Provenance Capture Python Implementation

J. Enrique Ruiz (IAA – CSIC), Mathieu Servillat (Obs. Paris-Meudon)

French Weekly Provenance Meeting 03/06/2020





Software candidates

work-in-progress software



Python **tool** prototype for the Cherenkov Telescope Array Science Tools. Software for end-users to analyse, model and fit **science-ready data**. https://gammapy.org



Python **pipeline** for the **On-site Analysis of low-level data** captured by the Large Size Telescope (Cherenkov Telescope Array precursor in La Palma) https://contrera.gitlab.io/lstosa



Python **library** for the **processing of low-level data** captured by the Large Size Telescope (Cherenkov Telescope Array precursor in La Palma) https://github.com/cta-observatory/cta-lstchain



Python **framework** for prototyping the **low-level data processing** algorithms for the Cherenkov Telescope Array. https://github.com/cta-observatory/ctapipe







Requirements

How?

Capture provenance info in text files using standard automatic logging mechanism. Implementation non-intrusive in already existing code with function/class decoration. Configuration set in independent config files.

Which info?

Defined in a file model following IVOA Prov recommendation.

What do we get?

Processing of log files to produce filtered provenance products using Prov syntax JSON files and PDF graphs





$\gamma \pi$ Gammapy High-level Interface API

A collection of **command-line tools** that may be used within Python scripts or in IPython sessions/notebooks.

Used and generated entities, as well as input parameters, for each tool are well known and can be described in the **provenance model file**.

Only provenance info defined in the model file is transparently and automatically logged in a text file during the analysis session.

After session ends the log file can be post-processed to produce filtered (i.e. time-range or agent) provenance products like graphs for a basic inspection and analysis.





γ_π Gammapy High-level Interface API

All code is in an independent package/folder gammapy.utils.provenance
Responsible class providing High-Level Tools is decorated with @provenance
Execution environment is captured and stored in a session provenance entity
Code initially forked from ctapipe.core.Provenance

Branch: prov - gammar	py / gammapy / utils / provenance /	Create new file	Upload files	Find file	History		
This branch is 111 commits ahead, 169 commits behind gammapy:master.			្លុំ Pull request 🖆 Compare				
Bultako remove unused export log_file_generation function			Latest commit bd28787 on 21 Apr				
							definition.yaml
config -					\longrightarrow	environment.yaml	
initpy	refactor functions in new scripts			las	t month		logger.yaml
🗅 capture.py	remove unused export log_file_generation function			las	t month		
io.py	clean up and make graphs in png format			las	t month		





```
ion.yaml
config/defini
```

activities:

```
get_observations:
    description:
        "Fetch observations from datastore and list of identifiers filtering by optional spatial/temporal criteria."
    parameters:
        - name: datastore_path
          description: "DataStore file path as string"
          value: config.observations.datastore.__str__()
        - name: obslist path
          description: "Observations list file path as string"
          value: config.observations.obs_file
        - name: obs_ids
          description: "Observations list of identifiers"
          value: config.observations.obs_ids
        - name: obs_cone
          description: "Conesearch criteria to select observations"
          value: config.observations.obs_cone.json()
        - name: obs_time
          description: "Time criteria to select observations"
          value: config.observations.obs_time.json()
    usage:
        - role: datastore
          description: "DataStore object file"
          entityName: DataStore
          value: config.observations.datastore
        - role: obslist_file
          description: "Observations list file"
          entityName: DataStore
          value: config.observations.obs_file
    generation:
        - role: observations_selected
          description: "Observations selected"
          entityName: Observations
          value: observations
          has members:
              list: observations._observations
              entityName: Observation
              id: obs_id
              location: _events_hdu.base_dir
              namespace: gamma-events
```

```
version: 1
       formatters:
           simple:
               format: '%(levelname)s %(name)s %(message)s'
               #format: '%(asctime)s.%(msecs)03d%(message)s'
               datefmt: '%Y-%m-%dT%H:%M:%S'
Φ
       handlers:
Ø
           provHandler:
8
               class: logging.handlers.WatchedFileHandler
0
               level: INFO
               formatter: simple
               filename: prov.log
þà
       loggers:
           provLogger:
onf
               level: INFO
               handlers: [provHandler]
               propagate: False
       disable_existing_loggers: False
       PREFIX: __PROV__
       HASH_METHOD: md5
       HASH_BUFFER: path
       capture: True
\boldsymbol{\omega}
       # Conda environment for provenance package
       # conda env update -f environment.yaml
onmen
        channels:
          - conda-forge
       dependencies:
          python
          pyyaml
env:
          - prov
          pydot
          pvdotplus
          # dev dependencies
          pytest
          - pytest-cov
          black
          - isort
```





prov.log

```
INFO provLogger PROV 2019-11-18T10:48:20.428982 PROV {'entity id': 519318473740404787, 'name': 'Observations', 'type': 'PythonObject'}
INFO provLogger _PROV_2019-11-18T10:48:20.429298_PROV_{'activity_id': '722a28', 'generated_id': 519318473740404787, 'generated_role':
'observations selected'}
INFO provLogger _PROV_2019-11-18T10:48:20.430010_PROV_{'entity_id': 'gamma-events:23523', 'name': 'Observation', 'location': '/Users/test/DATA/
qammapy-datasets/hess-dl3-dr1/data/hess_dl3_dr1_obs_id_023523.fits.gz', 'type': 'File', 'contentType': 'application/fits'}
INFO provLogger _PROV_2019-11-18T10:48:20.430217_PROV_{'entity_id': 519318473740404787, 'member_id': 'gamma-events:23523'}
INFO provLogger _PROV_2019-11-18T10:48:20.431010_PROV_{'entity_id': 'gamma-events:23526', 'name': 'Observation', 'location': '/Users/test/DATA/
qammapv-datasets/hess-dl3-dr1/data/hess_dl3_dr1_obs_id_023526.fits.gz', 'type': 'File', 'contentType': 'application/fits'}
INFO provLogger _PROV_2019-11-18T10:48:20.431250_PROV_{ 'entity_id': 519318473740404787, 'member_id': 'gamma-events:23526'}
INFO provLogger PROV_2019-11-18T10:48:20.432081_PROV_{'entity_id': 'gamma-events:23559', 'name': 'Observation', 'location': '/Users/test/DATA/
gammapy-datasets/hess-dl3-dr1/data/hess_dl3_dr1_obs_id_023559.fits.gz', 'type': 'File', 'contentType': 'application/fits'}
INFO provLogger _PROV_2019-11-18T10:48:20.432216_PROV_{'entity_id': 519318473740404787, 'member_id': 'gamma-events:23559'}
INFO provLogger _PROV_2019-11-18T10:48:20.433059_PROV_{'entity_id': 'gamma-events:23592', 'name': 'Observation', 'location': '/Users/test/DATA/
qammapy-datasets/hess-dl3-dr1/data/hess_dl3_dr1_obs_id_023592.fits.qz', 'type': 'File', 'contentType': 'application/fits'}
INFO provLogger _PROV_2019-11-18T10:48:20.433252_PROV_{entity_id': 519318473740404787, 'member_id': 'gamma-events:23592'}
INFO provLogger PROV_2019-11-18T10:48:20.433418 PROV_{'activity_id': '722a28', 'endTime': '2019-11-18T10:48:18.995966'}
INFO provLogger PROV 2019-11-18T10:48:25.940142 PROV {'activity id': '665a0c', 'name': 'get_datasets', 'startTime':
'2019-11-18T10:48:21.012240', 'in_session': 9223372036581382375, 'agent_name': 'test'}
INFO provLogger _PROV_2019-11-18T10:48:25.940709_PROV_{'activity_id': '665a0c', 'parameters': {'stack-datasets': True, 'dataset-type':
'MapDataset', 'geom': {'skydir': [83.633, 22.014], 'width': [5, 5], 'binsz': 0.04, 'coordsys': 'CEL', 'proj': 'TAN', 'axes': [{'name': 'energy',
'hi bnd': 10, 'lo bnd': 1, 'nbin': 4, 'interp': 'log', 'node type': 'edges', 'unit': 'TeV'}]}, 'offset-max': '2.5 deg', 'psf-kernel-radius': '0.3
deq'}}
INFO provLogger _PROV_2019-11-18T10:48:25.941046_PROV_{'entity_id': 519318473740404787, 'name': 'Observations', 'type': 'PythonObject'}
INFO provLogger PROV 2019-11-18T10:48:25.941174 PROV {'activity id': '665a0c', 'used id': 519318473740404787, 'used role':
'observations_selected'}
INFO provLogger _PROV_2019-11-18T10:48:25.941341_PROV_{'entity_id': 15337330674484208277, 'name': 'Datasets', 'type': 'PythonObject'}
INFO provLogger PROV 2019-11-18T10:48:25.941449 PROV {'activity id': '665a0c', 'generated id': 15337330674484208277, 'generated role':
'reduced datasets'}
INFO provLogger _PROV_2019-11-18T10:48:25.941574_PROV_{'entity_id': 'stacked', 'name': 'Dataset', 'type': 'PythonObject'}
INFO provLogger _PROV_2019-11-18T10:48:25.941668_PROV_{'entity_id': 15337330674484208277, 'member_id': 'stacked'}
INFO provLogger _PROV_2019-11-18T10:48:25.941835_PROV_{'activity_id': '665a0c', 'endTime': '2019-11-18T10:48:25.940069'}
INFO provLogger PROV_2019-11-18T10:48:26.495235_PROV_{'activity_id': 'lalace', 'name': 'set_model', 'startTime': '2019-11-18T10:48:26.245433',
'in_session': 9223372036581382375, 'agent_name': 'test'}
INFO provLogger _PROV_2019-11-18T10:48:26.495513_PROV_{'activity_id': '1a1ace', 'parameters': {'filename': 'model.yaml'}}
INFO provLogger PROV_2019-11-18T10:48:26.495759 PROV_{'entity_id': 'b5fe131e1d320d9c44adf492a7b14f1d', 'name': 'YAMLFile', 'location':
'model.yaml', 'hash': 'b5fe131e1d320d9c44adf492a7b14f1d', 'hash_type': 'md5', 'type': 'File', 'contentType': 'application/x-yaml'}
INFO provLogger _PROV_2019-11-18T10:48:26.495967_PROV_{'activity_id': 'lalace', 'used_id': 'b5fe131e1d320d9c44adf492a7b14f1d', 'used_role':
```





A collection of daily scheduled scripts that are run in parallel in a grid environment.

Used and generated entities, as well as input parameters, for each function in a script are well known and can be described in the provenance model file.

Only provenance info defined in the model file is **transparently and automatically logged** in a text file during the pipeline execution.

After data processing of a run ends the log file can be post-processed to produce filtered (i.e. time range, agent, activity, etc..) provenance products like graphs for a basic inspection and analysis.







LST On-site Analysis pipeline

Code is in a restricted access Gitlab repository curated/developed by GAE-UCM

All code is in an independent package/folder osa.provenance

Responsible functions providing data processing are decorated with @trace

Execution environment is captured and stored in a session provenance entity

Post-processing of provenance logs may produce different levels of granularity

An observation may be a list of runs

A run is a list of subruns

Most of the info is *hidden* in **small configuration files** that are compared with hashcontent algorithm and copied for reproducibility purposes





```
activities:
   r0 to dl1:
        description:
            "Create DL1 files for an observation run and subrun"
        parameters:
            - name: ObservationRun
             description: "Observation run number"
             value: ObservationRun
            - name: ObservationSubRun
             description: "Observation subrun number"
             value: ObservationSubRun
            - name: CalibrationRun
             description: "Calibration run number"
             value: CalibrationRun
            - name: PedestalRun
             description: "Pedestal run number"
             value: PedestalRun
            - name: ProdID
             description: "Production ID"
             value: ProdID
        usage:
            - role: "Observation subrun"
             description: "Observation subrun used"
              entityName: R0SubrunDataset
             value: R0SubrunDataset
              # filepath: /fefs/aswq/data/real/R0/20200218/LST1.1Run02006.0001.fits.fz
            - role: "Pedestal file"
             description: "Pedestal file used"
              entityName: PedestalFile
             value: PedestalFile
             # filepath: /fefs/aswg/data/real/calibration/20200218/v00/drs4_pedestal.Run02005.0000.fits
            - role: "Coefficients calibration file"
              description: "Coefficients calibration file"
              entityName: CoefficientsCalibrationFile
             value: CoefficientsCalibrationFile
             # filepath: /fefs/aswq/data/real/calibration/20200218/v00/calibration.Run02006.0000.hdf5
            - role: "Time calibration file"
              description: "Time calibration file"
              entityName: TimeCalibrationFile
             value: TimeCalibrationFile
              # filepath: /fefs/aswg/data/real/calibration/20191124/v00/time_calibration.Run1625.0000.hdf5
            - role: "Pointing file"
             description: "Pointing filename for DL1"
                 ityName: PointingFile
                   : PointinaFile
```

```
version: 1
       formatters:
           simple:
               format: '%(levelname)s %(name)s %(message)s'
               #format: '%(asctime)s.%(msecs)03d%(message)s'
               datefmt: '%Y-%m-%dT%H:%M:%S'
Ф
       handlers:
Ø
           provHandler:
8
               class: logging.handlers.WatchedFileHandler
0
               level: INFO
               formatter: simple
               filename: prov.log
þà
       loggers:
           provLogger:
onf
               level: INFO
               handlers: [provHandler]
               propagate: False
       disable_existing_loggers: False
       PREFIX: __PROV__
       HASH_METHOD: md5
       HASH_BUFFER: path
       capture: True
\boldsymbol{\omega}
       # Conda environment for provenance package
       # conda env update -f environment.yaml
onmen
        channels:
          conda-forge
       dependencies:
          python
          pyyaml
env
          - prov
          pydot
          pvdotplus
         # dev dependencies
          pytest
          pytest-cov
          - black
          - isort
```



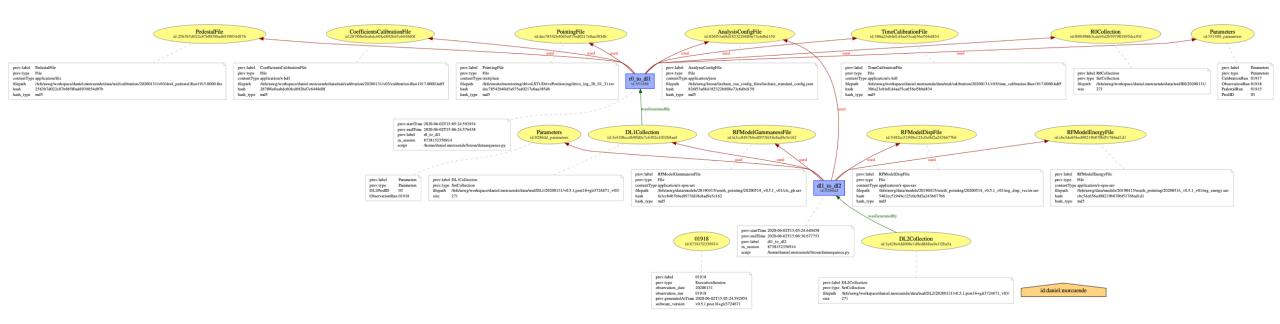
prov.log

INFO provLogger __PROV__2020-05-18T14:18:30.445713__PROV__{'session_id': 8739478486569, 'name': '01618', 'startTime': '2020-05-18T14:18:06.362321', 'system': {'executable': '/fefs/aswg/software/virtual_env/anaconda3/envs/osa/bin/python', 'platform': {'architecture_bits': '64bit', 'architecture_linkage': '', 'machine': 'x86_64', 'processor': 'x86_64', 'node': 'cp15', 'version': '#1 SMP Thu Nov 8 23:39:32 UTC 2018', 'system': 'Linux', 'release': '3.10.0-957.el7.x86_64', 'libcver': "('glibc', '2.10')", 'num_cpus': 32, 'boot_time': '2020-03-24T03:48:43'}, 'python': {'version_string': '3.7.6 | packaged by conda-forge | (default, Mar 23 2020, 23:03:20) \n[GCC 7.3.0]', 'version': '3.7.6', 'compiler': 'GCC 7.3.0', 'implementation': 'CPython'}, 'environment': {'CONDA_DEFAULT_ENV': 'osa', 'CONDA_PREFIX': '/fefs/aswg/software/virtual_env/anaconda3/envs/osa', 'CONDA_PYTHON_EXE': '/fefs/aswg/software/virtual_env/anaconda3/bin/python', 'CONDA_EXE': '/fefs/aswg/software/virtual_env/anaconda3/bin/conda', 'CONDA_PROMPT_MODIFIER': '(osa)', 'CONDA_SHLVL': '2', 'PATH': '/local/home/lstanalyzer/usr/bin:/local/home/lstanalyzer/.local/bin:/fefs/aswg/software/virtual_env/anaconda3/envs/osa/bin:/fefs/aswg/ software/virtual env/anaconda3/condabin:/usr/lib64/gt-3.3/bin:/usr/local/bin:/usr/bin:/usr/sbin:/opt/ibutils/bin:/local/home/lstanalyzer/.local/bin:/local/bin:/local/sbin:/usr/sbin:/opt/ibutils/bin:/local/home/lstanalyzer/.local/bin:/local/bin:/local/sbin:/l home/lstanalyzer/bin', 'LD_LIBRARY_PATH': '/local/home/lstanalyzer/usr/lib:', 'DYLD_LIBRARY_PATH': None, 'USER': 'lstanalyzer', 'HOME': '/local/home/lstanalyzer', 'SHELL': '/bin/bash'}, 'arguments': ['/fefs/aswg/lstosa/datasequence.py', '-c', 'cfg/sequencer_Nov2019_dragontime_v03.cfg', '-d', '2019_11_23', '--prod_id', 'v0.5.1_v03', '/fefs/ aswg/data/real/calibration/20191123/v03/calibration.Run1614.0000.hdf5', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.fits', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.fits', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.fits', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.hdf5', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.fits', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.hdf5', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.hdf5', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.fits', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.hdf5', '/fefs/aswg/data/real/calibration/20191123/v03/data/real/calibration/20191123/v03/data/real/calibration/20191123/v03/data/real/calibration/20191123/v03/data/real/calibration/20191123/v03/data/real/calibration/20191123/v03/data/real/calibration/20191123/v03/data/real/calibration/20191123/v03/data/real/calibration/20191123/v03/data/real/calibration/20191 real/calibration/20191123/v03/time_calibration.Run1614.0000.hdf5', '/fefs/aswg/scripts-osa/corrected_drive_logs_Nov19/drive_log_19_11_23.txt', '0', '0', '0', 'stderr=sequence_LST1_01618_2432982.err', '--stdout=sequence_LST1_01618_2432982.out', '01618.0008', 'LST1'], 'start_time_utc': '2020-05-18T14:18:30.445684'}, 'software_version': 'v0.5.1', 'observation_date': '20191123', 'observation_run': '01618', 'session_tag': 'r0_to_dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.447360__PROV__{'activity_id': '621ca2', 'name': 'r0_to_dl1', 'startTime': '2020-05-18T14:18:06.362321', 'in_session': 8739478486569, 'agent_name': 'lstanalyzer', 'script': '/fefs/aswg/lstosa/datasequence.py', 'session_tag': 'r0_to_dl1:01618'} INFO provLogger PROV 2020-05-18T14:18:30.447499 PROV {'activity_id': '621ca2', 'parameters': {'ObservationRun': '01618', 'ObservationSubRun': '0008', 'CalibrationRun': '01614', 'PedestalRun': '01611', 'ProdID': '03'}, 'session_tag': 'r0_to_dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.447628__PROV__{entity_id': '446f45dd1c878559585395eedce5bc7a', 'name': 'R0SubrunDataset', 'filepath': '/fefs/aswg/data/real/ R0/20191123/LST-1.1.Run01618.0008.fits.fz', 'hash': '446f45dd1c878559585395eedce5bc7a', 'hash_type': 'md5', 'type': 'File', 'contentType': 'application/fits', 'session_tag': 'r0 to dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.447752__PROV__{'activity_id': '621ca2', 'used_id': '446f45dd1c878559585395eedce5bc7a', 'used_role': '0bservation subrun', 'session_tag': 'r0_to_dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.447859__PROV__{'entity_id': '7404bb00748454d63badfe247c774a13', 'name': 'PedestalFile', 'filepath': '/fefs/aswg/data/real/ calibration/20191123/v03/drs4_pedestal.Run1611.0000.fits', 'hash': '7404bb00748454d63badfe247c774a13', 'hash_type': 'md5', 'type': 'File', 'contentType': 'application/fits', 'session tag': 'r0 to dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.447966__PROV__{'activity_id': '621ca2', 'used_id': '7404bb00748454d63badfe247c774a13', 'used_role': 'Pedestal file', 'session_tag': 'r0_to_dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.448065__PROV__{'entity_id': 'd8077e3bbdcb371f688ae65b0972e212', 'name': 'CoefficientsCalibrationFile', 'filepath': '/fefs/aswq/ data/real/calibration/20191123/v03/calibration.Run1614.0000.hdf5', 'hash': 'd8077e3bbdcb371f688ae65b0972e212', 'hash_type': 'md5', 'type': 'File', 'contentType': 'application/x-hdf', 'session_tag': 'r0_to_dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.447752__PROV__{'session_id': 8773094569769, 'name': '01618', 'startTime': '2020-05-18T14:18:06.362323', 'system': {'executable': '/fefs/aswg/software/virtual_env/anaconda3/envs/osa/bin/python', 'platform': {'architecture_bits': '64bit', 'architecture_linkage': '', 'machine': 'x86_64', 'processor': 'x86_64', 'node': 'cp15', 'version': '#1 SMP Thu Nov 8 23:39:32 UTC 2018', 'system': 'Linux', 'release': '3.10.0-957.el7.x86_64', 'libcver': "('qlibc', '2.10')", 'num_cpus': 32, boot_time': '2020-03-24T03:48:43'}, 'python': {'version_string': '3.7.6 | packaged by conda-forge | (default, Mar 23 2020, 23:03:20) \n[GCC 7.3.0]', 'version': '3.7.6', 'compiler': 'GCC 7.3.0', 'implementation': 'CPython'}, 'environment': {'CONDA_DEFAULT_ENV': 'osa', 'CONDA_PREFIX': '/fefs/aswg/software/virtual_env/anaconda3/envs/osa', 'CONDA_PYTHON_EXE': '/fefs/aswg/software/virtual_env/anaconda3/bin/python', 'CONDA_EXE': '/fefs/aswg/software/virtual_env/anaconda3/bin/conda', 'CONDA_PROMPT_MODIFIER': '(osa) ', 'CONDA_SHLVL': '2', 'PATH': '/local/home/lstanalyzer/usr/bin:/local/home/lstanalyzer/.local/bin:/fefs/aswg/software/virtual_env/anaconda3/envs/osa/bin:/fefs/aswg/ software/virtual_env/anaconda3/condabin:/usr/lib64/qt-3.3/bin:/usr/local/bin:/usr/local/sbin:/usr/sbin:/opt/ibutils/bin:/local/home/lstanalyzer/.local/bin:/local/ home/lstanalyzer/bin', 'LD_LIBRARY_PATH': '/local/home/lstanalyzer/usr/lib:', 'DYLD_LIBRARY_PATH': None, 'USER': 'lstanalyzer', 'HOME': '/local/home/lstanalyzer', 'SHELL': '/bin/bash'}, 'arguments': ['/fefs/aswg/lstosa/datasequence.py', '-c', 'cfg/sequencer_Nov2019_dragontime_v03.cfg', '-d', '2019_11_23', '--prod_id', 'v0.5.1_v03', '/fefs/aswg/data/real/calibration/20191123/v03/crslibration.Run1614.0000.hdf5', '/fefs/aswg/data/real/calibration/20191123/v03/drs4_pedestal.Run1611.0000.fits', '/fefs/aswg/data/ real/calibration/20191123/v03/time calibration.Run1614.0000.hdf5', '/fefs/aswg/scripts-osa/corrected drive logs Nov19/drive log 19 11 23.txt', '0', '0', '0', '-stderr=sequence_LST1_01618_2432980.err', '--stdout=sequence_LST1_01618_2432980.out', '01618.0006', 'LST1'], 'start_time_utc': '2020-05-18T14:18:30.447727'}, 'software_version': 'v0.5.1', 'observation_date': '20191123', 'observation_run': '01618', 'session_tag': 'r0_to_dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.448191__PROV__{'activity_id': '621ca2', 'used_id': 'd8077e3bbdcb371f688ae65b0972e212', 'used_role': 'Coefficients calibration file', 'session_tag': 'r0_to_dl1:01618'} INFO provLogger PROV 2020-05-18T14:18:30.448243 PROV {'activity id': '7e8065', 'name': 'r0 to dl1', 'startTime': '2020-05-18T14:18:06.362323', 'in session': 8773094569769, 'agent_name': 'lstanalyzer', 'script': '/fefs/aswg/lstosa/datasequence.py', 'session_tag': 'r0_to_dl1:01618'} INFO provLogger __PROV__2020-05-18T14:18:30.448296__PROV__{'entity_id': 'fcf52d425d9033504c154f25986978c2', 'name': 'TimeCalibrationFile', 'filepath': '/fefs/aswg/data/real/calibration/20191123/v03/time_calibration.Run1614.0000.hdf5', 'hash': 'fcf52d425d9033504c154f25986978c2', 'hash_type': 'md5', 'type': 'File', 'contentType': 'application/xhdf', 'session_tag': 'r0_to_dl1:01618'}





data processing provenance graph







Lessons learnt

The **importance of a model** to capture **interlinked info** among activities.

Structured logging may be a solution for small session provenance storage.

Need of a **provenance query mechanism** for detailed analysis and inspection.

This is easier if provenance info is not stored in log files but in a RDBMS or noSQL database.

Independent capture from different dependent software packages is possible/desirable?

LSTOSA requires Isthain

Isthain requires ctapipe

Post-processing of captured provenance info may be needed to filter raw provenance according to specific needs and/or artificially produce different **levels of granularity**.



