

Project Zen: Improving Apache Spark for Python Users

Hyukjin Kwon

Databricks Software Engineer

Hyukjin Kwon



Apache Spark Committer / PMC

Major Koalas contributor

Databricks Software Engineer

@HyukjinKwon in GitHub

Agenda

What is Project Zen?

Redesigned Documentation

PySpark Type Hints

Distribution Option for PyPI Users

Roadmap

DATA+AI SUMMIT EUROPE



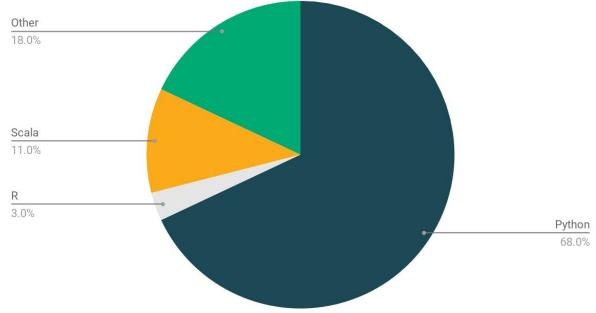
What is Project Zen?

Python Growth

68%

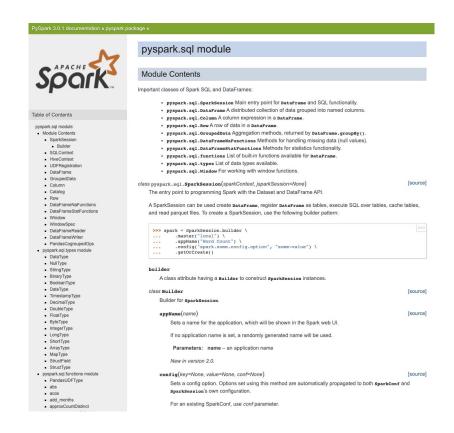
of notebook commands on Databricks are in Python





- Documentation difficult to navigate
 - All APIs under each module is listed in single page
 - No other information or classification

- Lack of information
 - No Quickstart page
 - No Installation page
 - No Introduction



PySpark documentation

IDE unfriendly

- Dynamically defined functions reported as missing functions
- Lack of autocompletion support
- Lack of type checking support

Notebook unfriendly

Lack of autocompletion support





Autocompletion in IDE

```
In [1]: rdd = spark.sparkContext.
```

Autocompletion in Jupyter

Less Pythonic

Deprecated Python built-in instance support when creating a DataFrame

```
>>> spark.createDataFrame([{'a': 1}])

/.../session.py:378: UserWarning: inferring schema from dict is deprecated, please use
pyspark.sql.Row instead
```

- Missing distributions with other Hadoop versions in PyPI
 - Missing Hadoop 3 distribution
 - Missing Hive 1.2 distribution

Δ1	66.6			
Ň	<pre>spark-3.0.1-bin-hadoop2.7-hive1.2.tgz</pre>	2020-08-28	18:25	209M
	spark-3.0.1-bin-hadoop2.7.tgz	2020-08-28		
	<pre>spark-3.0.1-bin-hadoop3.2.tgz</pre>	2020-08-28	18:25	214M
	spark-3.0.1-bin-without-hadoop.tgz	2020-08-28	18:25	149M

Filename, size	File type	Python version	Upload date	Hashes
pyspark-3.0.1.tar.gz (204.2 MB)	Source	None	Sep 8, 2020	View

Apache Mirror

PyPI Distribution

- Inconsistent exceptions and warnings
 - Unclassified exceptions and warnings

```
>>> spark.range(10).explain(1, 2)

Traceback (most recent call last):
    ...
Exception: extended and mode should not be set together.
```

The Zen of Python

The Zen of Python

```
Beautiful is better than ugly.

Explicit is better than implicit.

Simple is better than complex.

Complex is better than complicated.

Flat is better than nested.

Sparse is better than dense.

Readability counts.

Special cases aren't special enough to break the rules.
```

PEP 20 - The Zen of Python

Project Zen (SPARK-32082)

Be Pythonic

- The Zen of Python
- Python friendly

Better and easier use of PySpark

- Better documentation
- Clear exceptions and warnings
- Python type hints: autocompletion, static type checking and error detection
- More options for pip installation

Better interoperability with other Python libraries

- pandas, pyarrow, NumPy, Koalas, etc.
- Visualization

Redesigned Documentation

Problems in PySpark Documentation

Everything in few pages

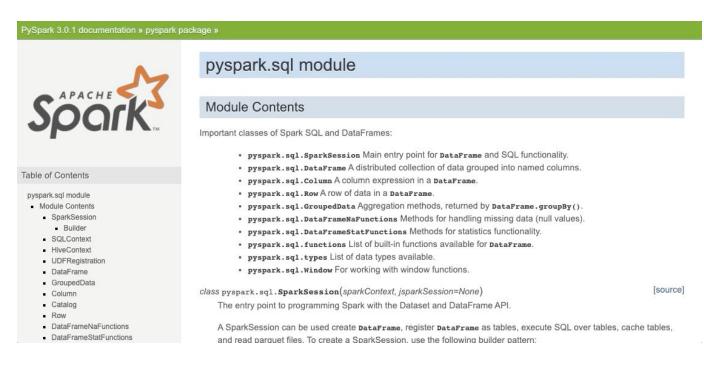
Whole module in single page w/o classification

Difficult to navigate

- Very long to stroll down
- Virtually no structure

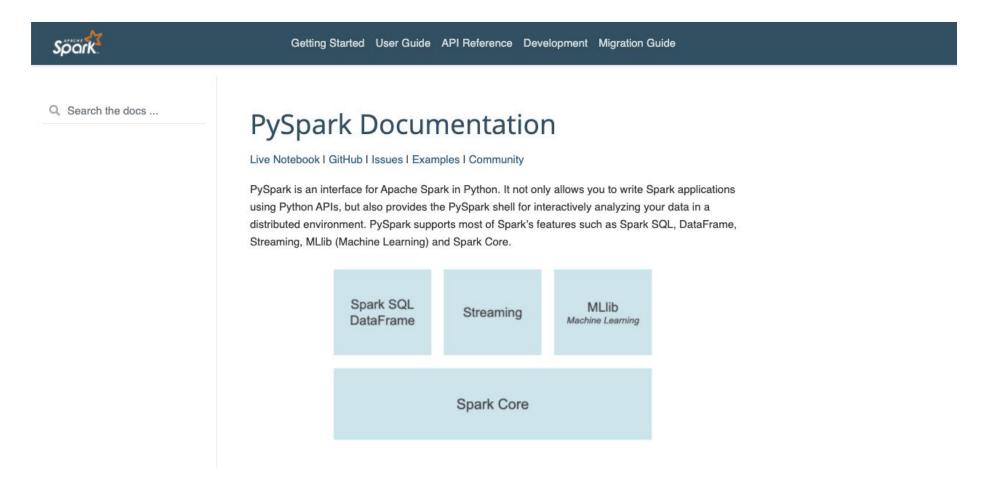
No other useful pages

- How to start?
- How to ship 3rd party packages together?
- How to install?
- How to debug / setup an IDE?



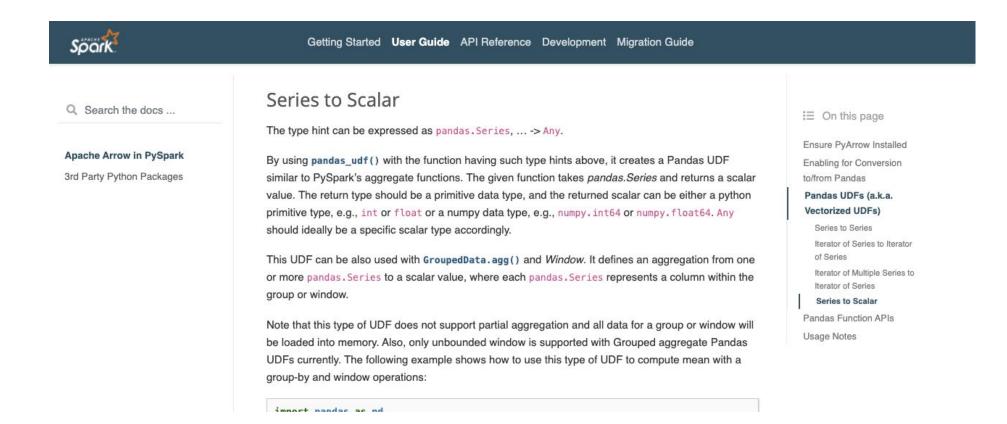
(Old) PySpark documentation

New PySpark Documentation



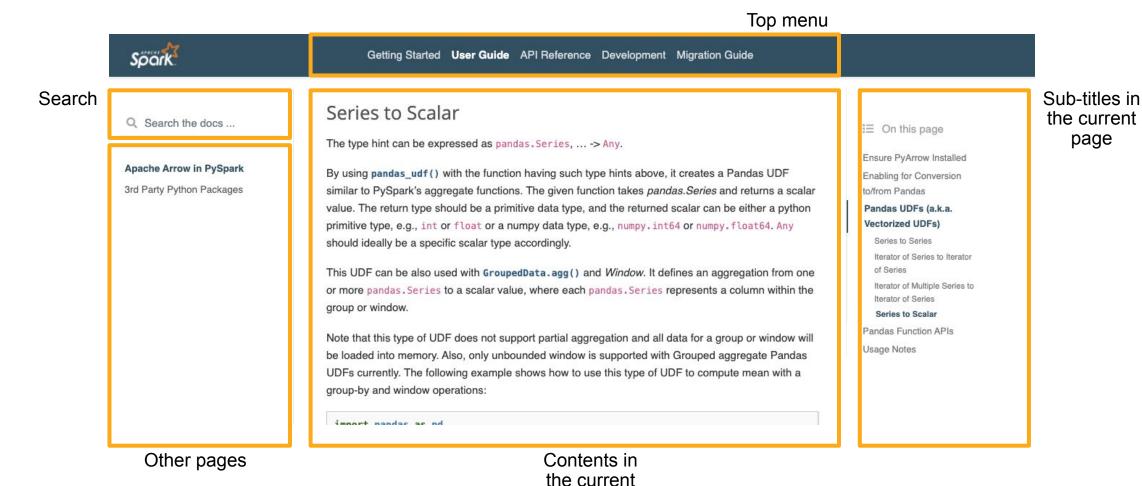
New PySpark documentation

New PySpark Documentation

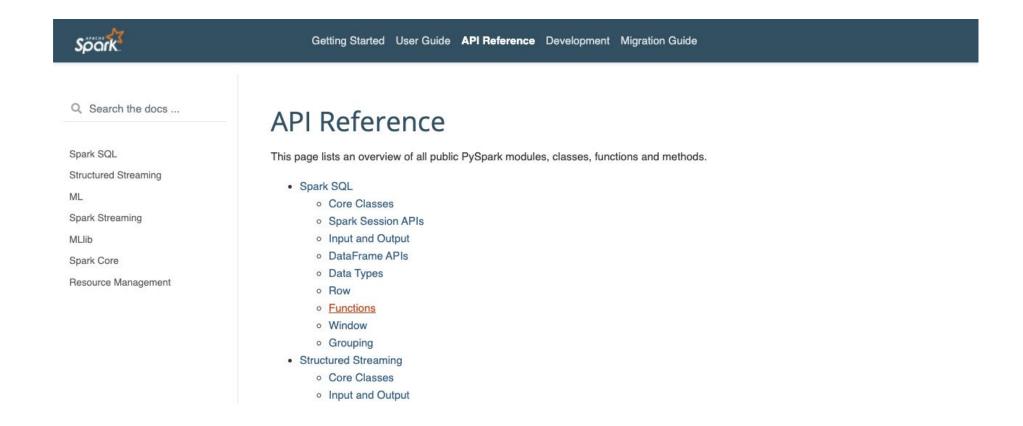


New user guide page

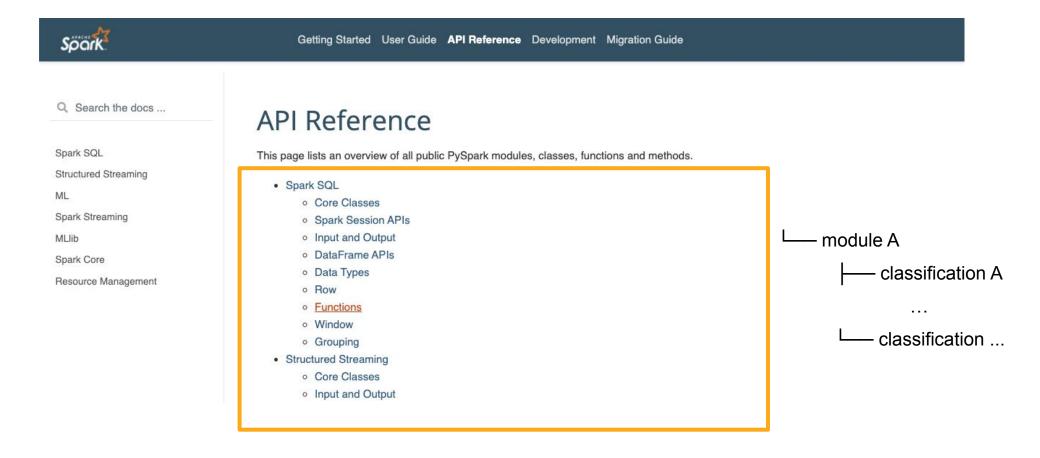
New PySpark Documentation



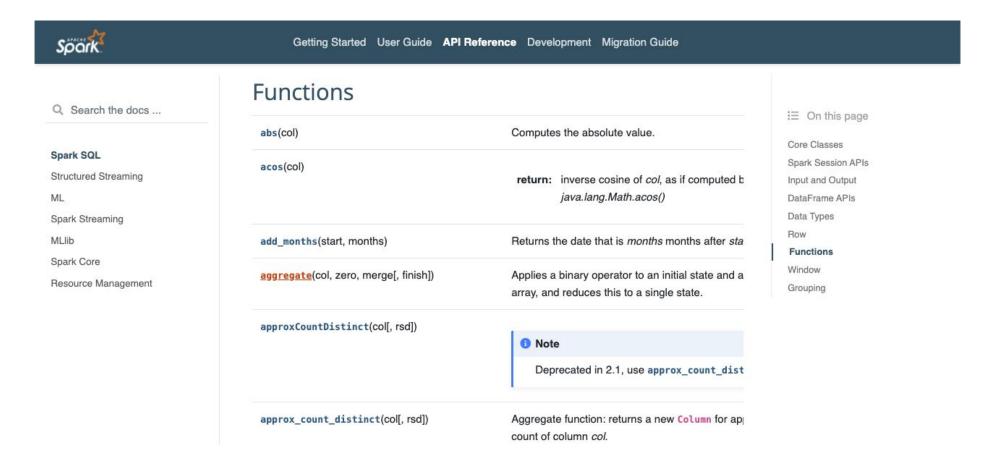
page



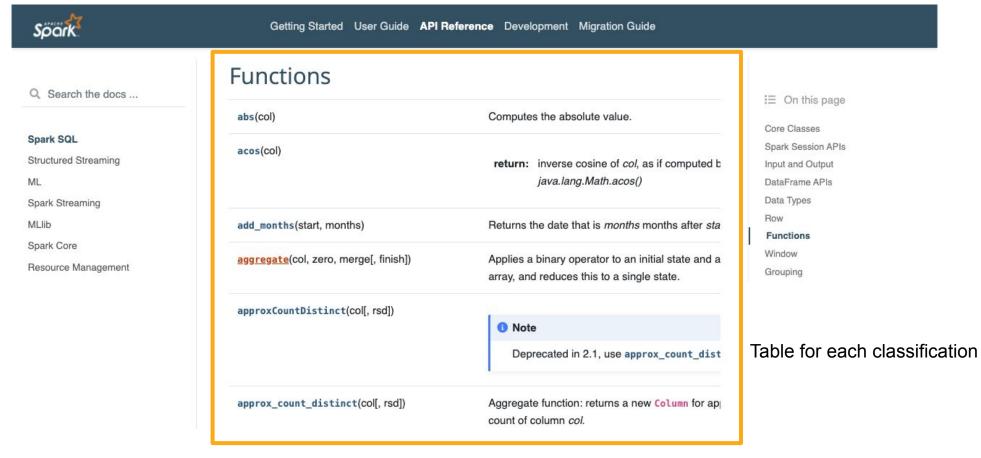
New API reference page



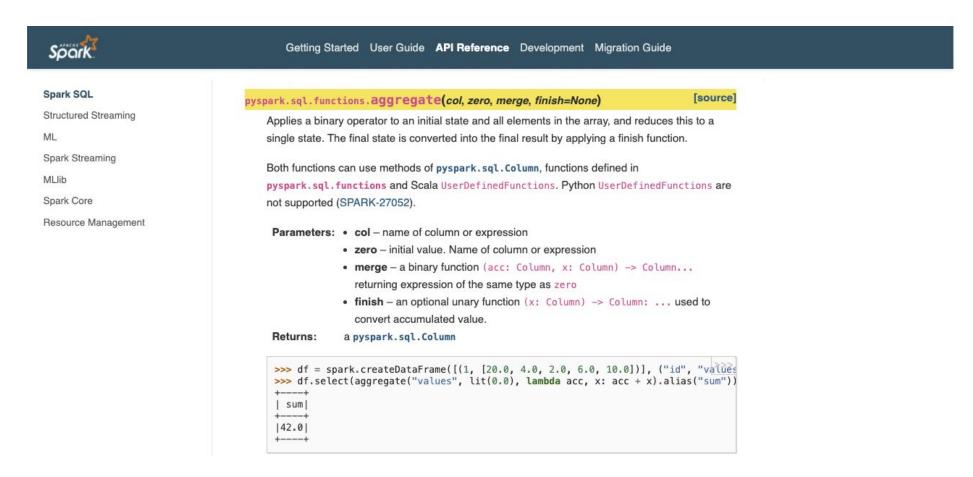
New API reference page



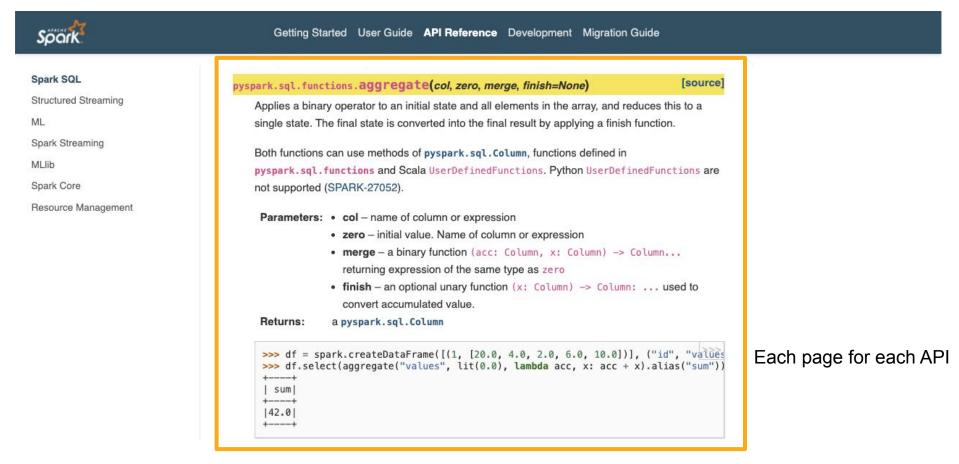
New API reference page



New API reference page

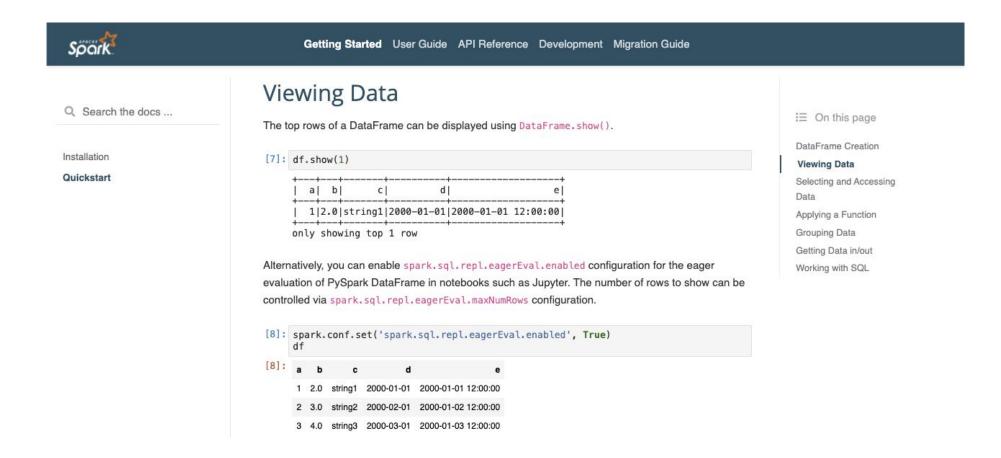


New API reference page



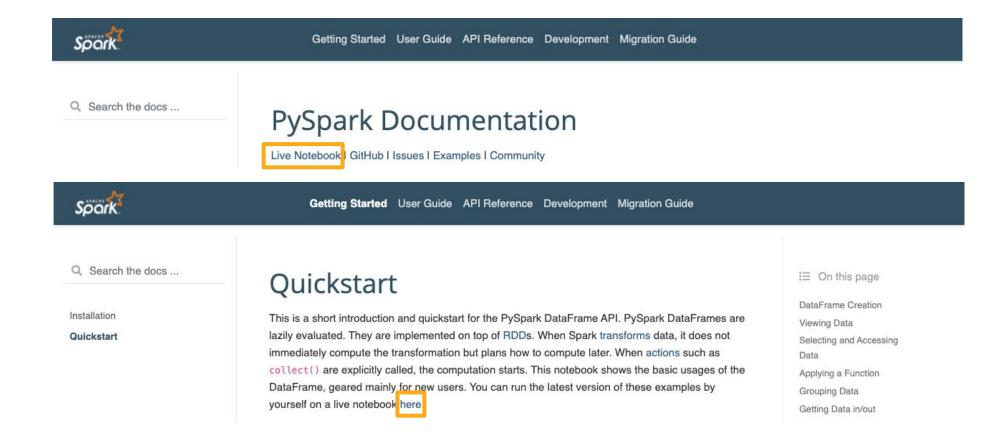
New API reference page

Quickstart



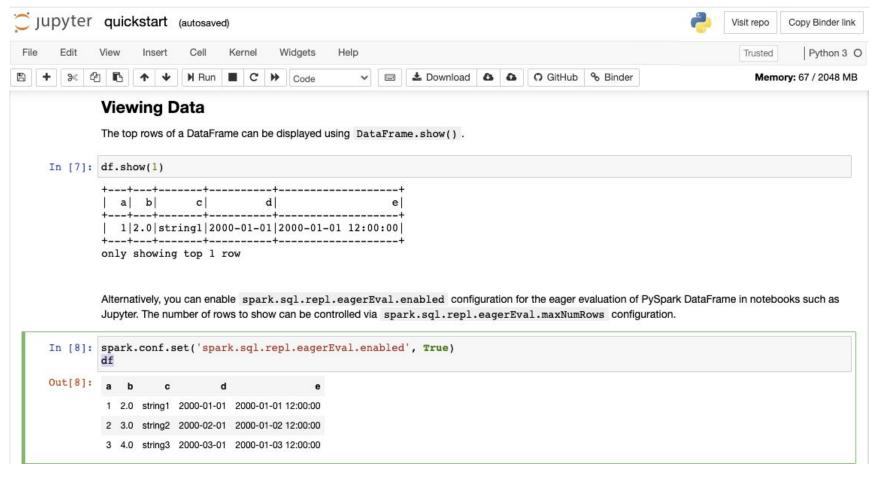
Quickstart page

Live Notebook



Move to live notebook (Binder integration)

Live Notebook



Live notebook (Binder integration)

Other New Pages

Development

- Contributing to PySpark
 - Contributing by Testing Releases
 - Contributing Documentation Changes
 - Preparing to Contribute Code Changes
 - Code Style Guide
- Testing PySpark
 - Running Individual PySpark Tests
 - Running tests using GitHub Actions
- Debugging PySpark
 - Remote Debugging (PyCharm Professional)
 - o Checking Resource Usage (top and ps)
 - o Profiling Memory Usage (Memory Profiler)
 - Identifying Hot Loops (Python Profilers)
- Setting up IDEs
 - PyCharm

Getting Started

This page summarizes the basic steps required

- Installation
 - · Python Version Supported
 - Using PyPI
 - Using Conda
 - Manually Downloading
 - Installing from Source
 - Dependencies
- Quickstart
 - DataFrame Creation
 - Viewing Data
 - Selecting and Accessing Data
 - Applying a Function
 - Grouping Data
 - Getting Data in/out
 - Working with SQL

User Guide

- · Apache Arrow in PySpark
 - Ensure PyArrow Installed
 - Enabling for Conversion to/from Pandas
 - Pandas UDFs (a.k.a. Vectorized UDFs)
 - Pandas Function APIs
 - Usage Notes
- · 3rd Party Python Packages
 - Using PySpark Native Features
 - Using Zipped Virtual Environment
 - Using PEX

Migration Guide

This page describes the migration guide specific to PySpark. Many items of applied when migrating PySpark to higher versions because PySpark international Please also refer other migration guides such as Migration Guide: SQL, Data

- · Upgrading from PySpark 2.4 to 3.0
- Upgrading from PySpark 2.3 to 2.4
- · Upgrading from PySpark 2.3.0 to 2.3.1 and above
- Upgrading from PySpark 2.2 to 2.3
- Upgrading from PySpark 1.4 to 1.5
- Upgrading from PySpark 1.0-1.2 to 1.3

New useful pages

PySpark Type Hints

What are Python Type Hints?

```
def greeting(name):
    return 'Hello ' + name
```

Typical Python codes

```
def greeting(name: str) -> str:
    return 'Hello ' + name
```

Python codes with type hints

```
def greeting(name: str) -> str: ...
```

Stub syntax (.pyi file)

IDE Support

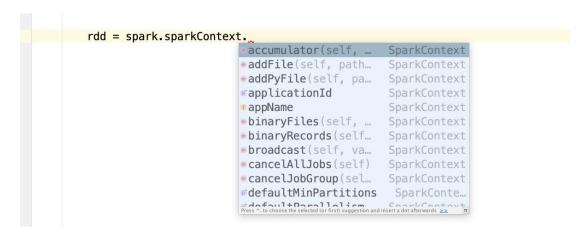
Notebook Support

Documentation

Static error detection



Before type hints



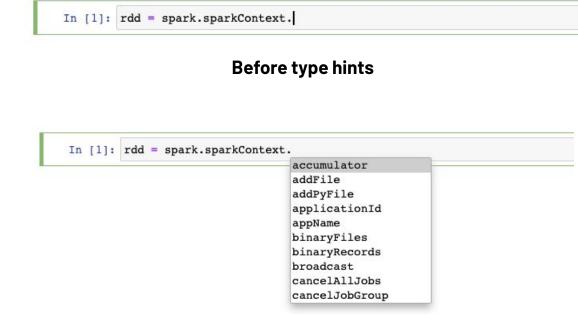
After type hints

IDE Support

Notebook Support

Documentation

Static error detection



After type hints

IDE Support

Notebook Support

Documentation

Static error detection

Before type hints

pyspark.sql.functions.Corr(col1: pyspark.sql.column.Column, col2: pyspark.sql.column.Column) →
pyspark.sql.column.Column
[source]

After type hints

IDE Support

Notebook Support

Documentation

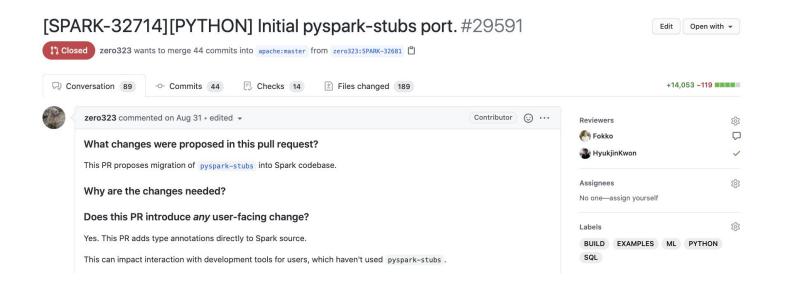
Static error detection

```
LogisticRegress... setLowerBoundsO...
       if not self.isSet(self.thresholds) and self.isSet(self.threshold):
           t = self.getOrDefault(self.threshold)
   def _checkThresholdConsistency(self):
       if self.isSet(self.threshold) and self.isSet(self.thresholds):
           ts = self.getParam(self.thresholds)
           if len(ts) != 2:
               raise ValueError("Logistic Regression getThreshold only applies to" +
                                 " thresholds: " + ",".join(ts))
           t = 1.0/(1.0 + ts[0]/ts[1])
           t2 = self.getParam( threshold)
           if abs(t2 - t) >= 1E-5:
                                 " threshold (%g) and thresholds (equivalent to %g)" % (t2, t))
   def setFamily(self, value):
   def getFamily(self):
```

Static error detection

https://github.com/zero323/pyspark-stubs#motivation

Python Type Hints in PySpark



Built-in in the upcoming Apache Spark 3.1!

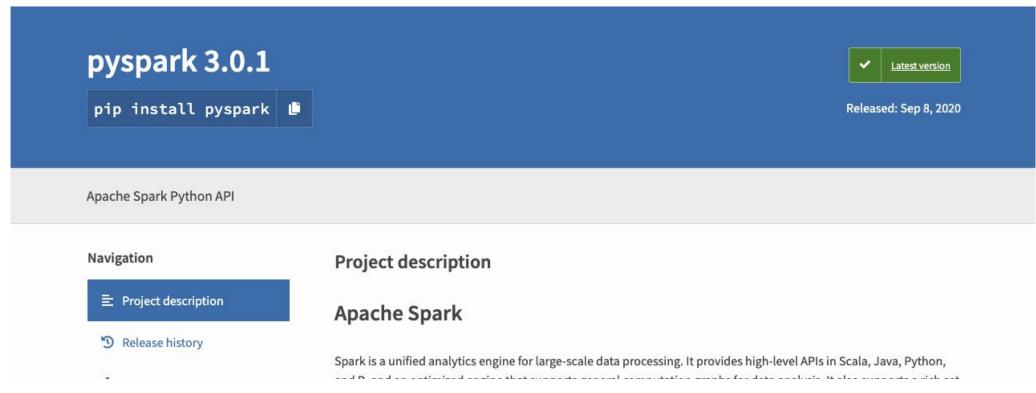
Community support: zero323/pyspark-stubs

User facing APIs only

Stub (.pyi) files

Installation Option for PyPI Users

PyPI Distribution



PySpark on PyPI

PyPI Distribution

Multiple distributions available

- Hadoop 2.7 and Hive 1.2
- Hadoop 2.7 and Hive 2.3
- Hadoop 3.2 and Hive 2.3
- Hive 2.3 without Hadoop

PySpark distribution in PyPI

Hadoop 2.7 and Hive 1.3



Multiple distributions in Apache Mirror

Filename, size	File type	Python version	Upload date	Hashes
pyspark-3.0.1.tar.gz (204.2 MB)	Source	None	Sep 8, 2020	View

One distribution in PyPI

New Installation Options

HADOOP_VERSION=3.2 pip install pyspark

Spark with Hadoop 3.2

HADOOP_VERSION=2.7 pip install pyspark

Spark with Hadoop 2.7

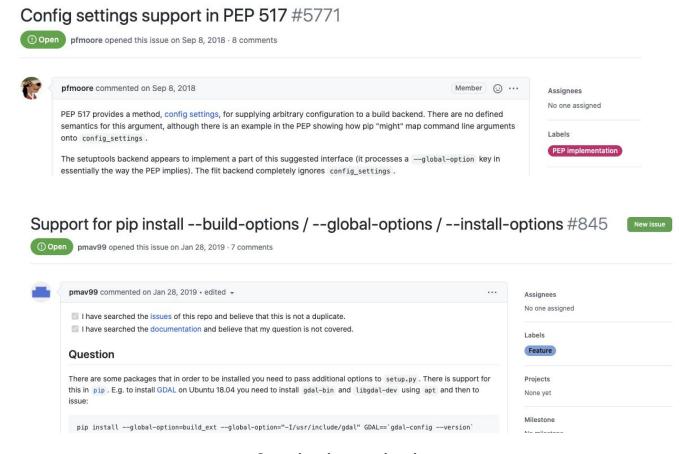
HADOOP_VERSION=without pip install pyspark

Spark without Hadoop

PYSPARK_RELEASE_MIRROR=http://mirror.apache-kr.org HADOOP_VERSION=2.7 pip install

Spark downloading from the specified mirror

Why not pip --install-options?



Ongoing issues in pip

- Migrate to NumPy documentation style
 - Better classification
 - Better readability
 - Widely used

```
"""Specifies some hint on the current
:class:`DataFrame`.

:param name: A name of the hint.
:param parameters: Optional parameters.
:return: :class:`DataFrame`
```

reST style

```
"""Specifies some hint on the current :class:`DataFrame`.

Parameters
------
name : str
    A name of the hint.
parameters : dict, optional
    Optional parameters

Returns
-----
DataFrame
```

Numpydoc style

- Standardize warnings and exceptions
 - Classify the exception and warning types
 - Python friendly messages instead of JVM stack trace

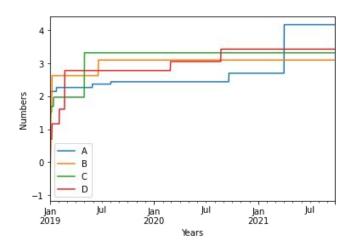
```
>>> spark.range(10).explain(1, 2)

Traceback (most recent call last):
    ...
Exception: extended and mode should not be set together.
```

Plain Exception being thrown

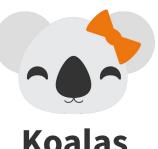
- Interoperability between NumPy, Koalas, other libraries
 - Common features in DataFrames
 - NumPy universe function

- Visualization and plotting
 - Make a chart from Spark DataFrame









Re-cap

Re-cap

- Python and PySpark are becoming more and more popular
- PySpark documentation is redesigned with many new pages

- Auto-completion and type checking in IDE and notebooks
- PySpark download options in PyPI

Re-cap: What's next?

Migrate to NumPy documentation style

Standardize warnings and exceptions

Visualization

Interoperability between NumPy, Koalas, other libraries

Question?