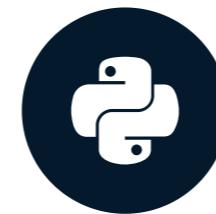


# Apply Expectations to New Data

INTRODUCTION TO DATA QUALITY WITH GREAT EXPECTATIONS

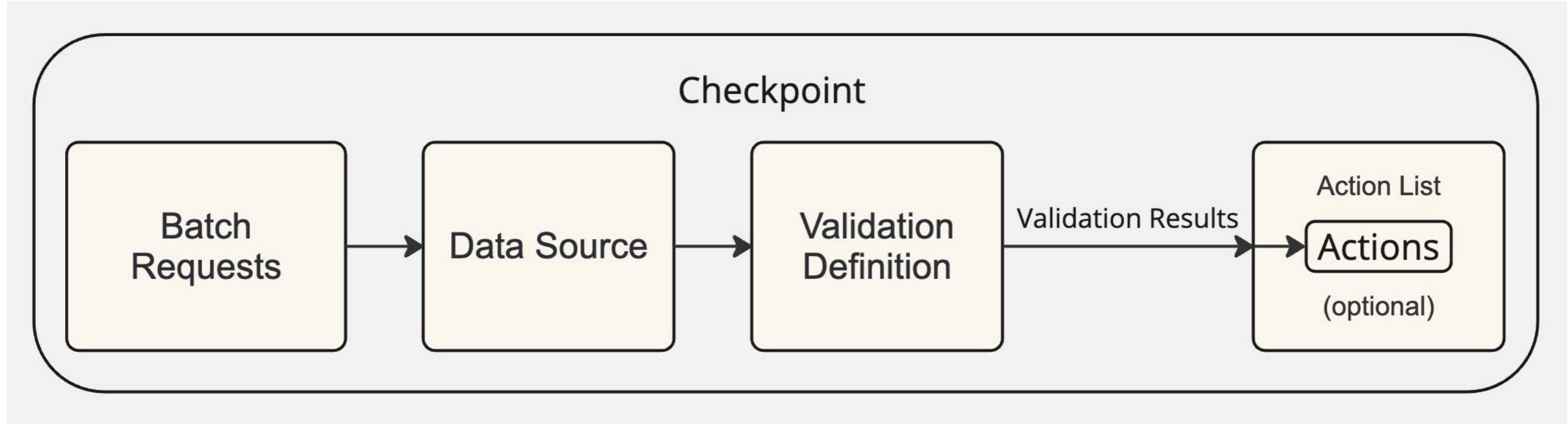


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# Checkpoints

**Checkpoint** - An object that groups and runs Validation Definitions with shared parameters



**Actions** - Components configured by Checkpoints that integrate GX with other tools based on Validation Results

# Why use Checkpoints?

## Reusability

- Can run multiple Validation Definitions against a Batch

## Actions

- Can trigger Actions based on Validation Results

# Creating a Checkpoint

Creating a Checkpoint with Slack Notification via `gx.Checkpoint()`:

```
checkpoint = gx.Checkpoint(  
    name="my_checkpoint",  
    validation_definitions=[validation_definition],  
    actions=[SlackNotificationAction()] # optional  
)
```

# Checkpoint errors

Running a Checkpoint before adding the Validation Definition to the Data Context raises an error:

```
CheckpointRelatedResourcesFreshnessError:  
ValidationDefinition 'my_validation_definition' must be added to the DataContext  
before it can be updated. Please call `context.validation_definitions.add(  
<VALIDATION_DEFINITION_OBJECT>)`, then try your action again.
```

# Adding a Validation Definition

Add the Validation Definition to the Data Context using `.validation_definitions.add()` :

```
validation_definition = context.validation_definitions.add(  
    validation_definition=validation_definition  
)
```

# Running a Checkpoint

```
checkpoint_results = checkpoint.run(  
    batch_parameters={"dataframe": dataframe}  
)
```

```
{  
    "validation_result_url": "https://app.greatexpectations.io/organizations/dawatek/data-assets/12f2fd76-d127-4517-83e6-464b0567e2fb/validations/expectation-suites/0c34304b-0ce0-4b39-8f6d-9cd9b4b0e151/results/5bc5404d-872f-4804-8bfd-f43fe04333f6",  
    "run_id": {  
        "run_name": null,  
        "run_time": "2024-06-05T14:53:12.870646-07:00"  
    },  
    "run_results": {  
        "GXCloudIdentifier::GXCloudRESTResource.VALIDATION_RESULT::5bc5404d-872f-4804-8bfd-f43fe04333f6": {  
            "validation_result": {  
                "success": true,  
                "results": [  
                    {  
                        "success": true,  
                        "expectation_config": {  
                            "expectation_type": "expect_column_to_exist",  
                            "kwargs": {  
                                "catch_exceptions": false,  
                                "column": "hero_image",  
                                "result_format": null,  
                                "batch_id": "2024-06-05 14:52:57.953264-2024-06-05 14:52:57.953264"  
                            }  
                        }  
                    ]  
                }  
            }  
        }  
    }  
}
```

# Assessing Checkpoint Results

```
print(checkpoint_results.success)
```

```
False
```

```
print(checkpoint_results.describe())
```

# Assessing Checkpoint Results

```
{ "success": false,  
  "statistics": {  
    "evaluated_expectations": 1, "successful_expectations": 0,  
    "unsuccessful_expectations": 1, "success_percent": 0.0  
  },  
  "expectations": [ {  
    "expectation_type": "expect_table_row_count_to_equal",  
    "success": false,  
    "kwargs": {"batch_id": "\"my_datasource-my_dataframe_asset\"", "value": 118000},  
    "result": {"observed_value": 11866} }  
  ],  
  "result_url": "https://app.greatexpectations.io/organizations/my_org/data-assets/*"  
}
```

# Data Docs

**Data Docs** - static websites generated from GX metadata

```
# Checkpoint with Action for Updating Data Docs
gx.Checkpoint(
    name,
    validation_definitions,
    actions=[
        gx.checkpoint.actions.UpdateDataDocsAction(
            name="update_my_site", site_names="my_data_docs_site"
        )
    ],
)
```

<sup>1</sup> [https://docs.greatexpectations.io/docs/core/configure\\_project\\_settings/configure\\_data\\_docs/](https://docs.greatexpectations.io/docs/core/configure_project_settings/configure_data_docs/)

# Data Docs

## Table level Expectations

All Expectations met

hero\_image is a required field.

OBSERVED VALUE: --

Must have at least these columns (in any order): name link price\_usd mark\_price\_usd star\_rating  
colour seller\_name See all

OBSERVED VALUE: ['name', 'link', 'price\_usd', 'mark\_price\_usd', 'star\_rating', 'colour', 'seller\_name', 'review\_count',  
'sku\_id', 'hero\_image']

Must have greater than or equal to 1 rows.

OBSERVED VALUE: 899

### Validation History

Run Time	17m ago	17m ago
Observed Value	899 ✓	899 ✓
Min Value	1	1
Max Value	None	None

# Cheat sheet

Add Validation Definition to Data Context:

```
context.validation_definitions.add(  
    validation_definition  
)
```

Create Checkpoint:

```
checkpoint = gx.Checkpoint(  
    name: str,  
    validation_definitions: list,  
)
```

Run Checkpoint:

```
checkpoint_results = checkpoint.run(  
    batch_parameters={"dataframe": dataframe}  
)
```

Check Checkpoint Results:

```
checkpoint_results.success  
checkpoint_results.describe()
```

# **Let's practice!**

**INTRODUCTION TO DATA QUALITY WITH GREAT EXPECTATIONS**

# Update Expectation Suites

INTRODUCTION TO DATA QUALITY WITH GREAT EXPECTATIONS



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# Adding Expectations

```
expectation = gx.expectations.ExpectTableColumnCountToEqual(  
    value=10  
)
```

```
suite = gx.ExpectationSuite(  
    name="my_suite"  
)
```

```
# Add Expectation to Suite  
suite.add_expectation(  
    expectation=expectation  
)
```

# Multiple Expectation Suites

```
# Create another Expectation Suite  
another_suite = gx.ExpectationSuite(name="my_other_suite")  
# Add the same Expectation to the new Suite  
another_suite.add_expectation(expectation=expectation)
```

Expectations **cannot** belong to multiple Suites at once:

RuntimeError: Cannot add Expectation because it already belongs to an ExpectationSuite. If you want to update an existing Expectation, please call Expectation.save(). If you are copying this Expectation to a new ExpectationSuite, please copy it first (the core expectations and some others support copy(expectation)) and set `Expectation.id = None`.

# Copying Expectations

If you are copying this Expectation to a new ExpectationSuite, please copy it first (the core expectations and some others support `copy(expectation)`) and set ``Expectation.id = None``.

Copy the Expectation, set its `.id` to `None`, and add it to the new Suite without errors:

```
expectation_copy = expectation.copy()  
expectation_copy.id = None
```

```
another_suite.add_expectation(  
    expectation=expectation_copy  
)
```

# Checking Expectations

```
print(  
    expectation_copy in another_suite.expectations  
)
```

```
True
```

# Deleting Expectations

Add

```
.add_expectation()
```

```
suite.add_expectation(  
    expectation=expectation  
)
```

Delete

```
.delete_expectation()
```

```
suite.delete_expectation(  
    expectation=expectation  
)
```

# Adjusting Expectations

Update the `.value` attribute and save changes:

```
expectation = gx.expectations.ExpectTableColumnCountToEqual(  
    value=10  
)  
expectation.value = 11  
expectation.save()
```

Ensure the Expectation belongs to a Suite, otherwise:

RuntimeError: Expectation must be added to ExpectationSuite before it can be saved.

# Updating an Expectation Suite

```
suite = gx.ExpectationSuite(name="my_suite")
validation_definition = gx.ValidationDefinition(
    data=batch_definition, suite=suite, name="my_validation_definition"
)
```

```
# Define Expectation
col_name_expectation = gx.expectations.ExpectColumnToExist(column="GHI")
# Add Expectation to Suite
suite.add_expectation(expectation=col_name_expectation)
# Run Validation Definition associated with the Suite
validation_results = validation_definition.run()
```

# Saving an Expectation Suite

Save changes to the Suite before running the Validation Definition to avoid errors:

```
validation_results = validation_definition.run()
```

```
ResourceFreshnessAggregateError: ExpectationSuite 'my_suite' has changed since it  
has last been saved. Please update with `<SUITE_OBJECT>.save()`, then try your  
action again.
```

# Saving an Expectation Suite

Use the `.save()` method to save the Suite and run the Validation Definition error-free:

```
suite.save()  
validation_results = validation_definition.run()  
print(validation_results.success)
```

False

# Cheat sheet

Copy Expectation:

```
expectation_copy = expectation.copy()  
expectation_copy.id = None
```

Check if Expectation is in Suite:

```
expectation in suite.expectations
```

Delete Expectation:

```
suite.delete_expectation(expectation)
```

Update Expectation value:

```
expectation.value = new_value
```

Save changes to Expectation:

```
expectation.save()
```

Save changes to Expectation Suite:

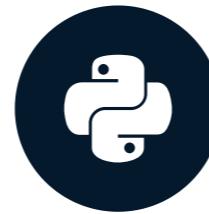
```
suite.save()
```

# **Let's practice!**

**INTRODUCTION TO DATA QUALITY WITH GREAT EXPECTATIONS**

# Manage Components

INTRODUCTION TO DATA QUALITY WITH GREAT EXPECTATIONS



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# Components

**GX components** - Python classes that represent data and data validation entities

- Data Context
- Data Sources & Data Assets
- Batch Definitions & Batches
- Expectations
- Expectation Suites
- Validation Definitions
- Checkpoints & Actions
- Data Docs

<sup>1</sup> [https://docs.greatexpectations.io/docs/core/introduction/gx\\_overview](https://docs.greatexpectations.io/docs/core/introduction/gx_overview)

# Component management in GX

**Data Sources:**

`context.data_sources`

- connect to data and contain Data Assets

**Expectation Suites:**

`context.suites`

- house Expectations

**Validation Definitions:**

`context.validation_definitions`

- validate Expectations against data

**Checkpoints:**

`context.checkpoints`

- group and automate Validations

# Adding components

Expectation Suite:

```
suite = context.suites.add(suite)
```

Validation Definition:

```
validation_definition = context.validation_definitions.add(validation_definition)
```

Checkpoint:

```
checkpoint = context.checkpoints.add(  
    checkpoint=checkpoint  
)
```

# Adding a Data Source

```
data_source = context.data_sources.add_<TYPE_NAME>()
```

	Data Source Type	Method	Parameters
0	pandas dataframe	add_pandas()	name: str
1	Spark dataframe	add_spark()	name: str
2	Local filesystem pandas	add_pandas_filesystem()	name: str, base_directory: str
3	Local filesystem Spark	add_spark_filesystem()	name: str, base_directory: str
4	Amazon S3 pandas	add_pandas_s3()	name: str, bucket: str, boto3_options: dict
5	Amazon S3 Spark	add_spark_s3()	name: str, bucket: str, boto3_options: dict
6	Azure Blob Storage pandas	add_pandas_abs()	name: str, azure_options: dict
7	Azure Blob Storage Spark	add_spark_abs()	name: str, azure_options: dict
8	Google Cloud Storage pandas	add_pandas_gcs()	name: str, bucket_or_name: str, gcs_options: dict
9	Google Cloud Storage Spark	add_spark_gcs()	name: str, bucket_or_name: str, gcs_options: dict
10	PostgreSQL	add_postgres()	name: str, connection_string: str
11	SQLite	add_sqlite()	name: str, connection_string: str
12	Snowflake	add_snowflake()	name: str, connection_string: str
13	DataBricks SQL	add_databricks_sql()	name: str, connection_string: str
14	Other SQL	add_sql()	name: str, connection_string: str

<sup>1</sup> [https://docs.greatexpectations.io/docs/core/connect\\_to\\_data/](https://docs.greatexpectations.io/docs/core/connect_to_data/)

# Adding a pandas Data Source

Use `.add_pandas()` to easily set up a Data Source for pandas DataFrames:

```
data_source = context.data_sources.add_pandas(  
    name="my_pandas_datasource"  
)
```

# Retrieving components

Retrieve components with `.get()` by specifying their name parameter:

```
context.<COMPONENT>s.get(  
    name: str  
)
```

```
data_source = context.data_sources.get(  
    name="my_pandas_datasource"  
)  
print(data_source)
```

```
id: 46c91f1b-1db9-4351-b5dd-83e038c0f511  
name: 'my_pandas_datasource'  
type: pandas
```

# Retrieving components

Data Sources:

```
context.data_sources.get(  
    name="my_pandas_datasource"  
)
```

Expectation Suites:

```
context.suites.get(  
    name="my_suite"  
)
```

Validation Definitions:

```
context.validation_definitions.get(  
    name="my_validation_definition"  
)
```

Checkpoints:

```
context.checkpoints.get(  
    name="my_checkpoint"  
)
```

# Listing components

Use `.all()` to list all components in your Data Context, including their names and metadata:

```
context.<COMPONENT>s.all()
```

```
data_sources = context.data_sources.all()  
print(data_sources)
```

```
{  
    'my_pandas_datasource': PandasDatasource(  
        type='pandas',  
        name='my_pandas_datasource',  
        id=UUID('c22b16f7-6945-400e-932f-026cbd63b112'),  
        assets=[]  
    )  
}
```

# Listing components

Data Sources:

```
context.data_sources.all()
```

Expectation Suites:

```
context.suites.all()
```

Validation Definitions:

```
context.validation_definitions.all()
```

Checkpoints:

```
context.checkpoints.all()
```

# Deleting components

Use `.delete()` to remove components by specifying their name:

```
context.<COMPONENT>s.delete(  
    name: str  
)
```

```
context.data_sources.delete(  
    name="my_pandas_datasource"  
)  
print(context.data_sources.all())
```

```
{}
```

# Deleting components

Data Sources:

```
context.data_sources.delete(  
    name="my_pandas_datasource"  
)
```

Expectation Suites:

```
context.suites.delete(  
    name="my_suite"  
)
```

Validation Definitions:

```
context.validation_definitions.delete(  
    name="my_validation_definition"  
)
```

Checkpoints:

```
context.checkpoints.delete(  
    name="my_checkpoint"  
)
```

# Cheat sheet

Add a component to Data Context:

```
context.data_sources.add(data_source)
```

```
context.suites.add(suite)
```

```
context.validation_definitions.add(  
    validation_definition  
)
```

```
context.checkpoints.add(checkpoint)
```

Retrieve a component:

```
.get(name: str)
```

List components:

```
.all()
```

Delete a component:

```
.delete(name: str)
```

# **Let's practice!**

**INTRODUCTION TO DATA QUALITY WITH GREAT EXPECTATIONS**