

Reproducible high energy physics analyses

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CERN

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Knowledge

Environment

Data

Software

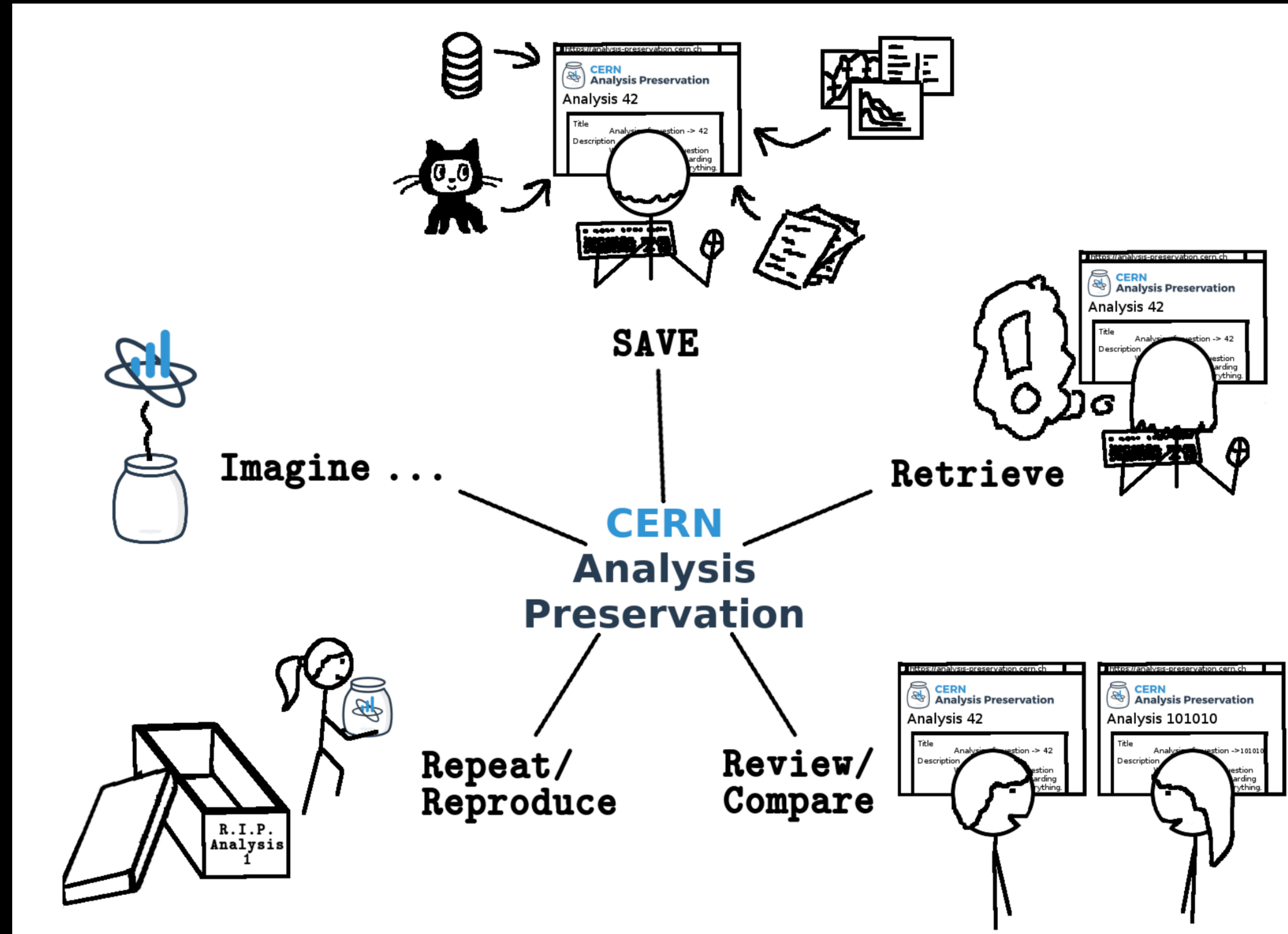
High turnover of researchers

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Brook, H. Brown, S. Brusa, A. Büchler-Germann, A. Bursche, J. Buytaert, S. Cadetdu, J.M. Calcedo Carvajal, O. Callot, M. Calvi, M. Calvo Gomez, A. Camboni, W. Cameron, L. Camilleri, P. Campana, A. Carbone, G. Carboni, R. Cardinale, A. Cardini, J. Carroll, L. Carson, K. Carvalho Akiba, G. Casse, M. Cattaneo, B. Chadaï, M. Charles, Ph. Charpentier, J. Cheng, N. Chlapolini, A. Chlopik, J. Christensen, P. Ciambri, X. Cid Vidal, P.J. Clark, P.E.L. Clarke, M. Clemencic, H.V. Cliff, J. Closier, C. Coca, V. Coco, J. Cogan, P. Collins, A. Comerma-Montells, F. Constantin, G. Coni, A. Conu, P. Cooke, M. Coombes, B. Corajod, G. Corti, G.A. Cowan, R. Currie, B. D'Almagne, C. D'Ambrosio, I. D'Ancone, W. Da Silva, E. Dane, P. David, I. De Bonis, S. De Capua, M. De Cian, F. De Lorenzi, J.M. De Miranda, L. De Paula, P. De Simone, D. Decamp, G. Decreuse, H. Degaudenzi, M. Deissenroth, L. Del Buono, C.J. Densham, C. Deplano, O. Deschamps, F. Dettori, J. Dickens, H. Dijkstra, M. Dima, S. Donleavy, P. Dorman, D. Dossott, A. Dovbnya, R. Dumps, F. Dupertuis, L. Dwyer, R. Dzholiyadin, C. Eames, S. Easo, U. Egede, V. Egorychev, S. Eidelman, D. van Eijk, F. Eisold, S. Eisenhardt, L. Eklund, D.G. d'Enterria, D. Esperante Pereira, L. Esteve, E. Fanchini, C. Färber, G. Fardell, C. Farinelli, S. Farry, V. Fave, G. Felici, V. Fernandez Albor, M. Ferro Luzzi, S. Filippov, C. Fitzpatrick, W. Flögel, F. Fontanelli, C. Forti, R. Forty, C. Fournier, B. Franek, M. Frank, C. Frei, M. Frosini, J.L. Funguairino Pazos, S. Furcas, A. Gallas Torreira, D. Galli, M. Gandelman, P. Gandini, Y. Gao, J.-C. Garnier, L. Garrido, D. Gascon, C. Gaspar, A. Gaspar De Valenzuela Cue, J. Gassner, N. Gauvin, P. Gavillet, M. Gersabeck, T. Gershon, Ph. Ghez, V. Gibson, Yu. Giliński, V.V. Gilgorov, C. Göbel, D. Golubkov, A. Golutvin, A. Gomes, G. Gong, H. Gong, H. Gordon, M. Grabalosa Gándara, V. Gracco, R. Gradani Diaz, L.A. Granado Cardoso, E. Graugés, G. Graziani, A. Grecu, S. Gregson, G. Guerrero, B. Gul, E. Gushchik, Yu. Guz, Z. Guzik, T. Gys, G. Haefliger, S.C. Haines, T. Hampson, S. Hansmann-Menzemer, R. Harj, N. Harnew, P.F. Harrison, J. He, K. Hennessy, P. Henrard, J.A. Hernandez Morala, E. van Herwijnen, A. Hicheur, E. Hicks, H.J. Hilke, W. Holmbeck, K. Holubnyov, P. Hopchev, W. Hulsbergen, P. Hunt, T. Huss, R.S. Huston, D. Hutchcroft, F. Iacoangeli, V. Iakovenko, C. Iglesias Escudero, C. Igner, J. Imong, R. Jacobsson, M. Jahjah Hussein, O. Janel, E. Jans, F. Jansen, P. Jaton, B. Jean-Marie, M. John, D. Johnson, C.R. Jones, B. Jost, F. Kapusta, T.M. Karbach, A. Kashchuk, S. Katvasz, J. Keaveney, U. Kerzel, T. Kotl, A. Keune, S. Khalil, B. Khanji, Y.M. Kim, M. Knecht, S. Kobliat, A. Konoplyanikov, P. Koppenburg, M. Korolev, A. Kozlinskiy, L. Kravchuk, R. Kristic, G. Krocker, P. Krokovny, F. Kruse, K. Krusell, M. Kucharczyk, I. Kudryashov, S. Kukulak, R. Kumar, T. Kvaratskheliya, V.N. La Thi, D. Lacarriere, A. Lai, R.W. Lambert, G. Lanfranchi, C. Langenbruch, T. Latham, R. Le Gac, J. P. Lees, R. Lefevre, A. Leflat, J. Lefrançois, F. Lohner, M. Lenzi, O. Leroy, T. Lesiak, L. Li, Y.Y. Li, L. Li Gioi, J. Libby, M. Lieng, R. Lindner, S. Lindsey, C. Linn, B. Liu, G. Liu, S. Löffler, J.H. Lopes, E. Lopez Asamar, N. Lopez March, P. Loveridge, J. Luisier, B. Mcharek, F. Machefert, I.V. Machikhiliyan, F. Maciuc, O. Maev, J. Magnin, A. Maier, S. Malde, R.M.D. Mamunur, G. Manca, G. Mancinelli, N. Manglafave, U. Marconi, R. Märki, J. Marks, G. Martellotti, A. Martens, L. Martin, D. Martinez Santos, A. Massafferri, Z. Mathe, C. Matteuzzi, V. Matveev, E. Maurice, B. Maynard, A. Mazurov, G. McGregor, R. McNulty, C. McLean, M. Merk, J. Merkel, M. Merkin, R. Messl, F.C.D. Metcal, S. Miglioranti, M.-N. Milard, G. Molin, S. Montell, D. Moran, J. Morant, J.V. Morris, J. Moseicki, R. Mountain, I. Mous, F. Muhel, R. Muresan, F. Murtas, B. Muryn, M. Musy, J. Myroie-Smith, P. Naik, T. Nakada, R. Nandakumar, J. Nardulli, A. Nawrot, M. Nedos, M. Needham, N. Neuleid, P. Neustroev, M. Nicol, L. Nicolas, S. Nies, V. Niess, N. Nikilin, A. Noor, A. Oblakowska-Mucha, V. Obraztsov, S. Oggero, O. Okhrimenko, R. Oldeman, M. Orlandea, A. Ostankov, J. Palacios, M. Palutan, J. Panman, A. Papadellis, A. Papanestis, M. Pappagallo, C. Parkes, C.J. Parkinson, G. Passaleva, G.D. Patel, M. Patel, S.K. Paterson, G.N. Patrick, C. Patrignani, E. Pauna, C. Pauna (Chiojeanu), C. Pavel (Nicorescu), A. Pazos Alvarez, A. Pellegrino, G. Penso, M. Pepe Altarelli, S. Perazzini, D.L. Perego, E. Perez Trigo, A. Pérez Calero Yzquierdo, P. Perrot, G. Pessina, A. Petrella, A. Petrolini, E. Picatoste Olloqui, B. Pie Valls, D. Piodigrossi, B. Pietrzyk, D. Pinci, S. Playfer, M. Plo Casasus, M. Poli Loner, G. Polok, A. Poluektov, E. Polycarpo, D. Popov, B. Popovici, S. Poss, C. Potterat, A. Powell, S. Pozzi, T. du Pree, V. Pugatch, A. Puig Navarro, W. Qian, J.H. Rademacker, B. Rakotomiramanana, I. Raniuk, G. Raven, S. Redford, W. Reecce, A.C. dos Reis, S. Ricciardi, J. Riera, K. Rinnert, D.A. 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Sparkes, E. Spiridonov, P. Spradlin, A. Srednicki, F. Stagni, S. Stahl, S. Steiner, O. Steinkamp, O. Stonyakin, S. Stoica, S. Stone, B. Storaci, U. Straumann, N. Styles, M. Szczekowski, P. Szczepka, T. Szumlak, S. T'Jampens, E. Tarkovskiy, E. Teodorescu, H. Terrier, F. Teubert, C. Thomas, E. Thomas, J. van Tilburg, V. Tisserand, M. Tobin, S. Topp Joergensen, M.T. Tran, S. Traynor, U. Trunk, A. Tsaregorodtsev, N. Tuning, A. Ukleja, O. Ullaland, U. Uwer, V. Vagnoni, G. Valent, A. Van Lysebetten, R. Vazquez Gomez, P. Vazquez Regueiro, S. Vecchi, J.J. Velthuis, M. Veltri, K. Vervink, B. Viaud, I. Vidoau, D. Vieira, X. Vilasis Cardona, J. Visniakov, A. Vollhardt, D. Volyanskyy, D. Voong, A. Vorobyev, An. Vorobyev, H. Voss, K. Wacker, S. Wandemuth, J. Wang, D.R. Ward, A.D. Webber, D. Websdale, M. Whitehead, D. Wiedner, L. Wiggers, G. Wilkinson, M.P. Williams, M. Williams, F.F. Wilson, J. Wishahi, M. Witek, W. Witzeling, M.L. Woodward, S.A. Wolton, K. Wylie, Y. Xia, F. Xing, Z. Yang, G. Ybeles Smit, R. Young, O. Yushchenko, M. Zang, L. Zhang, Y. Zhang, A. Zhelezov, E. Zverev (collapse list)

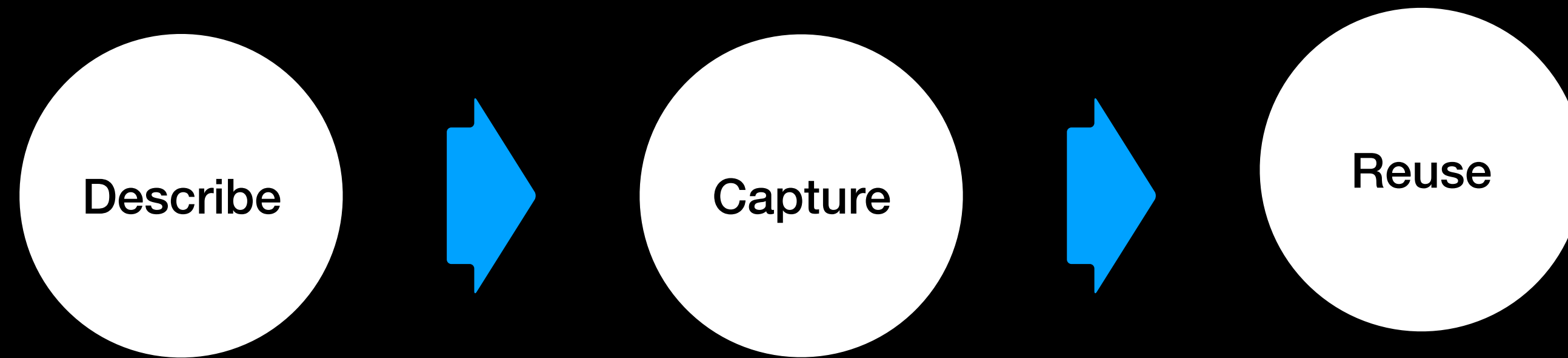
(Submitted on 16 Aug 2010 (v1), last revised 16 Sep 2010 (this version, v2))

“Particle Physics author lists change with time. Here that of the first @LHCbExperiment paper in 2010. Violet: still in LHCb. Blue: left LHCb” - @PKoppenburg

Use cases



Three pillars



CERN Analysis Preservation

A platform for **preserving knowledge** and **assets** of an individual physics analysis

Capturing the elements needed to **understand** and **rerun** an analysis even several years after

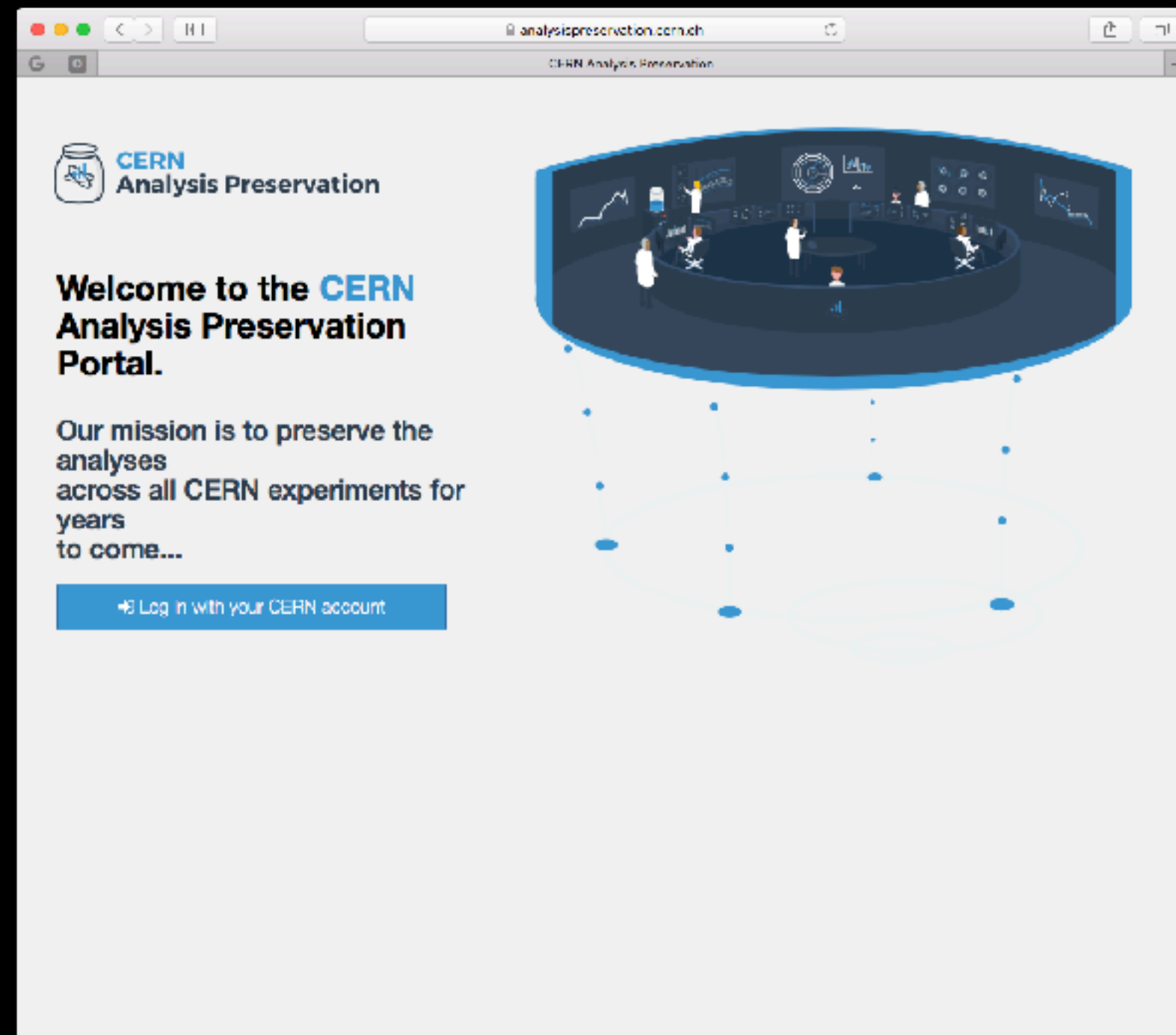
Advanced **search** for high-level physics information

Applying standard **collaboration access restrictions**

Describe

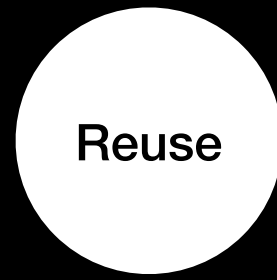
Capture

CERN Analysis Preservation



- JSONSchema
- W3C DCAT
- domain-specific-fields
- collaborative capabilities
- grabbing from Git, HTTP, XRootD
- powerful search

INVENIO)



REANA: Reusable Analyses

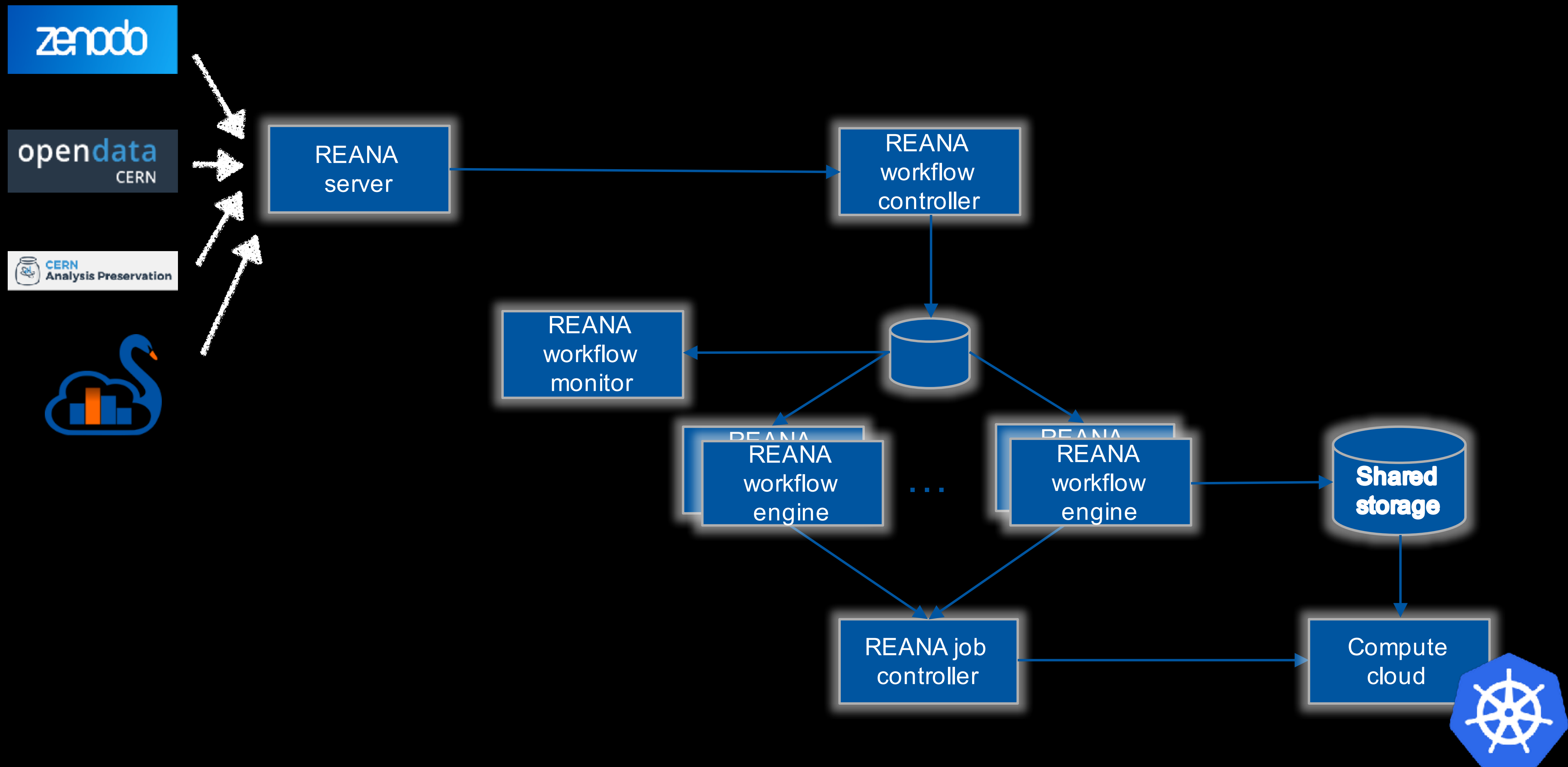
Born as part of the CERN Analysis Preservation framework

A platform which enables the **reusability** of physics analysis

Based in **cloud technologies**

Following the **12-factor application pattern**

Technology: REANA



Four questions

(1) data?

✓ EOS, CephFS

(2) software?

✓ Git, SVN, local machines

(3) environment?

✓ Docker, VMs

(4) workflow?

✓ CWL, Yadage

(2) Software



GitLab



```
#ifndef __CINT__
#include "RooGlobalFunc.h"
#endif
#include "RooRealVar.h"
#include "RooDataSet.h"
#include "RooGaussian.h"
#include "RooChebychev.h"
#include "RooAddPdf.h"
#include "RooExtendPdf.h"
#include "TCanvas.h"
#include "TAxis.h"
#include "RooPlot.h"
using namespace RooFit ;

void fitdata(const char* input, const char* output)
{
    // Open input file with workspace (generated by rf14_wspacewrite)
    TFile *f = new TFile(input) ;

    // Retrieve workspace from file
    RooWorkspace* w = (RooWorkspace*) f->Get("w") ;

    // Retrieve x,model and data from workspace
    RooRealVar* x = w->var("x") ;
    RooAbsPdf* model = w->pdf("model") ;
    RooAbsData* data = w->data("modelData") ;

    // Fit model to data, extended ML term automatically included
    model->fitTo(*data) ;

    // Plot data and PDF overlaid
    RooPlot* xframe = x->frame(Title("Fit example")) ;
    data->plotOn(xframe) ;
    model->plotOn(xframe,Normalization(1.0,RooAbsReal::RelativeExpected)) ;

    // Overlay the background component of model with a dashed line
    model->plotOn(xframe,Components("bkg"),LineStyle(kDashed),Normalization(1.0,RooAbsReal::RelativeExpected)) ;

    // Draw the frame on the canvas
    TCanvas res("rf202_composite","rf202_composite",600,600) ;
    gPad->SetLeftMargin(0.15) ;
    xframe->GetYaxis()->SetTitleOffset(1.4) ;
    xframe->Draw() ;

    res.Update() ;
    res.SaveAs(output) ;
    res.Close() ;
}
```

(3) Environment

Docker support, other technologies under investigation

Encourage the usage of **base images** i.e. *reanahub/reana-env-root6* for ROOT6 analyses

Take the most out of **image layering**

Encourage **collaboration** and **reusable images**

reana-env-root6



```
# Environment: ROOT6 on Ubuntu/Trusty:
```

```
FROM ubuntu:trusty
```

```
RUN apt-get update
```

```
RUN apt-get install --yes g++ cpp gcc gfortran git dpkg-dev make binutils libx11-dev libxpm-dev libxft-dev libxext-dev \
    libssl-dev libpcre3-dev xlibmesa-glu-dev libglew1.5-dev libftgl-dev libmysqlclient-dev \
    libfftw3-dev cfitsio-dev graphviz-dev libavahi-compat-libdnssd-dev libldap2-dev python-dev \
    libxml2-dev libkrb5-dev libgsl0-dev libqt4-dev libx11-dev libxpm-dev
```

```
ENV ROOTSYS /usr/local
```

```
RUN git clone --quiet http://root.cern.ch/git/root.git /code/root-v6-02-12 &&\
```

```
cd /code/root-v6-02-12 &&\
```

```
git checkout v6-02-12 &&\
```

```
./configure --all &&\
```

```
make -j4 &&\
```

```
make -j4 install &&\
```

```
cd / &&\
```

```
rm -rf /code
```

(4) Workflow

Structured computational workflows over free-text READMEs

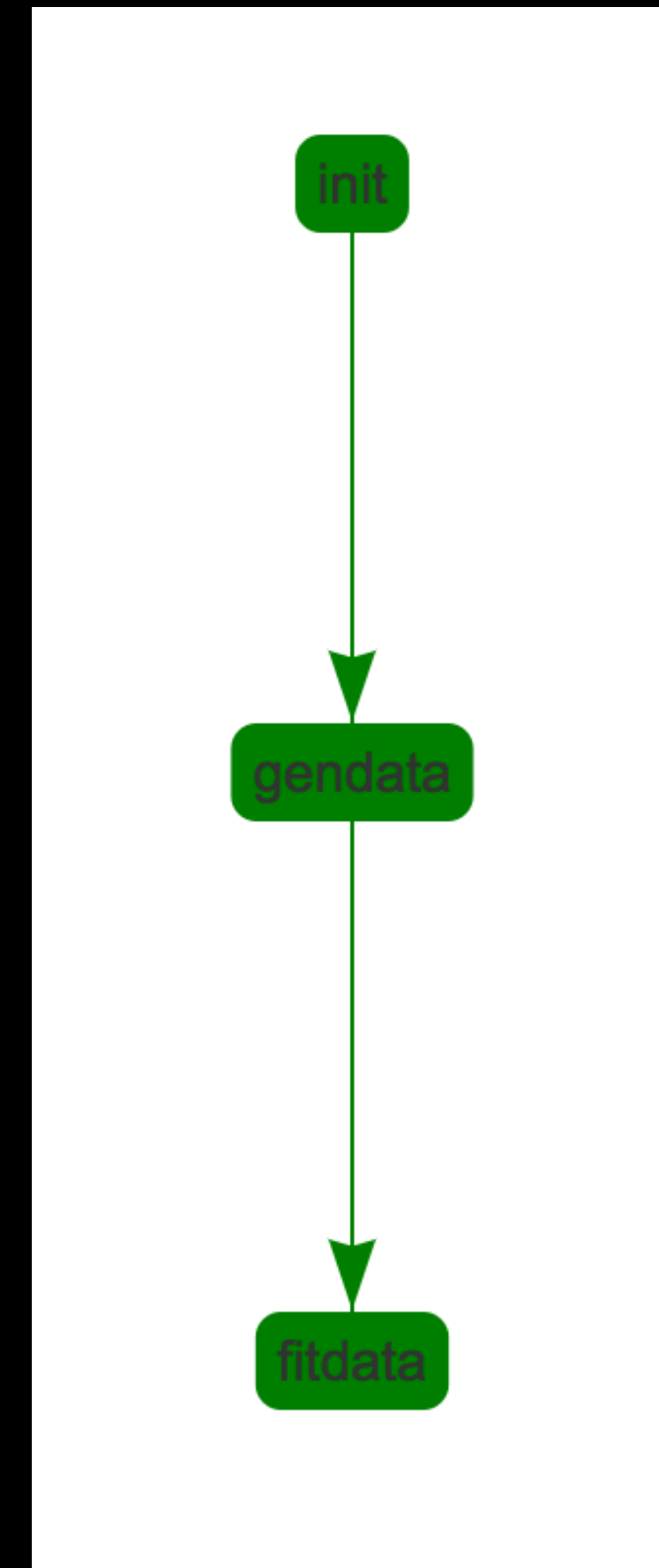
Testable approach

Support for Yadage workflows

Support for CWL workflows

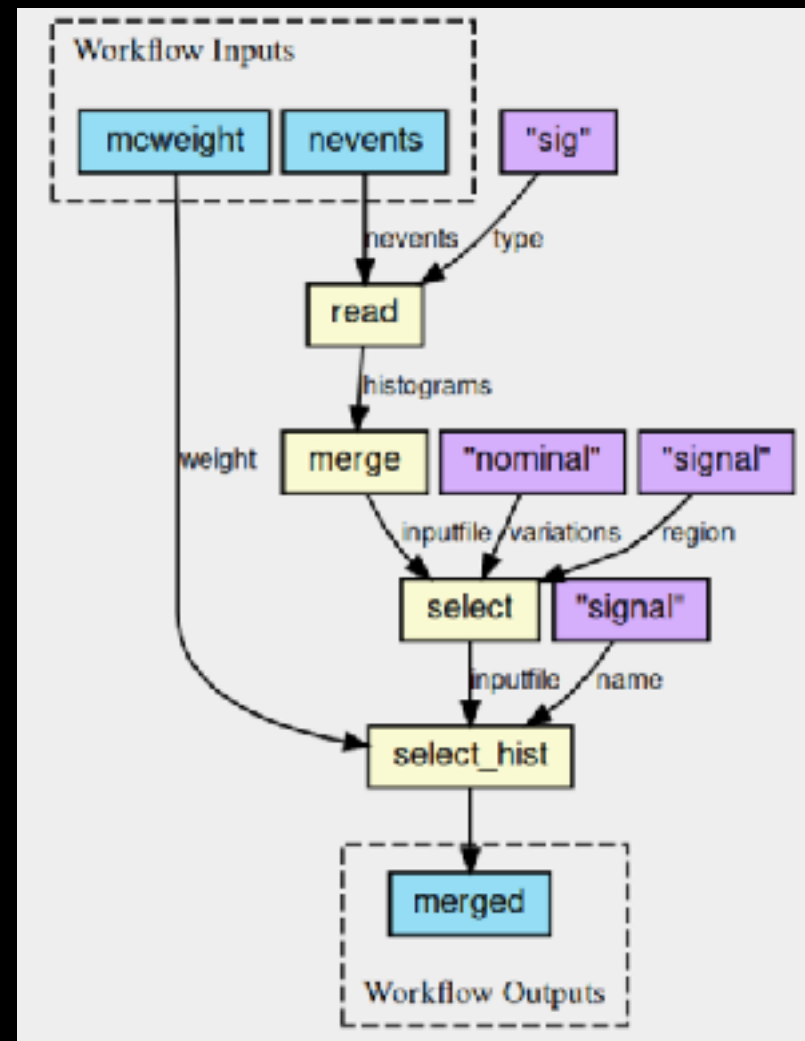
Yadage workflow example

```
stages:
- name: gendata
  dependencies: ['init']
  scheduler:
    scheduler_type: singlestep-stage
  parameters:
    events: {stages: init, output: events, unwrap: true}
    outfile: '{workdir}/data.root'
  step:
    process:
      process_type: 'interpolated-script-cmd'
      script: root -b -q 'gendata.C({events},"{outfile}")'
    publisher:
      publisher_type: 'frompar-pub'
      outputmap:
        data: outfile
    environment:
      environment_type: 'docker-encapsulated'
      image: johndoe/reana-demo-root6-roofit
- name: fitdata
  dependencies: ['gendata']
  scheduler:
    scheduler_type: singlestep-stage
  parameters:
    data: {stages: gendata, output: data, unwrap: true}
    outfile: '{workdir}/plot.png'
  step:
    process:
      process_type: 'interpolated-script-cmd'
      script: root -b -q 'fitdata.C("{data},"{outfile}")'
    publisher:
      publisher_type: 'frompar-pub'
      outputmap:
        plot: outfile
    environment:
      environment_type: 'docker-encapsulated'
      image: johndoe/reana-demo-root6-roofit
```

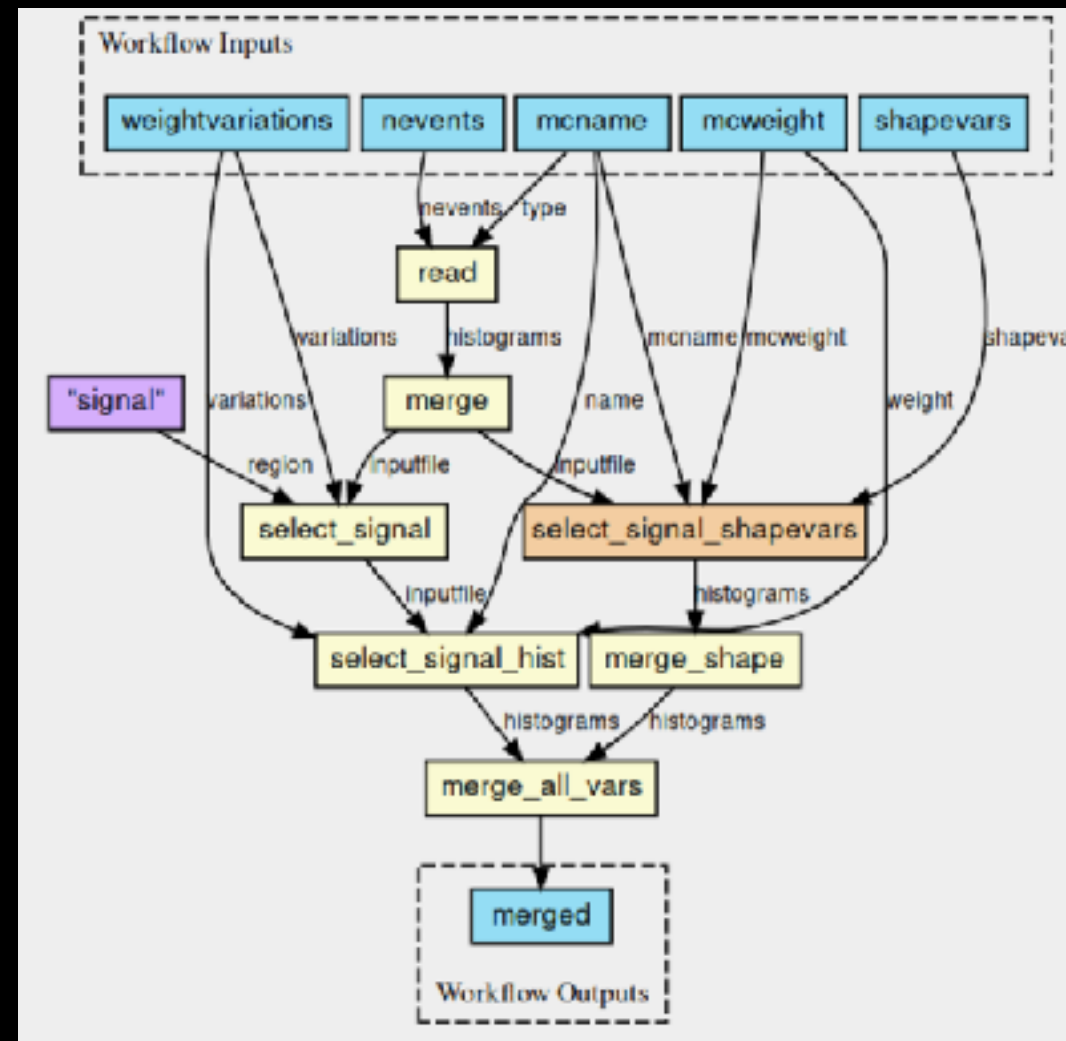


CWL workflow example

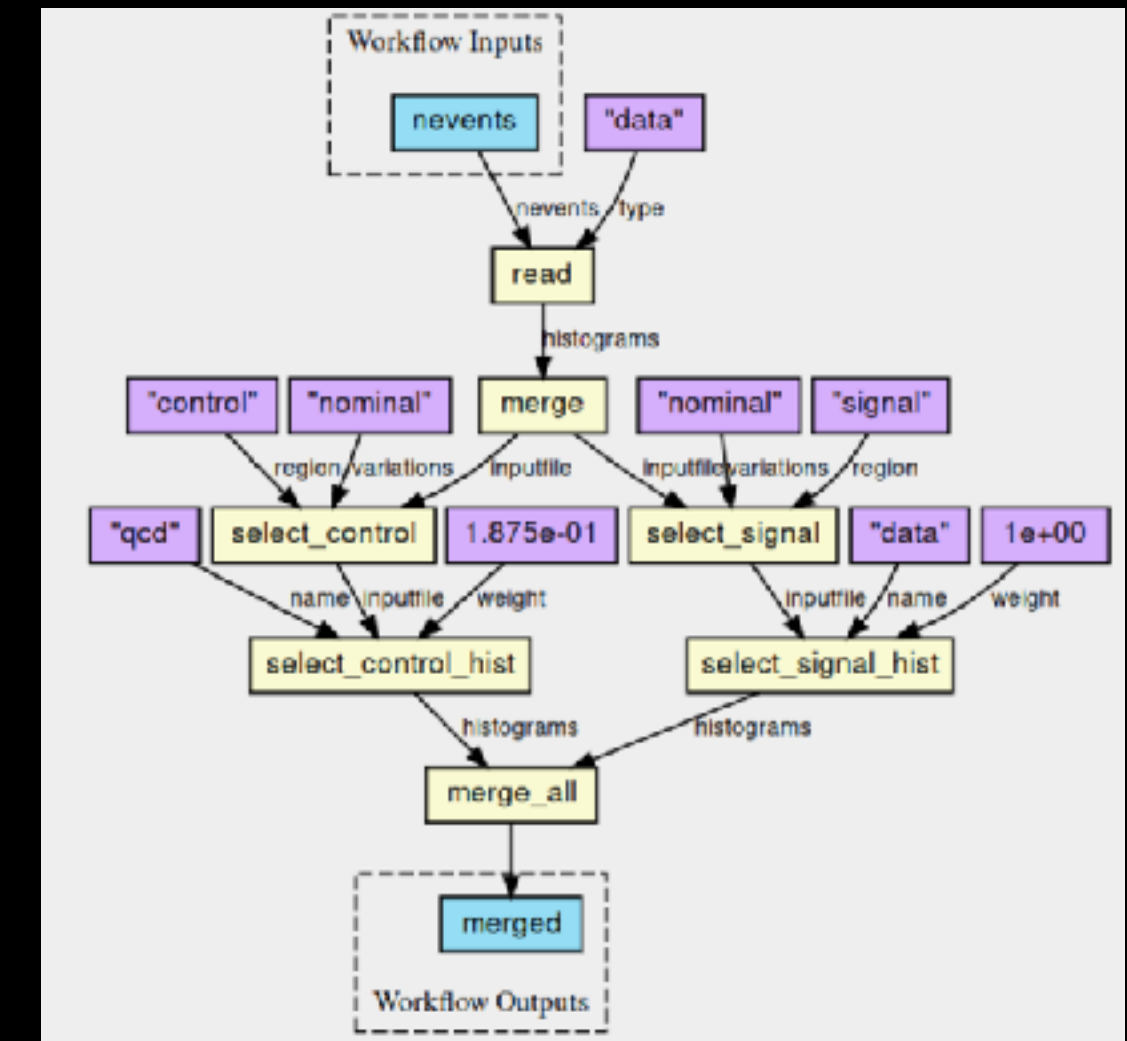
ATLAS full chain analysis example



sig



mc



data

How does it work?

Deploy REANA locally

```
(RCLUSTER-2.7) → reana-cluster git:(master) ✕ minikube start --kubernetes-version="v1.6.4"
```

```
Starting local Kubernetes v1.6.4 cluster...
```

```
Starting VM...
```

```
Moving files into cluster...
```

```
Setting up certs...
```

```
Starting cluster components...
```

```
Connecting to cluster...
```

```
Setting up kubeconfig...
```

```
Kubectl is now configured to use the cluster.
```

Deploy REANA locally

```
(RCLUSTER-2.7) → reana-cluster git:(master) ✘ reana-cluster init
[INFO] Validating REANA cluster specification file: /Users/rodrigdi/reana/reana-cluster/reana-cluster.yaml
[INFO] /Users/rodrigdi/reana/reana-cluster/reana-cluster.yaml is a valid REANA cluster specification.
[INFO] Cluster type specified in cluster specifications file is 'kubernetes'
[INFO] Creating a ReanaBackend object for Kubernetes interaction.
[INFO] Connecting to Kubernetes at https://192.168.99.100:8443
[INFO] Writing deployable REANA cluster configuration to ./cluster_config/
Init complete
```

Deploy REANA locally

```
(RCLUSTER-2.7) → reana-cluster git:(master) ✘ reana-cluster get server
[INFO] Validating REANA cluster specification file: /Users/rodrigdi/reana/reana-cluster/reana-cluster.yaml
[INFO] /Users/rodrigdi/reana/reana-cluster/reana-cluster.yaml is a valid REANA cluster specification.
[INFO] Cluster type specified in cluster specifications file is 'kubernetes'
[INFO] Creating a ReanaBackend object for Kubernetes interaction.
external_name: None
internal_ip: None
external_ip_s: 192.168.99.100
ports: ['31201']
```

Example analysis

```
(reana-client) → reana-demo-helloworld git:(master) tree
```

```
├── README.rst
├── code
│   └── helloworld.py
├── environment
│   └── Dockerfile
├── inputs
│   └── names.txt
├── outputs
├── reana.yaml
└── workflow
    ├── yadage
    └── workflow.yaml
```

```
6 directories, 6 files
```

Available at <https://github.com/reanahub/reana-demo-helloworld>

Run on REANA

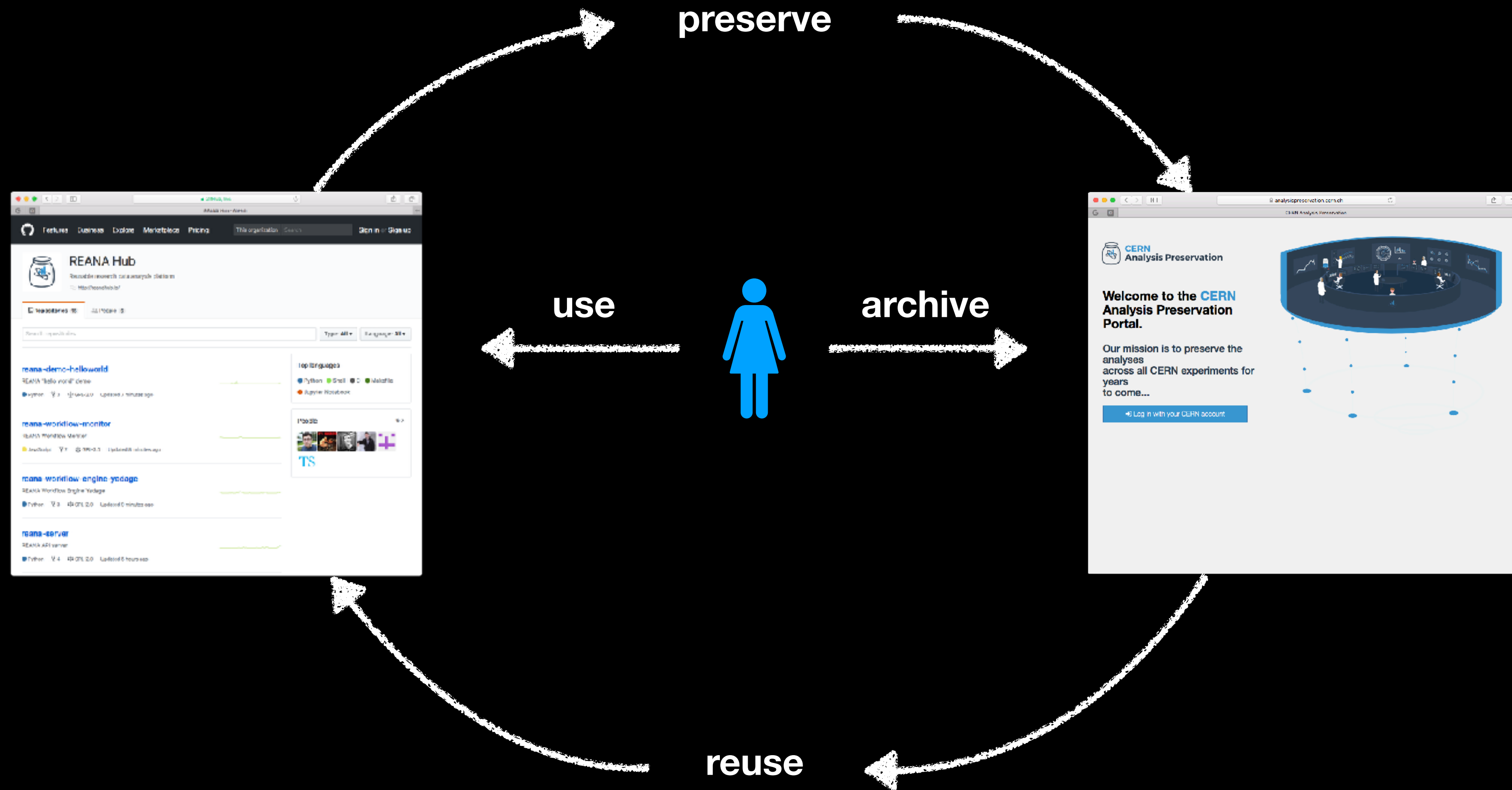
```
(reana-client) → reana-demo-helloworld git:(master) export REANA_SERVER_URL=http://192.168.99.100:31201
(reana-client) → reana-demo-helloworld git:(master) reana-client ping
[INFO] REANA Server URL ($REANA_SERVER_URL) is: http://192.168.99.100:31201
[INFO] Connecting to http://192.168.99.100:31201
[INFO] Server is running.
```

-

Run on REANA

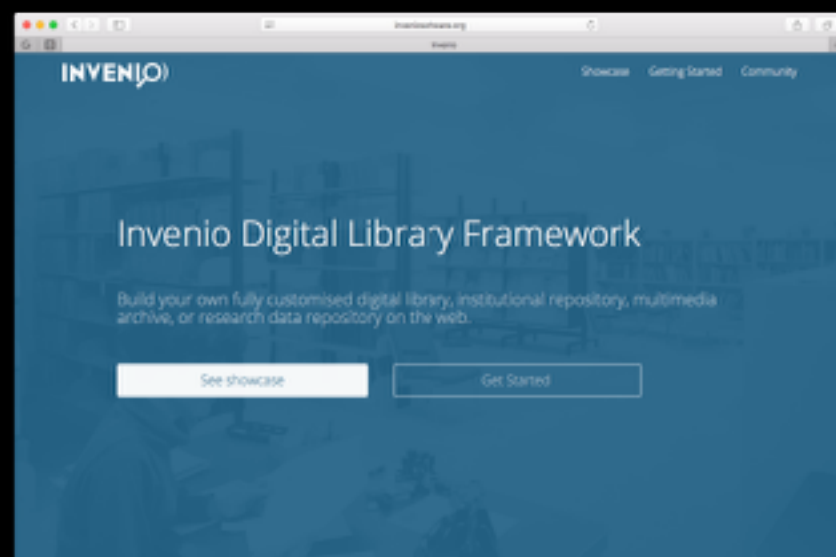
```
$ reana-client workflow create  
$ reana-client code upload helloworld.py  
$ reana-client inputs upload names.txt  
$ reana-client workflow start  
$ reana-client workflow status  
# wait until the workflow finishes  
$ reana-client outputs list  
$ reana-client outputs download helloworld/greetings.txt
```


Reusability Preservation



Challenges

Social	adopting structured computational workflow specifications
	publish or perish culture
	scientific benefit vs cost of preservation
Data	Ever-increasing data size?
Software	Ever-changing computing technology?



<http://inveniosoftware.org>



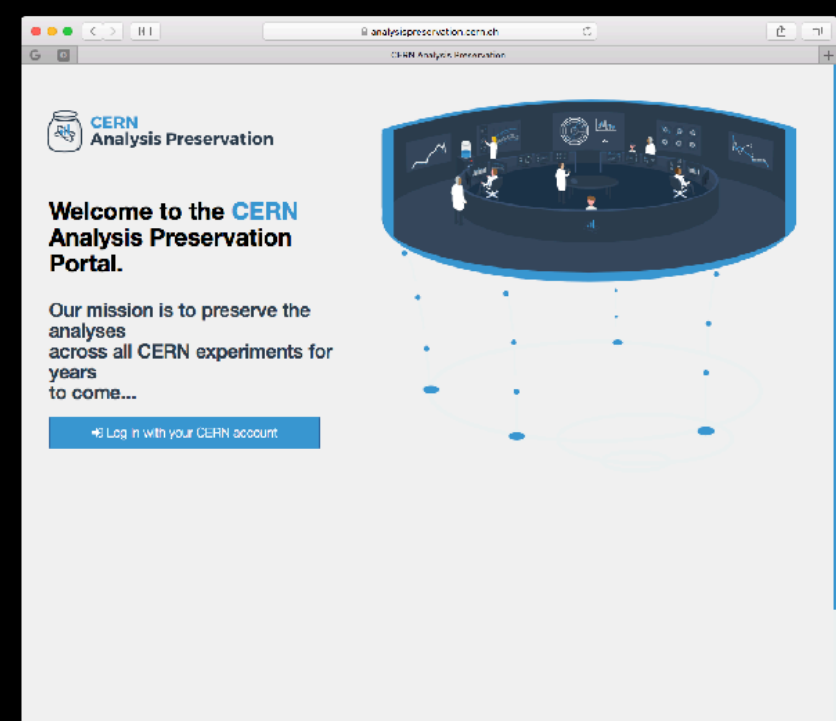
<http://github.com/inveniosoftware>



@inveniosoftware



info@inveniosoftware.org



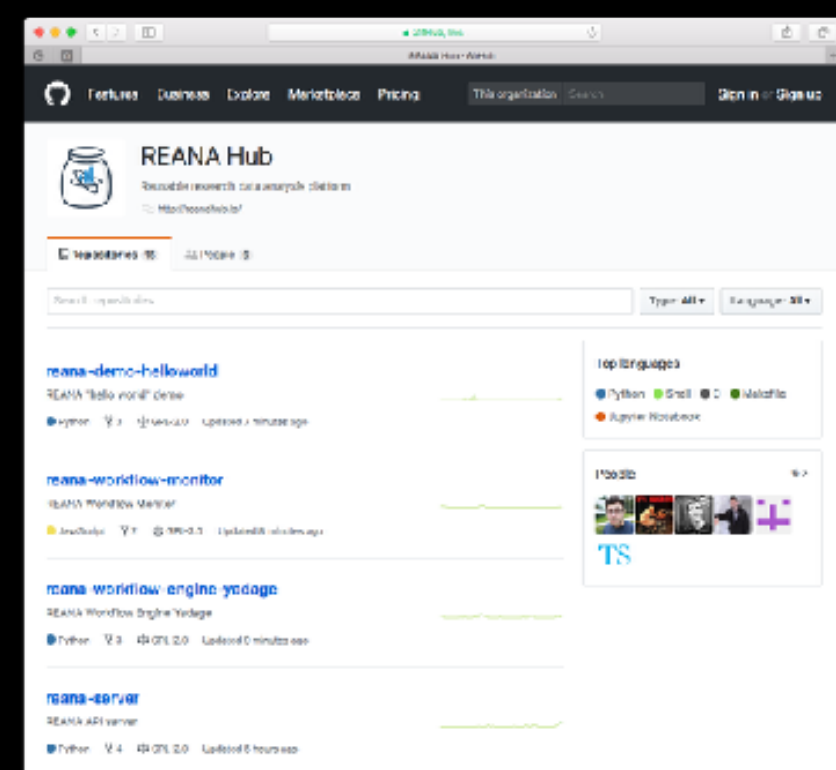
<http://analysispreservation.cern.ch>



<http://github.com/cernanalysispreservation>



analysis-preservation-support@cern.ch



<http://reanahub.io>



<http://github.com/reanahub>



@reanahub



info@reanahub.io

Questions?