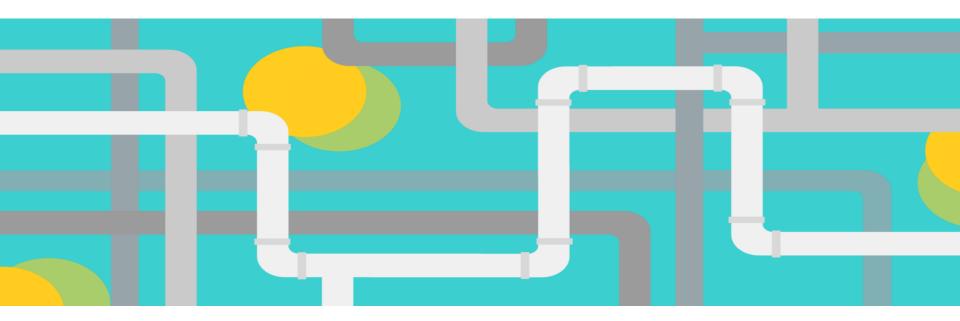
### Managing Scalable Data Workflows on HPC Clusters



Erfan Nourbakhsh (UC Davis)

Astroinformatics 2019

June 26<sup>th</sup>, Caltech

### Outline

- Time-based job schedulers
- Smart scheduling and scalability
- Workflow management systems and big data pipelines
- Introducing Apache Airflow
- Airflow components
- UI walk-through
- Airflow and HPC

# Time-based job schedulers CRON



### Smart scheduling and scalability

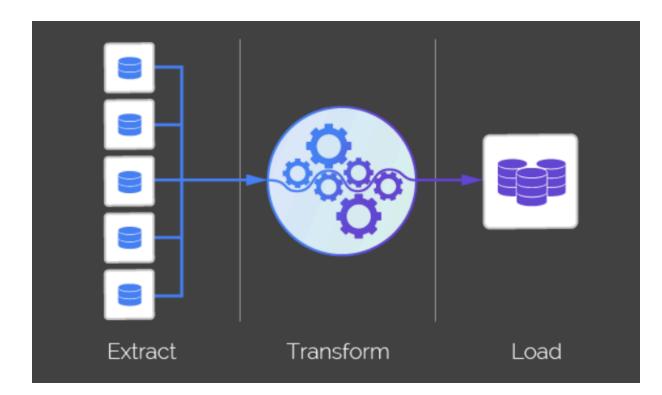
#### Smart Scheduling

- Scheduling task execution minimal criterion for a WMS
- We want task execution to be more "data-aware"

#### Scalability

- Not only address our current data processing needs, but also scale with our future growth
- This should be without requiring substantial engineering time and infrastructure changes

## Workflow management systems and big data pipelines



## Workflow management systems and big data pipelines











### **Apache Airflow**



- Airflow is a platform to programmatically author, schedule and monitor workflows.
- Developed at Airbnb in 2014
- Joined the Apache Software Foundation's incubation program in 2016
- It has been built to scale
- Python script (configuration as code)
- Active development on GitHub (835 contributors, 6,534 commits)
- Rich web UI
- Officially used by about 300 companies (Tesla, Twitter, Yahoo!, PayPal, United Airlines etc.)



### Airflow

Run your pipelines in style https://airflow.apache.org/

#### **Directed Acyclic Graph – DAG** The DAG defines the blueprint of your analysis . It is an instructional format to tell airflow which tasks are executed in what order.



#### **Operators**

Your task blueprint identifying the top level instructions to execute your task . Is your task a bash command, python function, sql query, spark operation, etc.



#### Sensors

Sensors are operators that wait for some event to occur, such as a file on appearing or an http request to occur, before executing a task.

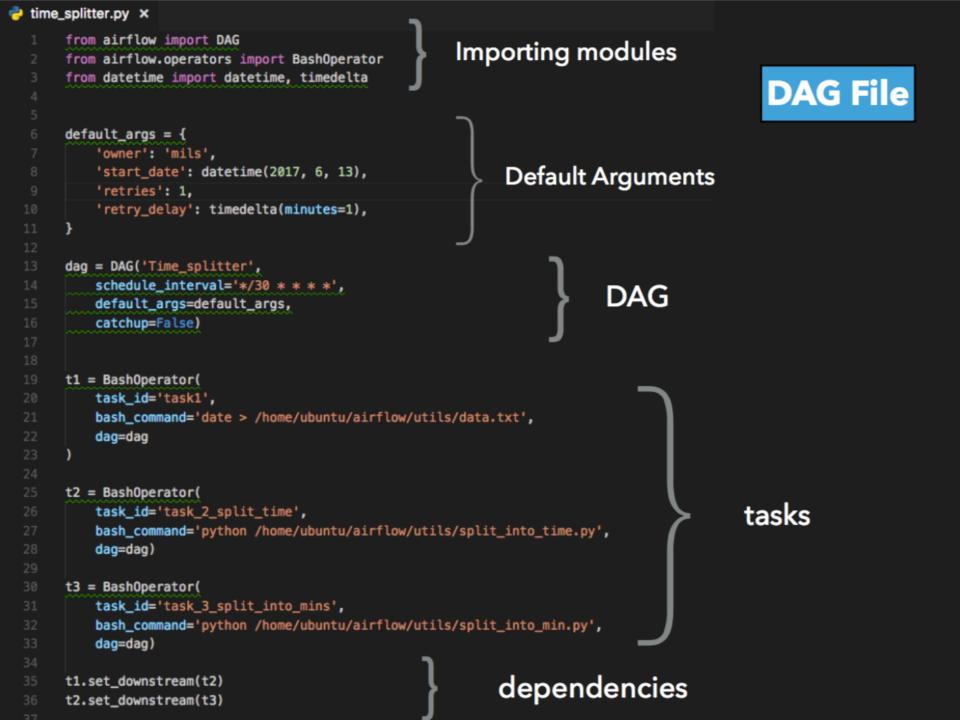
#### Tasks

The actual execution instructions. Your python function to execute, bash command to run, spark pipeline ,etc.

#### <sources>

Airflow Docs - https://airflow.apache.org/ Airflow Github - https://github.com/apache/airflow Some Icons made by "https://www.freepik.com/"

visit https://dabble-of-devops.com for more/ information>



Ľ	Airflow	DAGs	Data Profiling -	Browse			21:04 UTC		
DAGs how 10 + entries Search:									
	0	DAG		Schedule	Owner	Recent Statuses 0	Links		
0	On	db_backup_	_v1	04***	aflury	30000	♦ ♣ 山 木 ☰  ☰ ◯		
0	On	db_report_v	4	*/10****	scattaneo	00000	♦ <b>₩.山水三</b> ⊁≡0		
0	Off	emr_data_re	eport	01***	kmandich	3	♦★山水三ヶ三○		
0	On	emr_forward	ders	08***	kmandich	30000	<b>♦★山水ミィミン</b>		
0	On	emr_model_	building	01***	kmandich	<b>5320</b>	●●山水三ヶ三○		
0	Off	ep_model_t	puilding_v1	01***	sanand	00000	♦ ♣ 山 木 ☰  ☰ ♡		
0	Off	ep_reload_c	Jata	None	sanand	<b>4</b> 0000	♦ ♣ 山 ★ ☰ ४ ☰ 0		
0	Off	ep_summar	y_alert	Chourty	wforrester	00000	●●山水三ヶ三○		
0	On	ep_telemetr	y_v2	Chourty	sanand	00000	♥♥ di 木主 ≠ ≣C		
0	Off	feeback_rep	port_v1	1 day, 0:00:00	kmandich		◆★山水豆ヶ三0		

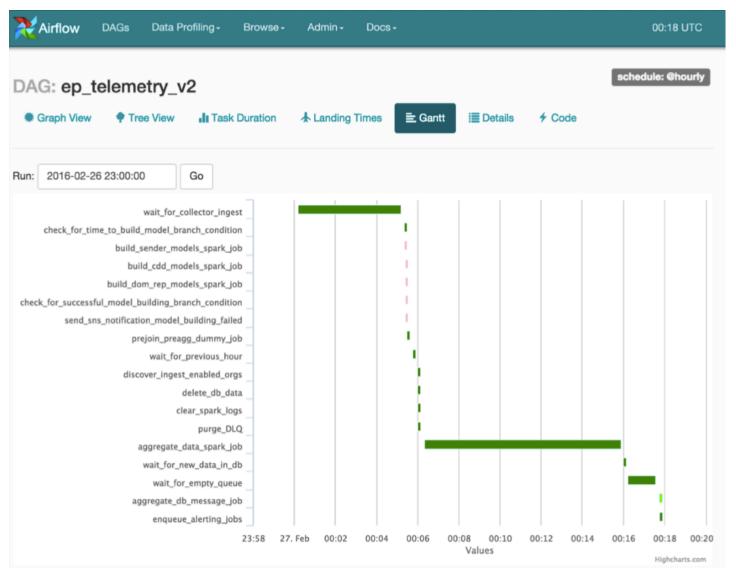
Showing 1 to 10 of 20 entries

Previous 1 2

2 Next

Airflow DAGs Data Profiling - Browse - Admin - Docs -	00:15 UTC
Graph View Tree View Is Task Duration Landing Times Gantt Gantt Gode	schedule: @hourly
running Run: scheduled_2016-02-26T23:00:00 ¢ Layout: Top->Bottom ¢ Go	Search for
BashOperator BranchPythonOperator DummyOperator ExternalTaskSensor PythonOperator	success running failed queued no status
wait_for_collector_ingest check_for_time_to_build_model_branch_condition build_dom_rep_models_spark_job build_dom_rep_models_spark_job build_dom_rep_models_spark_job check_for_successful_model_building_failed send_sns_notification_model_building_failed (ciear_spark_logs) delete_db_data discover_ingest_enabled_orgs wait_for_new_data_in_db wait_for_eney_queue aggregate_db_message_job enqueue_alerting_jobs send_email_notification_flow_successful	

Airflow DAGs Data Profiling - Browse - Admin - Doc			00:16 UT
A Colored television of			schedule: Chour
AG: ep_telemetry_v2			
Graph View 🔷 Tree View 📊 Task Duration 🔥 Landing Times	E Gantt 🔚 Details 🗲 Code		
se date: 2016-02-26 23:00:00 Number of runs: 25 \$ Go			
BashOperator O BranchPythonOperator O DummyOperator O Extern	nalTaskSensor 🔘 PythonOperator	success running	ailed 🔲 no statu
	F1/26 12PM		
[DAG]	000000000000000000000000000000000000000		
Osend_sns_notification_model_building_failed			
Ocheck_for_successful_model_building_branch_condition			
obuild_dom_rep_models_spark_job			
O_build_cdd_models_spark_job			
O build_sender_models_spark_job			
Ocheck_for_time_to_build_model_branch_condition			
wait_for_collector_ingest			
Osend_email_notification_flow_successful			
Oaggregate_db_message_job			
Owait_for_empty_queue			
Qwait_for_new_data_in_db			
Qaggregate_data_spark_job			
Ociear_spark_logs			
Qwait_for_previous_hour			
Check_for_successful_model_building_branch_condition			
Oprejoin_preagg_dummy_job			
Ocheck_for_time_to_build_model_branch_condition			
O delete_db_data			
Owait_for_previous_hour			
O discover_ingest_enabled_orgs			
Owait_for_previous_hour			
O purge_DLQ			
Owait_for_previous_hour			
O enqueue_alerting_jobs			
Owait_for_empty_queue			



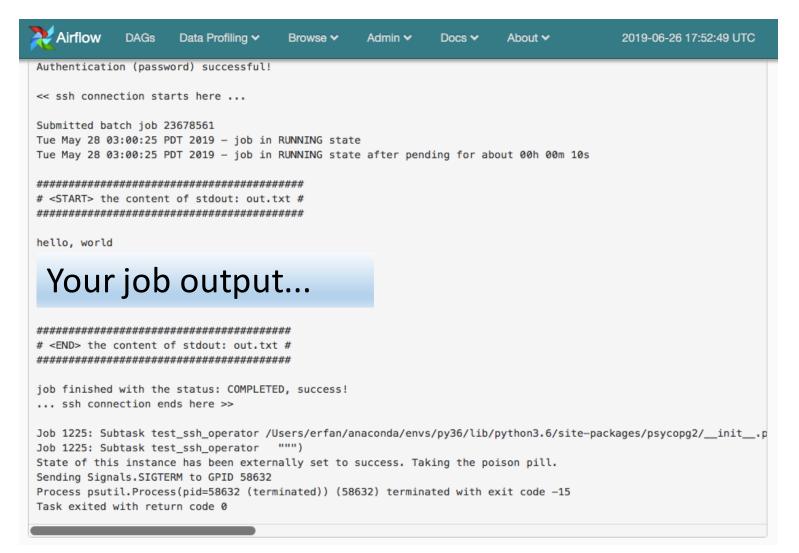
### Airflow and HPC

- Apache Spark Integration
- MPI with Slurm Integration (not natively supported)





### Slurm Output



### Conclusion

### Try Airflow and apply it to your work

### Thank you!

### Sources

https://github.com/apache/airflow

https://www.alooma.com/answers/what-is-apache-airflow

https://sonra.io/2018/01/01/using-apache-airflow-to-build-a-data-pipeline-on-aws/

https://www.slideshare.net/mesodiar/intro-to-airflow-good-bye-cron-welcome-scheduledworkflow-management

https://qcon.ai/system/files/presentation-slides/sid\_anand\_qcon\_ai\_2018\_v2.pdf

https://dabble-of-devops.com/learn-airflow-by-example-part-1-introduction/

https://towardsdatascience.com/why-quizlet-chose-apache-airflow-for-executing-dataworkflows-3f97d40e9571