

Barcelona Supercomputing Center Centro Nacional de Supercomputación

Provenance with PyCOMPSs (hands-on included)

Raül Sirvent

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BSC Training Course: Programming Distributed Computing Platforms with COMPSs



- Motivation and Background
- Design of Workflow Provenance recording
- Using Workflow Provenance with COMPSs
- Inspecting registered metadata
- Hands-on exercises

Motivation and Background



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Motivation

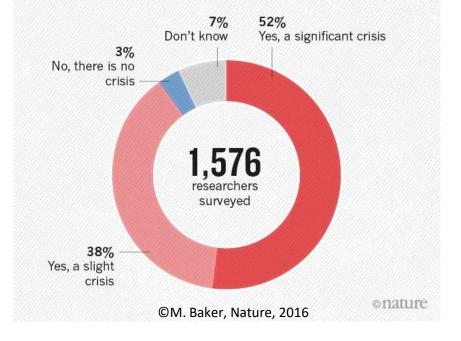
IS THERE A REPRODUCIBILITY CRISIS?



- Keep track of results Governance
- **Reproducibility** crisis in scientific papers
 - Conferences now request artifacts
 - E.g. SC Reproducibility Initiative
- Provenance recording can help with both problems

- **Provenance:** The chronology of the origin, development, ownership, location, and changes to a system or system component and associated data
 - Need to record metadata
 - Our focus: Workflow Provenance (data + software)





Motivation

- Provenance is **MORE** than just Reproducibility
 - Governance (availability, usability, consistency, ...) (FAIR Workflows)
 - **Replicability** (exchange inputs)
 - Knowledge extraction (queries, mining)
 - **Traceability** (validation/verification, visualisation)
- Our claim: desired features for Workflow Provenance registration
 - Automatic: lower user burden
 - Efficient: no overheads
 - Scalable: large workflows (both tasks and data assets used)



Background: COMPSs



- Sequential programming, parallel execution
- General purpose programming language + annotations/hints (identify tasks and directionality of data)
- Builds a task graph at runtime (potential concurrency)
- Tasks can be sequential, parallel (threaded or MPI)
- Offers to applications a shared memory illusion in a distributed system (Big Data apps support)
- Support for **persistent storage**
- Agnostic of computing platform: enabled by the runtime for clusters, clouds and container managed clusters
- 1 @task() def word_count(block): 2 for block in data: 3 p_result = word_count(block) return res 4reduce_count(result, p_result) 5 @task(f_res=INOUT) result = compss_wait_on(result) def merge_count(f_res, p_res): (b) Main code example 8 (a) Task annotation example Infrastructure Task Dependecy Graph Annotated Cloud docke python code Python binding Tasks COMPSs **Resource Mgmt** Runtime Monitoring Files, **Task Execution** objects Task Scheduling Analysis Data Mgmt.
- Advanced features: heterogeneous infrastructures, task constraints, streamed data, task faults, task exceptions, checkpointing, elasticity



Background: Research Object Crate

- Package research data + metadata
- Evolution from:
 - Research Object: describe digital and real-world resources
 - DataCrate: aggregate data with metadata
- Lightweight format
 - Both machines and humans can read it
- JSON Linked Data (JSON-LD)
 - Vocabulary: Schema.org
 - Structure:
 - Root Data Entity
 - Data Entities (files, directories)
 - Contextual Entities (non-digital elements)
- Strong ecosystem, we use:
 - ro-crate-py library
 - WorkflowHub





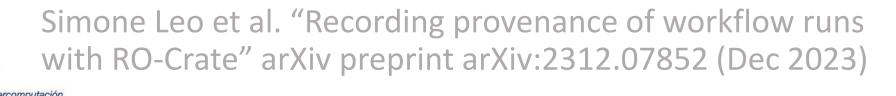


Background: RO-Crate Profiles

- RO-Crate is very generic (wide scope)
 - Profiles enable Interoperability
 - Set of conventions, types and properties (MUST, SHOULD, ...)
- Workflow RO-Crate profile
 - MUST ComputationalWorkflow, mainEntity (Root Dataset)
 - SHOULD WorkflowSketch

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- Workflow Run RO-Crate profile collection (MUST CreateAction)
 - Process Run Crate (set of tools)
 - Workflow Run Crate (computational workflow)
 - Provenance Run Crate (detailed computational workflow)





Workflow Run

{
 RO-Crate

Design of Workflow Provenance recording



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Design Requirements

- Target HPC workflows (commonly large)
- Provenance representation format
 - Simple but able to represent complex workflows
- Automatic provenance registration (no explicit annotations)
- Efficient provenance registration (avoid overheads at run time)
- Scale to large workflows (thousands of files and tasks)



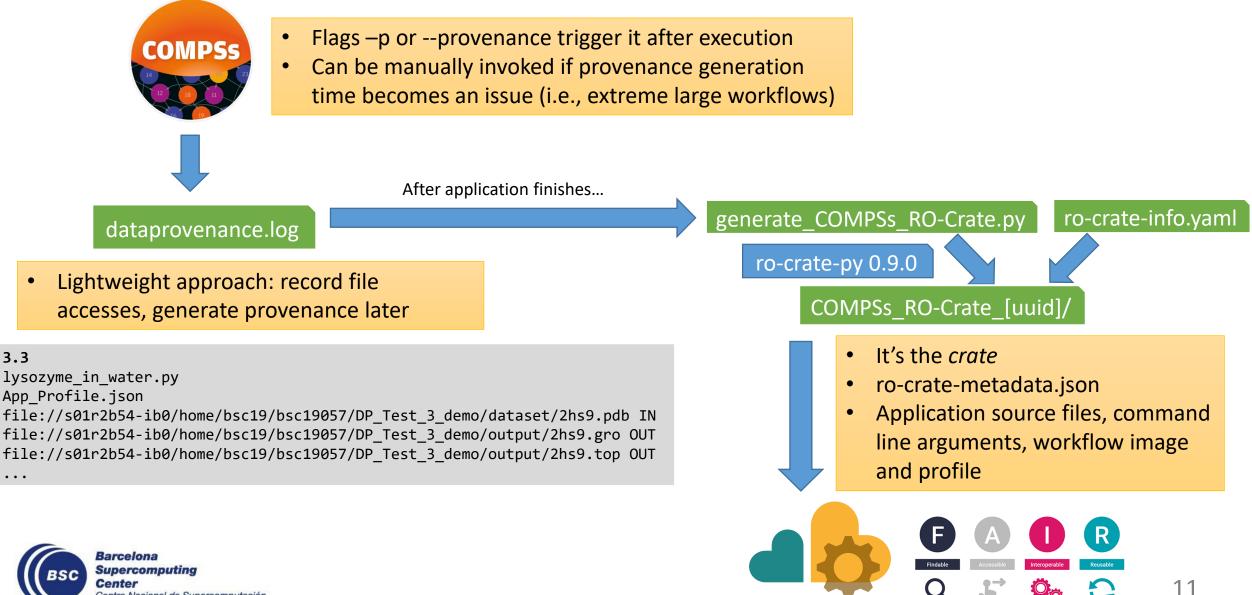


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COMPSs runtime modifications



WorkflowHub

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3.3

. . .

generate_COMPSs_RO-Crate.py features

- Detects and records COMPSs version used and the mainEntity
 - Looks for alternatives, if not found
- Automatically detects overall **inputs** and **outputs** of the workflow
 - Discards intermediate generated results as inputs
- Respects application **source files** sub-directory structure
- If data persistence, machine paths translated to crate paths
 - Identifies **common paths** to correctly arrange files
 - E.g. inputs/00/input_file.txt
- If no persistence: **URIs** to files are generated, **size** and **modification** date of files are stored to record the file version



Using Workflow Provenance with COMPSs



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Steps to record and publish Workflow Provenance in COMPSs

- Install ro-crate-py (if needed)
- Provide YAML information file
- Run with -p or --provenance
 - The *crate* is generated (a sub-folder COMPSs_RO-Crate_[uuid]/)
- Publish it at WorkflowHub, using the crate
- Generate a DOI, cite your results in papers







Install ro-crate-py

- pip install rocrate
- pip install rocrate --user
 - Typically, installs the library in ~/.local/
- pip install -t install_path rocrate
 - Specify target directory

https://github.com/ResearchObject/ro-crate-py



YAML information to be provided

- Non-automatically gathered info: ro-crate-info.yaml
- Sections:
 - COMPSs Workflow Information
 - Authors
 - Submitter
- Data persistence: True or False
- No inputs/outputs are provided, automatically detected by the provenance generation script

```
COMPSs Workflow Information:
  name: COMPSs Matrix Multiplication
  description: Blocks as hypermatrix
  license: Apache-2.0
  sources: [src/, ~/java/matmul/xml/,
   ~/java/matmul/pom.xml, Readme]
  data persistence: True
Authors:
  - name: Rosa M. Badia
    e-mail: Rosa.M.Badia@bsc.es
    orcid: https://orcid.org/0000-0003-2941-5499
    organisation name: Barcelona Supercomputing Center
    ror: https://ror.org/05sd8tv96
Submitter:
  name: Raül Sirvent
  e-mail: Raul.Sirvent@bsc.es
  orcid: https://orcid.org/0000-0003-0606-2512
  organisation_name: Barcelona Supercomputing Center
  ror: https://ror.org/05sd8tv96
```



Run your COMPSs application

- runcompss -p
- enqueue_compss -p
- pycompss run -p
- Either -p or --provenance

- Post-process automatically triggered after the end of the application
- Log and time statistics are provided
 - grep PROVENANCE
- If provenance generation fails for any reason:
 - Still possible to invoke it manually (commands provided in the output log)

...
PROVENANCE | RO-Crate writing to disk TIME: 0.01987314224243164 s
PROVENANCE | Workflow Provenance generation TOTAL EXECUTION TIME: 0.04113888740539551 s
PROVENANCE | COMPSs Workflow Provenance successfully generated in sub-folder:
 COMPSs_RO-Crate_d64966ac-fe34-463a-88fc-f97047c21a99/
PROVENANCE | ENDED WORKFLOW PROVENANCE SCRIPT



The Crate (resulting folder)

- application_sources/
- dataset/
- complete_graph.svg
- App_Profile.json
- compss_submission_command_line.txt
- ro-crate-metadata.json



```
App Profile.json
  application sources
    -- Readme
       pom.xml
    -- src
        -- main
            · _ _
               java
                 -- matmul
                     -- arrays
                         -- ...
                         -- Matmul.java
                     -- files
                         -- Block.class
                         -- Block.java
                         -- Matmul.class
                         -- Matmul.java
                         -- MatmulImpl.class
                         -- MatmulImpl.java
                         -- MatmulItf.class
                         -- MatmulItf.java
                        objects
                         -- ...
                         -- Matmul.java
    -- xml
        -- project.xml
        -- resources.xml
-- complete graph.svg
 - compss submission command line.txt
 - dataset
    -- ...
   -- C.1.1
-- ro-crate-info.yaml
-- ro-crate-metadata.json
```

10 directories, 41 files

Publish your results with WorkflowHub

- **zip** –r crate.zip COMPSs_RO-Crate_[uuid]/
- Login to WorfklowHub
- Create -> Workflow
 - **Upload**/Import Workflow RO-Crate tab -> Local file (crate.zip)
 - Click Register
- Review automatically obtained information
- Select the visibility of your workflow in the Sharing tab (for both general public, and for teams selected)
- Click Register again



Cite your results with WorkflowHub

- Freeze your workflow version
 - Overview tab -> Citation box -> Freeze version
 - Actions menu -> Freeze version
- Generate DOI
 - **IMPORTANT:** make sure your version is final
 - Citation box -> Generate a DOI
 - Actions menu -> Generate a DOI
 - Select Mint DOI
- The final generated DOI for the workflow results can be found in the Citation box

https://doi.org/10.48546/workflowhub.workflow.484.1





SC Conference Reproducibility Initiative

- Artifacts Available 🍸
 - Artifacts used in the research (including data and code) are permanently archived in a public repository that assigns a global identifier and guarantees persistence, and are made available via standard open licenses that maximize artifact availability

Artifacts Evaluated-Functional

- Documentation: Are the artifacts sufficiently documented to enable them to be exercised by readers of the paper?
- Completeness: Do the submitted artifacts include all of the key components described in the paper?
- Exercisability: Do the submitted artifacts include the scripts and data needed to run the experiments described in the paper, and can the software be successfully executed?
- Results Replicated
 - Reproduce Behavior: determine the equivalent or approximate behavior on available hardware
 - Reproduce the Central Results and Claims of the Paper











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```
"@id": "application_sources/matmul_files.py",
"@type": ["File", "SoftwareSourceCode", "ComputationalWorkflow"],
"contentSize": 1948,
"description": "Main file of the COMPSs workflow source files",
"encodingFormat": "text/plain",
"image": {"@id": "complete_graph.svg"},
"name": "matmul_files.py",
"programmingLanguage": {"@id": "#compss"}
```



"@id": "#compss", "@type": "ComputerLanguage", "alternateName": "COMPSs", "citation": "https://doi.org/10.1007/s10723-013-9272-5", "name": "COMPSs Programming Model", "url": "http://compss.bsc.es/", "version": "3.3"

"@id": "complete_graph.svg",
"@type": ["File", "ImageObject", "WorkflowSketch"],
"about": {"@id": "application_sources/matmul_files.py"},
"contentSize": 6681,
"description": "The graph diagram of the workflow, automatically generated by COMPSs runtime",
"encodingFormat": [["image/svg+xml",{"@id": "https://www.nationalarchives.gov.uk/PRONOM/fmt/92"}]],
"name": "complete_graph.svg"



Auxiliary Files

```
"@id":
    "application_sources/matmul_tasks.py",
"@type": ["File", "SoftwareSourceCode"]
"contentSize": 1549,
"description": "Auxiliary File",
"encodingFormat": "text/plain",
"name": "matmul_tasks.py"
```

Command line arguments

```
"@id": "compss_submission_command_line.txt",
"@type": "File",
"contentSize": 709,
"description": "COMPSs command line execution
    command (runcompss), including flags and
    parameters passed",
"encodingFormat": "text/plain",
"name": "compss_submission_command_line.txt"
```

COMPSs Task Profiling

```
"@id": "App_Profile.json",
"@type": "File",
"contentSize": 247,
"description": "COMPSs application Tasks profile",
"encodingFormat": ["application/json",{"@id":"https://www.nationalarchives.gov.uk/PRONOM/fmt/817"}],
"name": "App_Profile.json"
```



Persistent Data

```
"@id": "dataset/A.0.0",
"@type": "File",
"contentSize": 16,
"dateModified": "2023-09-07T09:20:20",
"name": "A.0.0",
"sdDatePublished": "2023-09-07T09:20:27+00:00"
```

Non-Persistent Data

```
"@id": "file://s07r1b33-ib0/home/bsc19/bsc19057/DP_Test_3_demo/dataset/1331.pdb",
"@type": "File",
"contentSize": 116154,
"dateModified": "2022-04-20T13:20:58",
"name": "1331.pdb",
"sdDatePublished": "2022-10-18T08:03:08+00:00"
```

"@id": "file://s02r2b26-ib0/home/bsc19/bsc19057/DP_Test_3_demo/config/energy.selection"



Hostname

Location path in hostname

CreateAction

Workflow Run {⁽)</sub> RO-Crate

"@id": "#COMPSs_Workflow_Run_Crate_marenostrum4_SLURM_JOB_ID_30132875", "@type": "CreateAction", "actionStatus": {"@id": "http://schema.org/CompletedActionStatus"}, "agent": {"@id": "https://orcid.org/0000-0003-0606-2512"}, "description": "Linux s01r2b48 4.4.59-92.20-default #1 SMP Wed May 31 14:05:24 UTC 2017 (8cd473d) x86_64 x86_64 x86_64 cmU/Linux SLURM_JOB_NAME=matmul-DP COMPSS PYTHON_VERSION=3.9.10 SLURM_JOB_QOS=debug_SLURM_MEM_PER_CPU=1880 COMPSS_BINDINGS_DEBUG=1 SLURM_JOB_ID=30132875 SLURM_JOB_USER=bsc19057 COMPSS_HOME=/apps/COMPSs/3.2/ SLURM_JOB_UID=2952 SLURM_SUBMIT_DIR=/gpfs/home/bsc19/bsc19057/COMPSs-DP_SLURM_JOB_NODELIST=s01r2b48 SLURM_JOB_GID=2950 SLURM_JOB_CPUS_PER_NODE=48 COMPSS_MPIRUN_TYPE=impi_SLURM_SUBMIT_HOST=login3 SLURM_JOB_PARTITION=main_SLURM_JOB_ACCOUNT=bsc19 SLURM_JOB_NUM_NODES=1 COMPSS_MASTER_NODE=s01r2b48 COMPSS_WORKER_NODES=", "endTime": "2023-09-07T09:46:26+00:00", "instrument": {"@id": "application_sources/matmul_files.py"}, "name": "COMPSs_matmul files.py execution at marenostrum4 with JOB_ID_30132875",



CreateAction



"subjectOf": ["https://userportal.bsc.es/"]



Conclusions

- FAIR HPC workflows combining COMPSs + RO-Crate + WorkflowHub
 - WMS that use RO-Crate (Galaxy, Nextflow, Streamflow, Sapporo, Autosubmit)
- Paper* experiments show
 - We provide automatic provenance registration (whenever possible)
 - We are **efficient** (no run time overhead appreciated)
 - We can scale and deal with large workflows (shown by use cases)
- Future Work
 - Integration with: WfExS, ROHub (RO-Crate)
 - Automatic reproducibility with the PyCOMPSs CLI
 - Governance and Knowledge extraction

*Raül Sirvent et al. "Automatic, Efficient and Scalable Provenance Registration for FAIR HPC Workflows" In: 2022 IEEE/ACM Workshop on Workflows in Support of Large-Scale Science (WORKS). IEEE, 2022. p. 1-9.



Hands-on Exercises



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Preliminary steps

- Find help in the Manual:
 - COMPSs ReadTheDocs -> Tools -> Workflow Provenance
- Create your WorkflowHub account
 - Open https://workflowhub.eu/
 - Click "Register"
 - "Log in using GitHub" or
 - Register with your e-mail
 - Mandatory: First name, Last name, e-mail. Recommended: ORCID
 - Confirm registration with received e-mail
- Join "COMPSs Tutorials" team ("eFlows4HPC" Space)
 - "Join a Team"
 - Search for "COMPSs Tutorials"
 - Organization:
 - Search for your institution not only by acronym, also with full words
 - Can try also: Browse -> Organizations -> Country (filter)
 - If not found: Create -> Organization
- List of commands used in the Exercises: /apps/COMPSs/TUTORIALS/2024_BSC_TRAINING_COMPSS_MN4/PROVENANCE_COMMANDS.txt



- Choose a COMPSs example from the ones you have previously run in the Cluster Hands-on session
 - Easy: Lysozyme in Water (any version) (mandatory dataset_small/)
 - Medium: Cholesky (can play with SIZE and BSIZE), K-means, Clustering Comparison
 - Hard: Wordcount (both reduce and merge)
- Create/edit ro-crate-info.yaml
 - cp /apps/COMPSs/TUTORIALS/2024_BSC_TRAINING_COMPSS_MN4/ro-crateinfo.yaml .
 - Establish yourself as 'Submitter'
 - If you don't have an ORCID, just remove the 'Submitter' section, the Author will be considered the Submitter



• ro-crate-info.yaml

COMPSs Workflow Information:

```
name: Lysozyme in water sample
description: Lysozyme in water sample COMPSs application
license: Apache-2.0
sources: [src/, launch.sh]
data_persistence: True
utbons:
```

Authors:

- name: Rosa M. Badia e-mail: Rosa.M.Badia@bsc.es orcid: https://orcid.org/0000-0003-2941-5499 organisation_name: Barcelona Supercomputing Center ror: https://ror.org/05sd8tv96

Submitter:

name: Raül Sirvent e-mail: Raul.Sirvent@bsc.es orcid: https://orcid.org/0000-0003-0606-2512 organisation_name: Barcelona Supercomputing Center ror: https://ror.org/05sd8tv96



Minimal information

Odd usernames: True Even usernames: False

Hint for Wordcount: look for the optional parameters of ro-crate-info.yaml in the manual

- Edit launch.sh script: add "--provenance" option
- Submit: Example ./launch.sh 2 10 false \$(pwd)/config/ \$(pwd)/dataset_small/ \$(pwd)/output/
 - Change number of nodes, or other parameters
 - Lysozyme in water: launch.sh, launch_full.sh, launch_full_no_mpi.sh or launch_full_singularity.sh
 - Cholesky: SIZE, BSIZE
 - Wordcount: launch.sh or launch_merge.sh
- Check time and result of provenance generation (compss_XXXX.out)
 - What was the longest time during generation?
- Zip and upload RO-Crate
 - zip –r my_app_crate.zip COMPSs_RO-Crate_XXX/
- Copy the file to your laptop. Run, from your laptop:
 - scp nct01XXX@mn3.bsc.es:~/my_app_folder/my_app_crate.zip ~/Desktop/
- Go to WorkflowHub -> Contribute
 - Upload/Import Workflow RO-Crate -> Select local file
 - Briefly inspect imported metadata
 - Select Team, check Sharing permissions, click Register



- DOI generation and reference (DON'T DO THIS NOW!!!!!!)
 - Freeze version
 - Generate a DOI
 - Share the obtained DOI (e.g. use it as a reference in a paper)
- Example: ROM Workflow DOI generated live



Exercise 2: Inspect a previous published execution

- Find your own published workflow
 - My Items -> Workflows
- Can you understand the metadata (ro-crate-metadata.json)? Ask, if not
 - Identify the 3 main parts of the JSON: Root Data Entity, Data Entities, Contextual Entities
 - ro-crate-metadata.json interesting keywords: mainEntity, ComputationalWorkflow, WorkflowSketch, #compss, CreateAction (object, result)
 - Observe the CreateAction in detail
- Questionnaire:
 - Who ran this code? Where? When? With which COMPSs version?
 - What is the name of the main application source file?
 - What were the inputs and outputs used or generated in this workflow run?
 - Can you say how many cluster nodes were used for the run? (Hint: 3 locations)
 - Where can you find detailed profiling of the application? (Hint: 2 locations)
 - Are the data assets included in the package?
 - What was the command used to run this workflow? What were the parameters passed to the application?
 - Navigate the workflow diagram



Exercise 2 (extra): Inspect a previous published execution

- Browse for other COMPSs Workflows at WorkflowHub
 - Browse -> Workflows
 - Workflow type: filter by "COMPSs"
 - Team: filter by "COMPSs Tutorials" (or don't)
- Inspect the metadata (keywords: mainEntity, ComputationalWorkflow, WorkflowSketch, #compss, CreateAction (object, result))
- Questionnaire:
 - Who ran this code? Where? When? With which COMPSs version?
 - What is the name of the main application source file?
 - What were the inputs and outputs used or generated in this workflow run?
 - Can you say how many cluster nodes were used for the run? (Hint: 3 locations)
 - Where can you find detailed profiling of the application? (Hint: 2 locations)
 - Are the data assets included in the package?
 - What was the command used to run this workflow? What were the parameters passed to the application?
 - Navigate the workflow diagram



Exercise 3: Repeat Exercises 1 and 2 with data_persistence flipped

- If your data_persistence was True, set it to False
- If it was False, set it to True
- Re-execute your application
- Publish your new run to WorkflowHub
- Compare the runs
 - dataset/ folder???
 - ro-crate-metadata.json -> check data assets
 - Search for a specific file you know
 - Or look for "CreateAction"



Exercise 4: Reproduce an execution from another participant in the tutorial

- Browse for COMPSs Workflows at WorkflowHub
 - Browse -> Workflows
 - Workflow type: filter by "COMPSs"
 - Team: filter by "COMPSs Tutorials"
 - Select preferably one with data_persistence=True (i.e. has a dataset/ folder)
- Click the workflow, click "Download RO-Crate"
- Create a directory at the supercomputer
 - mkdir ~/reproduced_app/
- Copy the file from your laptop to the supercomputer
 - scp ~/Desktop/workflow-XXX-X.crate.zip nct01XXX@mn3.bsc.es:~/reproduced_app/your_app_crate.zip
- At the supercomputer, in the ~/reproduced_app/ folder
 - unzip workflow-XXX-X.crate.zip



Exercise 4: Reproduce an execution from another participant in the tutorial

- Understand inputs/outputs location (ro-crate-metadata.json)
 - Check CreateAction -> object and result
- Example with dataset/
 - Inputs:
 - dataset/lysozyme_in_water/config/
 - dataset/lysozyme_in_water/dataset_small/
 - Outputs:
 - dataset/lysozyme_in_water/output/
- Example without dataset/
 - Inputs:
 - file://s02r1b59-ib0/home/nct01/nct00XXX/lysozyme_in_water/config/
 - file://s02r1b59-ib0/home/nct01/nct00XXX/lysozyme_in_water/dataset_small/
 - Outputs
 - file://s02r1b59-ib0/home/nct01/nct00XXX/lysozyme_in_water/output/
- Check parameters used in the run (compss_submission_command_line.txt)
 - Specifically, the num_nodes parameter



Exercise 4: Reproduce an execution from another participant in the tutorial

• CREATE A NEW OUTPUT FOLDER (avoid overwriting the recorded one)

- cd application_sources/
- mkdir new_output/
- Resubmit the application with the correct paths:
 - chmod ugo+x launch.sh
 - Provenance recording can be deactivated for this run (remove --provenance)
 - Persistence example:
 - ./launch.sh 2 10 false ../dataset/lysozyme_in_water/config/ ../dataset/lysozyme_in_water/dataset_small/ new_output/
 - Non-persistence example:
 - ./launch.sh 2 10 false /home/nct01/nct00XXX/lysozyme_in_water/config/ /home/nct01/nct00XXX/lysozyme_in_water/dataset_small new_output/
- Compare results:
 - diff new_output/ ../dataset/lysozyme_in_water/output/
 - diff new_output/ /home/nct01/nct00XXX/lysozyme_in_water/output
 - Are they identical? Why?





DT-//-GEO

GENCIA Statal Di



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Thank you for your attention

https://compss-doc.readthedocs.io/en/latest/Sections/05 Tools/04 Workflow Provenance.html

Raul.Sirvent@bsc.es