papermill Documentation

Release 2.4.0

nteract team

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Papermill is a tool for parameterizing and executing Jupyter Notebooks.

Papermill lets you:

- parameterize notebooks
- execute notebooks

This opens up new opportunities for how notebooks can be used. For example:

- Perhaps you have a financial report that you wish to run with different values on the first or last day of a month or at the beginning or end of the year, **using parameters** makes this task easier.
- Do you want to run a notebook and depending on its results, choose a particular notebook to run next? You can now programmatically **execute a workflow** without having to copy and paste from notebook to notebook manually.

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2 CONTENTS

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ONE

PYTHON VERSION SUPPORT

This library currently supports python 3.7+ versions. As minor python versions are officially sunset by the python org papermill will similarly drop support in the future.

CHAPTER

TWO

DOCUMENTATION

These pages guide you through the installation and usage of papermill.

2.1 Installation

2.1.1 Installing papermill

From the command line:

python3 -m pip install papermill

2.1.2 Installing In-Notebook language bindings

In-Notebook language bindings provide helpers and utilities for using Papermill with a programming language.

Python bindings

No additional installation steps are required since python bindings are built into papermill.

2.2 Usage

For an interactive example that demonstrates the usage of papermill, click the Binder link below:

2.2.1 Using papermill

The general workflow when using papermill is **parameterizing** a notebook, **executing** it, as well as **storing** the results. In addition to operating on a single notebook, papermill also works on a collection of notebooks.

Parameterize

See also:

Workflow reference

Generally, the first workflow step when using papermill is to parameterize the notebook.

To do this, tag notebook cells with parameters. These parameters are later used when the notebook is executed or run.

Designate parameters for a cell

To parameterize a notebook, designate a cell with the tag parameters.

```
In [1]: parameters x ... Add tag

1  # This cell is tagged `parameters`
2  alpha = 0.1
3  ratio = 0.1
```

Notebook

If using the Jupyter Notebook interface

- 1. Activate the tagging toolbar by navigating to View, Cell Toolbar, and then Tags
- 2. Enter parameters into a textbox at the top right of a cell
- 3. Click Add tag

JupyterLab 3.0+

If using JupyterLab v3 or above:

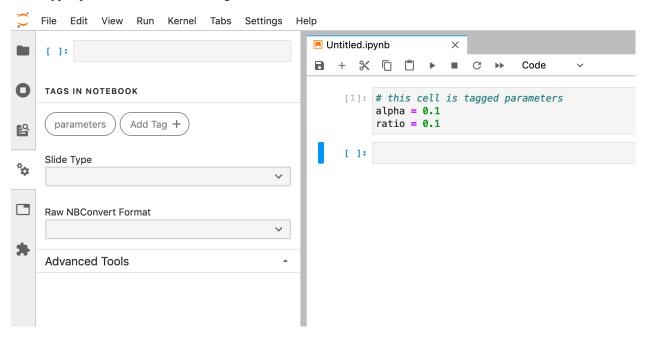
- 1. Select the cell to parameterize
- 2. Click the property inspector in the right sidebar (double gear icon)
- 3. Type "parameters" in the "Add Tag" box and hit "Enter".



JupyterLab 2.0 - 2.2.x

If using the JupyterLab interface

- 1. Select the cell to parameterize
- 2. Click the property inspector on the left side (double gear icon)
- 3. Type "parameters" in the "Add Tag" box and hit "Enter".



JupyterLab < 2.0

If using JupyterLab < 2.0, consider using the jupyterlab-celltags extension.

- 1. Select the cell to parameterize
- 2. Click the cell inspector (wrench icon)
- 3. Type "parameters" in the "Add Tag" box and hit "Enter".

If the extension is not installed, you can manually add the tag by editing the Cell Metadata field in the cell inspector by adding "tags":["parameters"].

Learn more about the jupyter notebook format and metadata fields here.

How parameters work

The parameters cell is assumed to specify default values which may be overridden by values specified at execution time.

- papermill inserts a new cell tagged injected-parameters immediately after the parameters cell
- injected-parameters contains only the overridden parameters
- subsequent cells are treated as normal cells, even if also tagged parameters
- if no cell is tagged parameters, the injected-parameters cell is inserted at the top of the notebook

2.2. Usage 7

One caveat is that a parameters cell may not behave intuitively with inter-dependent parameters. Consider a notebook note.ipynb with two cells:

```
#parameters
a = 1
twice = a * 2
```

```
print("a =", a, "and twice =", twice)
```

when executed with papermill note.ipynb -p a 9, the output will be a = 9 and twice = 2 (not twice = 18).

Inspect

The two ways to inspect the notebook to discover its parameters are: (1) through the Python API and (2) through the command line interface.

Execute via the Python API

The *inspect_notebook* function can be called to inspect a notebook:

```
inspect_notebook (<notebook path>)
```

```
import papermill as pm

pm.inspect_notebook('path/to/input.ipynb')
```

Note: If your path is parameterized, you can pass those parameters in a dictionary as second parameter:

```
inspect_notebook('path/to/input_{month}.ipynb', parameters={month='Feb'})
```

Inspect via CLI

To inspect a notebook using the CLI, enter the papermill —help-notebook command in the terminal with the notebook and optionally path parameters.

See also:

CLI reference

Inspect a notebook

Here's an example of a local notebook being inspected and an output example:

```
papermill --help-notebook ./papermill/tests/notebooks/complex_parameters.ipynb

Usage: papermill [OPTIONS] NOTEBOOK_PATH [OUTPUT_PATH]

Parameters inferred for notebook './papermill/tests/notebooks/complex_parameters.ipynb

--':
```

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Execute

The two ways to execute the notebook with parameters are: (1) through the Python API and (2) through the command line interface.

Execute via the Python API

The execute_notebook function can be called to execute an input notebook when passed a dictionary of parameters:

```
execute_notebook(<input notebook>, <output notebook>, <dictionary of parameters>)
```

```
import papermill as pm

pm.execute_notebook(
    'path/to/input.ipynb',
    'path/to/output.ipynb',
    parameters=dict(alpha=0.6, ratio=0.1)
)
```

Execute via CLI

To execute a notebook using the CLI, enter the papermill command in the terminal with the input notebook, location for output notebook, and options.

See also:

CLI reference

Execute a notebook with parameters

Here's an example of a local notebook being executed and output to an Amazon S3 account:

```
$ papermill local/input.ipynb s3://bkt/output.ipynb -p alpha 0.6 -p l1_ratio 0.1
```

In the above example, two parameters are set: alpha and ll_ratio using -p (--parameters also works). Parameter values that look like booleans or numbers will be interpreted as such.

Here are the different ways users may set parameters:

2.2. Usage 9

Using raw strings as parameters

Using -r or --parameters_raw, users can set parameters one by one. However, unlike -p, the parameter will remain a string, even if it may be interpreted as a number or boolean.

```
$ papermill local/input.ipynb s3://bkt/output.ipynb -r version 1.0
```

Using a parameters file

Using -f or --parameters_file, users can provide a YAML file from which parameter values should be read.

```
$ papermill local/input.ipynb s3://bkt/output.ipynb -f parameters.yaml
```

Using a YAML string for parameters

Using -y or --parameters_yaml, users can directly provide a YAML string containing parameter values.

```
$ papermill local/input.ipynb s3://bkt/output.ipynb -y "
x:
    - 0.0
    - 1.0
    - 2.0
    - 3.0
linear_function:
    slope: 3.0
    intercept: 1.0"
```

Using -b or --parameters_base64, users can provide a YAML string, base64-encoded, containing parameter values.

```
$ papermill local/input.ipynb s3://bkt/output.ipynb -b_
    YWxwaGE6IDAuNgpsMV9yYXRpbzogMC4xCg==
```

Note about using YAML

When using YAML to pass arguments, through -y, -b or -f, parameter values can be arrays or dictionaries:

```
$ papermill local/input.ipynb s3://bkt/output.ipynb -y "
x:
    - 0.0
    - 1.0
    - 2.0
    - 3.0
linear_function:
    slope: 3.0
    intercept: 1.0"
```

Note about using with multiple account credentials

If you use multiple AWS accounts and are accessing S3 files, you can configure your AWS credentials, to specify which account to use by setting the AWS_PROFILE environment variable at the command-line. For example:

```
$ AWS_PROFILE=dev_account papermill local/input.ipynb s3://bkt/output.ipynb -p alpha_ $ 0.6 -p 11_ratio 0.1
```

A similar pattern may be needed for other types of remote storage accounts.

Tracking the Execution with Cell Descriptions

If you want to keep track of the execution in a closer way, you can add cell descriptions to the notebook being executed that will be injected to the TQDM progress bar.

Here is an example of the TQDM output during the execution of a 4-cells notebook without cell descriptions:

You can inject cell descriptions by adding a comment with the following formatting at the very beginning of each cell you are interested in:

```
#papermill_description=TQDM_DESCRIPTION
```

In this way, when the execution will reach the cell tagged with the description, the TQDM progress bar will show the string TQDM_DESCRIPTION. Please be careful: the comment must not contain any space, otherwise it will be ignored.

Taking back our previous example, if we add the description 'FirstCell' to cell 0 and the description 'SecondCell' to the cell 1 we will get the TQDM to display the following information:

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Store

See also:

Reference - Storage

Papermill can store notebooks in a number of locations including AWS S3, Azure data blobs, and Azure data lakes.

The modular architecture of papermill allows new data stores to be added over time.

2.3 Command Line Interface

papermill may be executed from the terminal. The following are the command options:

```
Usage: papermill [OPTIONS] NOTEBOOK_PATH [OUTPUT_PATH]
  This utility executes a single notebook in a subprocess.
  Papermill takes a source notebook, applies parameters to the source
  notebook, executes the notebook with the specified kernel, and saves the
  output in the destination notebook.
  The NOTEBOOK_PATH and OUTPUT_PATH can now be replaced by `-` representing
  stdout and stderr, or by the presence of pipe inputs / outputs. Meaning
  `<generate input>... | papermill | ...<process output>`
  with `papermill - -` being implied by the pipes will read a notebook from
  stdin and write it out to stdout.
Options:
  --help-notebook
                                  Display parameters information for the given
                                  notebook path.
  -p, --parameters TEXT...
                                 Parameters to pass to the parameters cell.
  -r, --parameters_raw TEXT...
                                  Parameters to be read as raw string.
  -f, --parameters_file TEXT
-y, --parameters_yaml TEXT
                                  Path to YAML file containing parameters.
                                  YAML string to be used as parameters.
  -b, --parameters_base64 TEXT
                                  Base64 encoded YAML string as parameters.
  --inject-input-path
                                  Insert the path of the input notebook as
                                  PAPERMILL_INPUT_PATH as a notebook
                                  parameter.
  --inject-output-path
                                  Insert the path of the output notebook as
                                  PAPERMILL_OUTPUT_PATH as a notebook
                                  parameter.
                                  Insert the paths of input/output notebooks
  --inject-paths
                                  PAPERMILL_INPUT_PATH/PAPERMILL_OUTPUT_PATH
                                  as notebook parameters.
  --engine TEXT
                                  The execution engine name to use in
                                  evaluating the notebook.
  --request-save-on-cell-execute / --no-request-save-on-cell-execute
```

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```
Request save notebook after each cell
                                execution
                                How often in seconds to autosave the
--autosave-cell-every INTEGER
                                notebook during long cell executions (0 to
                                disable)
--prepare-only / --prepare-execute
                                Flag for outputting the notebook without
                                execution, but with parameters applied.
-k, --kernel TEXT
                                Name of kernel to run.
--cwd TEXT
                                Working directory to run notebook in.
--progress-bar / --no-progress-bar
                                Flag for turning on the progress bar.
--log-output / --no-log-output Flag for writing notebook output to the
                                configured logger.
--stdout-file FILENAME
                               File to write notebook stdout output to.
--stderr-file FILENAME
                               File to write notebook stderr output to.
--log-level [NOTSET|DEBUG|INFO|WARNING|ERROR|CRITICAL]
                                Set log level
--start-timeout, --start_timeout INTEGER
                                Time in seconds to wait for kernel to start.
--execution-timeout INTEGER
                                Time in seconds to wait for each cell before
                                failing execution (default: forever)
--report-mode / --no-report-mode
                                Flag for hiding input.
--version
                                Flag for displaying the version.
-h, --help
                                Show this message and exit.
```

2.4 Extending papermill

Papermill provides some interfaces with external services out of the box. However, you may find that you would like papermill to do more than it currently does. You could contribute to the papermill project yourself (see *Extending papermill by contributing to it*). However, an easier method might be to extend papermill using entry points.

In general, when you run a notebook with papermill, the following happens:

- 1. The notebook file is read in
- 2. The file content is converted to a notebook python object
- 3. The notebook is executed
- 4. The notebook is written to a file

Through entry points, you can write your own tools to handle steps 1, 3, and 4. If you find that there's more you want to contribute to papermill, consider developing papermill itself.

2.4.1 Extending papermill through entry points

What are entry points?

The python packaging documentation describes entry points as:

Entry points are a mechanism for an installed distribution to advertise components it provides to be discovered and used by other code. For example:

Distributions can specify console_scripts entry points, each referring to a function. When pip (or another console_scripts aware installer) installs the distribution, it will create a command-line wrapper for each entry point.

Applications can use entry points to load plugins; e.g. Pygments (a syntax highlighting tool) can use additional lexers and styles from separately installed packages. For more about this, see Creating and discovering plugins.

When running, papermill looks for entry points that implement input / output (I/O) handlers, and execution handlers.

Developing new I/O handlers

Virtually the first thing that happens when papermill is used is that the input notebook is read in. This is managed by I/O handlers, which allow papermill to access not just the local filesystem, but also remote services such as Amazon S3. The same goes for writing the executed notebook to a file system: I/O handlers allow papermill to write files to S3 or otherwise.

Creating a new handler

Writing your own I/O handler requires writing a class that has four methods. All I/O handlers should implement the following class methods:

- CustomIO.read(file_path), returning the file content
- CustomIO.write(file_content, file_path), returning nothing
- CustomIO.pretty_path (path), returning a prettified path
- CustomIO.listdir(path), returning a list of paths.

Note: If you don't want to support things such as read because your I/O handler is only intended for writing (such as a publish-only platform), then you should implement the method but raise an exception when it is used.

Ensuring your handler is found by papermill

Once you have developed a new handler, you need to declare papermill entry points in your setup.py file.

This is done by including the entry_points key-word argument to setup in your setup.py file:

```
from setuptools import setup, find_packages
setup(
    # all the normal setup.py arguments...
    entry_points={"papermill.io": ["sftp://=papermill_sftp:SFTPHandler"]},
)
```

This indicates to papermill that when a file path begins with sftp://, it should use the class papermill_sftp. SFTPHandler to handle reading or writing to that path. Anything before the equal sign is the path prefix, and everything after it is the class to be used, including where it is imported from.

Traditionally, entry points for papermill I/O handlers look like URL prefixes. For example, the Amazon Web Services S3 handler is registered under s3://, and so is used whenever a path begins with s3://.

Example: sftp I/O handler

As an example, let's go through how we would create an I/O handler that reads from an sftp server and writes back to it, so we could do the following:

```
papermill sftp://my_ftp_server.co.uk/input.ipynb sftp://my_ftp_server.co.uk/output.

→ipynb
```

Our project structure will look like this:

We can define the I/O handler in src/papermill_sftp/__init__.py. To do so, we have to create a class that does the relevant actions.

For reading, we will download the file to a temporary path and read it in from there. For writing, we will write to a temporary path and upload it from there. Prettifying the path doesn't need to change the path, and we are not going to implement a listdir option for now.

```
import os
import pysftp
sftp_username = os.getenv('SFTP_USERNAME')
sftp_password = os.getenv('SFTP_PASSWORD')
class SFTPHandler:
    @classmethod
    def read(cls, path):
        Read a notebook from an SFTP server.
        parsed_url = urllib.parse.urlparse(path)
        with tempfile. Temporary Directory () as tmpdir:
            tmp_file = pathlib.Path(tmpdir) / pathlib.Path(parsed_url.path).name
            with pysftp.Connection(
                parsed_url.hostname,
                username=sftp_username,
                password=sftp_password,
                port=(parsed_url.port or 22),
                cnopts=cnopts,
            ) as sftp:
                sftp.get(parsed_url.path, str(tmp_file))
            return tmp_file.read_text()
    @classmethod
```

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```
def write(cls, file_content, path):
    Write a notebook to an SFTP server.
    parsed_url = urllib.parse.urlparse(path)
    with tempfile. Temporary Directory () as tmpdir:
        tmp_file = pathlib.Path(tmpdir) / "output.ipynb"
        tmp_file.write_text(file_content)
        with pysftp.Connection(
            parsed_url.hostname,
            username=sftp_username,
            password=sftp_password,
            port=(parsed_url.port or 22),
           cnopts=cnopts,
        ) as sftp:
            sftp.put(str(tmp_file), parsed_url.path)
@classmethod
def pretty_path(cls, path):
    return path
@classmethod
def listdir(cls, path):
    raise NotImplementedError
```

The setup.py file contains the following code:

```
from setuptools import setup, find_packages

setup(
    name="papermill_sftp",
    version="0.1",
    url="https://github.com/my_username/papermill_sftp.git",
    author="My Name",
    author_email="my.email@gmail.com",
    description="An SFTP I/O handler for papermill.",
    packages=find_packages("./src"),
    package_dir={"": "src"},
    install_requires=["pysftp"],
    entry_points={"papermill.io": ["sftp://=papermill_sftp:SFTPHandler"]},
)
```

When executing, papermill will check if the input or output path begin with sftp://, and if so, use the SFTPHandler from the papermill_sftp project.

Developing a new engine

A papermill engine is a python object that can run, or execute, a notebook. The default implementation in papermill for example takes in a notebook object, and runs it locally on your machine.

By writing a custom engine, you could allow execution to be handled remotely, or you could apply post-processing to the executed notebook. In the next section, you will see a demonstration.

Creating a new engine

Papermill engines need to inherit from the papermill.engines.Engine class.

In order to be used, the new class needs to implement the class method execute_managed_notebook. The call signature should match that of the parent class:

```
class CustomEngine (papermill.engines.Engine):
    @classmethod
    execute_managed_notebook(cls, nb_man, kernel_name, **kwargs):
        pass
```

nb_man is a nbformat.NotebookNode object, and kernel_name is a string. Your custom class then needs to implement the execution of the notebook. For example, you could insert code that executes the notebook remotely on a server, or executes the notebook many times to simulate different conditions.

As an example, the following project implements a custom engine that adds the time it took to execute each cell as additional output after every code cell.

The project structure is:

The file src/papermill_timing/__init__.py will implement the engine. Since papermill already stores information about execution timing in the metadata, we can leverage the default engine. We will also need to use the nbformat library to create a notebook node object.

```
from datetime import datetime
from papermill.engines import NBClientEngine
from nbformat.v4 import new_output
class CustomEngine (NBClientEngine):
    @classmethod
   def execute_managed_notebook(cls, nb_man, kernel_name, **kwargs):
        # call the papermill execution engine:
        super().execute_managed_notebook(nb_man, kernel_name, **kwargs)
        for cell in nb_man.nb.cells:
            if cell.cell_type == "code" and cell.execution_count is not None:
                start = datetime.fromisoformat(cell.metadata.papermill.start_time)
                end = datetime.fromisoformat(cell.metadata.papermill.end_time)
                output_message = f"Execution took {(end - start).total_seconds():.3f}_
⇔seconds"
                output_node = new_output("display_data", data={"text/plain": [output_
→message]})
                cell.outputs = [output_node] + cell.outputs
```

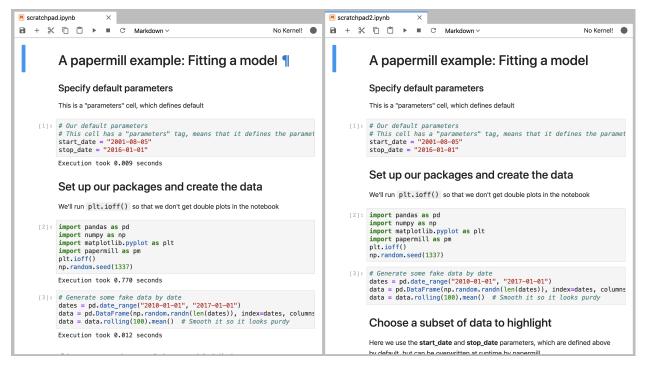
Once this is in place, we need to add our engine as an entry point to our setup.py script - for this, see the following section.

Ensuring your engine is found by papermill

Custom engines can be specified as entry points, under the papermill.engine prefix. The entry point needs to reference the class that we have just implemented. For example, if you write an engine called TimingEngine in a package called papermill_timing, then in the setup.py file, you should specify:

This allows users to specify the engine from papermill_timing by passing the command line argument --engine timer_engine.

In the image below, the notebook on the left was executed with the new custom engine, while the one on the left was executed with the standard papermill engine. As you can see, this adds our "injected" output to each code cell



2.4.2 Extending papermill by contributing to it

If you find that you'd like to not only add I/O and execution handlers, but think a fundamental aspect of the project could use some improvement, then you may want to contribute to it.

Development of papermill happens on github, and a detailed guide to contributing to it can be found there. There is also a code of conduct there. Please read both documents before beginning!

2.5 Troubleshooting

2.5.1 NoSuchKernel Errors (using Conda)

NoSuchKernel Errors can appear when running papermill on jupyter notebooks whose kernel has been specified via conda (nb_conda). nb_conda is used to easily set conda environment per notebook from within jupyterlab.

To illustrate, the following example demonstrates the creation of a new environment with all the dependencies necessary for an analysis.

```
conda create -n analysis_1 python=2 ipykernel
```

Once nb_conda is used within the jupyter server to set the kernel for a notebook to *analysis_1*, the notebook gets metadata similar to the following:

```
{
  "kernelspec": {
    "display_name": "Python [conda env:analysis_1]",
    "language": "python",
    "name": "conda-env-analysis_1-py"
  }
}
```

Papermill cannot use this metadata to determine that it should use *analysis_1* to execute this notebook. Running papermill (from *analysis_1* or another environment) will raise the following error:

```
jupyter_client.kernelspec.NoSuchKernel: No such kernel named conda-env-analysis_1-py
```

This can be fixed by:

• Installing jupyter (or at least ipykernel) in analysis_1

```
conda install -n analysis_1 jupyter
```

• Expose the *analysis_1* environment as a jupyter kernel (this is no longer automatic).

```
conda activate analysis_1 jupyter kernelspec install --user --name analysis_1
```

• Run papermill (from any environment) specifying the correct kernel using the -k option

```
papermill my_notebook.ipynb output_notebook.ipynb -k analysis_1
```

2.6 Change Log

2.6.1 Unreleased

2.6.2 2.4.0

- Add tracking cell executions with cell descriptions PR #650
- Fixed Azure Blob URI matching for prefixes PR #654
- Updates HDFS handler to use PyArrow.fs.HadoopFileSystm PR #658
- Drop support for Python 3.6 PR #666
- CI Build fixes PR #664
- Updated mock references in tests PR #668
- Added option for not writing any output ipynb file PR #669
- Allow custom kernel name and language in engine registration PR #676
- Allow for direct input of NotebookNode objects PR #670
- Removed deepcopy of input nodes PR #673
- Fixed failing tests for windows PR #672
- Implemented bash translator PR #674

2.6.3 2.3.4

- Add read handler for GitHub notebooks PR #622
- · Add GitHub Actions for CI
- Add cell description to tqdm PR #565
- Update builds for python 3.9 and 3.10
- Update file read to not fail early with boto empty file exception PR #614
- Support new version of gcsfs PR #624
- Fix an issue where the PapermillExecutionError can be pickled but will not be unpicklable PR #629
- Update documentation build and theme
- Remove deprecated pyarrow.hdfs.connect call from iorw.py PR #615
- Remove support for python 3.5
- Remove travis CI

2.6.4 2.3.3

- Fixed language check to catch non-v3-backwards compatible notebook specs
- Builds updated for python 3.6.12 / travis support
- README updated to reflect supported python versions

2.6.5 2.3.2

- Fixed code of conduct link
- Fixed codify for matlab kernels
- Added support for sparkmagic kernels

2.6.6 2.3.1

· Added minimum version pin for nbformat

2.6.7 2.3.0

- Notebooks that are loaded with papermill now upgrade the document to the latest spec version (to support cell-id assignments).
- Empty yaml files are now accepted as parameter files
- Binder typo fix for example notebook
- Entry point documentation improvements
- Code of Conduct documentation link cleanup
- · Tox change for local doc builds

2.6.8 2.2.1

• Allow pathlib.Paths in execute_notebook and inspect_notebook

2.6.9 2.2.0

- Provide help for Python notebooks by inspecting the parameters cell, via --help-notebook
- Support added for parameterizing Powershell kernels

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2.6.10 2.1.3

- Removed jupyter_client dependency in requirements to avoid confusing pip on the actual version requirements.
- Parameterized commenting so that once can pass a comment argument to assign the comment string in injected cells.

2.6.11 2.1.2

- Expand Usage Docs for JupyterLab
- Support nan and inf in Python translator
- Added fix for required async loop registration in python 38 on windows

2.6.12 2.1.1

- DeadKernelExceptions, usually from OOM, now exit with a status code of 138 from the CLI.
- Error cell at the top of failed notebook has been made better. It now also has a link to an injected cell where the
 error occurred.
- Updated a deprecated function to the new function name for nbclient dependency.
- Some development and documentation updates / fixes have also been made by a few different contributions (thank you!).

2.6.13 2.1.0

- Support for python 3.5 has been dropped. Upstream library changes for async were causing process deadlocks with await commands. End-of-life is later this year for 3.5 anyway so we decided to also drop support here.
- Error cells injected at the top of failed notebooks look nicer now as markdown.

2.6.14 2.0.0

Papermill 2.0 has a number of awesome features from many different contributors. We used the major version change mostly to signify the change to Python 3 only, but we also allowed for PRs which has small interaction changes to also be made. No major functionality should change with this release, but many minor improvements might impact specific execution patterns. We'll keep an eye on issues and post bug fixes ASAP if any of these cause larger unexpected issues.

Features

- Papermill is now Python 3.5+ only!
- nbconvert is no longer a dependency of papermill, instead the smaller and newly released nbclient is now the execution dependency.
- Support added for parameterizing C# kernels
- Support added for parameterizing F# kernels
- sys.exit(0) now respected by papermill
- Python parameters are now black formatted (in python versions >= 3.6)

- Notebook documents are saved periodically now rather than solely on cell completion.
- A cell --execute-timeout option was added.
- HDFS io support added with hdfs:// scheme (with papermill[hdfs] install).

Fixes

- Fixed metadata writing on markdown and raw cells to follow v4.4 schema correctly
- Azure Blob Storage support fixed for newer blob storage. azure-storage-blob >= 12.1.0 is now supported, older version support was dropped.
- IOPub timeouts now raise an exception instead of a warning.

Interaction Changes (more details)

- nbconvert dependency has been replaced with nbclient. This means the default engine is now nbclient rather than nbconvert and the NBConvertEngine class no longer exists. This may mean extensions that extended this class will need to be updated slightly to the new class.
- sys.exit(0) in python kernels now transfers exit code to papermill, meaning papermill will gracefully stop the notebook execution and not raise an exception to the user. sys.exit(1) or other exceptions still raise as expected and change the status code from 0 for the papermill process.
- When generating parameters for python (when running on 3.6+) the parameters will be printed more cleanly with a pass of black before injecting into the notebook.
- Older Azure Blob Storage support was dropped: azure-storage-blob < 12.1.0
- The --autosave-cell-every option now controls the minimum time between notebook saves during cell execution. This time will exponentially backoff if it takes more than 25% of the autosave-cell-every value. Setting --autosave-cell-every to 0 disabled this feature.
- The --execute-timeout option can be set to enable a per-cell execution timeout limit.
- IOPub timeouts used to only warn and attempt to continue execution. This can be triggered by printing '0' in a wide for-loop without any sleeps. The side-effect of best-effort execution was that outputs and failures could be lost in the IOPub timeout event and notebooks would "succeed" when they were actually failing. We chose to change this pattern from a warning to an error for papermill. To fix the issue when it occurs you need to delay the number of print or display messages per second being produced in your notebooks.

2.6.15 1.2.1

- Importing papermill no longer manipulates yaml. SafeLoader globally
- Parameters with leading _ now have prefix _ stripped before passing to R kernels
- A few documentation typos were fixed

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2.6.16 1.2.0

- Parameters lists passing feature from 1.1.0 was removed due to cli api issues it caused.
- Piping papermill into nbconvert no longer triggers an encoding error on Python 2
- Added BOTO3_ENDPOINT_URL environment variable to override boto session url
- stdout / stderr can now be streamed to a file via --stdout-file /dev/stdout and --stderr-file /dev/stderr.
- The CLI option --not-report-mode is now --no-report-mode
- GCFS connectors should now retry under all conditions that the upstream library defines as retryable. Papermill now uses the is retryable method from the upstream dependency.

2.6.17 1.1.0 (This version should be avoided for several known issues fixed in 1.2.0)

- Read content from stdin/to stdout when the path is or a pipe. This allows for <generate input>... | papermill | ... process output>, with papermill - being implied by the pipes.
- The built-in ADLHandler for Azure Pipelines should now work properly again.
- · Many documentation improvements
- IPython is now lazily imported only when progress bars are needed.
- A MATLAB translator is now available for parameters being passed to MATLAB notebooks.
- Parameters lists can more easily be passed to the command line via: -p name value1 value2 3 ... which results in adding to notebooks a parameter list assignment name = ["value1", "value2", 3].

2.6.18 1.0.1

- Cleaned up some dependency and build issues around pip 19 and pandas
- execute notebook can now take notebook as strings instead of only as a path
- kwargs are now passed through the default engine to nbconvert's wrapper class
- Passing dates through yaml as parameters will no longer raise an exception (i.e. -y "a_date: 2019-01-01" without having to quote ala -y "a_date: '2019-01-01'")

2.6.19 1.0.0

We made it to our 1.0 milestone goals! The largest change here is removal of record, Notebook, and NotebookCollection abstractions which are now living in scrapbook and requirement of nbconvert 5.5 as a dependency.

- Input and output paths can now reference input parameters. my_nb_{nb_type}.ipynb out_{nb_type}.ipynb -p nb_type test will substitute values into the paths passed in with python format application patterns.
- read_notebook, read_notebooks, record, and display api functions are now removed.
- [upstream] ipywidgets are now supported. See nbconvert docs for details.
- [upstream] notebook executions which run out of memory no longer hang indefinitely when the kernel dies.

2.6.20 0.19.1

- Added a warning when no parameter tag is present but parameters are being passed
- · Replaced retry with tenacity to help with conda builds and to use a non-abandoned library

2.6.21 0.19.0

DEPRECATION CHANGE The record, read_notebook, and read_notebooks functions are now officially deprecated and will be removed in papermill 1.0.

- · scrapbook functionality is now deprecated
- gcsfs support is expanded to cover recent releases

2.6.22 0.18.2

Fixes

• Addressed an issue with reading encoded notebook .ipynb files in python 3.5

2.6.23 0.18.1

Fixes

- · azure missing environment variable now has a better error message and only fails lazily
- · gcs connector now has a backoff to respect service rate limits

2.6.24 0.18.0

INSTALL CHANGE The iorw extensions now use optional dependencies. This means that installation for s3, azure, and gcs connectors are added via:

```
pip install papermill[s3,azure,gcs]
```

or for all dependencies

```
pip install papermill[all]
```

Features

- Optional IO extensions are now separated into different dependencies.
- Added gs:// optional dependency for google cloud storage support.
- null json fields in parmaeters now translate correctly to equivilent fields in each supported language

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Fixes

• tqdm dependencies are pinned to fetch a minimum version for auto tqdm

Dev Improvements

- · Releases and versioning patterns were made easier
- Tox is now used to capture all test and build requirements

2.6.25 0.17.0

Features

- Log level can now be set with --log-level
- The working directory of papermill can be set with the --cwd option. This will set the executing context of the kernel but not impact input/output paths. papermill --cwd foo bar/input_nb.ipynb bar/output_nb.ipynb would make the notebook able to reference files in the foo directory without ../foo but still save the output notebook in the bar directory.
- Tox has been added for testing papermill. This makes it easier to catch linting and manifest issues without waiting for a failed Travis build.

Fixes

- · Fixed warnings for reading non-ipynb files
- Fixed --report-mode with parameters (and made it more compatible with JupyterLab)
- Papermill execution progress bars now render within a notebook correctly after importing seaborn
- The --prepare-only option no longer requires that kernels be installed locally (you can parameterize a notebook without knowing how to execute it)
- Azure IO adapter now correctly prefixes paths with the adl:// scheme
- Tests on OSX should pass again

Docs

- · Install doc improvements
- Guide links are updated in the README
- Test docs updated for tox usage

2.6.26 0.16.2

- Injected parameter cells now respect -- report-mode
- · Logging level is only set for logger through CLI commands
- Output and input paths can be automatically passed to notebooks with the --inject-paths option
- Entrypoints have been added for registration of new papermill.io and papermill.engine plugins via setup files

2.6.27 0.16.1

• Fixed issue with azure blob io operations

2.6.28 0.16.0

- · Added engines abstraction and command line argument
- Moved some nbconvert wrappers out of papermill
- Added Azure blob storage support
- Fixed botocore upgrade comptability issue (all version of boto now supported again)
- Removed whitelisted environment variable assignment

2.6.29 0.15.1

- Added support for Julia kernels
- Many improvements to README.md and documentation
- nbconvert dependency pinned to >= 5.3
- Improved error handling for missing directories
- Warnings added when an unexpected file extension is used
- Papermill version is visible to the CLI
- More messages us logging module now (and can be filtered accordingly)
- Binder link from README was greatly improved to demostrate papermill features

2.6.30 0.15.0

- · Moved translator functions into registry
- Added development guide to help new contributors
- Travis, coverage, linting, and doc improvements
- Added support for Azure data lake sources
- Added python 3.7 testing

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2.6.31 0.14.2

• Added output flushing for log-output option

2.6.32 0.14.1

- Upgraded executor to stream outputs during execution
- Fixed UTF-8 encoding issues for windows machines
- Added black code formatter rules (experimental)
- · Contributors document added
- Added report-mode option for hiding inputs

2.6.33 0.13.4 (no code changes)

· Release manifest fix

2.6.34 0.13.3

• Fixed scala int vs long assignment

2.6.35 0.13.2

• Pip 10 fixes

2.6.36 0.13.1

• iPython pin to circumvent upstream issue

2.6.37 0.13.0

- Added prepare-only flag for parameterizing without processing a notebook
- Fixed cell number display on failed output notebooks
- Added scala language support

2.6.38 0.12.6

- · Changed CLI outputs from papermill messaging to stderr
- Changed IOResolvers to perseve ordering of definition in resolving paths

2.6.39 0.12.5

• Set click disable_unicode_literals_warning=True to disable unicode literals

2.6.40 0.12.4

- · Added universal wheel support
- Test coverage for s3 improved

2.6.41 0.12.3

• Added start timeout option for slow booting kernels

2.6.42 0.12.2

- · Added options around tqdm
- Fixed an S3 decoding issue

2.6.43 0.12.1

- ip_display improvements
- Docstring improvements

2.6.44 0.12.0

- Added type preservation for r and python parameters
- Massive test coverage improvements
- Codebase style pass

2.6. Change Log 29

CHAPTER

THREE

API REFERENCE

If you are looking for information about a specific function, class, or method, this documentation section will help you.

3.1 Reference

This part of the documentation lists the full API reference of all public classes and functions.

3.1.1 CLI

papermill.cli

Main papermill interface.

```
papermill.cli.print_papermill_version(ctx, param, value)
```

Command Line options

```
Usage: papermill [OPTIONS] NOTEBOOK_PATH OUTPUT_PATH

This utility executes a single notebook in a subprocess.

Papermill takes a source notebook, applies parameters to the source notebook, executes the notebook with the specified kernel, and saves the output in the destination notebook.

The NOTEBOOK_PATH and OUTPUT_PATH can now be replaced by `-` representing stdout and stderr, or by the presence of pipe inputs / outputs. Meaning that

`<generate input>... | papermill | ...process output>`
with `papermill - -` being implied by the pipes will read a notebook from stdin and write it out to stdout.

Options:
-p, --parameters TEXT... Parameters to pass to the parameters cell.
-r, --parameters_raw TEXT... Parameters to be read as raw string.
-f, --parameters_file TEXT Path to YAML file containing parameters.
-y, --parameters_yaml TEXT YAML string to be used as parameters.
```

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```
-b, --parameters_base64 TEXT Base64 encoded YAML string as parameters.
--inject-input-path
                               Insert the path of the input notebook as
                               PAPERMILL_INPUT_PATH as a notebook
                               parameter.
--inject-output-path
                               Insert the path of the output notebook as
                               PAPERMILL_OUTPUT_PATH as a notebook
                               parameter.
--inject-paths
                               Insert the paths of input/output notebooks
                               PAPERMILL_INPUT_PATH/PAPERMILL_OUTPUT_PATH
                               as notebook parameters.
--engine TEXT
                               The execution engine name to use in
                               evaluating the notebook.
--request-save-on-cell-execute / --no-request-save-on-cell-execute
                               Request save notebook after each cell
                                execution
--prepare-only / --prepare-execute
                                Flag for outputting the notebook without
                                execution, but with parameters applied.
-k, --kernel TEXT
                               Name of kernel to run.
--cwd TEXT
                               Working directory to run notebook in.
--progress-bar / --no-progress-bar
                               Flag for turning on the progress bar.
--log-output / --no-log-output Flag for writing notebook output to the
                              configured logger.
--stdout-file FILENAME
                              File to write notebook stdout output to.
--stderr-file FILENAME
                              File to write notebook stderr output to.
--log-level [NOTSET|DEBUG|INFO|WARNING|ERROR|CRITICAL]
                               Set log level
--start_timeout INTEGER
                               Time in seconds to wait for kernel to start.
--execution_timeout INTEGER
                              Time in seconds to wait for each cell before
                               failing execution (default: forever)
--report-mode / --no-report-mode
                               Flag for hiding input.
--version
                               Flag for displaying the version.
-h, --help
                                Show this message and exit.
```

3.1.2 Workflow

papermill.engines

Engines to perform different roles

```
class papermill.engines.Engine
    Bases: object
```

Base class for engines.

Other specific engine classes should inherit and implement the execute_managed_notebook method.

Defines *execute_notebook* method which is used to correctly setup the *NotebookExecutionManager* object for engines to interact against.

```
classmethod execute_managed_notebook (nb_man, kernel_name, **kwargs)

An abstract method where implementation will be defined in a subclass.
```

```
\begin{tabular}{ll} \textbf{classmethod execute\_notebook} (nb, kernel\_name, output\_path=None, progress\_bar=True, \\ log\_output=False, autosave\_cell\_every=30, **kwargs) \end{tabular}
```

A wrapper to handle notebook execution tasks.

Wraps the notebook object in a *NotebookExecutionManager* in order to track execution state in a uniform manner. This is meant to help simplify engine implementations. This allows a developer to just focus on iterating and executing the cell contents.

```
classmethod nb_kernel_name(nb, name=None)
```

Use default implementation to fetch kernel name from the notebook object

```
classmethod nb_language (nb, language=None)
```

Use default implementation to fetch programming language from the notebook object

```
class papermill.engines.NBClientEngine
```

Bases: papermill.engines.Engine

A notebook engine representing an nbclient process.

This can execute a notebook document and update the *nb_man.nb* object with the results.

Performs the actual execution of the parameterized notebook locally.

Parameters

- nb_man (NotebookExecutionManager) Wrapper for execution state of a notebook.
- **kernel_name** (str) Name of kernel to execute the notebook against.
- **log_output** (bool) Flag for whether or not to write notebook output to the configured logger.
- **start_timeout** (*int*) Duration to wait for kernel start-up.
- **execution_timeout** (*int*) Duration to wait before failing execution (default: never).

```
class papermill.engines.NotebookExecutionManager (nb, output_path=None, log\_output=False, progress\_bar=True, autosave\_cell\_every=30)
```

Bases: object

Wrapper for execution state of a notebook.

This class is a wrapper for notebook objects to house execution state related to the notebook being run through an engine.

In particular the NotebookExecutionManager provides common update callbacks for use within engines to facilitate metadata and persistence actions in a shared manner.

```
COMPLETED = 'completed'
FAILED = 'failed'
PENDING = 'pending'
RUNNING = 'running'
```

autosave cell()

Saves the notebook if it's been more than self.autosave_cell_every seconds since it was last saved.

```
cell_complete (cell, cell_index=None, **kwargs)
```

Finalize metadata for a cell and save notebook.

Optionally called by engines during execution to finalize the metadata for a cell and save the notebook to the output path.

```
cell_exception (cell, cell_index=None, **kwargs)
```

Set metadata when an exception is raised.

Called by engines when an exception is raised within a notebook to set the metadata on the notebook indicating the location of the failure.

```
cell_start (cell, cell_index=None, **kwargs)
```

Set and save a cell's start state.

Optionally called by engines during execution to initialize the metadata for a cell and save the notebook to the output path.

cleanup pbar()

Clean up a progress bar

complete_pbar()

Refresh progress bar

get_cell_description (cell, escape_str='papermill_description=')

Fetches cell description if present

notebook_complete(**kwargs)

Finalize the metadata for a notebook and save the notebook to the output path.

Called by Engine when execution concludes, regardless of exceptions.

notebook_start (**kwargs)

Initialize a notebook, clearing its metadata, and save it.

When starting a notebook, this initializes and clears the metadata for the notebook and its cells, and saves the notebook to the given output path.

Called by Engine when execution begins.

now()

Helper to return current UTC time

save (**kwargs)

Saves the wrapped notebook state.

If an output path is known, this triggers a save of the wrapped notebook state to the provided path.

Can be used outside of cell state changes if execution is taking a long time to conclude but the notebook object should be synced.

For example, you may want to save the notebook every 10 minutes when running a 5 hour cell execution to capture output messages in the notebook.

set timer()

Initializes the execution timer for the notebook.

This is called automatically when a NotebookExecutionManager is constructed.

class papermill.engines.PapermillEngines

Bases: object

The holder which houses any engine registered with the system.

This object is used in a singleton manner to save and load particular named Engine objects so they may be referenced externally.

```
execute_notebook_with_engine (engine_name, nb, kernel_name, **kwargs)
```

Fetch a named engine and execute the nb object against it.

```
get_engine (name=None)
```

Retrieves an engine by name.

nb_kernel_name (engine_name, nb, name=None)

Fetch kernel name from the document by dropping-down into the provided engine.

nb_language (engine_name, nb, language=None)

Fetch language from the document by dropping-down into the provided engine.

```
register (name, engine)
```

Register a named engine

register_entry_points()

Register entrypoints for an engine

Load handlers provided by other packages

```
papermill.engines.catch_nb_assignment(func)
```

Wrapper to catch *nb* keyword arguments

This helps catch nb keyword arguments and assign onto self when passed to the wrapped function.

Used for callback methods when the caller may optionally have a new copy of the originally wrapped nb object.

papermill.execute

```
papermill.execute.execute_notebook (input_path, output_path, parameters=None, en-
gine_name=None, request_save_on_cell_execute=True,
prepare_only=False, kernel_name=None, lan-
guage=None, progress_bar=True, log_output=False,
stdout_file=None, stderr_file=None, start_timeout=60,
report_mode=False, cwd=None, **engine_kwargs)
```

Executes a single notebook locally.

Parameters

- input_path (str or Path or nbformat.NotebookNode) Path to input notebook or NotebookNode object of notebook
- output_path (str or Path or None) Path to save executed notebook. If None, no file will be saved
- parameters (dict, optional) Arbitrary keyword arguments to pass to the note-book parameters
- engine name (str, optional) Name of execution engine to use
- request_save_on_cell_execute (bool, optional) Request save notebook after each cell execution
- autosave_cell_every (int, optional) How often in seconds to save in the middle of long cell executions
- prepare_only (bool, optional) Flag to determine if execution should occur or not

- **kernel_name** (str, optional) Name of kernel to execute the notebook against
- language (str, optional) Programming language of the notebook
- progress_bar(bool, optional) Flag for whether or not to show the progress bar.
- log_output (bool, optional) Flag for whether or not to write notebook output to the configured logger
- start_timeout (int, optional) Duration in seconds to wait for kernel start-up
- report_mode (bool, optional) Flag for whether or not to hide input.
- cwd (str or Path, optional) Working directory to use when executing the note-book
- **kwargs Arbitrary keyword arguments to pass to the notebook engine

Returns nb – Executed notebook object

Return type NotebookNode

```
papermill.execute.prepare_notebook_metadata(nb, input_path, output_path, re-
port_mode=False)
```

Prepare metadata associated with a notebook and its cells

Parameters

- **nb** (NotebookNode) Executable notebook object
- input_path (str) Path to input notebook
- output_path (str) Path to write executed notebook
- report_mode (bool, optional) Flag to set report mode

papermill.execute.raise_for_execution_errors(nb, output_path)

Assigned parameters into the appropriate place in the input notebook

Parameters

- **nb** (NotebookNode) Executable notebook object
- output_path (str) Path to write executed notebook

papermill.execute.remove_error_markers(nb)

papermill.clientwrap

```
class papermill.clientwrap.PapermillNotebookClient(**kwargs: Any)
    Bases: nbclient.client.NotebookClient
```

Module containing a that executes the code cells and updates outputs

```
execute (**kwargs)
```

Wraps the parent class process call slightly

log output

A boolean (True, False) trait.

log_output_message(output)

Process a given output. May log it in the configured logger and/or write it into the configured stdout/stderr files.

 $\begin{tabular}{ll} \textbf{Parameters} & \textbf{output} - nb format. note book node. Note book Node \\ \end{tabular}$

Returns

papermill_execute_cells()

This function replaces cell execution with it's own wrapper.

We are doing this for the following reasons:

- 1. Notebooks will stop executing when they encounter a failure but not raise a *CellException*. This allows us to save the notebook with the traceback even though a *CellExecutionError* was encountered.
- 2. We want to write the notebook as cells are executed. We inject our logic for that here.
- 3. We want to include timing and execution status information with the metadata of each cell.

```
process_message(*arg, **kwargs)
```

Processes a kernel message, updates cell state, and returns the resulting output object that was appended to cell.outputs.

The input argument cell is modified in-place.

Parameters

- msg (dict) The kernel message being processed.
- cell (nbformat.NotebookNode) The cell which is currently being processed.
- **cell_index** (*int*) The position of the cell within the notebook object.

Returns output – The execution output payload (or None for no output).

Return type NotebookNode

Raises CellExecutionComplete – Once a message arrives which indicates computation completeness.

stderr_file

A trait whose value must be an instance of a specified class.

The value can also be an instance of a subclass of the specified class.

Subclasses can declare default classes by overriding the klass attribute

stdout_file

A trait whose value must be an instance of a specified class.

The value can also be an instance of a subclass of the specified class.

Subclasses can declare default classes by overriding the klass attribute

3.1.3 Language Translators

Translators

Translator

```
class papermill.translators.Translator

classmethod assign(name, str_val)

classmethod codify(parameters, comment='Parameters')

classmethod comment(cmt_str)
```

classmethod inspect (parameters_cell)

Inspect the parameters cell to get a Parameter list

It must return an empty list if no parameters are found and it should ignore inspection errors.

Note: inferred_type_name should be "None" if unknown (set it to "NoneType" for null value)

Parameters parameters_cell (NotebookNode) - Cell tagged _parameters_

Returns A list of all parameters

Return type List[Parameter]

classmethod translate (val)

Translate each of the standard json/yaml types to appropiate objects.

${\tt classmethod\ translate_bool\ }(val)$

Default behavior for translation

classmethod translate_dict(val)

classmethod translate_escaped_str(str_val)

Reusable by most interpreters

classmethod translate_float(val)

Default behavior for translation

classmethod translate_int(val)

Default behavior for translation

classmethod translate_list(val)

classmethod translate none (val)

Default behavior for translation

classmethod translate_raw_str (val)

Reusable by most interpreters

classmethod translate_str(val)

Default behavior for translation

PapermillTranslators

class papermill.translators.PapermillTranslators

The holder which houses any translator registered with the system. This object is used in a singleton manner to save and load particular named Translator objects for reference externally.

```
find_translator(kernel_name, language)
```

register (language, translator)

Python

```
class papermill.translators.PythonTranslator
    PARAMETER_PATTERN = re.compile('^(?P<target>\\w[\\w_]*)\\s*(:\\s*[\\"\']?(?P<annotatio
    classmethod codify (parameters, comment='Parameters')
    classmethod comment(cmt_str)
    classmethod inspect (parameters_cell)
         Inspect the parameters cell to get a Parameter list
         It must return an empty list if no parameters are found and it should ignore inspection errors.
             Parameters parameters_cell (NotebookNode) - Cell tagged _parameters_
             Returns A list of all parameters
             Return type List[Parameter]
    classmethod translate_bool(val)
         Default behavior for translation
    {\tt classmethod} {\tt translate\_dict} (val)
    classmethod translate_float(val)
         Default behavior for translation
    classmethod translate_list(val)
R
class papermill.translators.RTranslator
    classmethod assign(name, str_val)
    classmethod comment(cmt str)
    classmethod translate_bool(val)
         Default behavior for translation
    classmethod translate_dict(val)
    classmethod translate_list(val)
    classmethod translate_none(val)
         Default behavior for translation
Julia
class papermill.translators.JuliaTranslator
    classmethod comment(cmt_str)
    classmethod translate_dict(val)
    classmethod translate_list(val)
    classmethod translate none (val)
         Default behavior for translation
```

Scala

```
class papermill.translators.ScalaTranslator

classmethod assign (name, str_val)

classmethod comment (cmt_str)

classmethod translate_dict (val)

    Translate dicts to scala Maps

classmethod translate_int (val)

    Default behavior for translation

classmethod translate_list (val)

    Translate list to scala Seq
```

Functions

papermill.translators.translate_parameters(kernel_name, language, parameters, comment='Parameters')

3.1.4 Input / Output

papermill.iorw

```
class papermill.iorw.ABSHandler
    Bases: object
    {f listdir}\left(path
ight)
    pretty_path(path)
    read(path)
    write(buf, path)
class papermill.iorw.ADLHandler
    Bases: object
    listdir(path)
    pretty_path (path)
    read(path)
    write(buf, path)
class papermill.iorw.GCSHandler
    Bases: object
    RATE_LIMIT_RETRIES = 3
    RETRY_DELAY = 1
    RETRY_MAX_DELAY = 4
    RETRY MULTIPLIER = 1
    listdir(path)
    pretty_path (path)
```

```
read(path)
    write(buf, path)
class papermill.iorw.GithubHandler
    Bases: object
    listdir(path)
    pretty_path (path)
    read(path)
    write(buf, path)
class papermill.iorw.HDFSHandler
    Bases: object
    listdir(path)
    pretty_path (path)
    read(path)
    write(buf, path)
class papermill.iorw.HttpHandler
    Bases: object
    classmethod listdir(path)
    classmethod pretty_path(path)
    classmethod read(path)
    classmethod write(buf, path)
class papermill.iorw.LocalHandler
    Bases: object
    cwd (new_path)
        Sets the cwd during reads and writes
    listdir(path)
    pretty_path (path)
    read(path)
    write(buf, path)
class papermill.iorw.NoDatesSafeLoader(stream)
    Bases: yaml.loader.SafeLoader
    yaml_implicit_resolvers = {'': [('tag:yaml.org,2002:null', re.compile('^(?: ~\n |nul
class papermill.iorw.NoIOHandler
    Bases: object
    Handler for output_path of None - intended to not write anything
    listdir(path)
    pretty_path(path)
    read(path)
    write(buf, path)
```

```
class papermill.iorw.NotebookNodeHandler
     Bases: object
     Handler for input_path of nbformat.NotebookNode object
     listdir(path)
     pretty_path (path)
     read (path)
     write(buf, path)
class papermill.iorw.PapermillIO
     Bases: object
     The holder which houses any io system registered with the system. This object is used in a singleton manner to
     save and load particular named Handler objects for reference externally.
     get_handler (path, extensions=None)
          Get I/O Handler based on a notebook path
              Parameters
                  • path (str or nbformat.NotebookNode or None) -
                  • extensions (list of str, optional) - Required file extension options for the
                   path (if path is a string), which will log a warning if there is no match. Defaults to None,
                   which does not check for any extensions
              Raises PapermillException - If a valid I/O handler could not be found for the input path:
              Returns
              Return type I/O Handler
     listdir(path)
     pretty_path(path)
     read (path, extensions=['.ipynb', '.json'])
     register (scheme, handler)
     register_entry_points()
     reset()
     write (buf, path, extensions=['.ipynb', '.json'])
class papermill.iorw.S3Handler
     Bases: object
     classmethod listdir(path)
     classmethod pretty_path(path)
     classmethod read(path)
     classmethod write(buf, path)
class papermill.iorw.StreamHandler
     Bases: object
     Handler for Stdin/Stdout streams
     listdir(path)
     pretty_path (path)
```

```
read (path)
     write (buf, path)
papermill.iorw.fallback_gs_is_retriable(e)
papermill.iorw.get_pretty_path(path)
papermill.iorw.gs_is_retriable(e)
papermill.iorw.list_notebook_files(path)
     Returns a list of all the notebook files in a directory.
papermill.iorw.load_notebook_node(notebook_path)
     Returns a notebook object with papermill metadata loaded from the specified path.
         Parameters notebook_path (str) - Path to the notebook file.
         Returns nbformat.NotebookNode
papermill.iorw.local_file_io_cwd(path=None)
papermill.iorw.read_yaml_file(path)
     Reads a YAML file from the location specified at 'path'.
papermill.iorw.write_ipynb(nb, path)
     Saves a notebook object to the specified path. :param nb_node: Notebook object to save. :type nb_node:
     nbformat.NotebookNode:param notebook_path: Path to save the notebook object to.:type notebook_path: str
```

3.1.5 Storage

Azure

These modules outline how to interact with Azure data stores, specifically Azure Blob Storage and Azure Data Lakes.

papermill.abs module

papermill.adl module

AWS

This module shows how to interact with AWS S3 data stores.

papermill.s3 module

```
Utilities for working with S3.
```

```
class papermill.s3.Bucket (name, service=None)
    Bases: object
```

Represents a Bucket of storage on S3

Parameters

- name (string) name of the bucket
- **service** (*string*, *optional* (*Default is None*)) name of a service resource, such as SQS, EC2, etc.

```
list (prefix=", delimiter=None)
```

Limits a list of Bucket's objects based on prefix and delimiter.

Bases: object

A key that represents a unique object in an S3 Bucket.

Represents a file or stream.

Parameters

- bucket (object) A bucket of S3 storage
- name (string) representative name of the bucket
- size(???, optional (Default is None))-
- etag(???, optional (Default is None))-
- last_modified(date, optional (Default is None)) -
- storage_class(???, optional (Default is None))-
- **service** (string, optional (Default is None)) name of a service resource, such as SQS, EC2, etc.

class papermill.s3.Prefix(bucket, name, service=None)

Bases: object

Represents a prefix used in an S3 Bucket.

Parameters

- bucket (object) A bucket of S3 storage
- name (string) name of the bucket
- **service** (*string*, *optional* (*Default is None*)) name of a service resource, such as SQS, EC2, etc.

class papermill.s3.S3 (keyname=None, *args, **kwargs)

Bases: object

Wraps S3.

Parameters keyname (TODO) -

The following are wrapped utilities for S3:

- cat
- cp_string
- list
- list_dir
- read

cat (source, buffersize=None, memsize=16777216, compressed=False, encoding='UTF-8', raw=False)

Returns an iterator for the data in the key or nothing if the key doesn't exist. Decompresses data on the

Returns an iterator for the data in the key or nothing if the key doesn't exist. Decompresses data on the fly (if compressed is True or key ends with .gz) unless raw is True. Pass None for encoding to skip encoding.

cp_string(source, dest, **kwargs)

Copies source string into the destination location.

Parameters

- **source** (*string*) the string with the content to copy
- **dest** (string) the s3 location

```
list (name, iterator=False, **kwargs)
```

Returns a list of the files under the specified path name must be in the form of s3://bucket/prefix

Parameters

- **keys** (optional) if True then this will return the actual boto keys for files that are encountered
- **objects** (optional) if True then this will return the actual boto objects for files or prefixes that are encountered
- delimiter (optional) if set this
- iterator (optional) if True return iterator rather than converting to list object

```
listdir (name, **kwargs)
```

Returns a list of the files under the specified path.

This is different from list as it will only give you files under the current directory, much like ls.

name must be in the form of s3://bucket/prefix/

Parameters

- keys (optional) if True then this will return the actual boto keys for files that are encountered
- **objects** (optional) if True then this will return the actual boto objects for files or prefixes that are encountered

```
lock = <unlocked _thread.RLock object owner=0 count=0>
```

```
read (source, compressed=False, encoding='UTF-8')
```

Iterates over a file in s3 split on newline.

Yields a line in file.

```
s3_session = (None, None, None)
```

3.1.6 Utilities

Utils

```
papermill.utils.any_tagged_cell(nb, tag)
```

Whether the notebook contains at least one cell tagged tag?

Parameters

- **nb** (nbformat.NotebookNode) The notebook to introspect
- tag (str) The tag to look for

Returns Whether the notebook contains a cell tagged tag?

Return type bool

```
papermill.utils.chdir(path)
```

Change working directory to path and restore old path on exit.

path can be None in which case this is a no-op.

```
papermill.utils.find_first_tagged_cell_index(nb, tag)
```

Find the first tagged cell tag in the notebook.

Parameters

- **nb** (nbformat.NotebookNode) The notebook to introspect
- tag(str) The tag to look for

Returns Whether the notebook contains a cell tagged tag?

Return type nbformat.NotebookNode

```
papermill.utils.merge_kwargs(caller_args, **callee_args)
```

Merge named argument.

Function takes a dictionary of caller arguments and callee arguments as keyword arguments Returns a dictionary with merged arguments. If same argument is in both caller and callee arguments the last one will be taken and warning will be raised.

Parameters

- caller_args (dict) Caller arguments
- **callee args Keyword callee arguments

Returns args - Merged arguments

Return type dict

```
papermill.utils.nb_kernel_name(nb, name=None)
```

Helper for fetching out the kernel name from a notebook object.

Parameters

- **nb** (nbformat.NotebookNode) The notebook to introspect
- name (str) A provided name field

Returns The name of the kernel

Return type str

Raises ValueError – If no kernel name is found or provided

```
papermill.utils.nb_language(nb, language=None)
```

Helper for fetching out the programming language from a notebook object.

Parameters

- **nb** (nbformat.NotebookNode) The notebook to introspect
- language (str) A provided language field

Returns The programming language of the notebook

Return type str

Raises ValueError - If no notebook language is found or provided

```
papermill.utils.remove_args (args=None, **kwargs)
```

Remove arguments from kwargs.

Parameters

- **args** (list) Argument names to remove from kwargs
- **kwargs Arbitrary keyword arguments

```
Returns kwargs – New dictionary of arguments Return type dict
```

```
papermill.utils.retry(num)
```

Exceptions

- **exception** papermill.exceptions.**AwsError** Raised when an AWS Exception is encountered.
- **exception** papermill.exceptions.**FileExistsError** Raised when a File already exists on S3.
- **exception** papermill.exceptions.**PapermillException**Raised when an exception is encountered when operating on a notebook.

Raised when an exception is encountered in a notebook.

- **exception** papermill.exceptions.**PapermillMissingParameterException**Raised when a parameter without a value is required to operate on a notebook.
- **exception** papermill.exceptions.**PapermillOptionalDependencyException**Raised when an exception is encountered when an optional plugin is missing.
- **exception** papermill.exceptions.**PapermillParameterOverwriteWarning** Callee overwrites caller argument to pass down the stream.
- **exception** papermill.exceptions.**PapermillRateLimitException** Raised when an io request has been rate limited
- **exception** papermill.exceptions.PapermillWarning Base warning for papermill.

```
papermill.exceptions.missing_dependency_generator(package, dep)
papermill.exceptions.missing_environment_variable_generator(package, env_key)
```

Log

Sets up a logger

CHAPTER

FOUR

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