



@rantav
totango



Spotify™

WHO AM I?





WHO AM I?

- A developer
 - Google, Microsoft, Outbrain, Gigaspaces, Totango etc
 - FLOSS: Hector, flask-restful-swager, meteor-migrations, monitoring...
 - Contributor to **Luigi**
- reversim.com
- [Gormim](#)



We help developers find their dream job!

Curated weekly email of top companies seeking talented software engineers in Israel

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Nir Dremer

Nir builds products at the intersection of technology, business & psychology. He founded MediaBox and led products at Imperva (NYSE: IMPV) & BitBand

(acquired by Motorola)



Ran Tavory

Ran is domain expert in web infrastructure and scaling. He founded SocialStudios and built products at Google, YouTube, Microsoft and Outbrain. Ran is

also a blogger and a podcaster.

WHAT IS LUIGI?



WHAT IS LUIGI?

- A **Workflow Engine**.
 - Who the fuck needs a workflow engine?
- You do!!!
 - If you run hadoop (or other ETL jobs)
 - If you have dependencies b/w them (who doesn't?!)
 - If they fail (**s/if/when/**)
- Luigi doesn't replace Hadoop, Scalding, Pig, Hive, Redshift.
 - It **orchestrates** them



SCREENSHOTS

Luigi Task Visualiser

https://pipeline.spotify.net/luigi/static/visualiser/index.html

1 WebplayerRequestTimeImporterMulti

1 WeeklyBrowseData

Failed Tasks

6 ActivationDomino

10 AggregateClientCrashHockeyApp

15 CrashLogsToHdfs

1 DominoImportTask

6 ImpressionsAndUsers

2 OrganicMultiplier

10 RetentionDomino

6 UpdateLogAvroSchemas

1 UserUsageSummary

6 UTMAcquisitionShard

Running Tasks

1 AdReportingMetrics

1 AggregateClientCrashHockeyApp

AggregateClientCrashHockeyApp (test=False, date=2013-11-02) 6:32:03 PM

1 AggregateWebPlayerUpgradeTest

10 AndroidHockeyAppCrashes

1 BandwidthConnectionJoin

2 DominoImportTask

1 DumpFslmage

2 DumpMetadata

DumpMetadata (date=2013-11-06, table=publishedaudio) 7:21:09 PM

DumpMetadata (date=2013-11-06, table=audio) 7:21:09 PM

1 DumpSuperviseStatus

Luigi Task Visualiser

https://pipeline.spotify.net/luigi/static/visualiser/index.html#HockeyAppCrashesToPostgresMulti(last_date=2013-11-06, days_back=...

Luigi Task Status Active tasks

Task List Dependency Graph

TaskId[param1=wait_param] Show task details

HockeyAppCrashesToPostgresMulti(last_date=2013-11-06, days_back=15, days_back_strict=10, today=False)

Dependency Graph

Failed (Red), Running (Blue), Pending (Yellow), Done (Green)

HOW DO **YOU** ETL YOUR DATA?

- Hadoop
- Spark
- Redshift
- Postgres
- *Ad-hoc java/python/ruby/go/...*

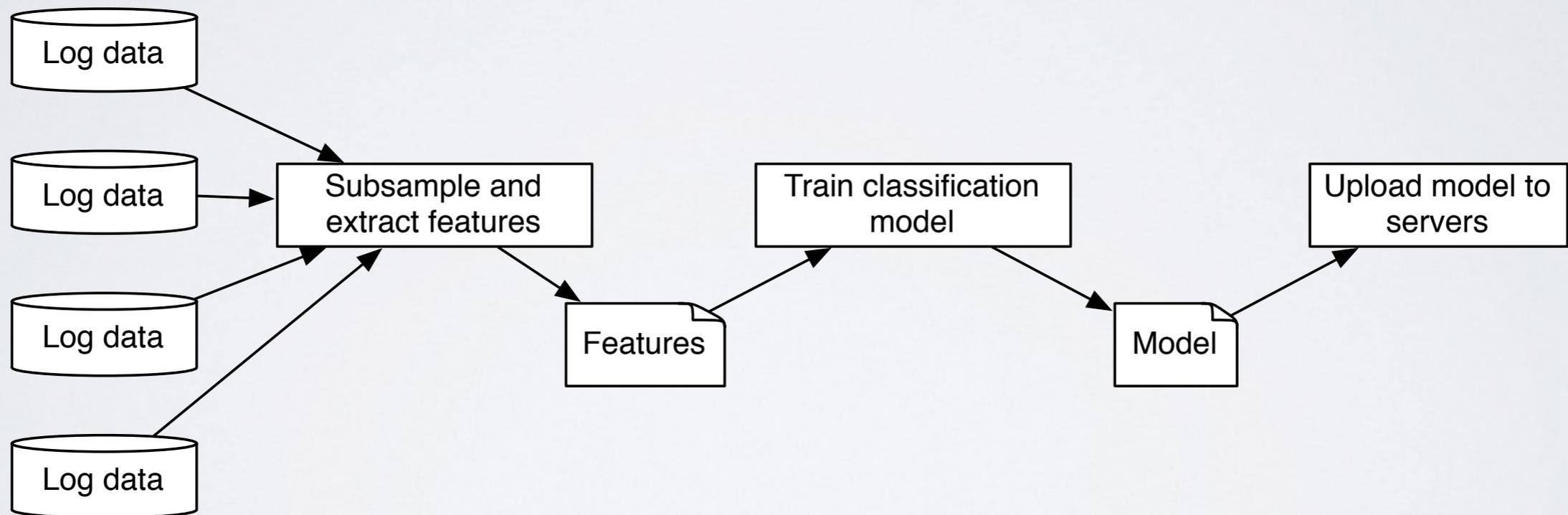
RUNNING **ONE** JOB IS EASY RUNNING **MANY** IS HARD

- 100s of concurrent jobs, 1000s Daily.
- Job dependencies.
 - E.g. first copy the file, then crunch it.
- Errors / retries
 - Idempotency
- Monitoring / Visuals

THE WRONG WAY TO DO IT



EXAMPLE WORKFLOW



THE CRON PHENOMENON

THE **WRONG** WAY TO DO IT

```
pydata_pres -- emacs -- 139x13
# m h dom mon dow user  command
0 1 * * * spotify-analytics /usr/bin/spotify_extract_features --date `date +%Y-%m-%d` # let log files are available by 1am
0 2 * * * spotify-analytics /usr/bin/spotify_train_model --date `date +%Y-%m-%d` # job finished by 2am
0 3 * * * spotify-analytics /usr/bin/spotify_update_model --date `date +%Y-%m-%d` # ugly!!!

-uu:---F1 crontab      All L3      (Fundamental)-----
Wrote /Users/erikbern/pydata_pres/crontab
```

Don't try this at home!!!

ENTER LUIGI



ENTER LUIGI

- Like Makefile - but in python
 - And - For data
- Integrates well with data targets
 - Hadoop, Spark, Databases
 - Atomic file/db operations
- Visualization
- CLI - really nice developer interface!



LUIGITASK

```
class MyTask(Task):  
    def output(self):  
        pass  
  
    def requires(self):  
        pass  
  
    def run(self):  
        pass
```

LUIGITASK

```
class AggregateArtists(Task):
    def output(self):
        return HdfsTarget("data/artist_streams.tsv")

    def requires(self):
        return Streams()

    def run(self):
        with self.input().open('r') as in_file:
            ... # read stuff from in_file

        with self.output().open('w') as out_file:
            ... # write stuff to out_file

if __name__ == "__main__":
    luigi.run()
```

Store output in HDFS

**Run - actual work
Read from input
Write to output**

Run with `__main__`

RUN FROM THE CLI

Run on the command line:

```
$ python dataflow.py Aggreg
```

```
DEBUG: Checking if AggregateArtists() is complete
INFO: Scheduled AggregateArtists()
DEBUG: Checking if Streams() is complete
INFO: Done scheduling tasks
DEBUG: Asking scheduler for work...
DEBUG: Pending tasks: 1
INFO: [pid 74375] Running    AggregateArtists()
INFO: [pid 74375] Done      AggregateArtists()
DEBUG: Asking scheduler for work...
INFO: Done
INFO: There are no more tasks to run at this time
```

TASK PARAMETERS

```
class AggregateArtists(Task):  
    date = DateParameter()
```

```
$ python dataflow.py AggregateArtists --date 2013-03-05
```

AWESOME HADOOP (MR) SUPPORT

```
class AggregateArtists(luigi.hadoop.JobTask):  
    def requires(self):  
        return Streams()  
  
    def output(self):  
        return HdfsTarget("data/artist_streams.tsv")  
  
    def mapper(self, line):  
        timestamp, artist, track = line.split('\t')  
        yield artist, 1  
  
    def reducer(self, artist, streams):  
        yield artist, sum(streams)
```

WEB UI

Luigi Task Status

Task List **Dependency Graph**

Upstream Failure

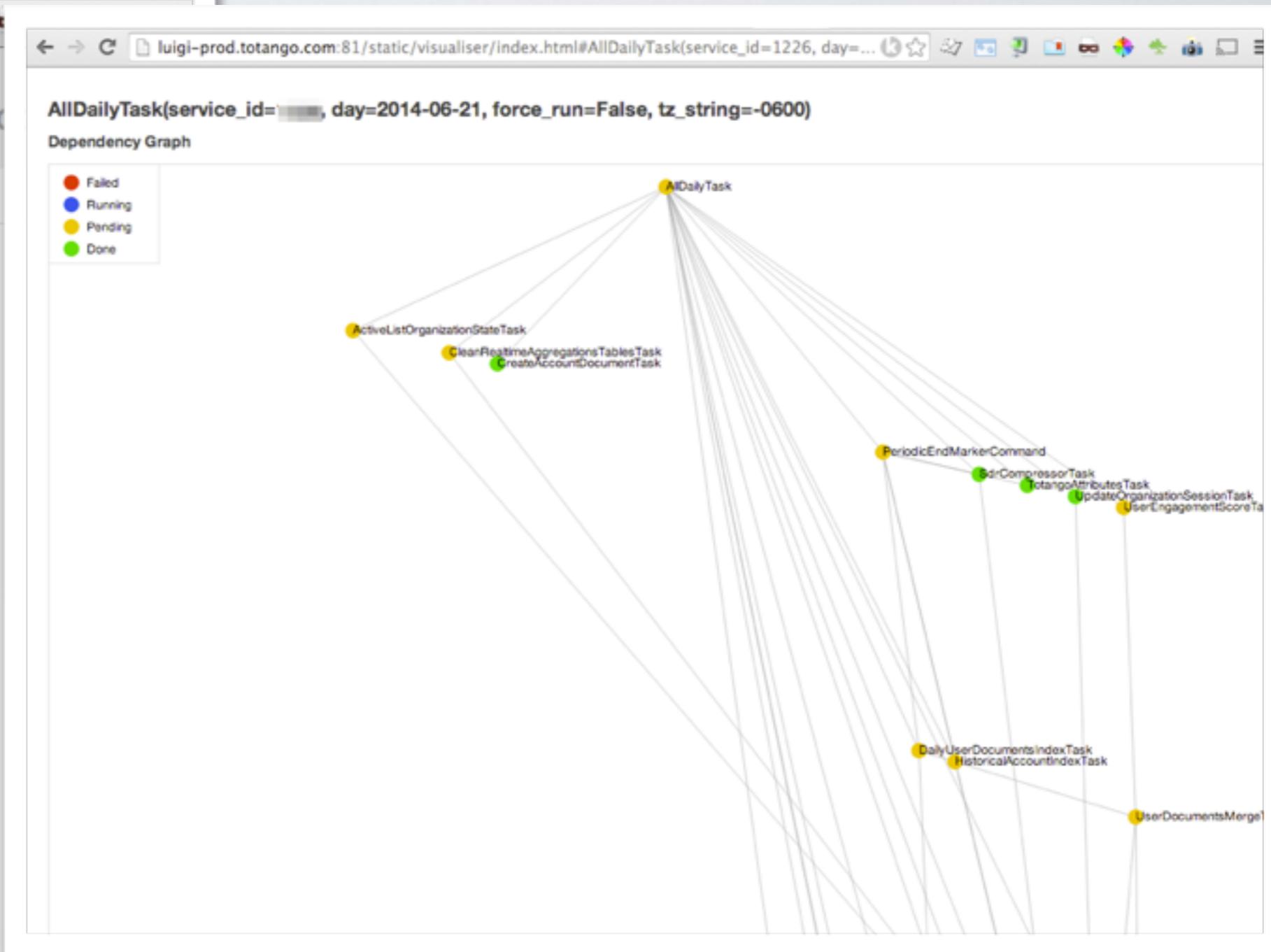
Failed Tasks

Running Tasks

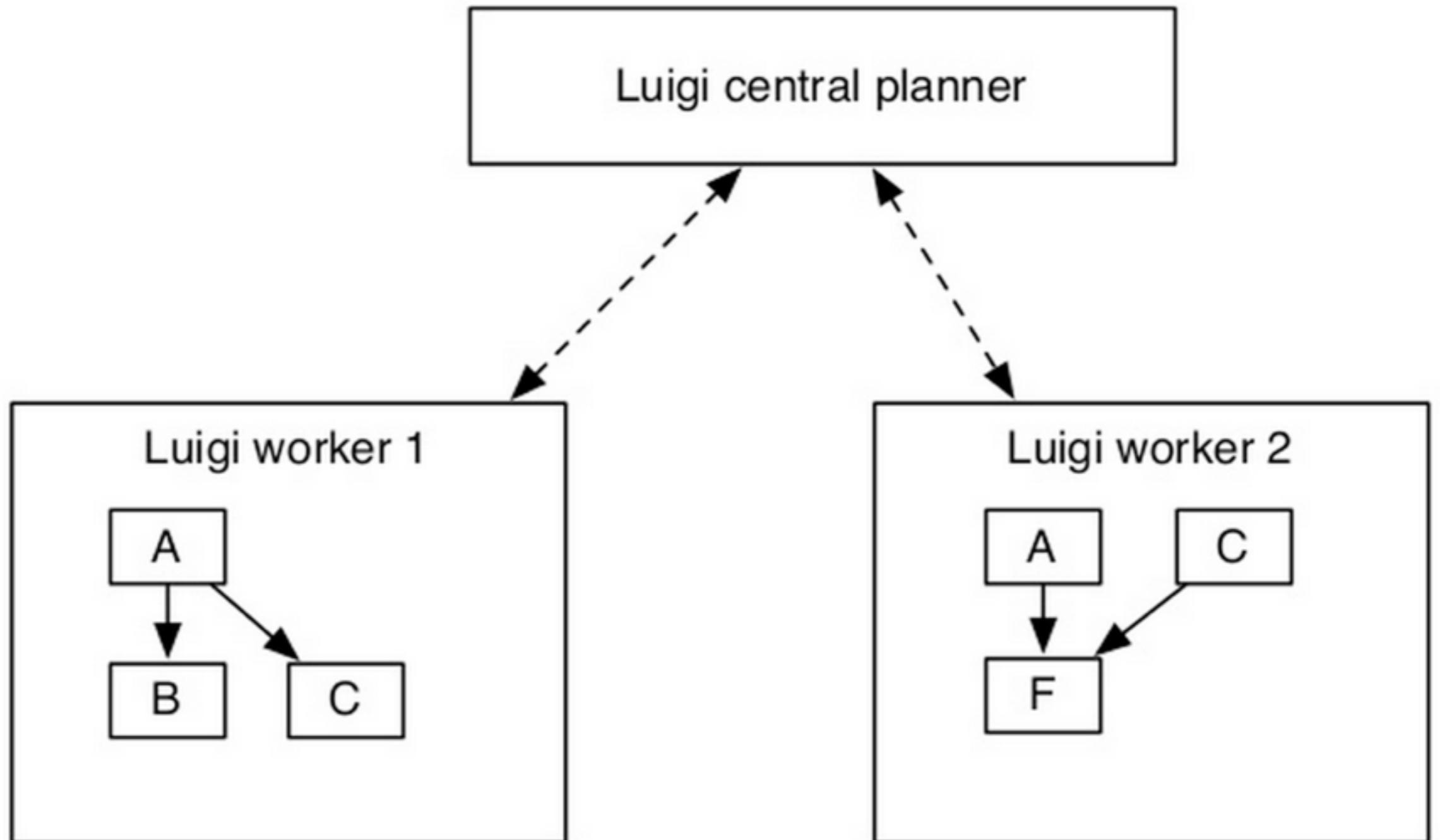
- + 1 AccountIndexDataLoaderTask
- + 3 ActivelistRealtimeTask
- + 1 AvgActivityLevelTask
- + 2 CreateUserDocumentTask
- + 1 DownloadSdrTask
- + 1 HadoopAccountAggregationTask
- + 1 HadoopUserAggregationTask
- + 2 UserDocumentsMergeTask

Pending Tasks

- + 1 AccountAgingTask
- + 3 AccountIndexDataLoaderTask
- + 1 AccountSecondIndexDataLoaderTask



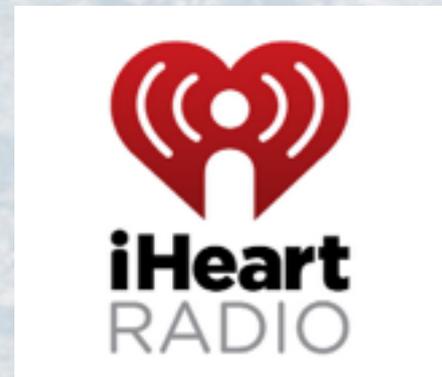
PROCESS SYNCHRONIZATION



USED BY



Spotify®



foursquare®



VisualDNA™



UPPSALA
UNIVERSITET



SEMI-DEEP DIVE



Programming for Luigi

LUIGI TASKS

- Implement 4 method:

```
def input(self) (optional)
```

```
def output(self)
```

```
def run(self)
```

```
def depends(self)
```

LUIGI TASKS

- Or extend one of the predefined tasks
 - **S3CopyToTable**
 - **RedshiftManifestTask**
 - **SparkJob**
 - **HiveQueryTask**
 - **HadoopJobTask**
 - ...

EXAMPLE

LOCAL WORDCOUNT

```
class WordCount(luigi.Task):
    date_interval = luigi.DateIntervalParameter()

    def requires(self):
        return [InputText(date) for date in self.date_interval.dates()]

    def output(self):
        return luigi.LocalTarget('/var/tmp/text-count/%s' % self.date_interval)

    def run(self):
        count = {}
        for file in self.input():
            for line in file.open('r'):
                for word in line.strip().split():
                    count[word] = count.get(word, 0) + 1

        # output data
        f = self.output().open('w')
        for word, count in count.iteritems():
            f.write("%s\t%d\n" % (word, count))
        f.close()
```

EXAMPLE

HADOOP WORDCOUNT

```
class WordCount(luigi.hadoop.JobTask):
    date_interval = luigi.DateIntervalParameter()

    def requires(self):
        return [InputText(date) for date in self.date_interval.dates()]

    def output(self):
        return luigi.hdfs.HdfsTarget('/tmp/text-count/%s' % self.date_interval)

    def mapper(self, line):
        for word in line.strip().split():
            yield word, 1

    def reducer(self, key, values):
        yield key, sum(values)
```

LUIGI TARGETS

- HDFS
- Local File
- Postgres / MySQL, Redshift, ElasticSearch
- ... Easy to extend

DEFINING A **TARGET**

- Implement:

```
def exists(self)
```

And optionally:

```
connect or open / close
```

EXAMPLE

MYSQLTARGET

```
class MySqlTarget(luigi.Target):

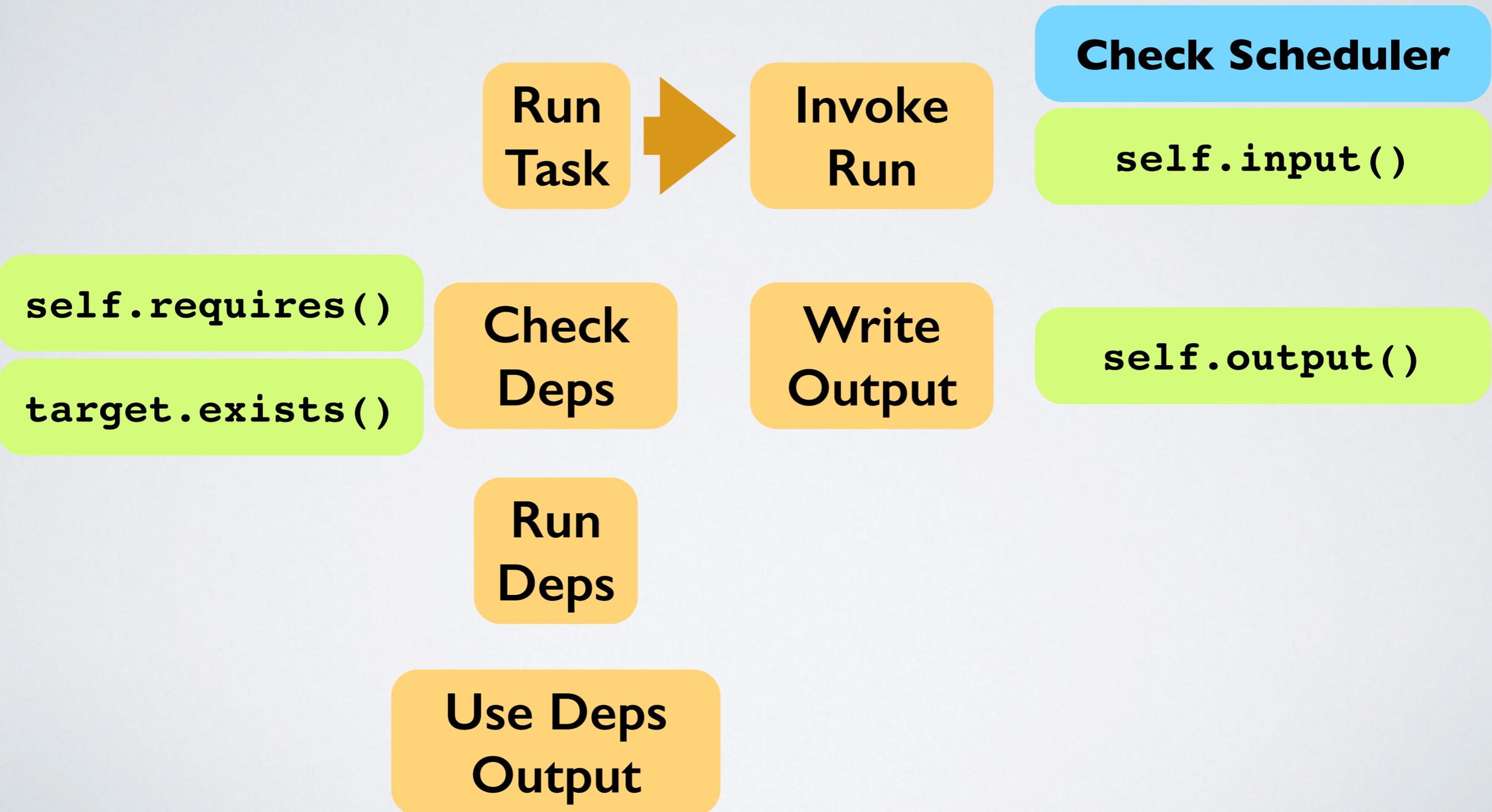
    def touch(self, connection=None):
        ...

    def exists(self, connection=None):
        cursor = connection.cursor()
        cursor.execute("""SELECT 1 FROM {marker_table}
                        WHERE update_id = %s
                        LIMIT 1""".format(marker_table=self.marker_table),
                        (self.update_id,))
        )
        row = cursor.fetchone()
        return row is not None

    def connect(self, autocommit=False):
        ...

    def create_marker_table(self):
        ...
```

THE GRAND SCHEME



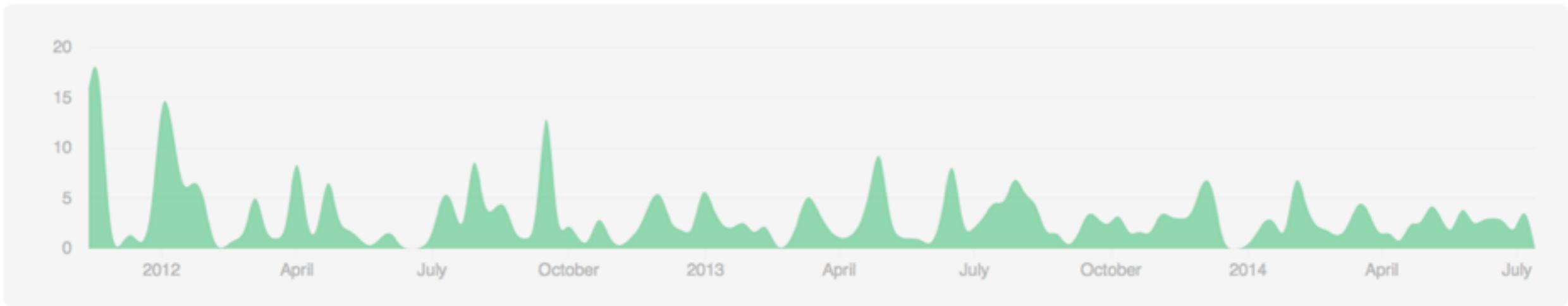
OPEN SOURCE



BY

The Spotify logo is centered on a green background. It features the word "Spotify" in a white, rounded, sans-serif font with a thick green outline. Above the letter "o" in "Spotify" are three curved lines representing a Wi-Fi signal. To the right of the word is a small "TM" trademark symbol.

Spotify™



**authors,
spotify**



erikbern

188 commits / 9,116 ++ / 4,218 --

#1



freider

115 commits / 6,142 ++ / 2,083 --

#2



jcrobak

23 commits / 2,661 ++ / 949 --

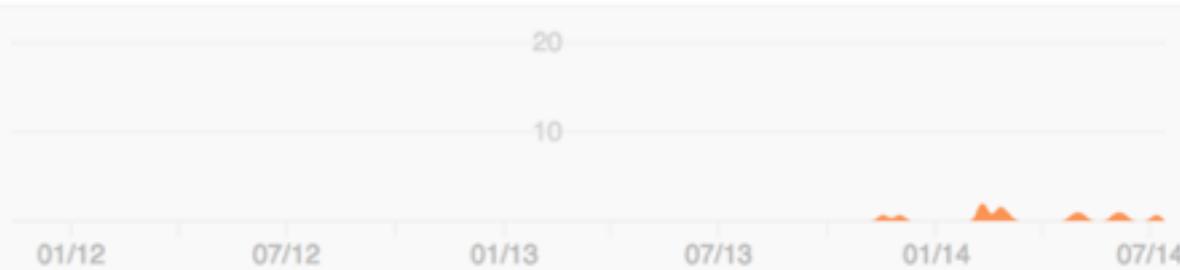
#3



rantav

13 commits / 967 ++ / 510 --

#4



JonNelson

9 commits / 129 ++ / 65 --

#5



miku

7 commits / 724 ++ / 7 --

#6



That's Joe!

That's me!

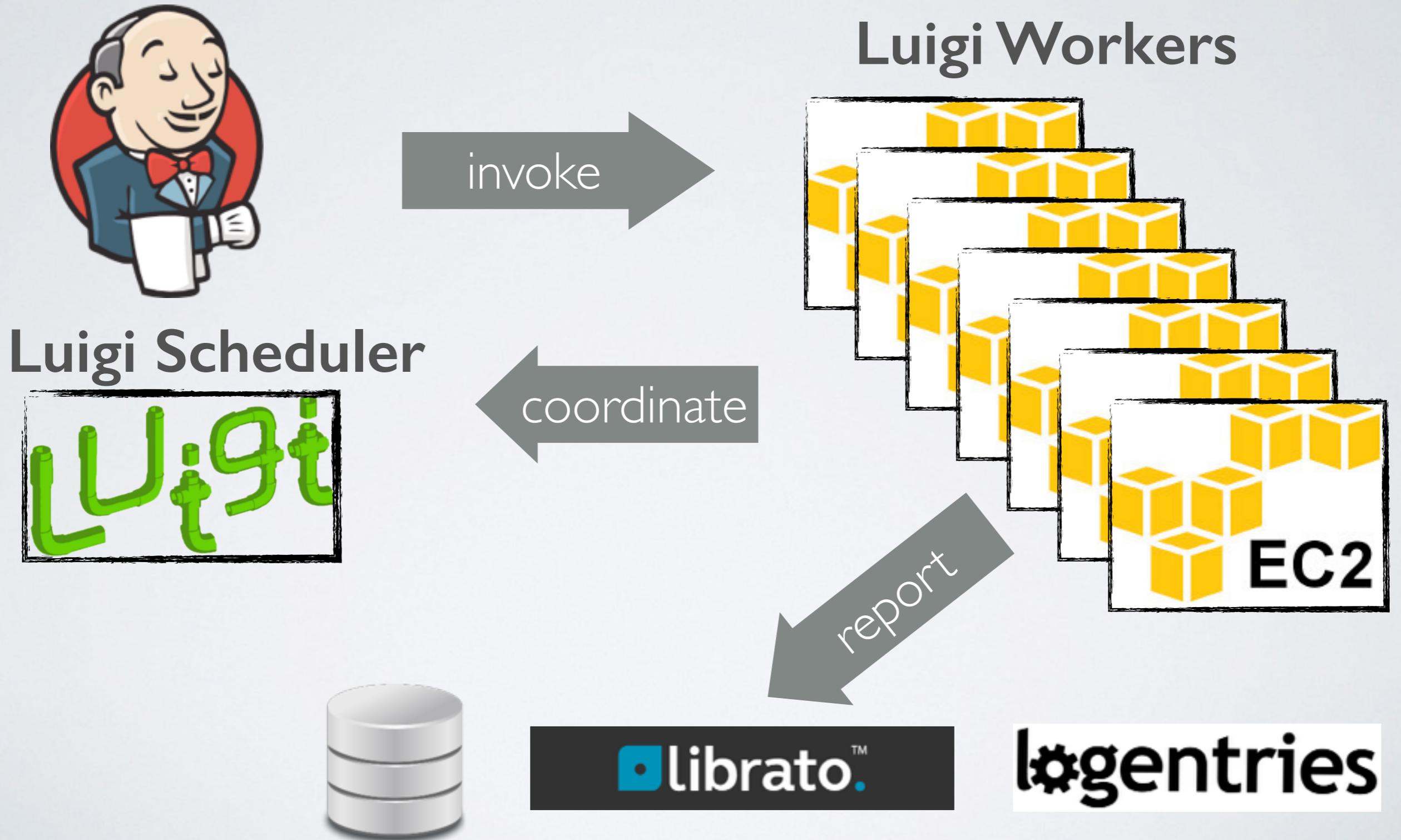
WHAT DID I DO?

- Add **Redshift** support
- Add **MySQL** support
- Various small features (improved **notifications**, **dep.py**, **historydb** etc)
- Various bug reports
 - And fixes!

LUIGI @TOTANGO

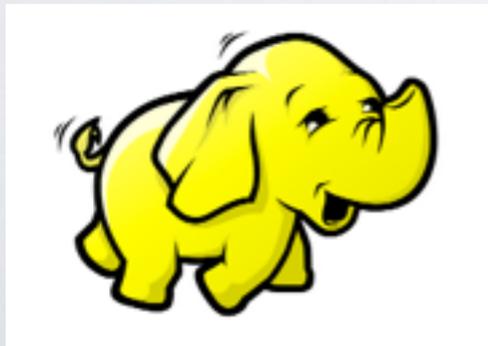
- Daily computation
- Hourly computation
- Ad-hoc data loading (for data analysis activities, to redshift)

TOTANGO'S SETUP



TOTANGO'S SETUP

Luigi Worker

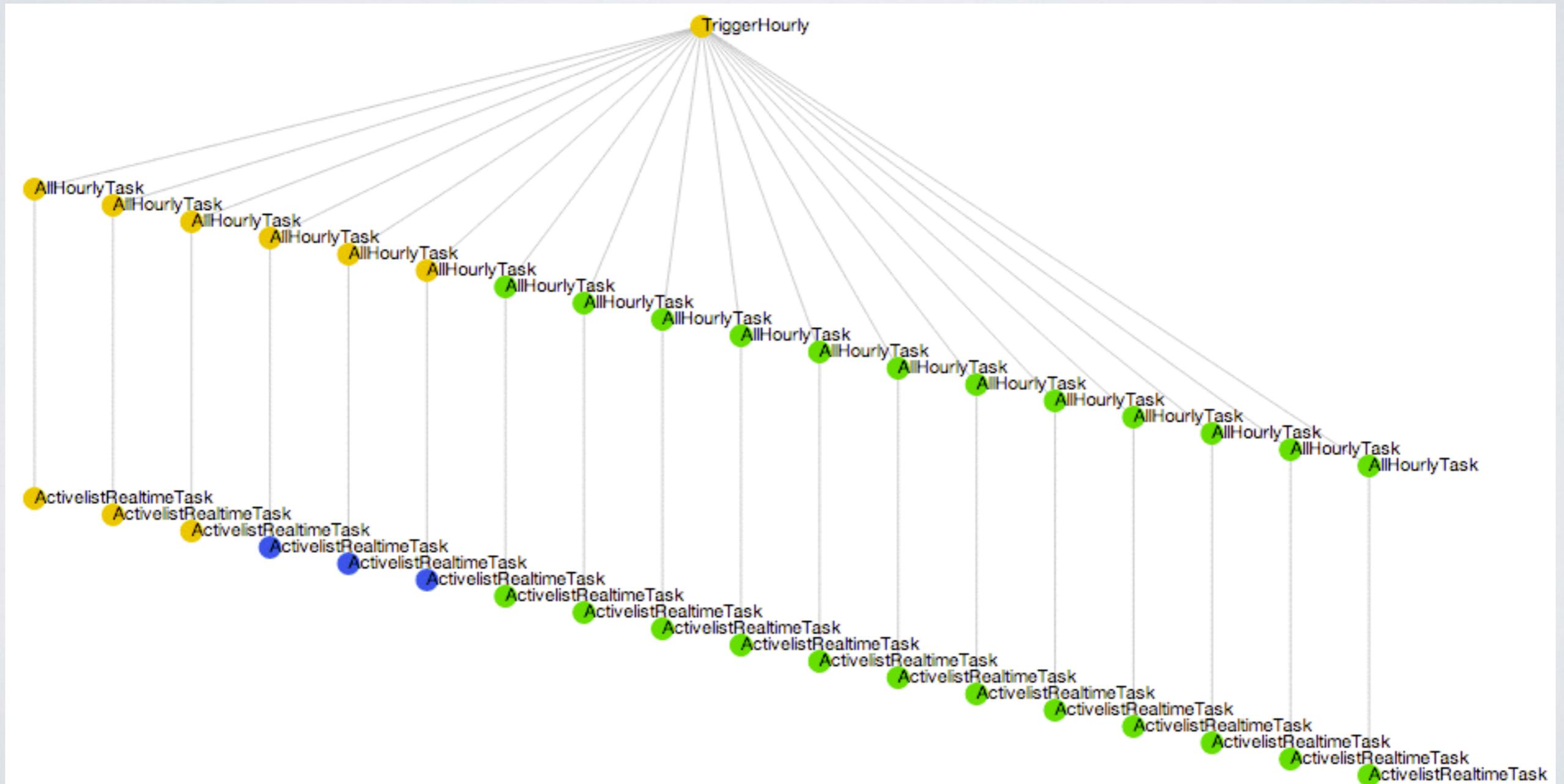


MOAR SCREENSHOTS

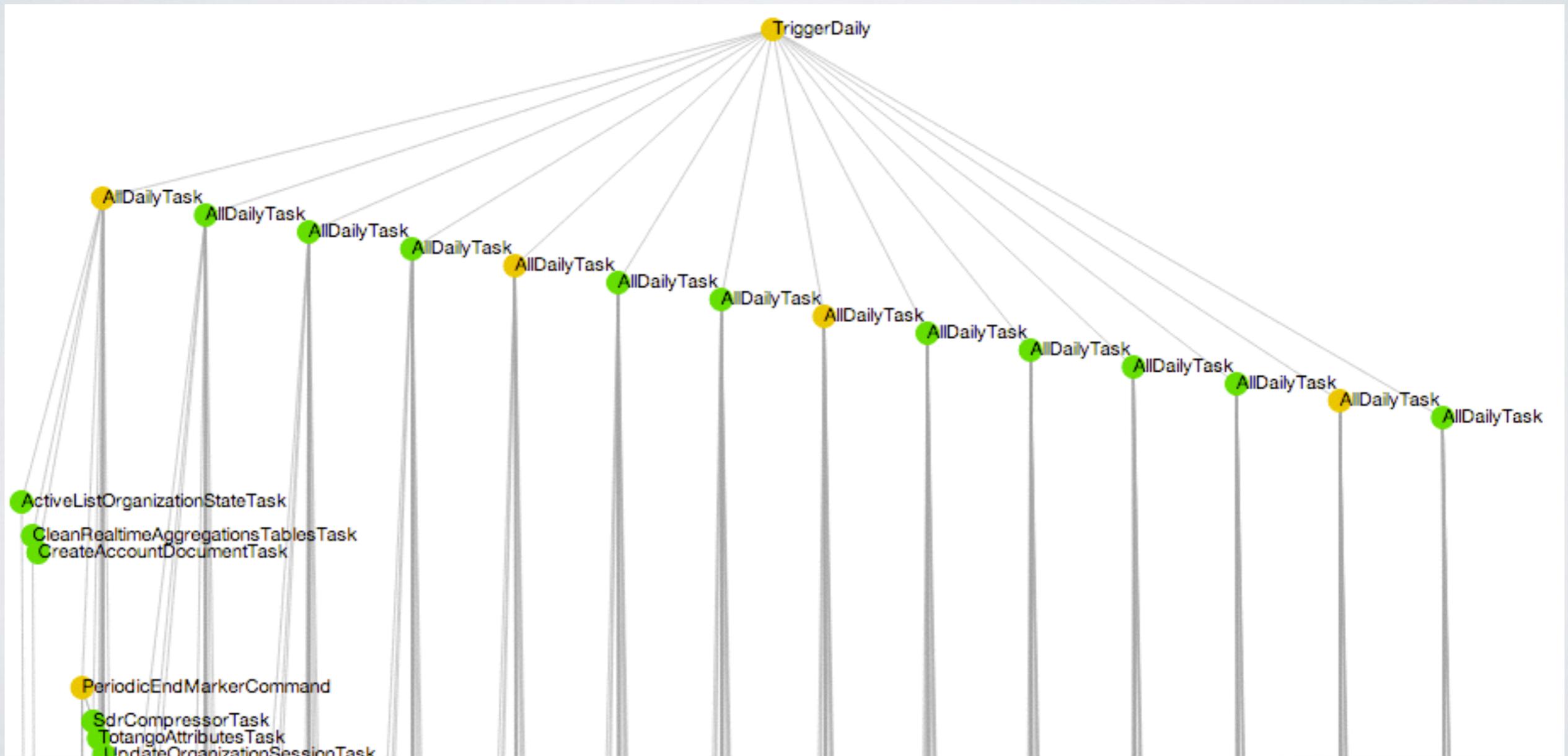
MOAR



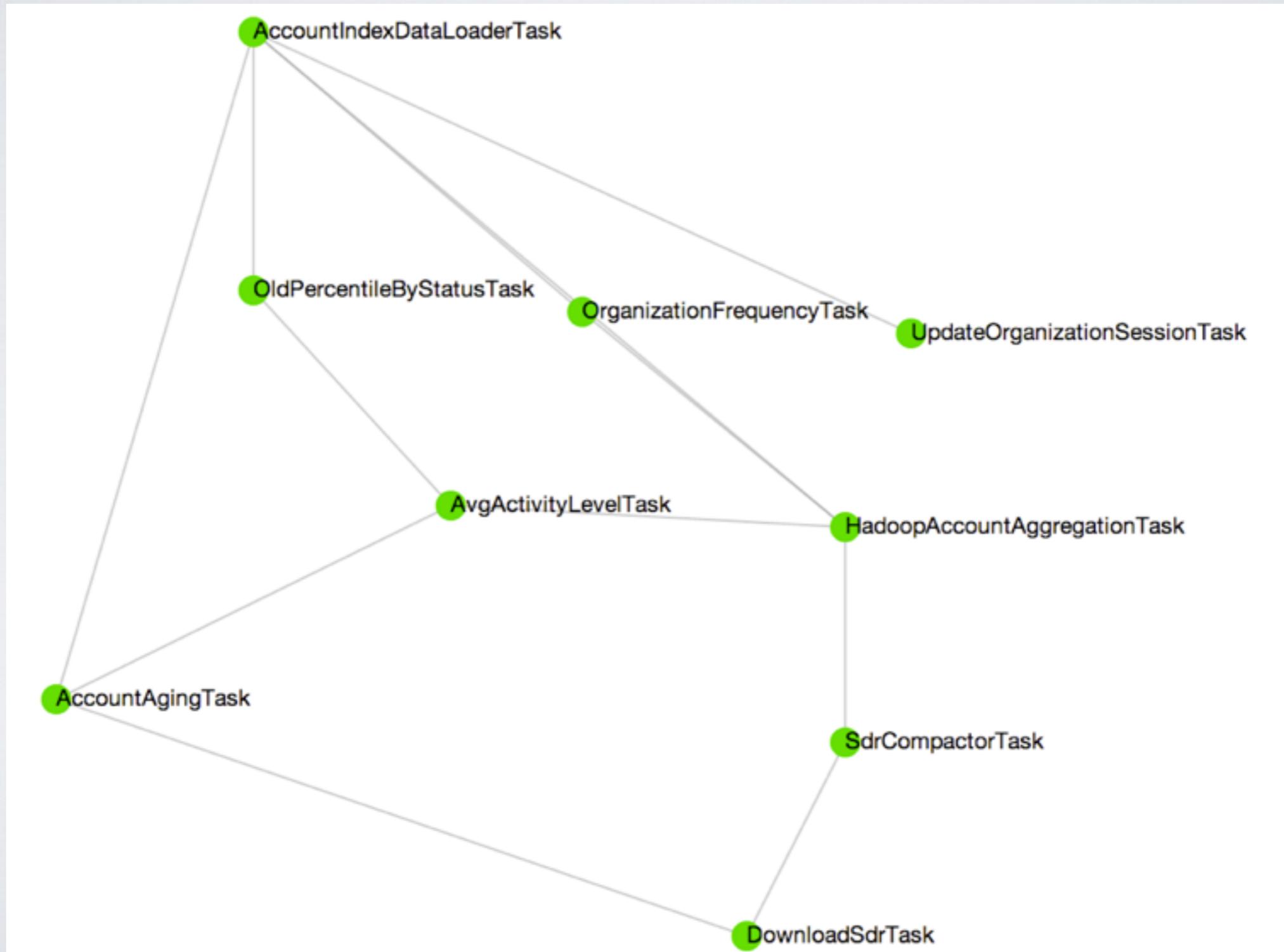
MOAR SCREENSHOTS



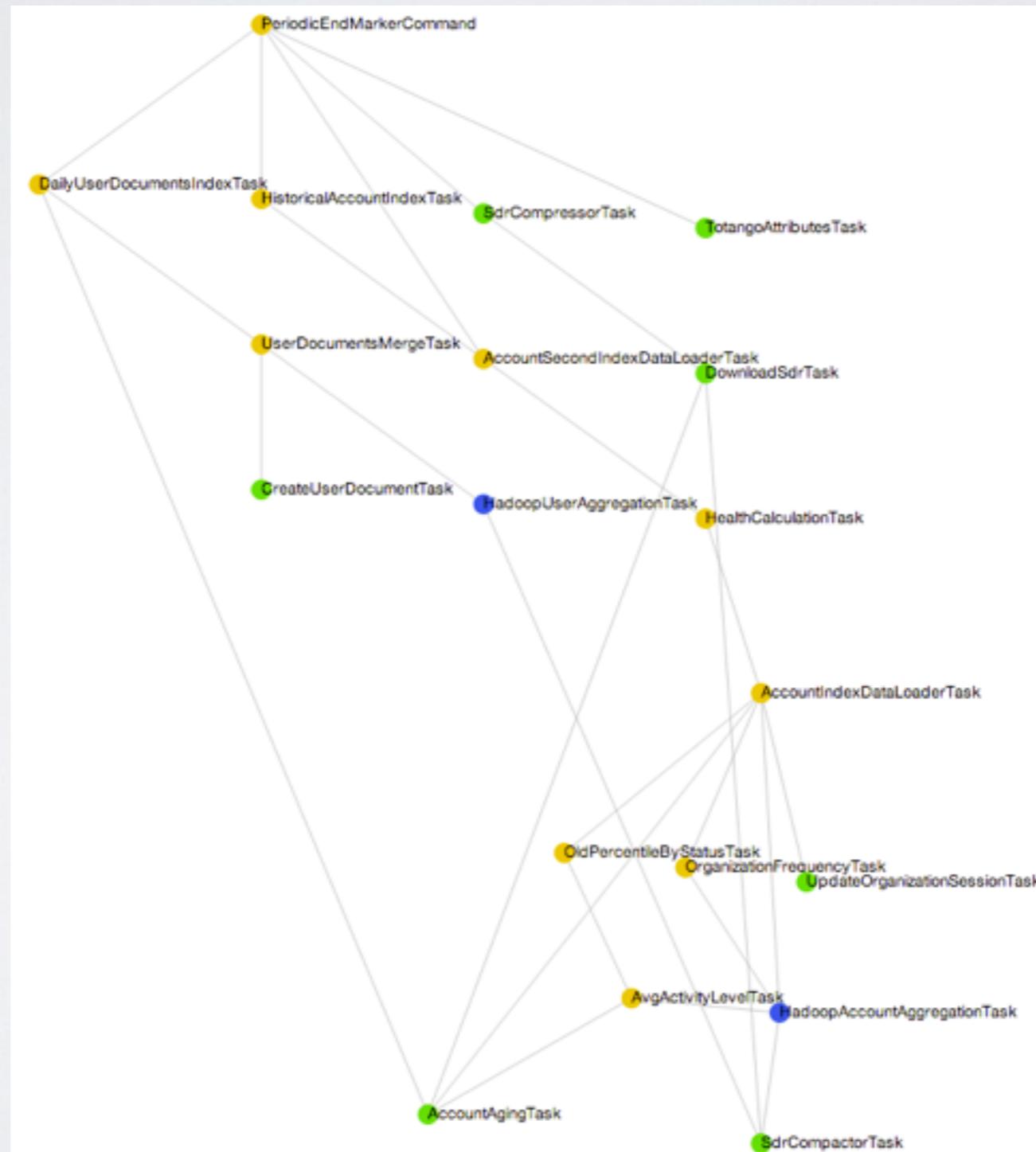
MOAR SCREENSHOTS



MOAR SCREENSHOTS



MOAR SCREENSHOTS



GAMEBOY!!!



GAMEBOY

Gameboy
Home / Dashboard

- Dashboard
- Daily
- Hourly
- Services
- Jenkins

TODAY

130 (30 pending/running)
DAILY
96 services (96 in luigi)

2351 (56 pending/running)
HOURLY
96 services (96 in luigi)

0
FAILED

0
JENKINS QUEUE

PAST WEEK DAILIES

Service	Past Week
	D D D D D D D D P
	D D D D D D D D P
	D D D D D D D D P
	M D D D D D D D D
	M D D D D D D D D
	D D D D D D D D P
	D D D D D D D D P
	M D D D D D D D D
	D D D D D D D D P
	M D D D D D D D D
	M M M M D D D D D
	M D D D D D D D D
	M D D D D D D D D
	M D D D D D D D P
	D D D D D D D D P

RUNNING/PENDING/FAILED TODAY

Task	Status	Service
filter		
DailyUserDocumentsIndexTask	PENDING	1
PeriodicEndMarkerCommand	PENDING	1
AllDailyTask	PENDING	1
HistoricalAccountIndexTask	PENDING	1
AccountSecondIndexDataLoaderTask	PENDING	1
HealthCalculationTask	PENDING	1
AccountIndexDataLoaderTask		

STATUS

Gameboy Status

- 200 admin_db
- 200 history_db
- 200 jenkins
- 200 luigi
- 200 maint_db
- 200 status

Jenkins Status

- enabled daily-cron
- enabled daily-manual
- enabled hourly-cron

Luigi Workers CPU Utilization

GAMEBOY

Gameboy

Dashboard

Daily

All Dailies

2014-06-23

2014-06-22

2014-06-21

2014-06-20

2014-06-19

2014-06-18

2014-06-17

Hourly

Services

Jenkins

Home / Daily / Daily on 2014-06-21

DAILY FOR 2014-06-21

ALL JOBS

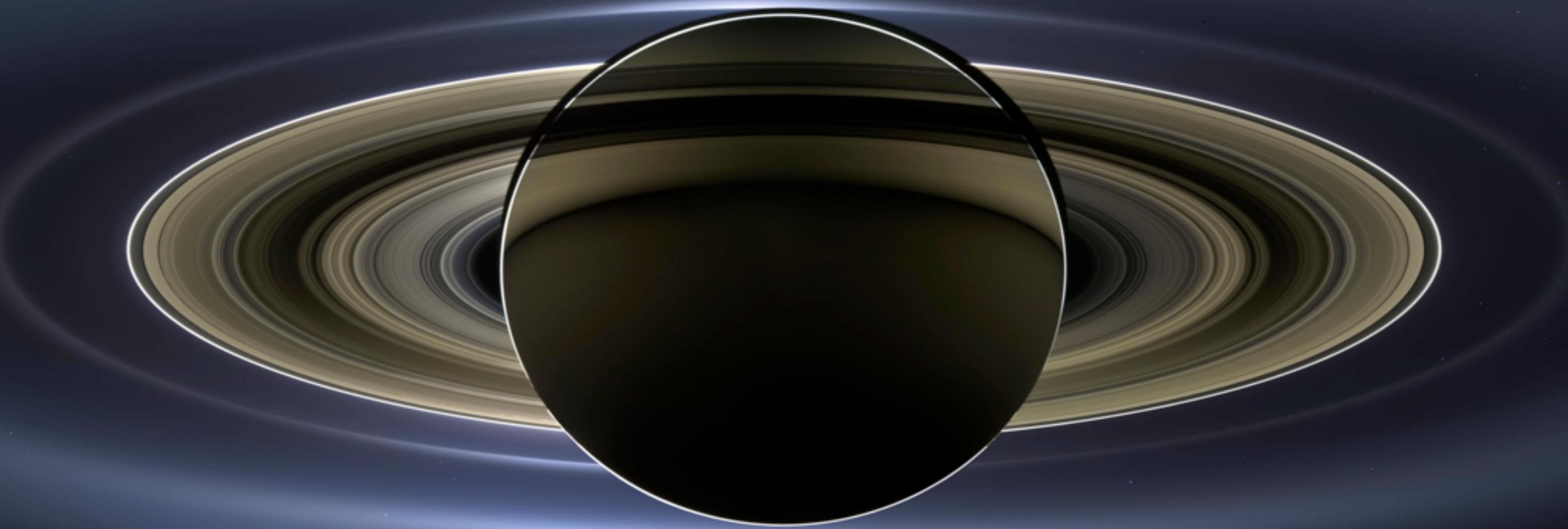
Service	Start	Last update	Duration	Status
<input type="text" value="filter"/>				
	22nd - 07:01:56	22nd - 09:23:13	2 hours	DONE
	22nd - 07:02:05	22nd - 10:56:59	4 hours	DONE
	22nd - 07:01:41	22nd - 12:56:49	6 hours	DONE
	22nd - 12:31:40	22nd - 02:33:12	2 hours	DONE
	22nd - 04:01:45	22nd - 04:42:14	40 minutes	DONE
	22nd - 07:01:56	22nd - 09:19:24	2 hours	DONE
	22nd - 07:02:03	22nd - 10:06:33	3 hours	DONE
	22nd - 12:31:39	22nd - 01:14:05	42 minutes	DONE
	22nd - 07:01:54	22nd - 08:41:19	2 hours	DONE
	21st - 09:31:46	21st - 10:23:40	an hour	DONE
	21st - 09:31:44	21st - 10:25:55	an hour	DONE
	22nd - 04:01:42	22nd - 04:55:17	an hour	DONE
	21st - 10:31:40	21st - 11:35:10	an hour	DONE
	22nd - 07:02:01	22nd - 09:40:05	3 hours	DONE
	22nd - 06:01:41	22nd - 02:48:28	9 hours	DONE

GAMEBOY IS

- A Totango specific controller for Luigi
 - The transition process (to Luigi)
 - Provide **high level** overview
 - Manual **re-run** of tasks
 - Monitor **progress, performance, run times, queues, worker load** etc...
 - Implemented using **Flask** and **AngularJS**



WHAT ELSE IS OUT THERE?



WHAT ELSE IS OUT THERE?

- Oozie
- Azkaban
- AWS Data Pipeline
- Chronos
- spring-batch
- Dataswarm (facebook)
- River (outbrain internal)
- What's your favorite WF engine? (did you build one?)

REFS

- <https://github.com/spotify/luigi>
- Facebook's Dataswarm <https://www.youtube.com/watch?v=M0VCbhfQ3HQ>
- Outbrain's River <https://www.youtube.com/watch?v=EzsckTggDiM>