# Data Management Package for the novel data delivery system, ServiceX, and Applications to various physics analysis workflows

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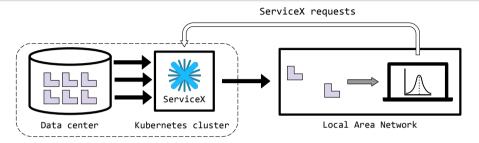
University of Texas at Austin Department of Physics

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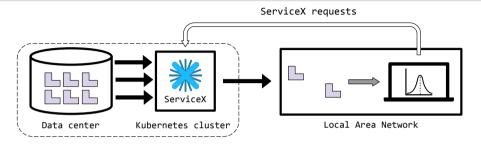


#### What's ServiceX?



- A service to easily and quickly access large data at remote with transformation
- Deployed in a Kubernetes cluster and usually co-located with the data center to allow a wide network bandwidth.
- See more at Ben Galewsky's talk on the ServiceX ♂

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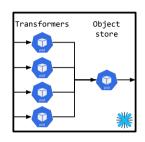
#### Why ServiceX?

- ✓ A user wants few columns from datasets in the grid for ML study. Grid jobs?
- √ What about full-scale analysis?

#### What's ServiceX?

#### Under the hood

- ServiceX spawns the so-called Transformer pods (Docker container) to read columns and filter events or do whatever it's designed for
- 2 Transformer pods are also scaled automatically using Kubernetes auto-scaling feature
- Outputs from each transformer written to object store then delivered to a destination as soon as it becomes available or consumed later



#### **Transformers today**

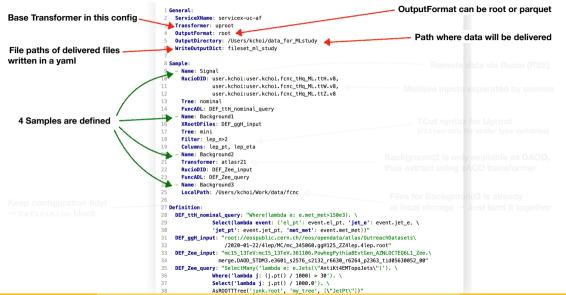
Transformer	Input data format			
Uproot (uproot)	Flat ROOT ntuple			
ATLAS R21 (atlasr21)	ATLAS R21 ×AOD			
CMS Run1 (cmssw-5-3-32)	CMS Run-1 AOD			
Python (python)	*Runs user-provided python function			

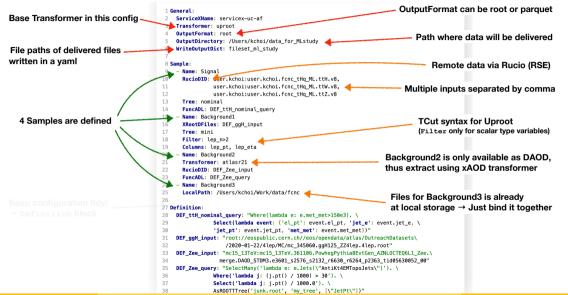
#### What is ServiceX DataBinder?

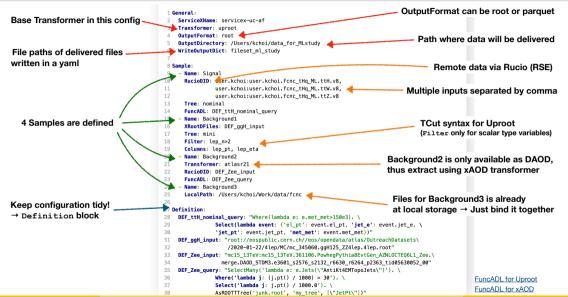
```
Python library ( GitHub & , PyPl & ) for easy configurations of ServiceX delivery requests and handling of delivered data using a single configuration file and more
```

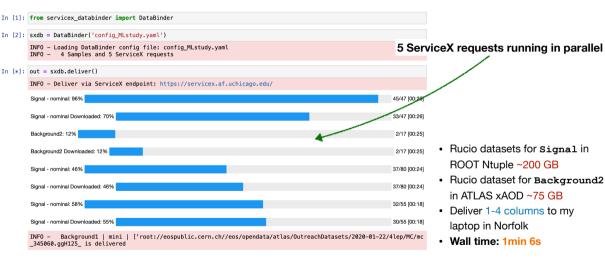
General: ServiceYName: servicey-uc-af Transformer: uproot OutputFormat: root OutputDirectory: /Users/kchoi/data for MLstudy WriteOutputDict: fileset ml study 8 Sample: Name: Signal RucioDID: user.kchoi:user.kchoi.fcnc tHg ML.ttH.v8. user.kchoi:user.kchoi.fcnc\_tHq\_ML.ttW.v8, user.kchoi:user.kchoi.fcnc\_tHq\_ML.ttZ.v8 Tree: nominal FuncADL: DEF ttH nominal query Name: Background1 XRootDFiles: DEF ggH input Tree: mini Filter: len n>2 Columns: lep pt, lep eta - Name: Background2 Transformer: atlasr21 RucioDID: DEF Zee input FuncADL: DEF Zee guery Name: Background3 LocalPath: /Users/kchoi/Work/data/fcnc 26 27 Definition: DEF ttH nominal query: "Where(lambda e: e.met met>150e3). \ 29 Select(lambda event: {'el pt': event.el pt, 'jet e': event.jet e. \ 'iet pt': event.iet pt. 'met met': event.met met})" DEF ggH input: "root://eospublic.cern.ch//eos/opendata/atlas/OutreachDatasets\ /2020-01-22/4lep/MC/mc 345060.ggH125 ZZ4lep.4lep.root" DEF Zee input: "mc15 13TeV:mc15 13TeV.361106.PowhegPythia8EvtGen AZNLOCTEO6L1 Zee.\ merge.DAOD STDM3.e3601 s2576 s2132 r6630 r6264 p2363 tid05630052 00" DEF Zee query: "SelectMany('lambda e: e.Jets(\"AntiKt4EMTopoJets\")'). \ Where('lambda i: (i.pt() / 1000) > 30'). \ Select('lambda i: i.pt() / 1000.0'). \ AsROOTTTree('junk.root', 'my tree', [\"JetPt\"])"

OutputFormat can be root or parquet General: Base Transformer in this config ServiceYName: servicey-uc-af Transformer: unroot OutputFormat: root 4 Path where data will be delivered OutputDirectory: /Users/kchoi/data for MLstudy WriteOutputDict: fileset ml study File paths of delivered files written in a vaml 8 Sample: Name: Signal RucioDID: user.kchoi:user.kchoi.fcnc tHg ML.ttH.v8. user.kchoi:user.kchoi.fcnc\_tHq\_ML.ttW.v8, user.kchoi:user.kchoi.fcnc\_tHq\_ML.ttZ.v8 Tree: nominal FuncADL: DEF ttH nominal query Name: Background1 XRootDFiles: DEF ggH input Tree: mini Filter: len n>2 Columns: lep pt, lep eta Name: Background2 Transformer: atlasr21 RucioDID: DEF Zee input FuncADL: DEF Zee query Name: Background3 LocalPath: /Users/kchoi/Work/data/fcnc 26 27 Definition: DEF ttH nominal query: "Where(lambda e: e.met met>150e3). \ 29 Select(lambda event: {'el pt': event.el pt, 'jet e': event.jet e. \ 'iet pt': event.iet pt. 'met met': event.met met})" DEF ggH input: "root://eospublic.cern.ch//eos/opendata/atlas/OutreachDatasets\ /2020-01-22/4lep/MC/mc 345060.ggH125 ZZ4lep.4lep.root" DEF Zee input: "mc15 13TeV:mc15 13TeV.361106.PowhegPythia8EvtGen AZNLOCTEO6L1 Zee.\ merge.DAOD STDM3.e3601 s2576 s2132 r6630 r6264 p2363 tid05630052 00" DEF Zee query: "SelectMany('lambda e: e.Jets(\"AntiKt4EMTopoJets\")'). \ Where('lambda i: (i.pt() / 1000) > 30'). \ Select('lambda i: i.pt() / 1000.0'). \ AsROOTTTree('junk.root', 'my tree', [\"JetPt\"])"









- Prepare ServiceX access file
  - YAML file containing ServiceX endpoint information

- ② Prepare DataBinder configuration file ⇒

- 1 api endpoints:
  - name: servicex-uc-af
  - endpoint: https://servicex.af.uchicago.edu/
  - token: <TOKEN>
- type: uproot

```
1 General:
   ServiceXName: servicex-uc-af
   OutputFormat: root
5 Sample:
     Name: ggH125_ZZ4lep
      XRootDFiles: "root://eospublic.cern.ch//eos/opendata/atlas/OutreachDatasets\
                   /2020-01-22/4lep/MC/mc_345060.ggH125_ZZ4lep.4lep.root"
      Tree: mini
     FuncADL: "Select(lambda event: {'lep_pt': event.lep_pt, 'lep_eta': event.lep_eta})"
```

```
    Deliver!!
```



```
1 from servicex databinder import DataBinder
2 sx db = DataBinder('config minimum.yaml')
3 out = sx db.deliver()
```

In the Jupyter notebook,

In the Jupyter notebook,

```
In [1]: from servicex_databinder import DataBinder

In [2]: sxdb = DataBinder('config_minimum.yaml')

INFO - Loading DataBinder config file: config_minimum.yaml
INFO - 1 Samples and 1 ServiceX requests

In [*]: out = sxdb.deliver()

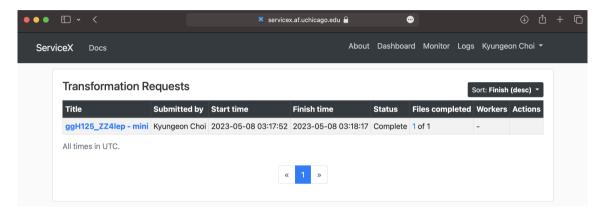
INFO - Deliver via ServiceX endpoint: https://servicex.af.uchicago.edu/

ggH125_ZZ4lep - mini: 0%

ggH125_ZZ4lep - mini: 0%

0/1 [00:05]
```

Also from ServiceX Dashboard,

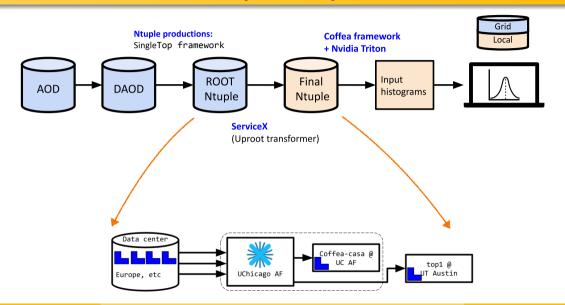


In the Jupyter notebook,

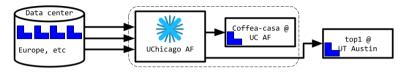
In the Jupyter notebook,

```
In [1]: from servicex databinder import DataBinder
In [2]: sxdb = DataBinder('config minimum.vaml')
        INFO - Loading DataBinder config file: config minimum.vaml
        INFO - 1 Samples and 1 ServiceX requests
In [3]: out = sydh.deliver()
        INFO - Deliver via ServiceX endpoint: https://servicex.af.uchicago.edu/
                 ggH125 ZZ4lep | mini | ['root://eospublic.cern.ch//eos/opendata/atlas/OutreachDatasets/2020-01-22/4lep/MC/
        mc 345060.ggH125 is delivered
        INFO - Delivered at /Users/kchoi/Work/UTAustin/Computing/ServiceX/ServiceXDataBinder/ServiceXData
In [4]: out
Out[4]: {'ggH125 ZZ4lep': {'mini': ['/Users/kchoi/Work/UTAustin/Computing/ServiceX/ServiceXDataBinder/ServiceXData/ggH125 Z
        Z4lep/mini/root 192.170.240.18 1094 root eospublic.cern.ch eos opendata atlas OutreachDatasets 2020-01-22 4le
        p MC mc 345060.ggH125 ZZ4lep.4lep.root.root'l}}
```

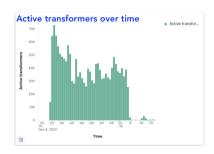
# Use-case: ATLAS Run-2 Physics Analysis



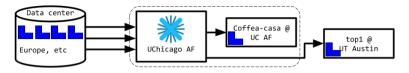
# Use-case: ATLAS Run-2 Physics Analysis



- ServiceX spawns 140 Uproot transformer pods and scaled up/down (up to ~800 pods) to extract 30-70 columns from 130 trees out of ~1.1TB ROOT ntuples (>600 Rucio datasets)
- Wall time: ~53mins to UC Analysis Facility (AF)
- DataBinder configuration file only about 400 lines
- Returned fileset from DataBinder is directly passed to coffea as input
- Accommodate various needs
  - ✓ Delivered data can be also processed with ROOT
  - ✓ Data can be delivered to AF, or University cluster



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```
Mdata for Mistudy
  #Background1
  L Maint
  L Troot 192.170.240.18 1094 root eospublic.cern.ch eos opendata atlas CutreachDatasets 2
  Front 192,170,240,18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Front 192,170,240,18 1094 root fax.mut2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Troot 192,170,240,18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Front 192,170,240,18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Front 192.170.240.18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
    Froot 192.170.240.18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Troot 192,170,240,18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Front 192,170,240,18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Front 192,170,240,18 1094 root fax mut2 org 1094 nnfs uchigago edu atlaslocalgroundisk r
   Troot 192,170,240,18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Front 192,170,240,18 1094 root fax.myt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
    Front 192,170,240,18 1094 root fax.mut2.org 1094 nnfs uchicago.edu atlaslocalgroundisk r
   Front 192.170.240.18 1094 root fax,mwt2,org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Troot 192.170.240.18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
   Front 192,170,240,18 1094 root fax.myt2.org 1094 pnfs uchicago.edu atlaslocalgroundisk x
   Froot 192,170,240,18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
  Front 192,170,240,18 1094 root fax.mwt2.org 1094 pnfs uchicago.edu atlaslocalgroupdisk r
  #Signal
  L monina
 - T00a13b7ab0038c2a848aa67460e41591- pnfs physik.uni-wuppertal.de data atlas atlaslocalgroupd
```

#### Where is ServiceX?





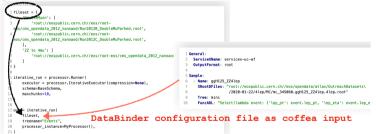


- https://servicex.af.uchicago.edu ☐ at University of Chicago Analysis Facility for ATLAS users
- https://coffea.casa ☑ at University of Nebraska-Lincoln (UNL) for CMS users
- - ⇒ ServiceX endpoint accessible only inside UNL coffea-casa facilities but ServiceX access file is pre-generated for users

More about coffea-casa at Oksana's Plenary talk ♂

### **Future plans**

- √ Support other ServiceX data delivery options
  - Streaming from ServiceX object-store or from local path
- √ Better integration into coffea framework



- √ Support (upcoming) ServiceX updates
  - multi-tree Uproot transformer, Python transformer, ATLAS R22 transformer, ...
- √ Towards more generic data management package

# Questions?

Special thanks to the ServiceX team!

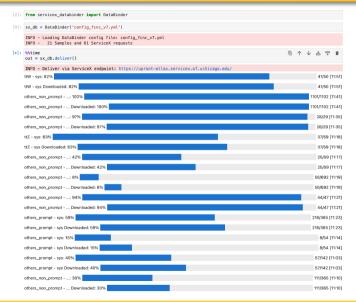


# Backup

# Delivery of full datasets - a snippet of DataBinder config

```
General:
   ServiceXBackendName: uproot uc af
   OutputDirectory: /data_ceph/kyungeon/fcnc_tHq_ML/ServiceXData_v7
   OutputFormat: root
   WriteOutputDict: out paths v7
Sample:
 - Name: ttH
   RucioDID: user.kchoi:user.kchoi.fcnc tHg ML.ttH.v7
   TransformerImage: kyungeonchoi/servicex func adl uproot transformer:fcnc nominal
   Tree: nominal
   FuncADL: DEF_funcadl_prompt_NOMINAL
  - Name: ttH
   RucioDID: user.kchoi:user.kchoi.fcnc tHg ML.ttH.v7
   TransformerImage: kyungeonchoi/servicex_func_adl_uproot_transformer:fcnc_fullsim
   Tree: svs fullsim
   FuncADL: DEF funcadl prompt SYS
Definition:
 DEF funcadl prompt NOMINAL: "Where(lambda e: e.el truthIFFClass.Where(lambda i: i==2).Count() == e.el truthIFFCl
 Where(lambda e: e.mu_truthIFFClass.Where(lambda i: i==4).Count() == e.mu_truthIFFClass.Count()).
 Select(lambda e: {'mu pt': e.mu pt, 'mu eta': e.mu eta, 'mu phi': e.mu phi, 'mu e': e.mu e, 'mu charge': e.mu ch
                   'el pt': e.el pt. 'el eta': e.el eta. 'el phi': e.el phi. 'el e': e.el e. 'el charge': e.el ch
                   'met met': e.met met. 'met phi': e.met phi.
                   'iet pt': e.iet pt. 'iet eta': e.iet eta. 'iet phi': e.iet phi. 'iet e': e.iet e. 'iet tagWeig
                   'weights': e.weight mc*e.weight pileup*e.weight leptonSF*e.weight bTagSF DL1r Continuous*e.wei
                   'mcChannelNumber': e.mcChannelNumber, 'runNumber': e.runNumber, 'eventNumber': e.eventNumber,
                    'mc generator weights': e.mc generator weights.
```

# Delivery of full datasets - Run DataBinder in Jupyter Notebook



# Delivery of full datasets - Dashboard

Transformation Requests							Sort: Finish (desc) *		
Title	Submitted by	Start time	Finish time	Status	Files completed	Workers	Actions		
others_non_prompt - sy s	Kyungeon Choi	2022-12-09 05:25:00	-	Running	30 of 365	62	Cancel		
others_non_prompt - sy s	Kyungeon Choi	2022-12-09 05:24:59	-	Running	5 of 59	30	Cancel		
others_prompt - sys	Kyungeon Choi	2022-12-09 05:25:00	-	Running (	6 of 142	34	Cancel		
fcnc_tHc_prod - sys	Kyungeon Choi	2022-12-09 05:25:01	-	Running	1 of 34	19	Cancel		
ttZ - sys	Kyungeon Choi	2022-12-09 05:24:59	-	Running	6 of 59	38	Cancel		
others_non_prompt - sy s	Kyungeon Choi	2022-12-09 05:25:01	-	Running	4 of 142	22	Cancel		
others_prompt - sys	Kyungeon Choi	2022-12-09 05:24:59	-	Running	111 of 1102	158	Cancel		
others_non_prompt - sy s	Kyungeon Choi	2022-12-09 05:24:59	-	Running	5 of 692	44	Cancel		
others_prompt - sys	Kyungeon Choi	2022-12-09 05:24:59	-	Running	43 of 365	68	Cancel		