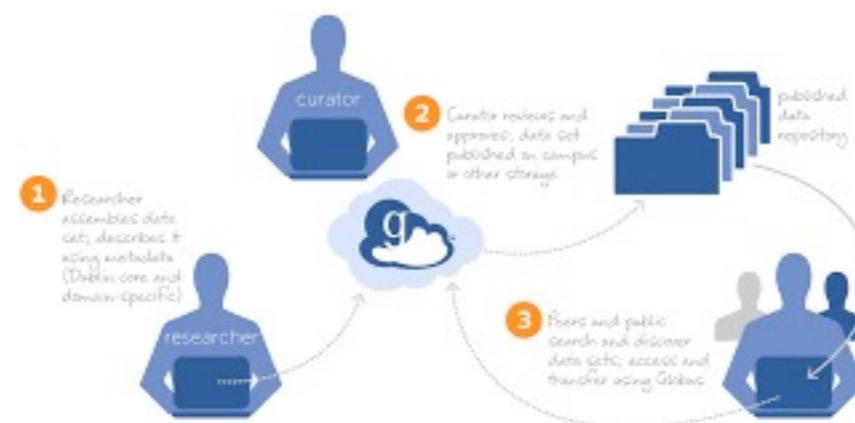
# Globus Services



## Authentication

The screenshot shows a login interface for WestGrid MyProxy. At the top, there are links for WestGrid, Compute Canada, About, and Contact. Below that, the title "WestGrid MyProxy" and "OAuth Client Authentication" are displayed. A message states: "The Client below is requesting access to your WestGrid account." It shows a client entry for "Name: Globus" and "URL: https://www.globus.org/". Below this, it says "If you approve, please sign in below with your WestGrid username and password." There are fields for "Username" and "Password".

## Transfer



## Sharing

## Publication

# PROVaaS



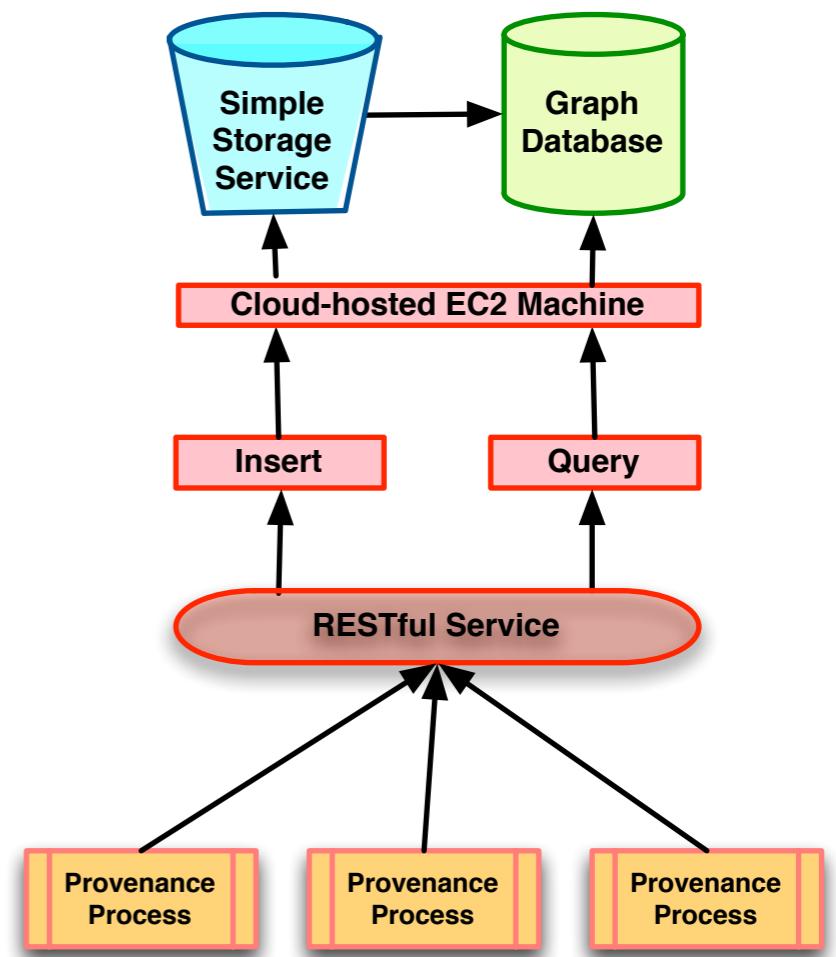
Show apps PROVaaS alpha

News Quick Links Github About Contact us

Your Provenance Host

News

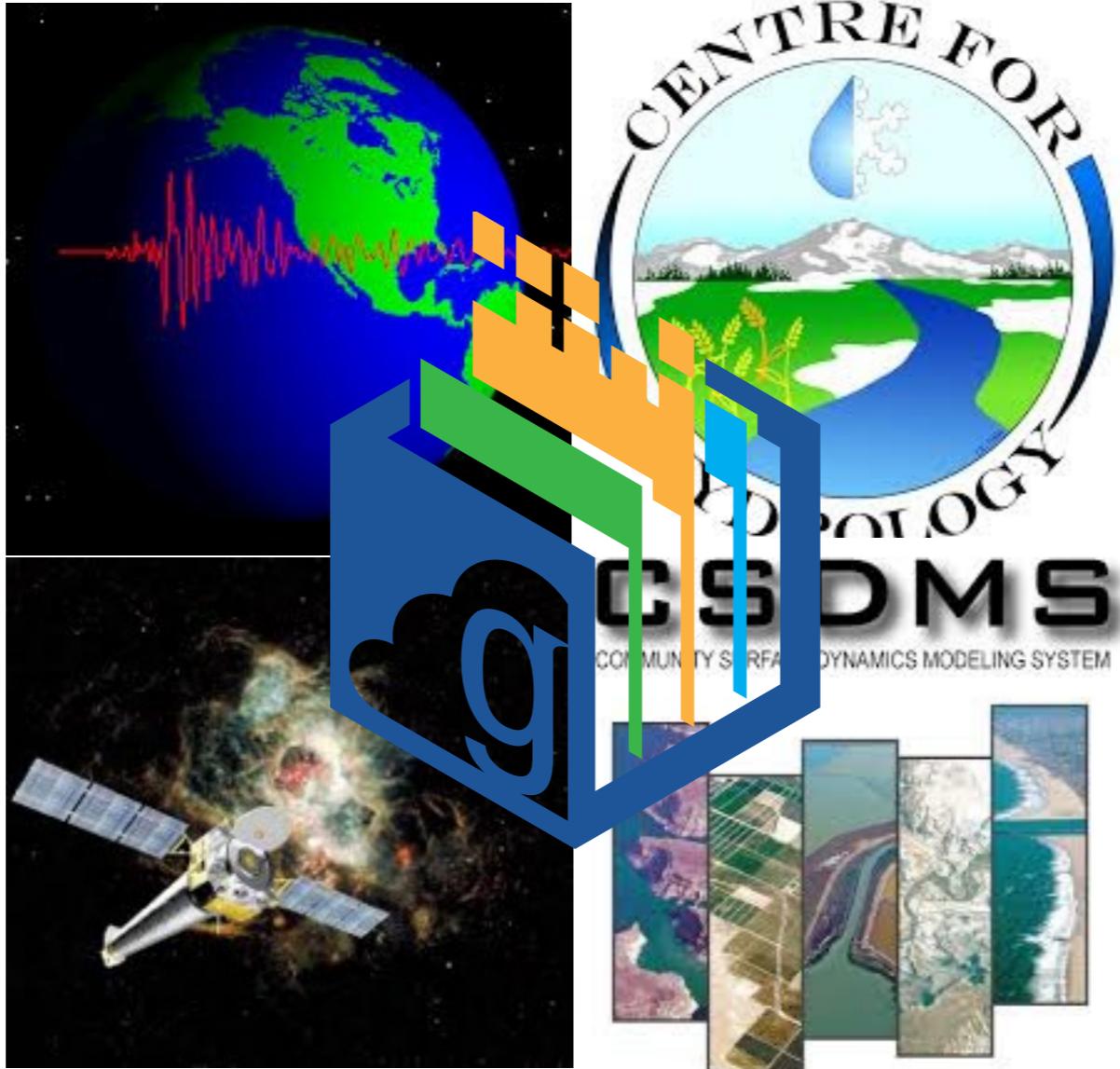
04-09-14 Demonstrating PROVaaS at Earth Tech Hands Meeting  
04-05-14 PROVaaS website launched  
04-01-14 Provenance API launched





# Bringing Order to Chaos in Science Use Cases

Solid Earth      Hydrology



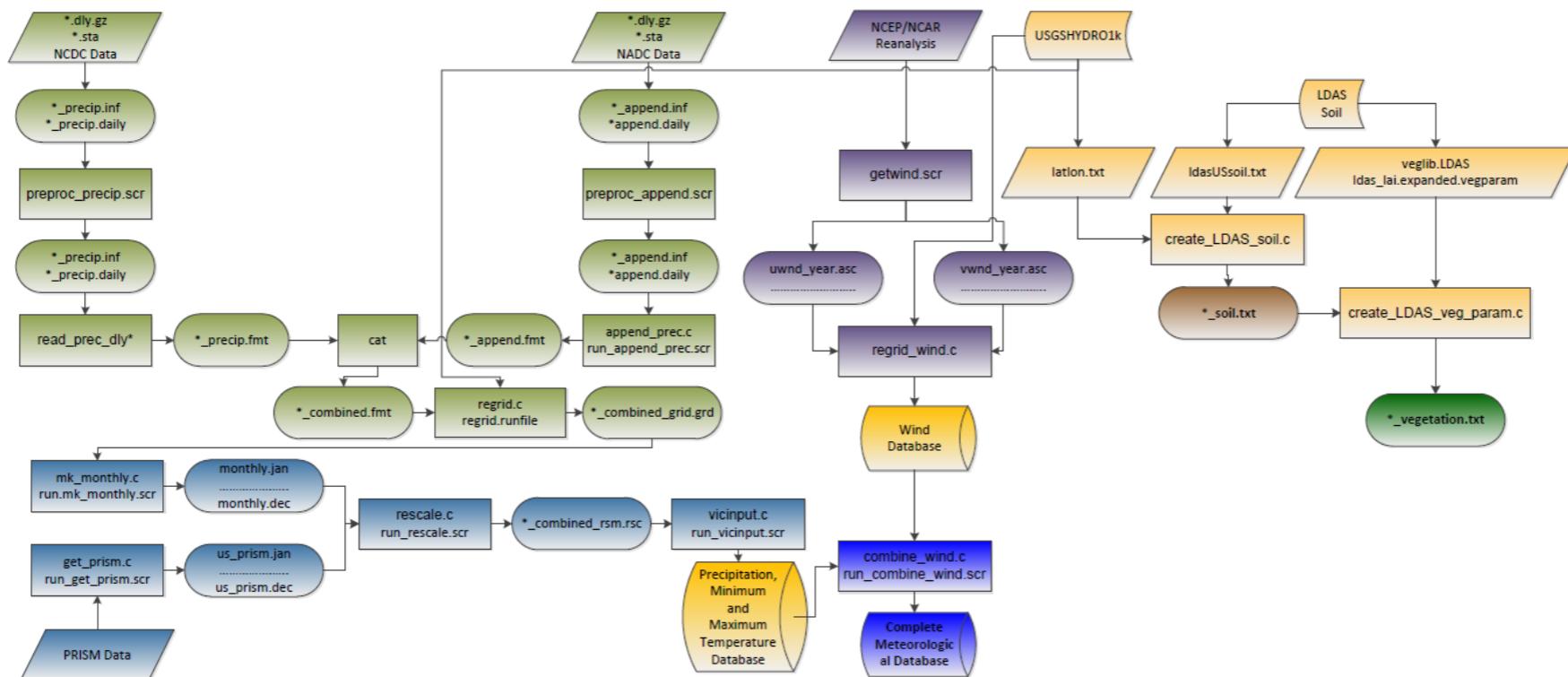
Space Science

CSDMS



# Hydrology

## (Curation, Encapsulation, Reuse)



- Data processing steps for the VIC model

# The reality



```
irods@ec2-54-86-215-185:~/iRODS/server/bin$ cd cmd/
irods@ec2-54-86-215-185:~/iRODS/server/bin/cmd$ ls
adjprcp_rsm.rsc          forcingData
adjtmin_grid.grd          gauss_t62_lat.list
amqprecv.py                gauss_t62_lon.list
amqpsend.py                gdal.py
Basin                      gdal.pyc
basin_prcp_adj(fmt)        get_prism
basin_prcp(fmt)            get_prism.c
boundaries_US_SLAD_2010.dbf get_prism_ir.scr
boundaries_US_SLAD_2010.prj getwind.scr
boundaries_US_SLAD_2010.sbn hello
boundaries_US_SLAD_2010.sbx hello.scr
boundaries_US_SLAD_2010.shp inputPrcp.scr
boundaries_US_SLAD_2010.shp.xml inputTmax.scr
boundaries_US_SLAD_2010.shx inputTmin.scr
build                     irodsAgent
catchment.dbf              irodsReServer
catchment.prj              irodsServer
catchment.shx              irodsServerMonPerf
checkData                  irodsXmsgServer
climate                   latlong99.txt
cmd                       latlon.txt
combine_wind               LDAS
combine_wind.c             ldas_lai.expanded.vegparams
convertPrcp                ldas_latlon2.scr
convertPrcp.cpp             ldas_latlon3.scr
convert_tif_ascii.py         ldas_latlon4.scr
convertTmax                 ldas_latlon.scr
convertTmax.cpp             ldas_soil.scr
convertTmin                 ldas_veg.scr
convertTmin.cpp             LeastSoilMoistureduration.py
coop_tob.his                list.pl
create_LDAS_soil_nearest    mask2latlon
create_LDAS_soil_nearest.c   mask2latlon.c
create_LDAS_veg_param       metadata.txt
create_LDAS_veg_param.c     meteoCombined
data_US_SLAD_2010.csv       mk_mnth
default                    mk_monthly
DEM.tif                    mk_monthly.c
DSMwithpopulation.py        mk_monthly_ir.scr

old
osgeo.bak
output_1.txt
PamAuthCheck
PopulationVsSoilMoisture.scr
popvssm.run
Prcp
prcp.daily
prcp.inf
prcp_tobAdj.scr
prec_tob_adj
prec_tob_adj.f
prec_tob_adj.input
preproc_precip.scr
prism
prism-rawdata
python_script1.py
raw_wind
read_prec_dly
read_prec_dly.f
readRodSLog.py
read_temp_dly
read_tempn_dly
read_tempx_dly
regrdPrcp
regrd_prcp.scr
regrdTmax
regrd_tmax.scr
regrdTmin
regrd_tmin.scr
regridPrcp
regridPrcp.runfile
regridTmax
regridTmin
regridTmin.runfile
regrid_wind
regrid_wind.c
rescale
rescale.c

rescale_ir.scr
run_combine_wind_ir.scr
run_combine_wind.scr
run_convert_prcp.scr
run_convert_tif_ascii.scr
run_convert_tmax.scr
run_convert_tmin.scr
run_get_prism.scr
run_mk_monthly.scr
run_psp_vic_evapotranspiration.scr
run_psp_vic_sm.scr
run_psp_vic_soilmoisture1.scr
run_psp_vic_soilmoisture2.scr
run_psp_vic_soilmoisture3.scr
run_psp_vic_soilmoistureComparison.scr
run_psp_vic_soilmoisture.scr
run_regrid_wind_ir.scr
run_regrid_wind.scr
run_rescale.scr
run_vicinput_ir.scr
run_vicinput.scr
script_1.scr
script1.scr
script_2.scr
script_3.scr
script_4.scr
script_5.scr
script_6.scr
script_7.scr
script.save
script.scr
script_test.scr
script_vic_pre-processing.scr
sm_comparison.py
sm_seasonal.py
smseasonal.scr
soil
spatiotempdatabase.py
spatiotempdatabase.pyc

stationinfo.txt
temp_wind
TerraPopCountieswzVicOutput.py
test
test3.py
test_execstream.py
test.py
test.scr
tiff2ascii.py
Tmax
tmax_tob_adj
tmax_tob_adj.f
tmax_tobAdj.scr
Tmin
tmin_tob_adj
tmin_tob_adj.f
tmin_tobAdj.scr
tob
univMSSIface.sh
uploadToS3.py
vacuumdb.pl
vegetation
vic_calc_mnth_mc1.py
vic_calc_mnth_mc2.py
vic_calc_mnth_mc.py
vic_calc_mnth_peb.py
vic_evapotranspiration.py
vicinput
vicinput.c
vic_monthlyPEBestimates.py
vic_monthly_soilmoisture2.py
vic_monthly_soilmoisture.py
VIC_Pre_processing_script.scr
vic_soil_moisture3.py
vic_soil_moisture.py
vic_spatiotempdatabase.py
wind_latlong.txt
write.py
```

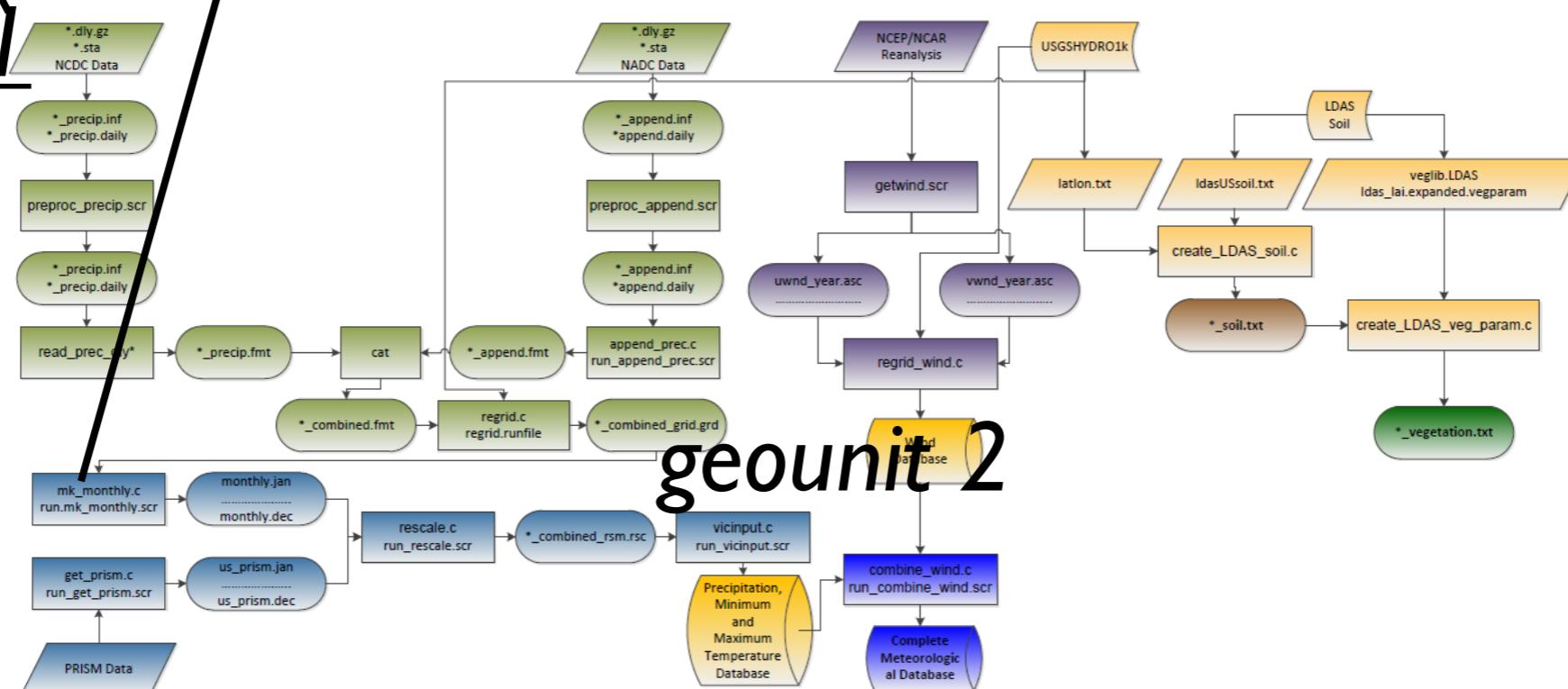
# Organized in space



```
irods@ec2-54-86-215-185:~/IRODS/server/bin$ cd cmd/  
irods@ec2-54-86-215-185:~/IRODS/server/bin/cmd$ ls  
adjprca_rsn.rsc  
adjtmn_grid.grd  
anomrcv.rsc  
  
amposend.py  
Basin  
basin_prcp_adj.fmt  
basin_prcp.fmt  
boundaries_US_SLAD_2010.dbf  
boundaries_US_SLAD_2010.prj  
boundaries_US_SLAD_2010.sbn  
boundaries_US_SLAD_2010.vbx  
boundaries_US_SLAD_2010.shp  
boundaries_US_SLAD_2010.shp.xml  
boundaries_US_SLAD_2010.shx  
build  
catchment.dbf  
catchment.prj  
catchment.shx  
checkData  
climate  
cmd  
combine_wind  
  
convert_Wrap.c  
convertPrcp  
convertPrcp.cpp  
convert_tif_ascii.py  
convertTmax  
convertTmax.cpp  
convertTmin  
convertTmin.cpp  
coop_top.his  
create_LDAS_soil_nearest  
create_LDAS_soil_nearest.c  
create_LDAS_veg_param  
create_LDAS_veg_param.c  
data_US_SLAD_2010.csv  
default  
DEM.tif  
DMSwithcorrelation.ov  
forcingData  
gauss_t62_lat.list  
gauss_t62_lon.list  
gdal.py  
gdal.pyc  
get_prism  
get_prism.c  
get_prism_ir.scr  
getwind.scr  
hello  
hello.scr  
inputPrcp.scr  
inputTmax.scr  
inputTmin.scr  
irodsAgent  
irodsReServer  
irodsServer  
irodsServerMonPerf  
irodsXmpServer  
latlon99.txt  
latlon.txt  
LDAS  
  
ldas_wat_expanded_rain.scr  
ldas_latlon2.scr  
ldas_latlon3.scr  
ldas_latlon4.scr  
ldas_latlon.scr  
ldas_soil.scr  
ldas_veg.scr  
LeastSelMoistureduration.py  
list.pl  
mask2latlon  
mask2latlon.c  
metadata.txt  
metoCombined  
nk_uth  
nk_monthly  
nk_monthly.c  
nk_monthly_ir.scr
```

```
old
osgeo.bak
output_1.txt
PanAuthCheck
PopulationVsSoilMoisture.scr
popvsm.run
Prcp
prcp.daily
prcp.inf
prcp_tobadj.scr
prec_tob_adj
prec_tob_adj.f
prec_tob_adj.input
preproc_precip.scr
prism
prism-rawdata
python_script1.py
raw_wind
read_prec_dly
read_prec_dly.f
readObsLog.py
read_temp_dly
read_temp_dly.f
read_tempn_dly
read_tempx_dly
regrdPrcp
regrd_prcp.scr
regrdTmax
regrd_tmax.scr
regrdTmin
regrd_tmin.scr
regridPrcp
regridPrcp.runfile
regridTmax
regridTmin
regridTmin.runfile
regrid_wind
regrid_wind.c
rescale
rescale.c
rescale_ir.scr
run_combine_wind_ir.scr
run_combine_wind.scr
run_convert_srcp.scr
run_convert_tif_ascii.scr
run_convert_thmx.scr
run_convert_tm1n.scr
run_get_prism.scr
run_mk_monthly.scr
run_psp_vic_soilmoisture1.scr
run_psp_vic_soilmoisture2.scr
run_psp_vic_soilmoisture3.scr
run_psp_vicSoilMoistureComparison.scr
run_psp_vic_soilmoisture.scr
run_regrid_wind_ir.scr
run_regrid_wind.scr
run_rescale.scr
run_vicinput_ir.scr
run_vicinput.scr
script_1.scr
script1.scr
script_2.scr
script_3.scr
script_4.scr
script_5.scr
script_6.scr
script_7.scr
script.save
script.scr
script_test.scr
script_vic_pre-processing.scr
sm_comparison.py
sm_seasonal.py
smseasonal.scr
soil
spatiotempdatabase.py
spatintempdatabase.nrr
stationinfo.txt
temp_wind
TerraPopCountiesw2VicOutput.py
test
test3.py
test_execstream.py
test.sjy
test.scr
tiff2ascii.py
tmax
tmax_tob_adj
tmax_tob_adj.f
tmax_tobAdj.scr
Tmin
tmin_tob_adj
tmin_tobAdj.f
tmin_tobAdj.scr
tob
univMSSInterface.sh
uploadToS3.py
vacuumdb.pl
vegetation
vic_calc_mnth_mc1.py
vic_calc_mnth_mc2.py
vic_calc_mnth_mc.py
vic_calc_mnth_peb.py
vic_evapotranspiration.py
vicinput
vicinput.c
vic_monthlyPEBestimates.py
vic_monthly_soilmoisture2.py
vic_monthly_soilmoisture.py
VIC_Pre_processing_script.scr
vic_soil_moisture3.py
vic_soil_moisture.py
vic_soiltempdatabase.py
wind_latlong.txt
write.py
```

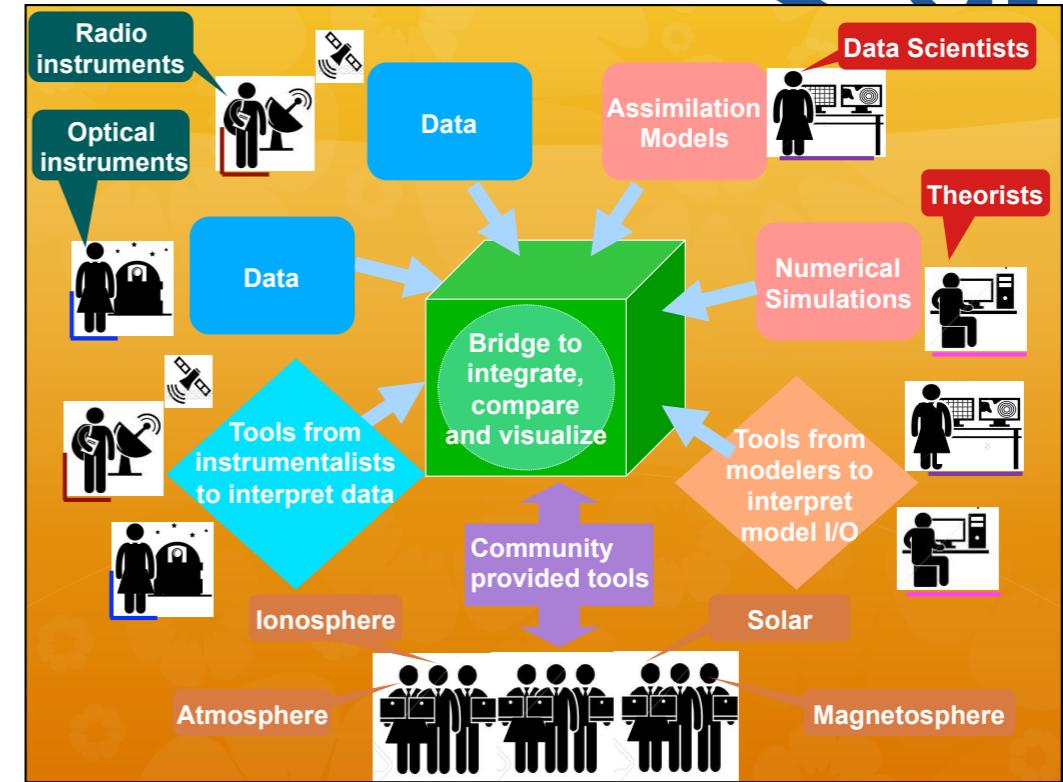
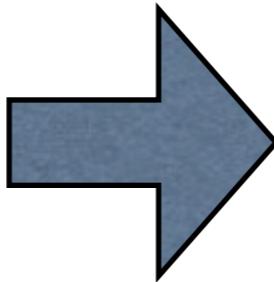
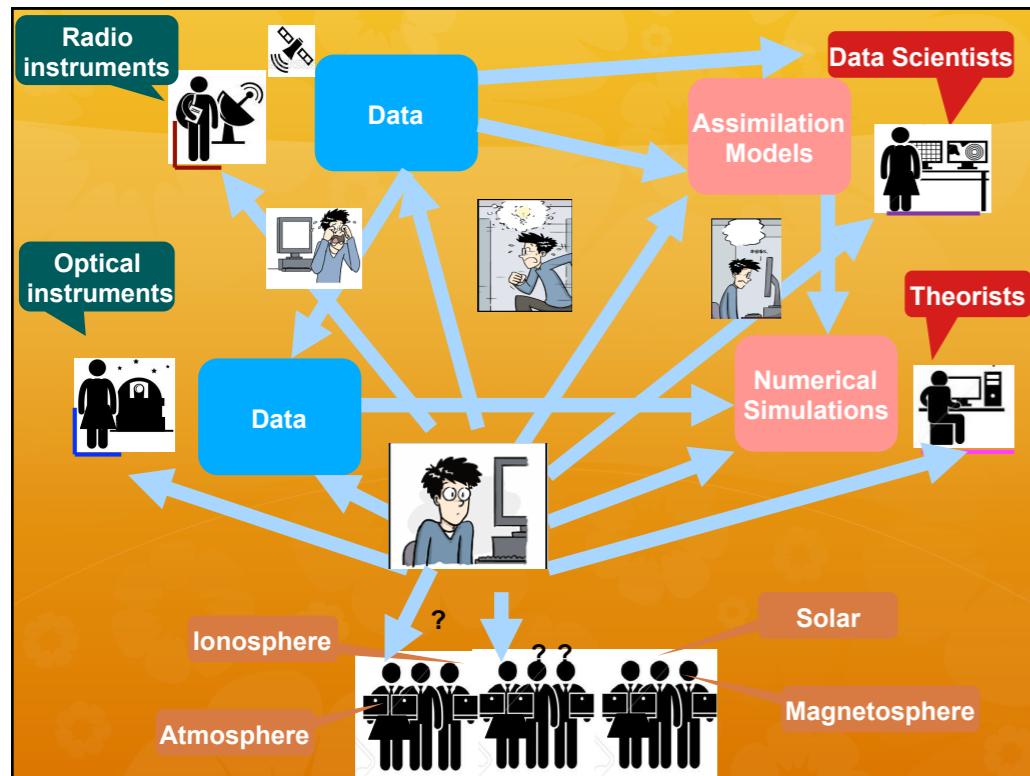
# geounit





# Space Science

## (Model and Data Integration)



InGeo: Integrative GeoScience Observatory

EarthCube Integrative Activity: Asti Bhatt,  
Russell Cosgrove (SRI International)

# Summary

- Capability-rich tools
  - Self-curation
  - Tracking cause and effect between data and models
  - Ensuring reproducibility
  - Support services: discovery, sharing, publication
- **Simplify** model and data management for computational/data geoscientists
- **Faster and reproducible hand-shakes** among faculty and students
- **Cuts down IT support** for modeling centers and real science



# Track it!

- Science Usecases, Reports, Presentations, News
  - <http://workspace.earthcube.org/geodataspace>
- Source Code (Public Release Pending)
  - <http://github.com/TanuMalik/SciDataspace/Geo>
- The GeoDataspace (Internal URL)
  - <https://scidataspace.org/geo>

# Acknowledgements



EARTH**CUBE**



- National Science Foundation
- EarthCube Community
- Globus team
- CI team