



One jupyter to rule them all

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About me

- Senior Data Engineer @ Allegro
- pySpark advocate
- tiny contributions to Spark, Hue, Hive
- stackoverflow pyspark tag watcher





allegro

- the biggest marketplace platform in Central Europe
- 52M active offers
- 18M transactions per month (population of Poland: 38M)
- Hadoop: 4PB of storage, 12TB of RAM



- Legacy (2015)
 - MapReduce in Java
 - SQL in Hive (via Hue)



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- Actual workflow
 - SQL in Hive (via Hue)
 - exporting results to CSV
 - analyzing aggregates in Excel
- Java microservices
 - connecting to Hive via JDBC
 - a lot of Kerberos issues



- Spark using java and scala
 - JVM dependency hell
 - cumbersome workflow: build jar \rightarrow scp \rightarrow test \rightarrow fix \rightarrow repeat
 - spark-shell is OK, but not usable by analysts



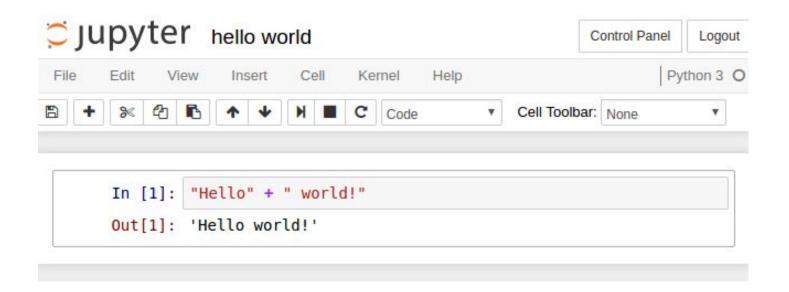
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PySpark

- more understandable api
- still CLI, spark sessions via ssh with screen



no CLI anymore





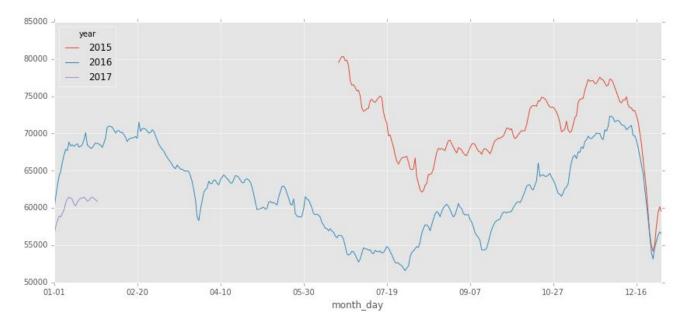


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- no Kerberos knowledge required
- great tool for visualizations
- easy switching between Spark versions

```
try:
    assert __IPYTHON__ == True
    import sparkselector
    sparkselector.use_spark('2.1.0', enable_jmx=True) # 2.0.2, 1.6.2
except AssertionError:
    pass # driver running in YARN

Spark version selected: 2.1.0
JMX enabled at: 10.71.193.154:53134
```



But... what about cyclical jobs and ETLs?

- filling up BI dashboards
- looking for anomalies
- feeding search engine with bestmatch features
- updating machine learning models
- creating snapshots of microservices data
- exporting data from HDFS to databases





Add parametrization



- Add parametrization
- Ensure it runs from the top to the bottom





- Add parametrization
- Ensure it runs from the top to the bottom
- Add some logging

```
logger.warn("Corrupted record {} in {}".format(record, dataset))
logger.warn("Duplicated data found: " + duplicates.count())
```

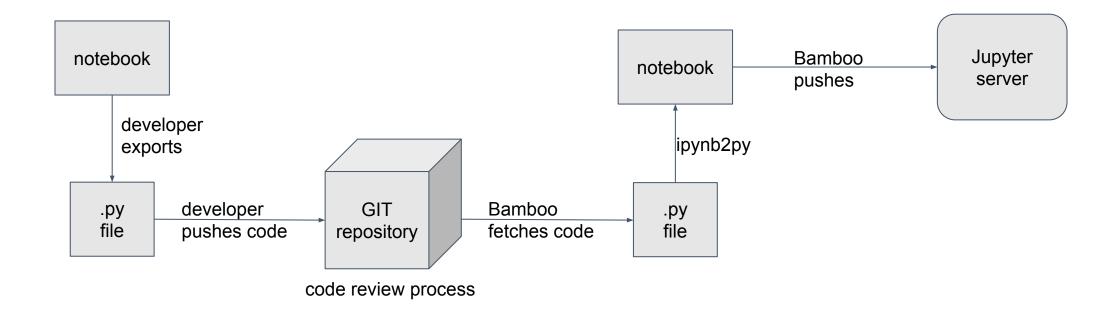


- Add parametrization
- Ensure it runs from the top to the bottom
- Add some logging
- Send metrics

```
metrics.send("stats.offer.imagescore.verifier.items", items.count())
metrics.send("stats.offer.imagescore.verifier.run-time", elapsed)
```



Code review and git flow





- Code review and git flow
- Unit tests
 - using py.test inside docker container

```
@pytest.fixture(scope="session")
def sc(request):
    conf = (SparkConf()
            .setMaster("local[2]")
            .setAppName("pytest-pyspark-local-testing")
            .set("spark.default.parallelism",2)
            .set("spark.sql.shuffle.partitions",2)
    sc = SparkContext(conf=conf)
    def fin():
        print ("teardown sc")
        sc.stop()
    request.addfinalizer(fin)
    return sc
@pytest.fixture(scope="session")
def sqlContext(sc):
    return SQLContext(sc)
```

```
def test_sanity(sqlContext):
    row = {'name': 'Alice', 'age': 1}
    df = sqlContext.createDataFrame([row])

    collected = df.collect()

    collected[0].asDict() == row
```



- Code review and git flow
- Unit tests
- Integration tests:
 - mocks data on local Hive and local HDFS and runs application inside docker container

```
class TestVerifySolrHasNewItems(unittest.TestCase):

def test_should_report_missing_score(self):
    self._add_dwh_event(100, '19866', "2016-10-10")
    self._mock_solr_file([])

return_code = self._run_application()

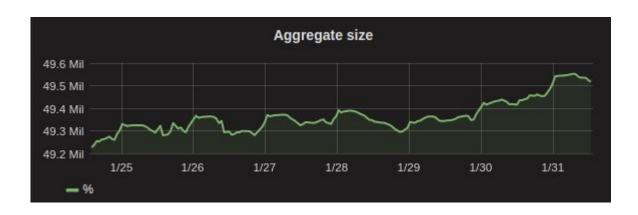
self.assertEquals(0, return_code)
    self._verify_solr_metrics(existing=0, missing=1, active_offers=1, missing_percent=100.0)
    self._verify_missing_score_reported(100, '2016-10-10', 'Moda i uroda > Biżuteria i Zegarki')
    self._verify_category_metrics(category='Moda i uroda > Biżuteria i Zegarki', scores_fill=0.0)
```



- Code review and git flow
- Unit tests
- Integration tests
- Continuous Integration
 - tests are performed after every commit to repository
 - pull request is blocked till tests succeed



- Code review and git flow
- Unit tests
- Integration tests
- Continuous Integration
- Metrics
 - stored in Graphite, visualized in Grafana





- Code review and git flow
- Unit tests
- Integration tests
- Continuous Integration
- Metrics
- Monitoring
 - conditions on Graphite metrics trigger incidents and alerts



- Code review and git flow
- Unit tests
- Integration tests
- Continuous Integration
- Metrics
- Monitoring
- Deployment
 - Bamboo uploads .py files to HDFS after merge to master

pl.allegro.offer.imagescore

Floki Offline Scorer Deploy

2 weeks ago



Scheduling

- Apache Oozie
 - very easy to use using Hue UI
 - cannot switch efficiently between Spark versions
 - unreliable execution and SLA monitoring
 - poor Spark jobs maintaining



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- Apache Airflow
 - matches almost all our needs
 - extended using SparkOperator https://git.io/airflow-spark-operator



Jupyter for non-technical staff

 Domain Specific Language that joins data from multiple sources and simplifies access

```
AllegroUsers() \
    .with_permission_to_mailing() \
    .sold(at_least=4, category='Sports', between=('2017-01-01', '2017-01-20')) \
    .living_near('87-100', radius=10) \
    .prepare_for_mailing('sellers_in_sports_category_living_near_Torun')
```



Issues

- Jupyter lacks git/code review support
 - ipynb⇔py "continuous conversion"
- Shared RAM for spark drivers on jupyter servers
- Airflow cannot handle multitenancy
- YARN logs of Spark apps are hard to debug
- Unable to share notebooks between users



Thank you!

Questions time!