

Airflow at Burns & McDonnell

Orchestration from 0 to 100

Bonnie Why

Bonnie Why

is just your average person with
way too many interests and not
enough time.



Bonnie Why

is just your average person with
way too many interests and not
enough time.

And that's my dog



AGENDA

1. Data at Burns & McDonnell
2. Ingestion in one day (or less)
3. Airflow is awesome

Slide Deck
and
Resources



ABOUT BURNS & MCDONNELL

STRENGTH

14,000+ PROFESSIONALS

DEPTH

75+ OFFICES WORLDWIDE

EXCELLENCE

#7 TOP 500 DESIGN FIRMS
Engineering News-Record

COMMITMENT

100% EMPLOYEE-OWNED

The background image shows a vast solar power plant in a desert landscape under a blue sky with scattered clouds. The plant consists of numerous blue solar panels arranged in a grid pattern across a hillside. In the distance, a tall white tower stands prominently. The overall scene conveys a sense of renewable energy and industrial scale.

IVANPAH SOLAR THERMAL POWER FACILITY

NRG ENERGY | NIPTON, CA

LUNAR PRODUCTION & OPERATION CENTER

INTUITIVE MACHINES | HOUSTON, TX



STARTING LINE

DATA AT BURNS & MCDONNELL



**HARD TO
MAINTAIN**

- Multitude of varied source systems
- Multitude of differing tools and processes
- Teams working in silos

HARD TO MAINTAIN



**HARD TO
TRUST**

- **Duplicated effort, duplicated data**
- **Lack of discoverability**
- **Unclear as to what the data means**

HARD TO TRUST



**HARD TO
CHANGE**

- **Brittle, interconnected systems**
- **Unsure of who is using the data, and how often**
- **Little testing, end users find the bugs**

HARD TO CHANGE



FINISH LINE

DATA AT BURNS & MCDONNELL



SCALEABLE

- **Scale with the business, as well as the data**
- **Centralized for uniform access**
- **Maintainable to keep up with high demand**

SCALEABLE



RELIABLE

- Company-wide understanding, shared language
- Using the “right” data
- Obvious, secure, and accurate data lineage

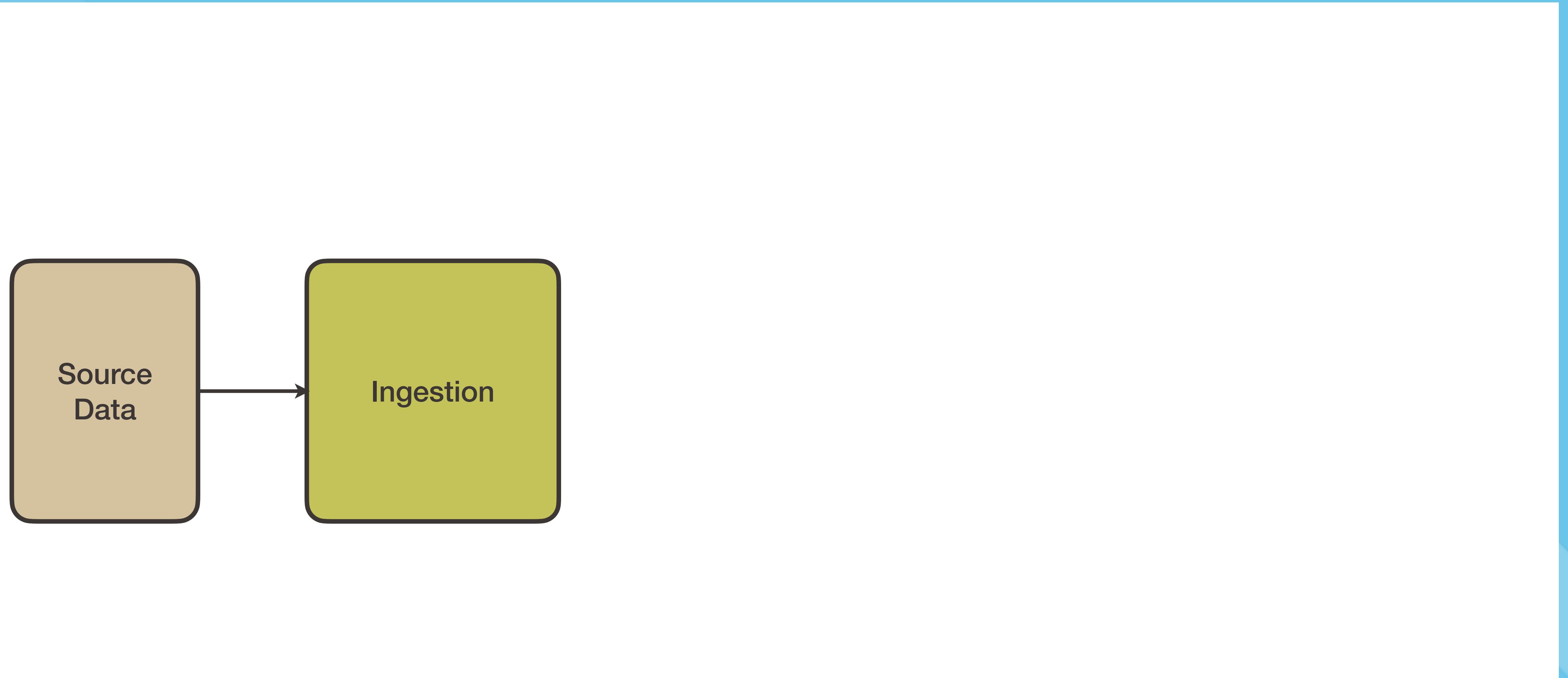
RELIABLE



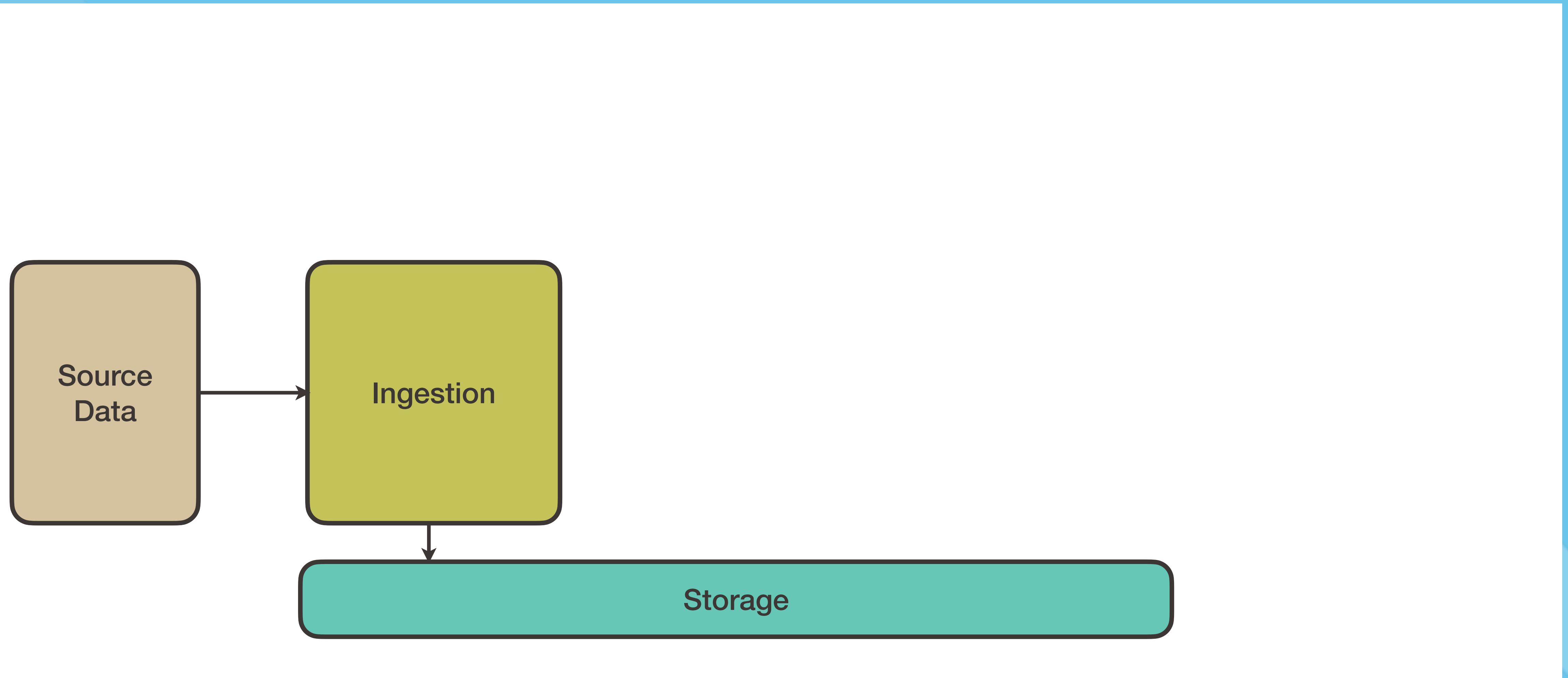
EVOLVABLE

- Composable data management strategy
- Grow with emerging technologies
- Support any new use cases our business needs

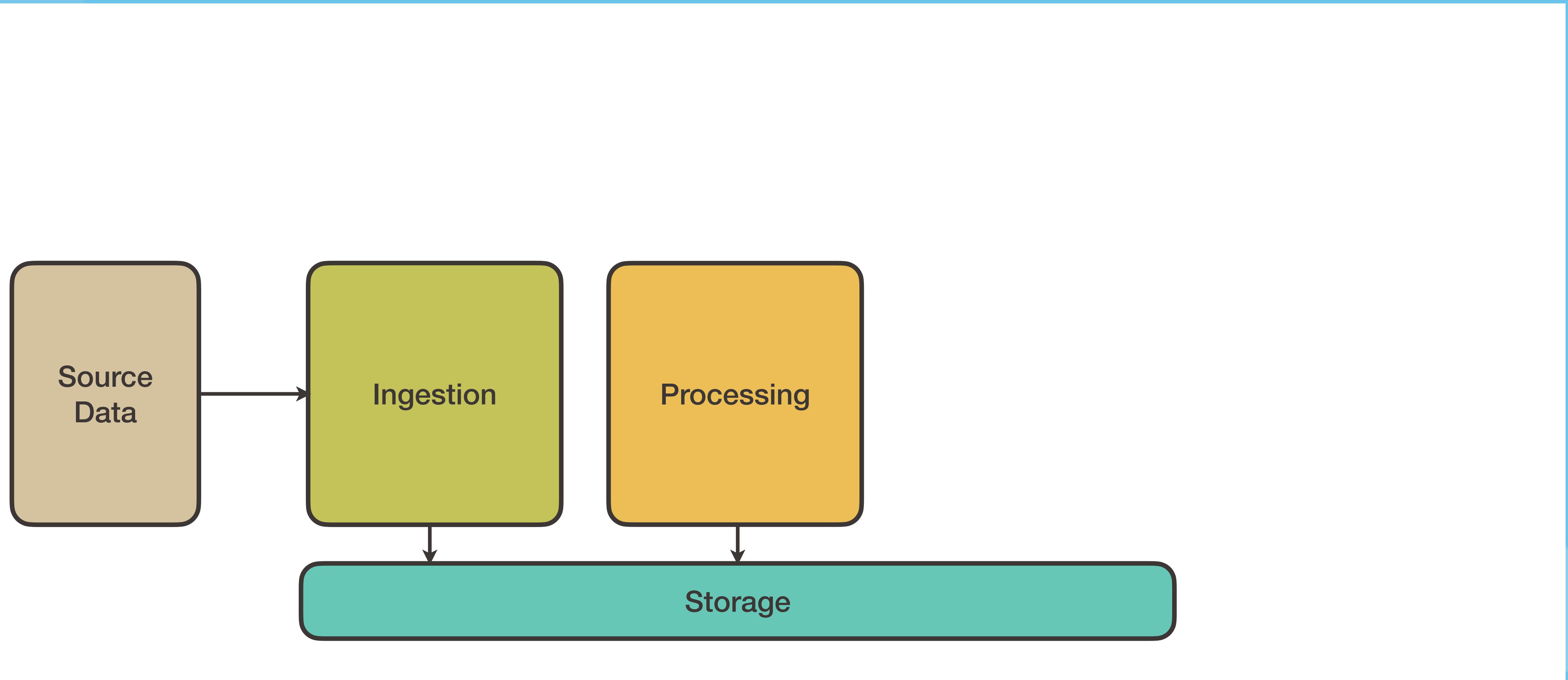
EVOLVABLE



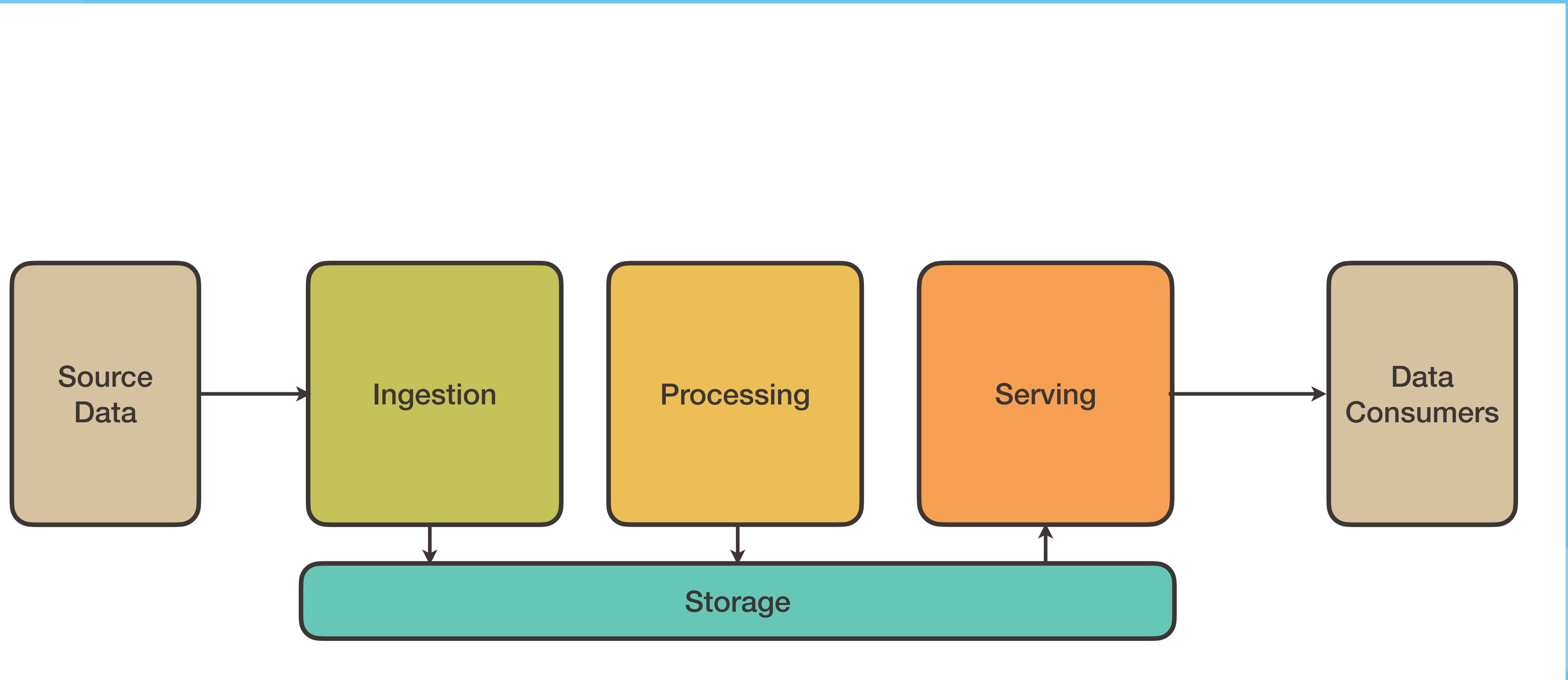
Adapted from “Designing Cloud Data Platforms” by
Daniel Zburivsky, Lynda Partner



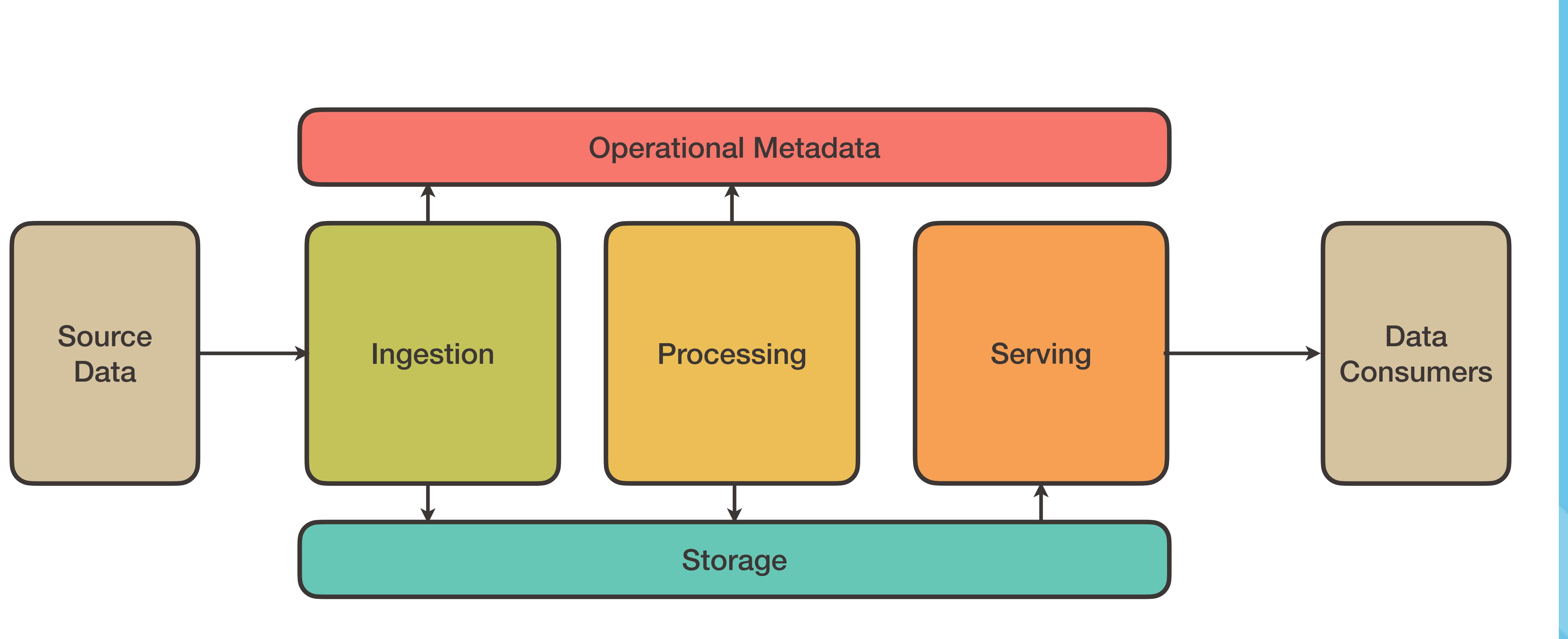
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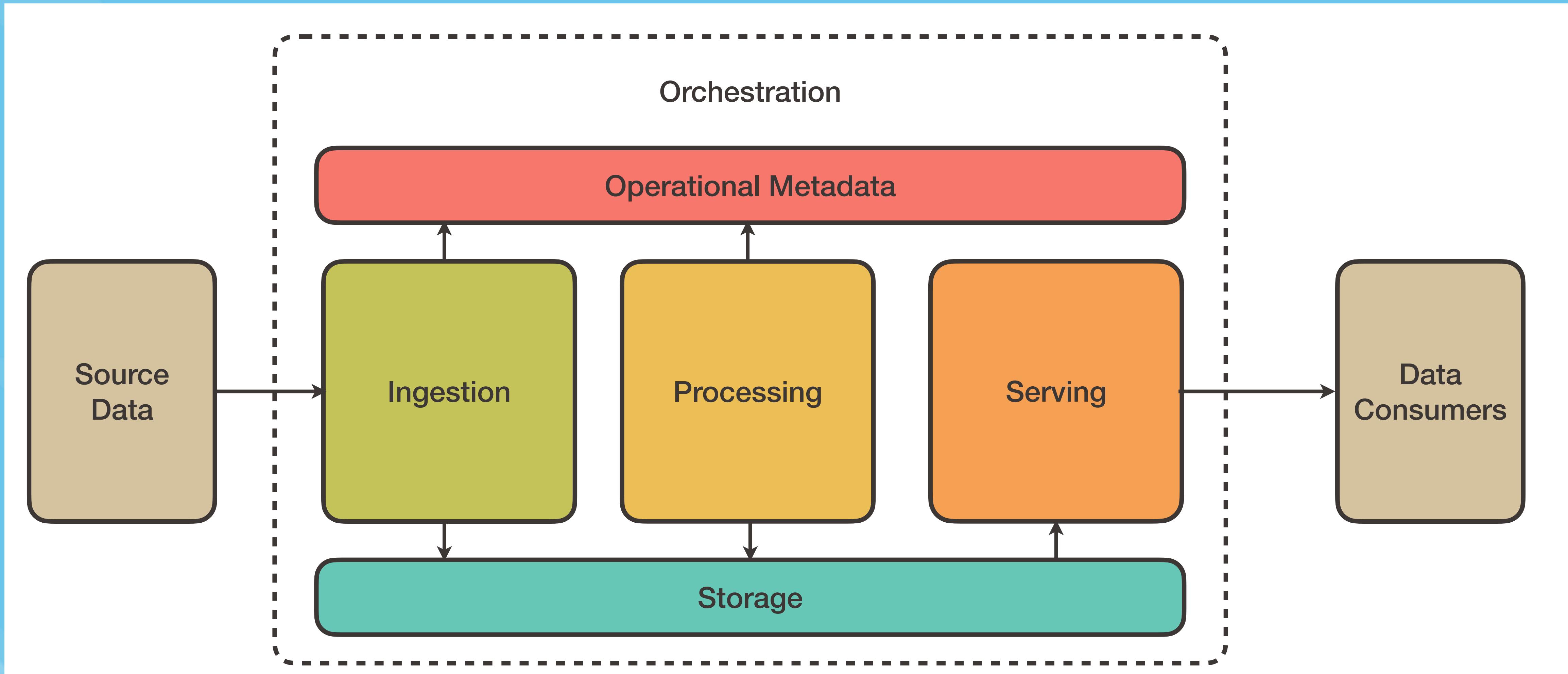
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ON YOUR MARK



You have one day.



STARTING AT ZERO

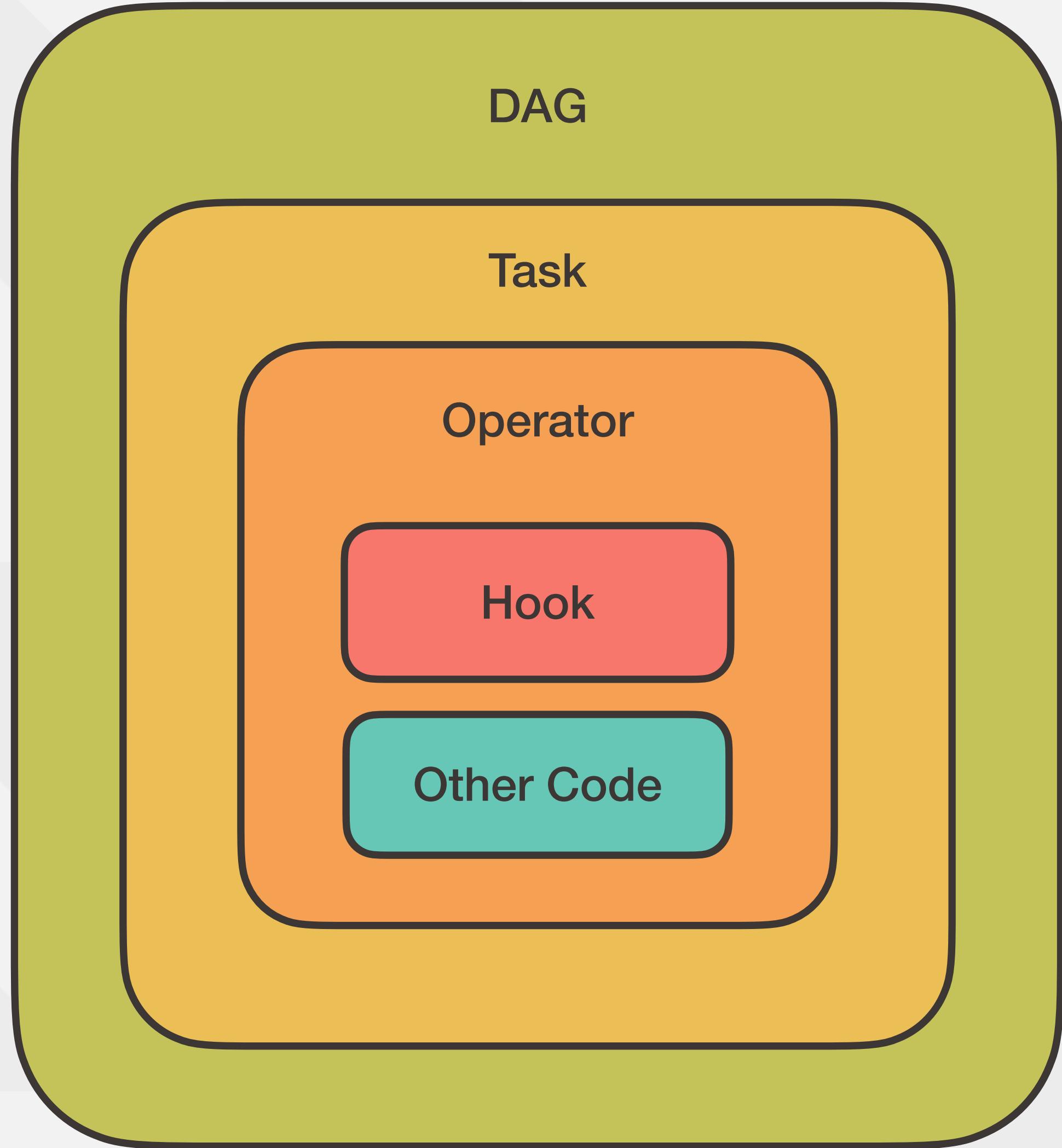
GETTING STARTED

```
7
8 def log_data_from_oracle():
9     oracle_hook = OracleHook(oracle_conn_id="oracle")
10    sql_query = "SELECT * from A_REDACTED_TABLE"
11    records = oracle_hook.get_records(sql=sql_query)
12    for record in records:
13        print(record)
14
15
16 with DAG(
17     "oracle_connector_test_dag",
18     description="DAG to read data from Oracle and log it",
19     schedule=timedelta(days=1),
20     start_date=datetime(2023, 8, 23),
21     catchup=False,
22 ) as dag:
23     read_from_oracle = PythonOperator(
24         task_id="read_from_oracle",
25         python_callable=log_data_from_oracle,
26     )
27
28     read_from_oracle
29
```

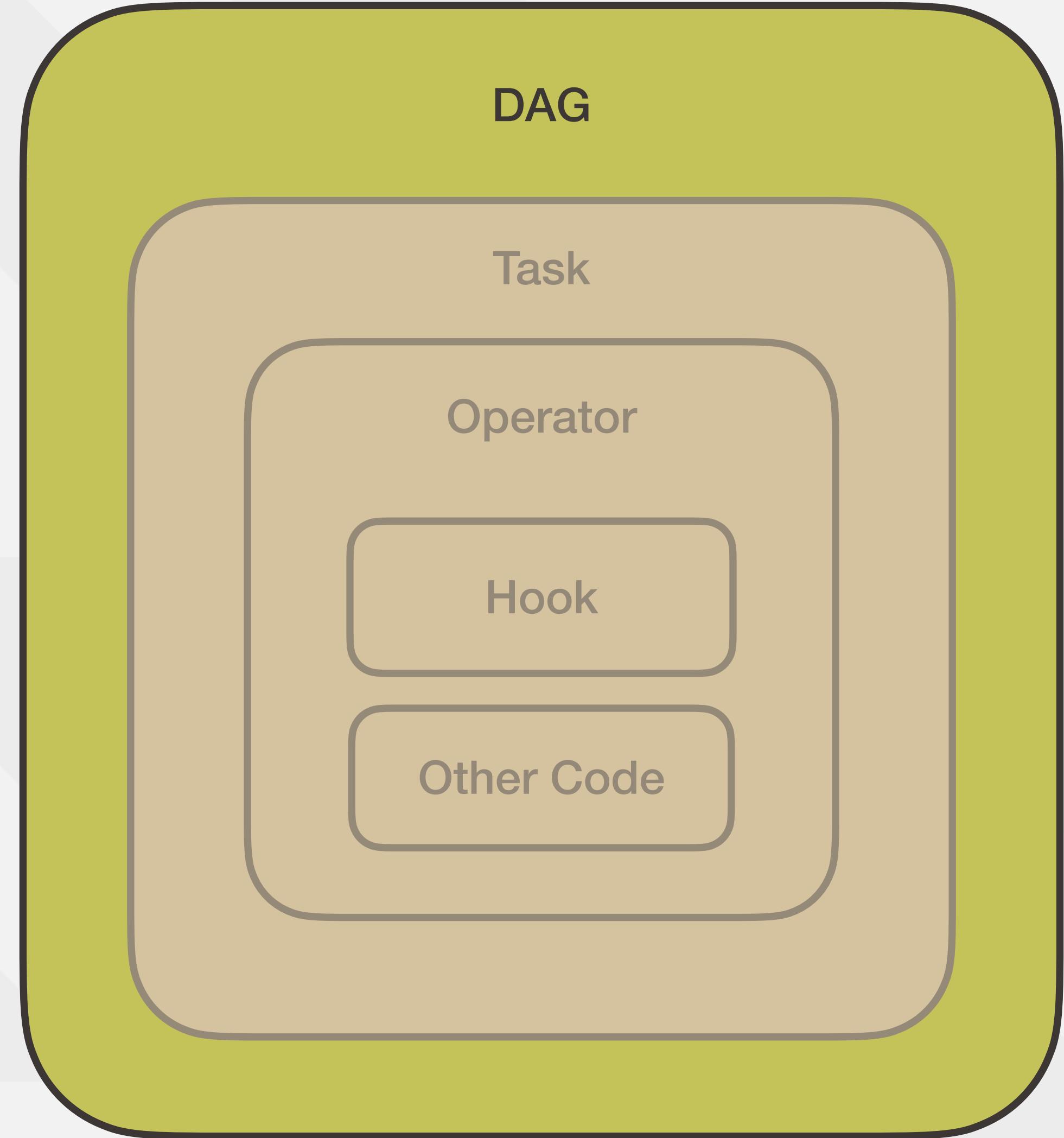


Wiggle your big toe.

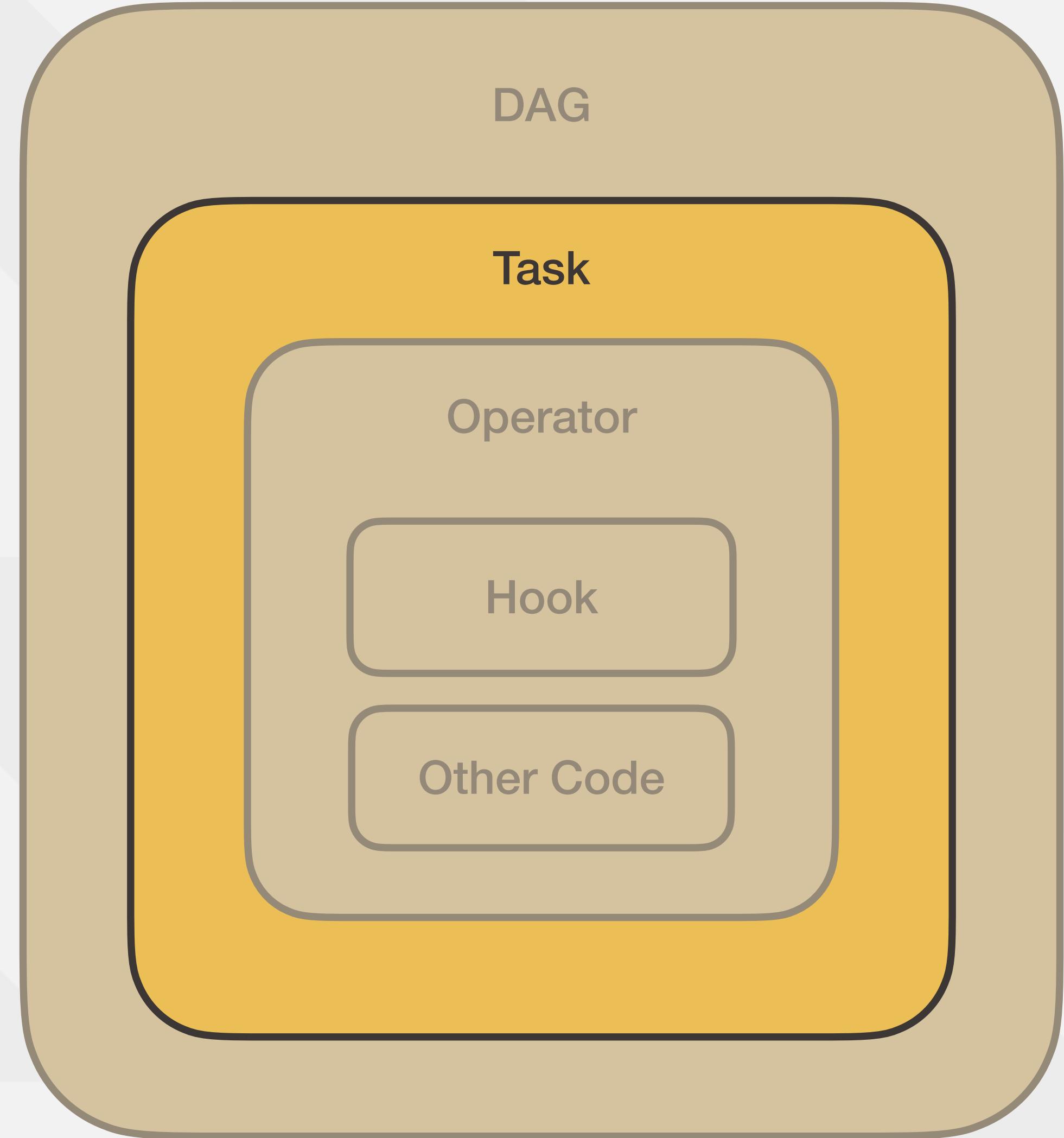
GETTING STARTED



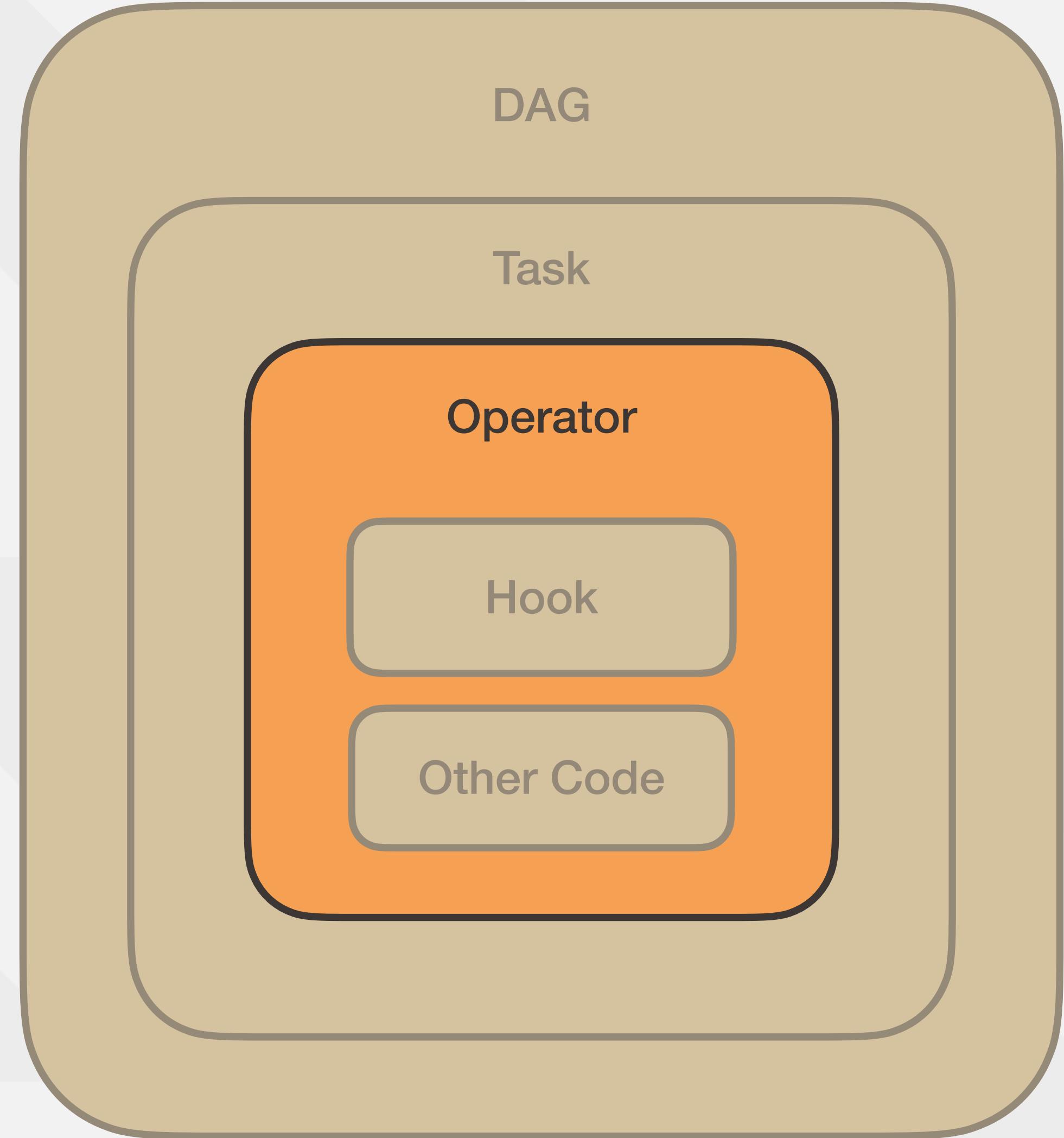
GETTING STARTED



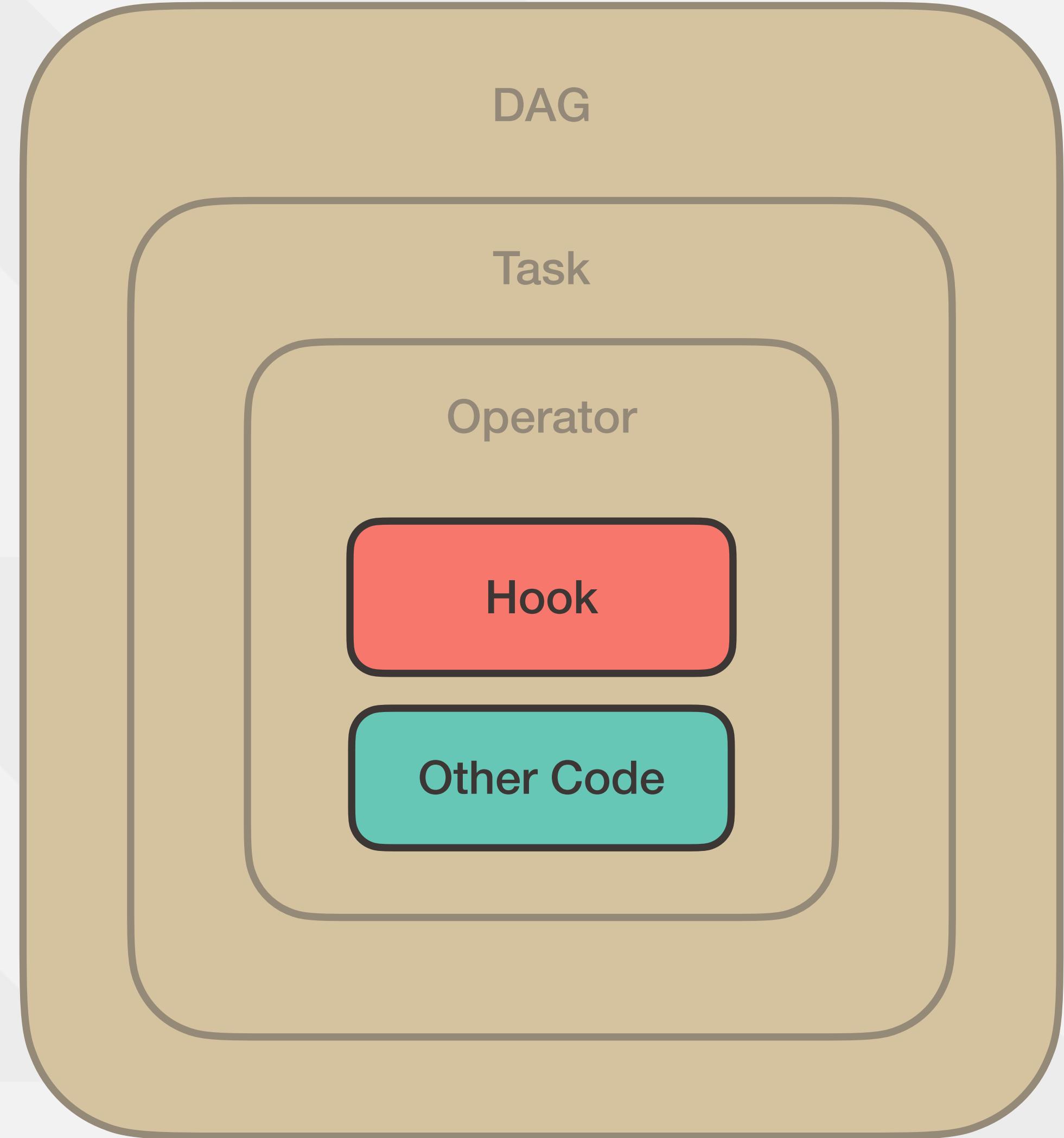
GETTING STARTED



GETTING STARTED



GETTING STARTED



GETTING STARTED

DAG

Task

Operator

Hook

Other
Code

GETTING STARTED

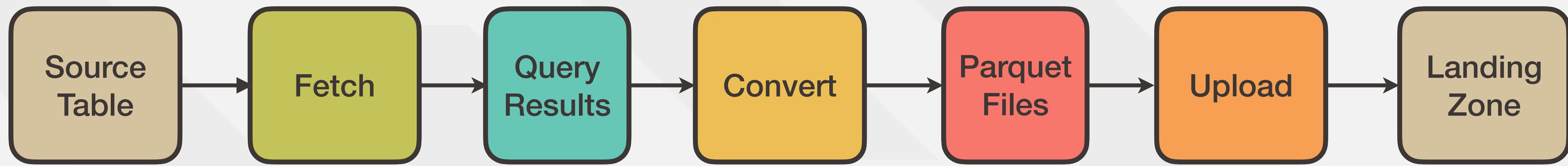


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27     read_from_oracle
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```

CUSTOM OPERATOR



CUSTOM OPERATOR

Fetch

Query
Results

Convert

Parquet
Files

Upload

CUSTOM OPERATOR



```
8 class CopyOperator(BaseOperator):
9     def __init__(
10         self,
11         query,
12         config_data,
13         **kwargs,
14     ):
15         super().__init__(**kwargs),
16         self._query = query
17         self._config_data = config_data
18         self._domain = config_data.get_batch_property("domain")
19         self._target_container = self.config_data.get_batch_property("target_container")
20         self._load_type = config_data.get_batch_property("load_type")
21
22     def execute(self, **context):
23         df = self.get_source_df()
24
25         parquet_file = df.to_parquet(path=None, engine="pyarrow")
26
27         self.upload_file(parquet_file)
28
29     def get_source_df(self):
30         hook = getattr(Hooks, self._config_data.get_batch_property("source"))
31         source_file_path = self.get_source_file_path()
32         sql_query = self.read_file(source_file_path)
33         df = hook.get_pandas_df(sql=sql_query)
```

CUSTOM OPERATOR

Fetch

Query
Results

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20         self._load_type = config_data.get_batch_property("load_type")
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CUSTOM OPERATOR



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31         source_file_path = self.get_source_file_path()  
32         sql_query = self.read_file(source_file_path)  
33         df = hook.get_pandas_df(sql=sql_query)  
34         return df  
35  
36     def upload_file(self, file):  
37         hook = getattr(Hooks, self._config_data.get_batch_property("target"))  
38         target_file_path = self.get_target_file_path()  
39         hook.upload(  
40             container_name=self._target_container,  
41             blob_name=target_file_path,  
42             data=file,  
43         )  
44  
45     def read_file(self, file_path):
```

CUSTOM OPERATOR

Fetch

Query
Results

Convert

Parquet
Files

Upload

```
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9     def __init__(
10         self,
11         query,
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18         self._domain = config_data.get_batch_property("domain")
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20         self._load_type = config_data.get_batch_property("load_type")
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22     def execute(self, **context):
23         df = self.get_source_df()
24
25         parquet_file = df.to_parquet(path=None, engine="pyarrow") parquet_file = df.to_parquet(path=None, engine="pyarrow")
26
27         self.upload_file(parquet_file) self.upload_file(parquet_file)
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31         source_file_path = self.get_source_file_path()
32         sql_query = self.read_file(source_file_path)
33         df = hook.get_pandas_df(sql=sql_query)
```

CUSTOM OPERATOR

```
37
38 @task
39 def fetch_the_things(hook, things, **context):
40
41     things_to_return = get_things(things)
42
43     for thing in things:
44         things_to_return.append(thing)
45
46     return things_to_return
47
48
```

CUSTOM OPERATOR

GENERATOR PATTERN

DAG

Task

Operator

Hook

Other
Code

GENERATOR PATTERN

DAG

Task

Operator

Hook

Other
Code

```
1 batch:
2   source_system: oracle
3   source_schema: make_believe
4   migration_system: sunset_bldv
5   migration_schema: california
6   load_type: incremental
7
8 connection:
9   source_conn_id: oracle
10  target_conn_id: azure
11
12 dag:
13   name: sql_source_dag
14   description: Ingests all data from sql source
15   schedule_interval: "0 11 * * *"
16   start_date: "2024-07-01"
17   owner: date_team
18   retries: 3
19   retry_delay: 3
20   pool: default_pool
21   catchup: true
22
23 tasks:
24   queries:
25     - name: REDACTED_TABLE_NAME
26
```

GENERATOR PATTERN



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GENERATOR PATTERN



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GENERATOR PATTERN

DAG

Task

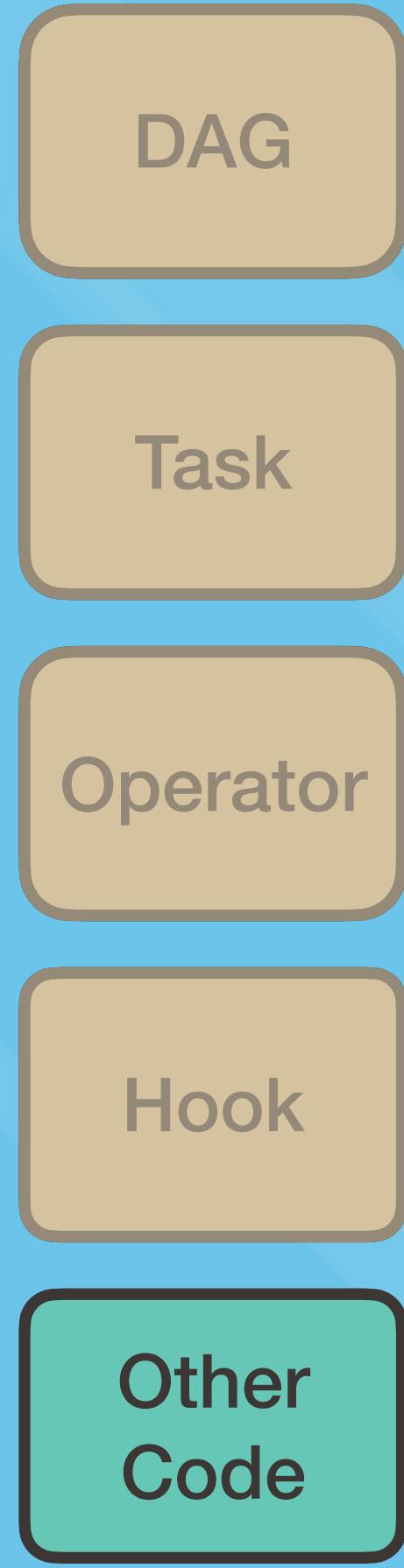
Operator

Hook

Other
Code

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23 tasks:
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26
```

GENERATOR PATTERN



```
10 class DAGConfig:  
11  
12     @property  
13     def connection_metadata(self) → dict:  
14         """  
15             Returns the metadata for the connection.  
16  
17             :return: Dictionary containing the connection metadata.  
18         """  
19         return self.config.get("connection", {})  
20  
21     @property  
22     def queries(self) → list:  
23         """  
24             Returns the list of SQL queries from the configuration.  
25  
26             :return: List of SQL query configurations.  
27         """  
28         return self.config.get("tasks", {}).get("queries", [])  
29  
30     def get_dag_property(self, prop_name: str, default=None) → any:  
31         """  
32             Retrieve a specific property from the DAG metadata.  
33  
34             :param prop_name: Name of the property to retrieve.  
35             :param default: Default value to return if property doesn't exist.  
36             :return: Value of the property or default value if not present
```

GENERATOR PATTERN



```
17 def create_dag_from_config(config_data):
18     default_args = {
19         "owner": config_data.get_dag_property("owner"),
20         "depends_on_past": config_data.get_dag_property("depends_on_past"),
21         "email_on_failure": config_data.get_dag_property("email_on_failure"),
22         "email_on_retry": config_data.get_dag_property("email_on_retry"),
23         "retries": config_data.get_dag_property("retries"),
24         "retry_delay": timedelta(minutes=config_data.get_dag_property("retry_delay")),
25         "pool": "mis_pool",
26         "on_failure_callback": [task_failure_log_callback],
27     }
28
29 @dag(
30     dag_id=config_data.get_dag_property("name"),
31     schedule=config_data.get_dag_property("schedule_interval"),
32     default_args=default_args,
33     start_date=datetime.strptime(
34         config_data.get_dag_property("start_date"), "%Y-%m-%d"
35     ),
36     catchup=config_data.get_dag_property("catchup", default=False),
37     tags=config_data.get_tags(),
38     render_template_as_native_obj=True,
39 )
40 def generated_dag():
41     for query_info in config_data.queries:
42         mapped_tasks = config_data.get_mapped_task_intervals(query_info)
```

GENERATOR PATTERN

DAG

Task

Operator

Hook

Other
Code

```
60
61 CONFIG_DIR = Path(__file__).parent / "config"
62 dag_configs = DAGConfig.from_directory(Path(CONFIG_DIR))
63
64 for config_data in dag_configs:
65     dag_id = config_data.get_dag_property("name")
66     globals()[dag_id] = create_dag_from_config(config_data)
67
```

GENERATOR PATTERN



```
18 def create_dag_from_config(config_data):
33     catchup=False,
34 )
35 def generated_dag():
36     sql_dir = str(Path(__file__).parent / "config" / "sql")
37     oracle_hook = OracleHook(oracle_conn_id="oracle")
38     wasb_hook = WasbHook(wasb_conn_id="azure")
39
40     for query_info in config_data.queries:
41         file_name = query_info["name"] + ".parquet"
42         target = config_data.get_landing_zone_target(
43             generate_base_path(config_data),
44             file_name
45         )
46
47         execute_sql_task = CopyOperator(
48             task_id=f"execute_{query_info['name']}_sql",
49             query=query_info["sql"],
50             oracle_hook=oracle_hook,
51             wasb_hook=wasb_hook,
52             sql_path=sql_dir,
53             azure_container_name=AZURE_CONTAINER_NAME,
54             target=target,
55         )
56
57         execute_sql_task
```

GENERATOR PATTERN



30 MPH

“LOCAL” DEVELOPMENT

deployToSandbox

“LOCAL” DEVELOPMENT

```
git commit -m "I hope this works"
```

```
git tag -f deployToSandbox
```

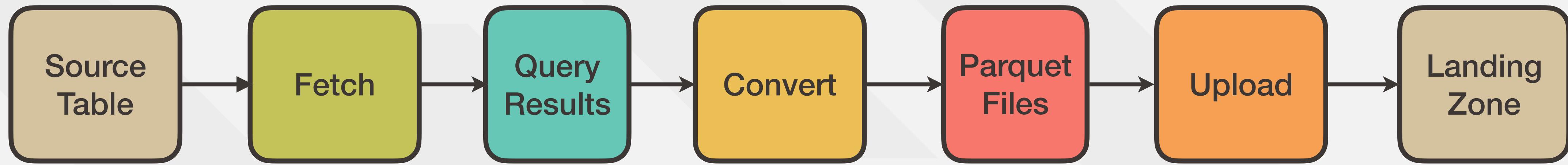
```
git push -f deployToSandbox
```

“LOCAL” DEVELOPMENT

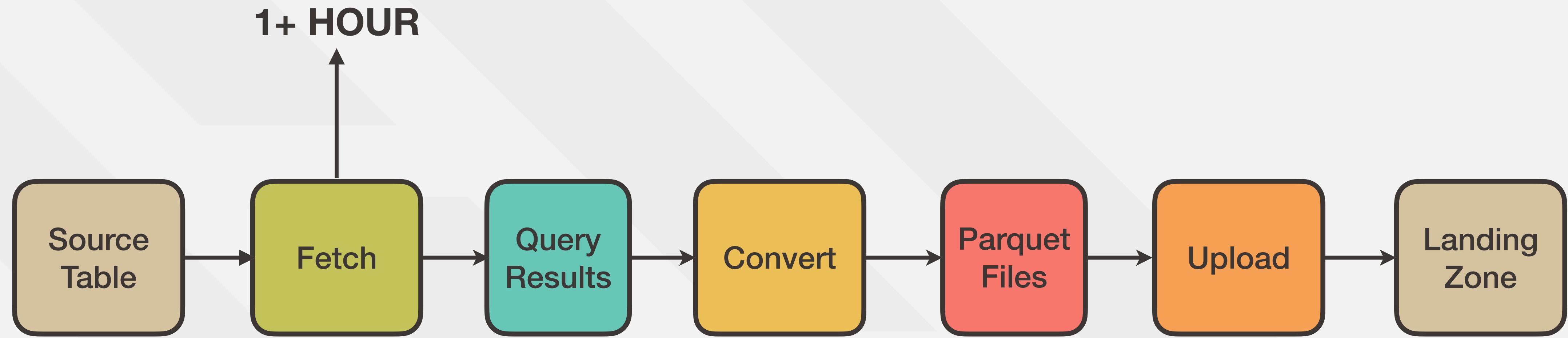


50 MPH

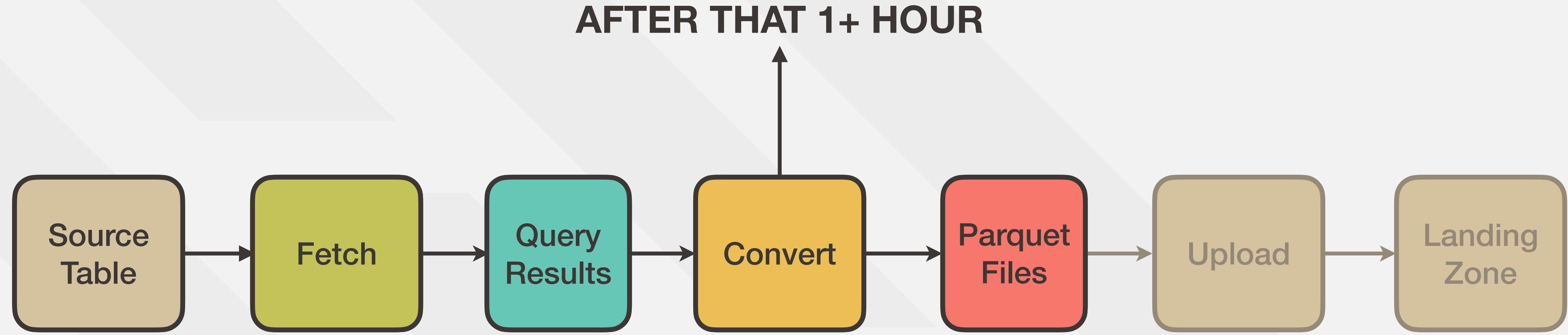
CHUNKING AND PARALLELIZATION



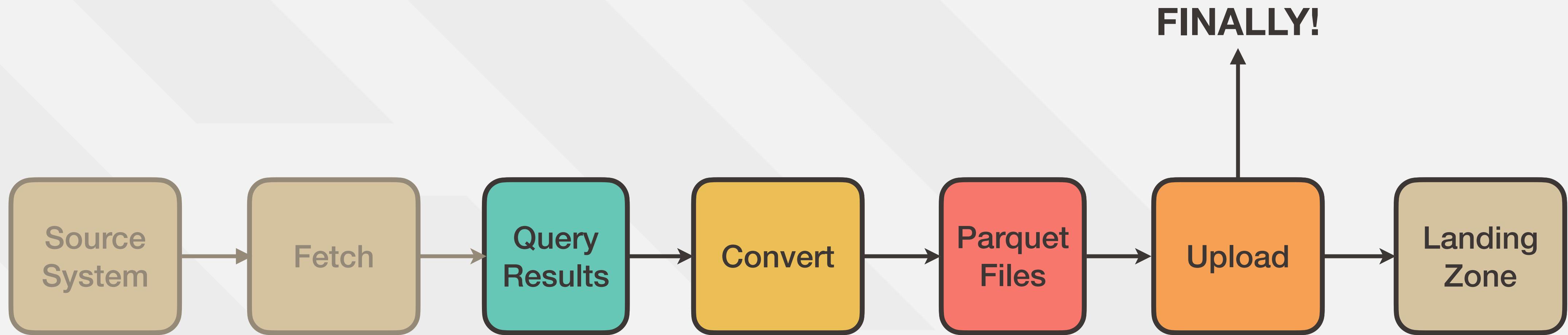
CHUNKING AND PARALLELIZATION



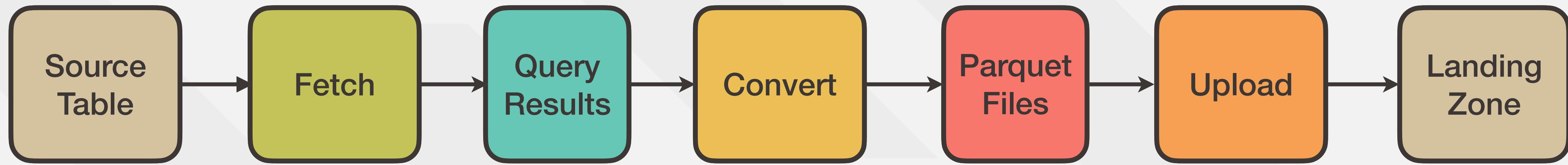
CHUNKING AND PARALLELIZATION



CHUNKING AND PARALLELIZATION



CHUNKING AND PARALLELIZATION



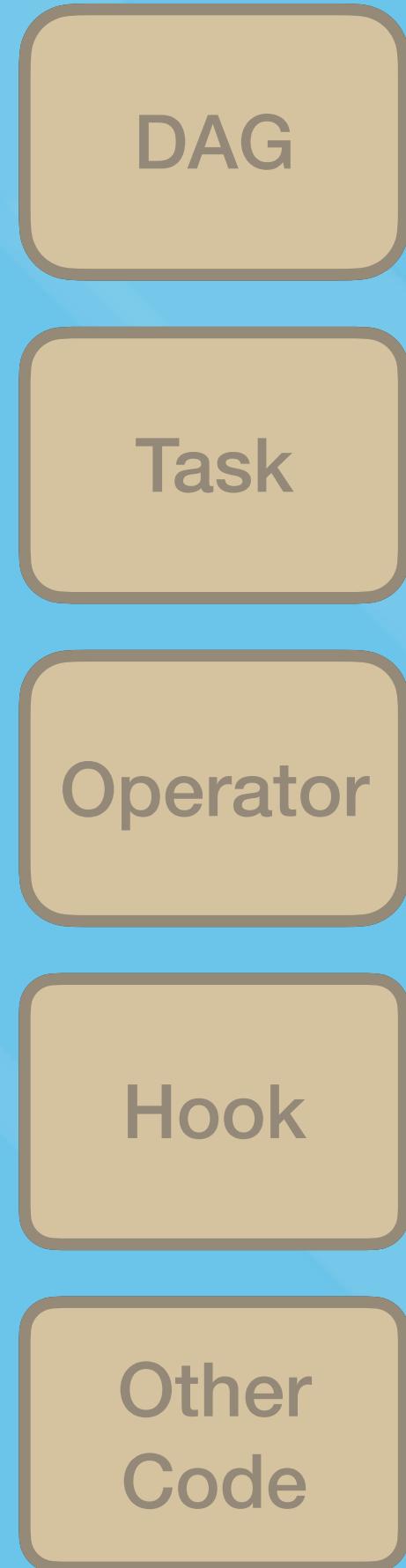
CHUNKING AND PARALLELIZATION



```
57     return generated_dag()
34     |     config_data.get_dag_property("start_date"), "%Y-%m-%d"
35     |),
36     | catchup=config_data.get_dag_property("catchup", default=False),
37     | tags=config_data.get_tags(),
38     | render_template_as_native_obj=True,
39   )
40 def generated_dag():
41   for query_info in config_data.queries:
42     mapped_tasks = config_data.get_mapped_task_intervals(query_info)

44     execute_sql_task = CopyOperator.partial(
45       task_id=f"execute_{query_info['name']}_sql",
46       query_info=query_info,
47       config_data=config_data,
48       source_hook=config_data.get_batch_property("source"),
49       target_hook=config_data.get_batch_property("target"),
50       current_run_scheduled_date="{{ data_interval_end.to_date_string() }}"
51       previous_run_scheduled_date="{{ data_interval_start.to_date_string(
52         on_success_callback=[task_success_log_callback],
53       ).expand(query_clip_range=mapped_tasks)
54
55       execute_sql_task
56
57     return generated_dag()
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CHUNKING AND PARALLELIZATION



```
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```

CHUNKING AND PARALLELIZATION

The screenshot shows a user interface for managing a Data Access Gateway (DAG). At the top, there is a color-coded legend for task states: deferred (purple), failed (red), queued (light gray), removed (gray), restarting (pink), running (green), scheduled (orange), skipped (magenta), success (dark green), up_for_reschedule (teal), up_for_retry (yellow), upstream_failed (orange), and no_status (light gray). Below the legend, the interface displays a DAG structure with a run identifier: Run 2024-08-19, 14:24:30 CDT. The main area contains four tabs: Details, Graph, Gantt, and Code. The 'Mapped Tasks' tab is currently selected and highlighted with a red box. The table below lists 13 mapped tasks, each with a map index, state, duration, start date, and end date.

MAP INDEX	STATE	DURATION	START DATE	END DATE
0	success	00:02:22	2024-08-19, 14:25:31 CDT	2024-08-19, 14:27:54 CDT
1	success	00:00:07	2024-08-19, 14:26:29 CDT	2024-08-19, 14:26:37 CDT
2	success	00:00:07	2024-08-19, 14:28:12 CDT	2024-08-19, 14:28:19 CDT
3	success	00:00:07	2024-08-19, 14:28:15 CDT	2024-08-19, 14:28:22 CDT
4	success	00:00:08	2024-08-19, 14:28:59 CDT	2024-08-19, 14:29:07 CDT
5	success	00:00:06	2024-08-19, 14:28:48 CDT	2024-08-19, 14:28:55 CDT
6	success	00:00:07	2024-08-19, 14:29:31 CDT	2024-08-19, 14:29:39 CDT
7	success	00:00:06	2024-08-19, 14:29:50 CDT	2024-08-19, 14:29:57 CDT
8	success	00:00:07	2024-08-19, 14:29:56 CDT	2024-08-19, 14:30:03 CDT
9	success	00:00:14	2024-08-19, 14:30:57 CDT	2024-08-19, 14:31:12 CDT
10	success	00:00:11	2024-08-19, 14:30:51 CDT	2024-08-19, 14:31:03 CDT
11	success	00:00:07	2024-08-19, 14:31:30 CDT	2024-08-19, 14:31:38 CDT
12	success	00:00:07	2024-08-19, 14:31:33 CDT	2024-08-19, 14:31:41 CDT

CHUNKING AND PARALLELIZATION

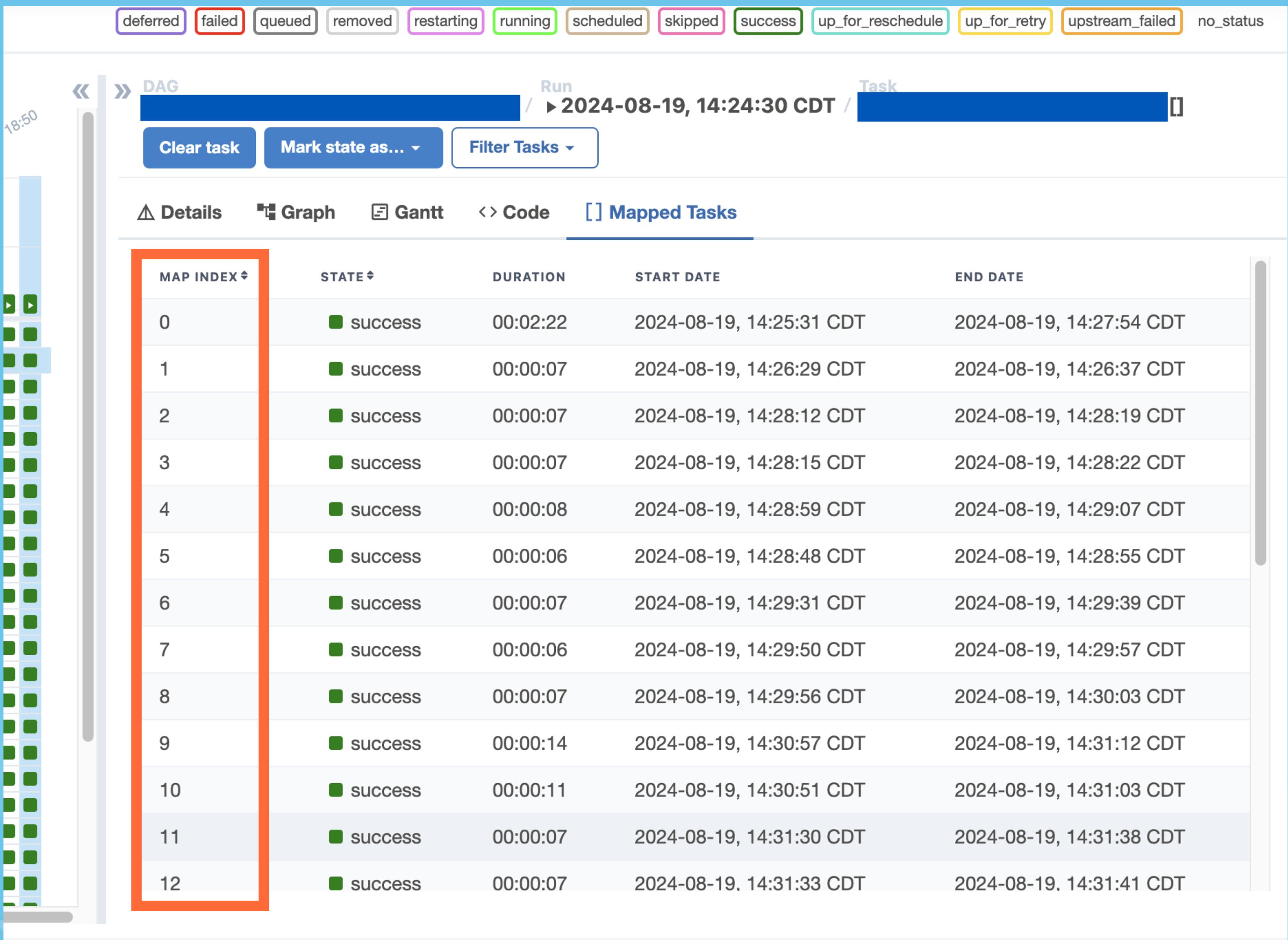
The screenshot shows a DAG run details page. At the top, it displays the DAG name, run date (2024-08-19, 14:24:30 CDT), and task count (0). Below the header, there are several tabs: Details (highlighted with a red box), Graph, Gantt, Code, Logs, and XCom. Under the Details tab, there are links for More Details, Rendered Template, K8s Pod Spec, and List Instances, all runs. A section titled "Task Instance Notes:" is present. Below this, a table titled "Task Instance Details" lists various parameters:

Parameter	Value
Overall Status	success
Task ID	[REDACTED]
Run ID	manual_2024-08-19T19:24:30.741139+00:00
Map Index	0
Operator	CopyOperator
Trigger Rule	all_success
Overall Duration	00:02:22
Started	2024-08-19, 14:25:31 CDT
Ended	2024-08-19, 14:27:54 CDT

CHUNKING AND PARALLELIZATION

depends_on_past	False
deps	frozenset({<TIDep(Trigger Rule)>, <TIDep(Task has been mapped)>, <TIDep(Previous Dagrun State)>, <TIDep(Not Previously Skipped)>, <TIDep(Not In Retry Period)>})
downstream_task_ids	()
email	None
end_date	None
execution_timeout	None
executor_config	{}
	<pre>({'query_clip_range': [('2001-01-01', '2005-01-01'), ('2005-01-01', '2005-01-06'), ('2005-01-06', '2005-01-11'), ('2005-01-11', '2005-01-16'), ('2005-01-16', '2005-01-21'), ('2005-01-21', '2005-01-26'), ('2005-01-26', '2005-01-31'), ('2005-01-31', '2005-02-05'), ('2005-02-05', '2005-02-10'), ('2005-02-10', '2005-02-15'), ('2005-02-15', '2005-02-20'), ('2005-02-20', '2005-02-25'), ('2005-02-25', '2005-03-02'), ('2005-03-02', '2005-03-07'), ('2005-03-07', '2005-03-12'), ('2005-03-12', '2005-03-17'), ('2005-03-17', '2005-03-22'), ('2005-03-22', '2005-03-27'), ('2005-03-27', '2005-04-01'), ('2005-04-01', '2005-04-06'), ('2005-04-06', '2005-04-11'), ('2005-04-11', '2005-04-16'), ('2005-04-16', '2005-04-21'), ('2005-04-21', '2005-04-26'), ('2005-04-26', '2005-05-01'), ('2005-05-01', '2005-05-06'), ('2005-05-06', '2005-05-11'), ('2005-05-11', '2005-05-16'), ('2005-05-16', '2005-05-21'), ('2005-05-21', '2005-05-26'), ('2005-05-26', '2005-05-31'), ('2005-05-31', '2005-06-05'), ('2005-06-05', '2005-06-10'), ('2005-06-10', '2005-06-15'), ('2005-06-15', '2005-06-20'), ('2005-06-20', '2005-06-25'), ('2005-06-25', '2005-06-30'), ('2005-06-30', '2005-07-05'), ('2005-07-05', '2005-07-10'), ('2005-07-10', '2005-07-15'), ('2005-07-15', '2005-07-20'), ('2005-07-20', '2005-07-25'), ('2005-07-25', '2005-07-30'), ('2005-07-30', '2005-08-04'), ('2005-08-04', '2005-08-09'), ('2005-08-09', '2005-08-14'), ('2005-08-14', '2005-08-19'), ('2005-08-19', '2005-08-24'), ('2005-08-24', '2005-08-29'), ('2005-08-29', '2005-08-29'), ('2005-08-29', '2005-09-03'), ('2005-09-03', '2005-09-08'), ('2005-09-08', '2005-09-13'), ('2005-09-13', '2005-09-18'), ('2005-09-18', '2005-09-23'), ('2005-09-23', '2005-09-28'), ('2005-09-28', '2005-10-03'), ('2005-10-03', '2005-10-08'), ('2005-10-08', '2005-10-13'), ('2005-10-13', '2005-10-18'), ('2005-10-18', '2005-10-23'), ('2005-10-23', '2005-10-28'), ('2005-10-28', '2005-11-02'), ('2005-11-02', '2005-11-07'), ('2005-11-07', '2005-11-12'), ('2005-11-12', '2005-11-17'), ('2005-11-17', '2005-11-22'), ('2005-11-22', '2005-11-27'), ('2005-11-27', '2005-12-02'), ('2005-12-02', '2005-12-07'), ('2005-12-07', '2005-12-12'), ('2005-12-12', '2005-12-17'), ('2005-12-17', '2005-12-22'), ('2005-12-22', '2005-12-27'), ('2005-12-27', '2006-01-01'), ('2006-01-01', '2006-01-06'), ('2006-01-06', '2006-01-11'), ('2006-01-11', '2006-01-16'), ('2006-01-16', '2006-01-21'), ('2006-01-21', '2006-01-26'), ('2006-01-26', '2006-01-31'), ('2006-01-31', '2006-02-05'), ('2006-02-05', '2006-02-10'), ('2006-02-10', '2006-02-15'), ('2006-02-15', '2006-02-20'), ('2006-02-20', '2006-02-25'), ('2006-02-25', '2006-03-02'), ('2006-03-02', '2006-03-07'), ('2006-03-07', '2006-03-12'), ('2006-03-12', '2006-03-17'), ('2006-03-17', '2006-03-22'), ('2006-03-22', '2006-03-27'), ('2006-03-27', '2006-04-01'), ('2006-04-01', '2006-04-06'), ('2006-04-06', '2006-04-11'), ('2006-04-11', '2006-04-16'), ('2006-04-16', '2006-04-21'), ('2006-04-21', '2006-04-26'), ('2006-04-26', '2006-05-01'), ('2006-05-01', '2006-05-06'), ('2006-05-06', '2006-05-11'), ('2006-05-11', '2006-05-16'), ('2006-05-16', '2006-05-21'), ('2006-05-21', '2006-05-26'), ('2006-05-26', '2006-05-31'), ('2006-06-05', '2006-06-05'), ('2006-06-05', '2006-06-10'), ('2006-06-10', '2006-06-15'), ('2006-06-15', '2006-06-20'), ('2006-06-20', '2006-06-25'), ('2006-06-25', '2006-06-30'), ('2006-06-30', '2006-07-05'), ('2006-07-05', '2006-07-10'), ('2006-07-10', '2006-07-15'), ('2006-07-15', '2006-07-20'), ('2006-07-20', '2006-07-25'), ('2006-07-25', '2006-07-30'), ('2006-07-30', '2006-08-04'), ('2006-08-04', '2006-08-09'), ('2006-08-09', '2006-08-14'), ('2006-08-14', '2006-08-19'), ('2006-08-19', '2006-08-24'), ('2006-08-24', '2006-08-29'), ('2006-08-29', '2006-09-03'), ('2006-09-03', '2006-09-08'), ('2006-09-08', '2006-09-13'), ('2006-09-13', '2006-09-18'), ('2006-09-18', '2006-09-23'), ('2006-09-23', '2006-09-28'), ('2006-09-28', '2006-10-03'), ('2006-10-03', '2006-10-08'), ('2006-10-08', '2006-10-13'), ('2006-10-13', '2006-10-18'), ('2006-10-18', '2006-10-23'), ('2006-10-23', '2006-10-28'), ('2006-10-28', '2006-11-02'), ('2006-11-02', '2006-11-07'), ('2006-11-07', '2006-11-12'), ('2006-11-12', '2006-11-17'), ('2006-11-17', '2006-11-22'), ('2006-11-22', '2006-11-27'), ('2006-11-27', '2006-12-02'), ('2006-12-02', '2006-12-07'), ('2006-12-07', '2006-12-12'), ('2006-12-12', '2006-12-17'), ('2006-12-17', '2006-12-22'), ('2006-12-22', '2006-12-27'), ('2006-12-27', '2007-01-01'), ('2007-01-01', '2007-01-06'), ('2007-01-06', '2007-01-11'), ('2007-01-11', '2007-01-16'), ('2007-01-16', '2007-01-21'), ('2007-01-21', '2007-01-26'), ('2007-01-26', '2007-01-31'), ('2007-01-31', '2007-02-05'), ('2007-02-05', '2007-02-10'), ('2007-02-10', '2007-02-15'), ('2007-02-15', '2007-02-20'), ('2007-02-20', '2007-02-25'), ('2007-02-25', '2007-03-02'), ('2007-03-02', '2007-03-02')])</pre>

CHUNKING AND PARALLELIZATION



(deferred) (failed) (queued) (removed) (restarting) (running) (scheduled) (skipped) (success) (up_for_reschedule) (up_for_retry) (upstream_failed) (no_status)

» DAG / Run ▶ 2024-08-19, 14:24:30 CDT / Task []

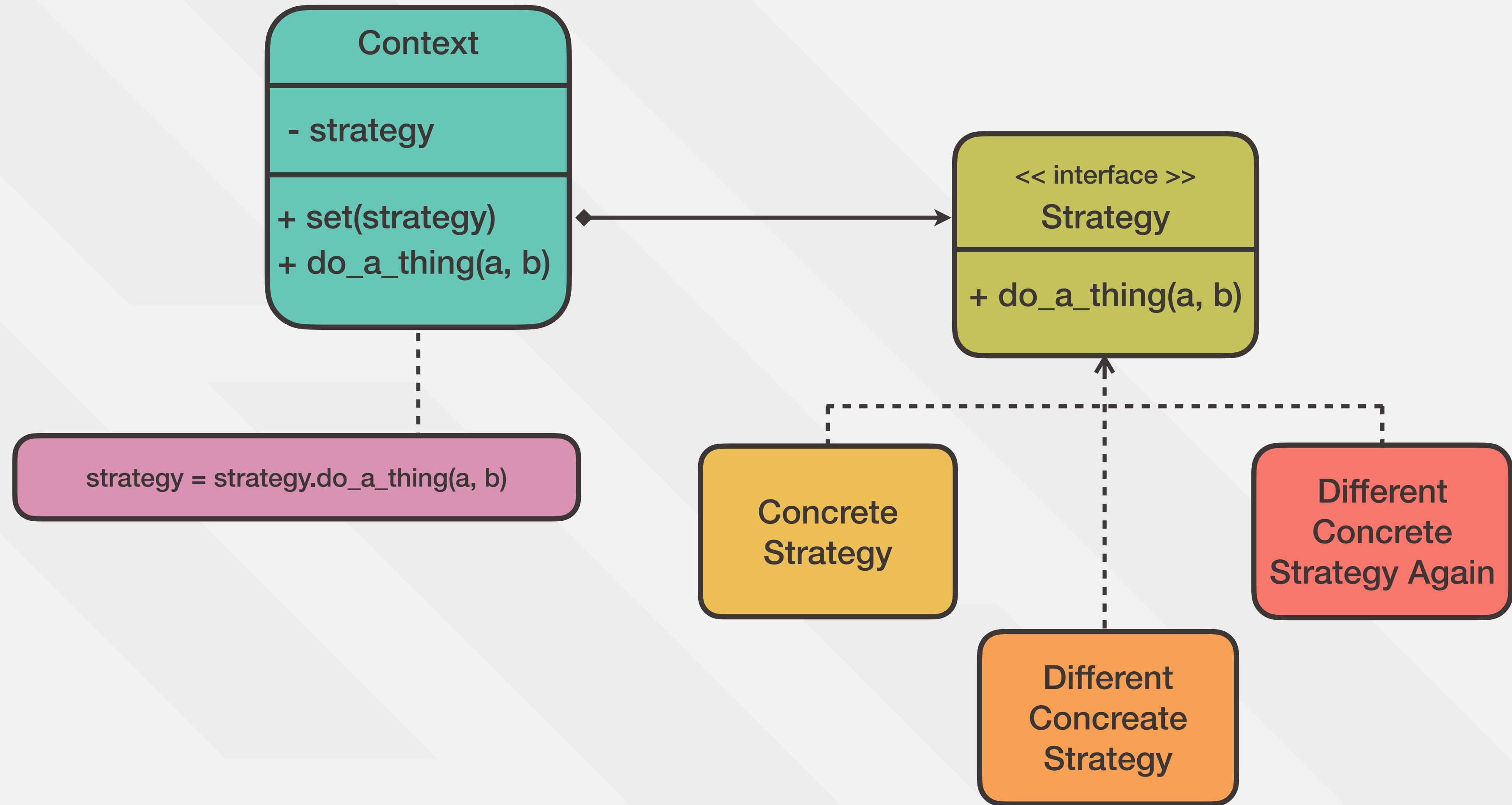
Clear task **Mark state as...** **Filter Tasks**

Details **Graph** **Gantt** **Code** **Mapped Tasks**

MAP INDEX	STATE	DURATION	START DATE	END DATE
0	■ success	00:02:22	2024-08-19, 14:25:31 CDT	2024-08-19, 14:27:54 CDT
1	■ success	00:00:07	2024-08-19, 14:26:29 CDT	2024-08-19, 14:26:37 CDT
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3	■ success	00:00:07	2024-08-19, 14:28:15 CDT	2024-08-19, 14:28:22 CDT
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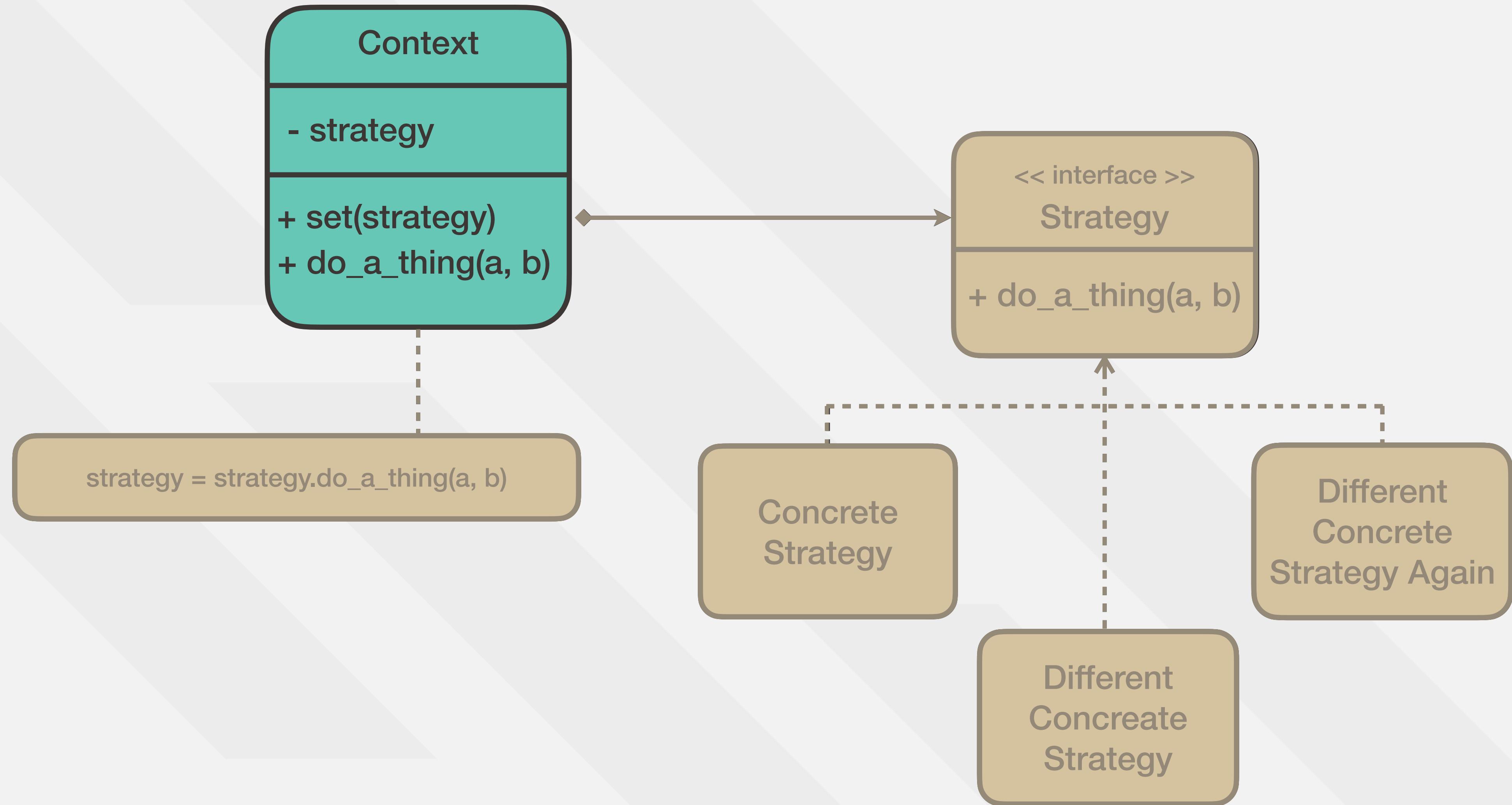
CHUNKING AND PARALLELIZATION

STRATEGY PATTERN



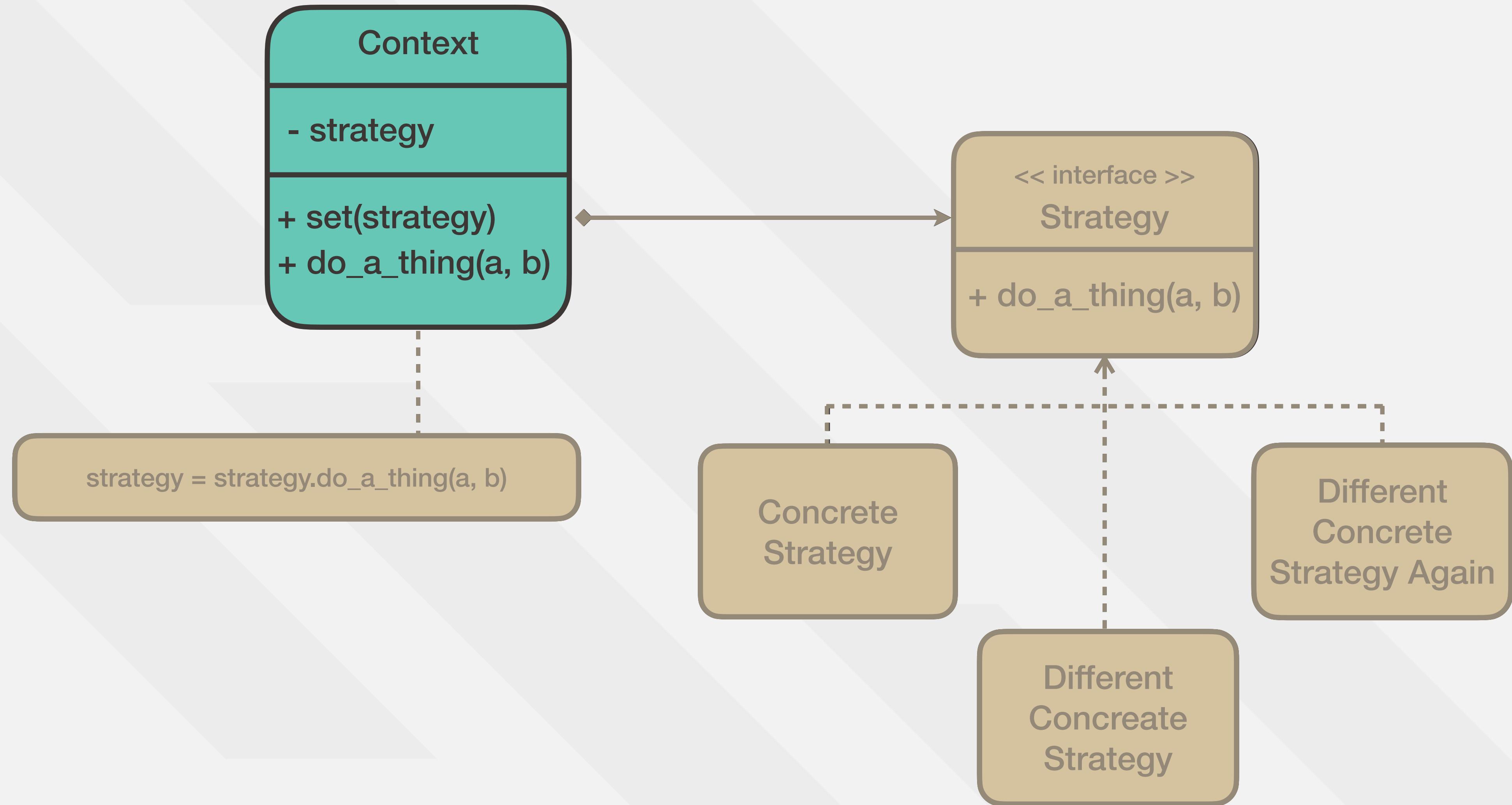
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<https://refactoring.guru/design-patterns/strategy>

STRATEGY PATTERN



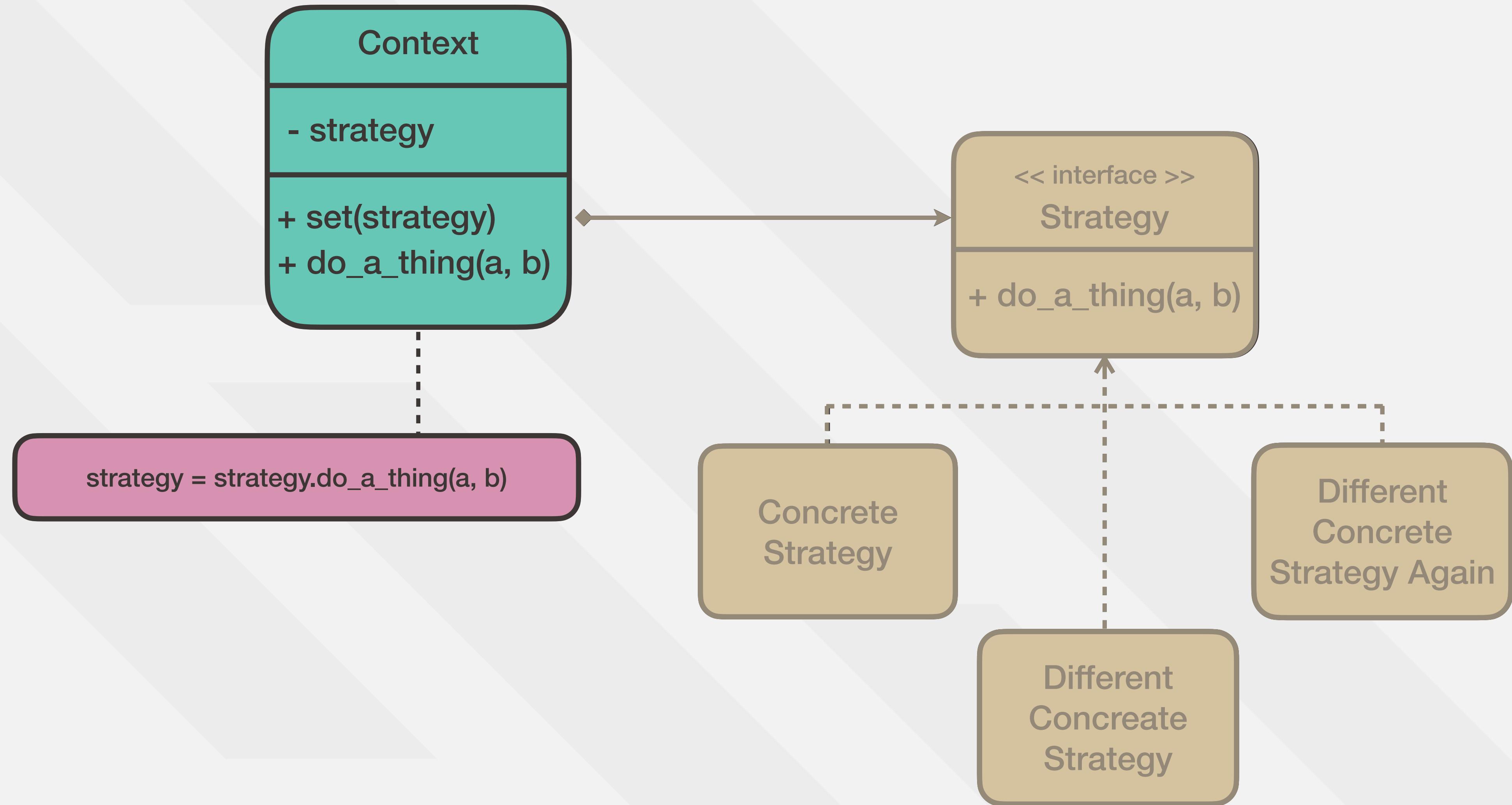
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STRATEGY PATTERN



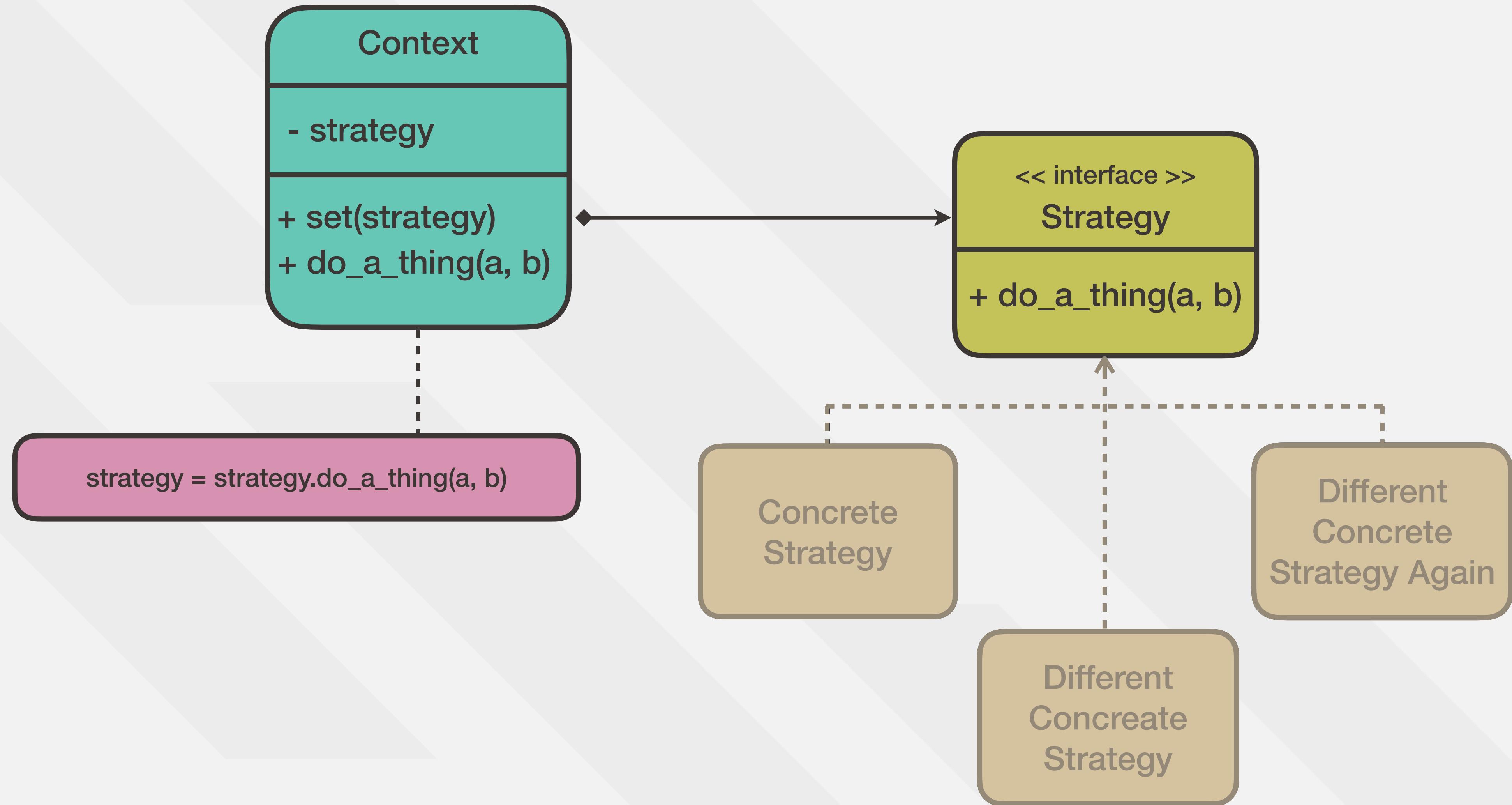
Adapted from
<https://refactoring.guru/design-patterns/strategy>

STRATEGY PATTERN



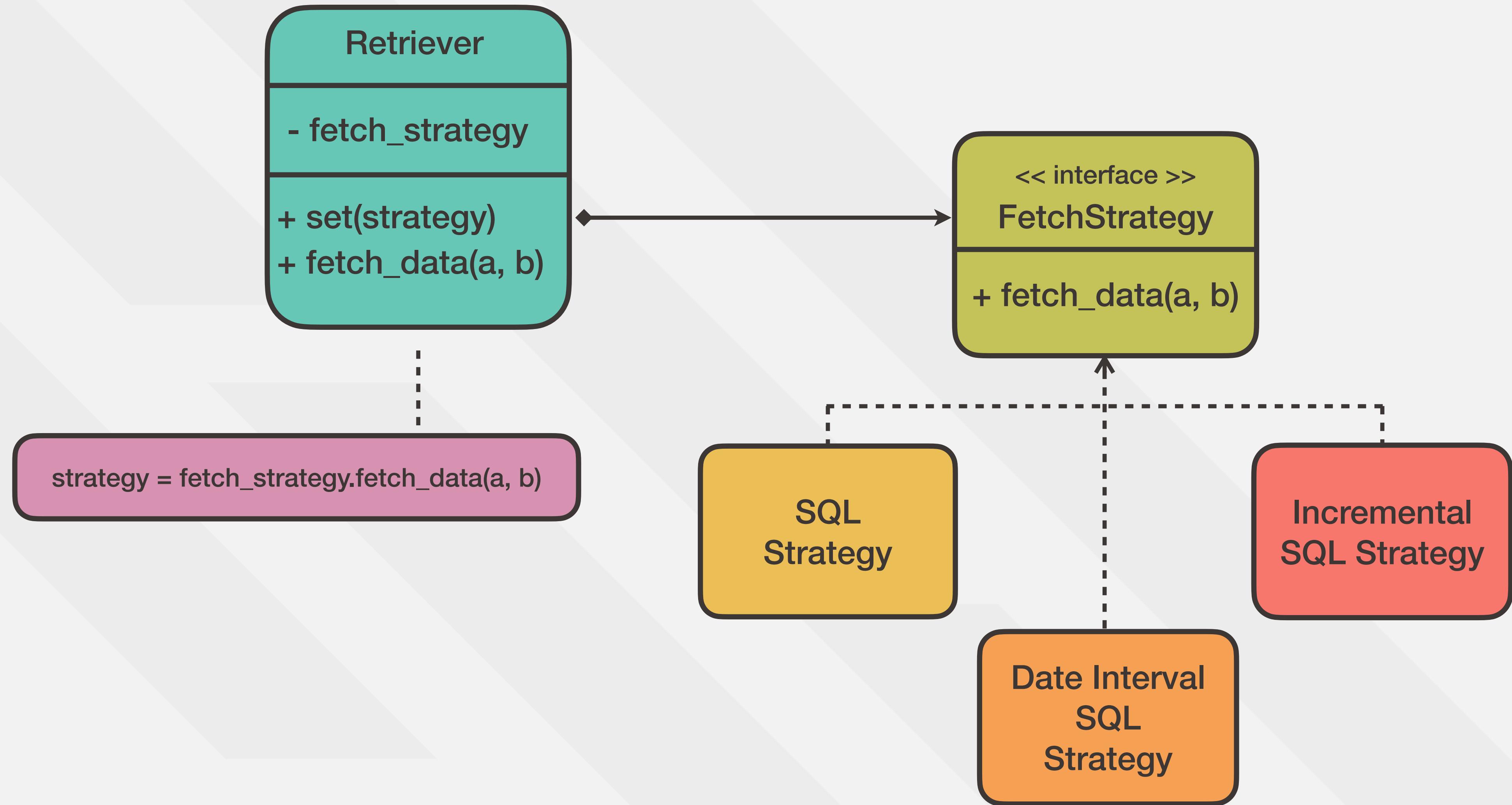
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<https://refactoring.guru/design-patterns/strategy>

STRATEGY PATTERN



Adapted from
<https://refactoring.guru/design-patterns/strategy>

STRATEGY PATTERN



Adapted from
<https://refactoring.guru/design-patterns/strategy>

STRATEGY PATTERN

Interface

Context

Strategy

Config

Utilize

STRATEGY PATTERN



```
7 class Retriever:  
16  
17     def __init__(self, strategy: FetchStrategy) → None:  
18         """  
19             Provide a concrete FetchStrategy when instantiating a Retriever.  
20  
21             :param strategy: FetchStrategy to dictate how data is retrieved  
22         """  
23  
24         self._strategy = strategy  
25  
26     @property  
27     def strategy(self) → FetchStrategy:  
28         """  
29             A reference to the concrete FetchStrategy that is set.  
30  
31             :return: Referenced FetchStrategy set on the Retriever  
32         """  
33  
34         return self._strategy  
35  
36     @strategy.setter  
37     def strategy(self, strategy: FetchStrategy) → None:  
38         """  
39             Set a FetchStrategy to allow for strategy switching at runtime.  
40         """
```

STRATEGY PATTERN



```
7 class Retriever:  
8  
9     def fetch_data(  
10         self, source_file_path, source_connection, query_range_interval=None  
11     ):  
12         """  
13             Returns a dataframe from the source system's response to the supplied  
14             SQL query.  
15  
16             :param source_file_path: Path to the file containing information to  
17                 call the downstream system.  
18             :param source_connection: Connection object to use when calling the  
19                 source system  
20             :param query_clip_range: A tuple representing a range of dates to  
21                 insert into a WHERE clause in the provided  
22                 query.  
23             :return: Response from the source system  
24         """  
25  
26         return self._strategy.fetch_data(  
27             source_file_path, source_connection, query_range_interval  
28         )  
29  
30         
```

STRATEGY PATTERN



```
9 class SqlStrategy(FetchStrategy):
10
11     def fetch_data(
12         self, source_file_path, source_connection, query_clip_range=None
13     ) → Generator[DataFrame, None, None]:
14         """
15
16         Returns a DataFrame from the source system's response to the SQL query
17         executed.
18
19         :param source_file_path: Path to the file containing the desired
20             SQL query to execute
21         :param source_connection: Connection object to use when executing the
22             query on the source system
23         :param query_clip_range: A tuple representing a range of dates to
24             insert into a WHERE clause in the provided
25             query. Should always be None for this
26             general SQL strategy.
27
28         :return: DataFrame containing the data from the source
29         """
30
31
32         sql_query = self._read_file(source_file_path)
33         for response_data in lib.client_libs.oracle.client.execute_oracle_query(
34             conn=source_connection,
35             query=sql_query,
36             batch=True,
37             batch_size=1000000,
38         ):
39             yield lib.client_libs.oracle_client.oracledb.response_to_dataframe(
```

STRATEGY PATTERN



```
12 dag:  
13   name: sql_source_dag  
14   description: Ingests all data from sql source  
15   schedule_interval: "0 11 * * *"  
16   start_date: "2024-07-01"  
17   owner: date_team  
18   retries: 3  
19   retry_delay: 3  
20   pool: default_pool  
21   catchup: true  
22  
23 tasks:  
24   queries:  
25     - name: REDACTED_TABLE_NAME  
26       predicate:  
27         min_date: "2005-01-01"  
28         max_date: "2024-09-01"  
29         interval: "30 days"  
30
```

STRATEGY PATTERN



```
10 class DAGConfig:  
11  
12     def get_fetch_strategy(self, query_info):  
13         sql_strategy = SqlStrategy()  
14  
15         isIncrementalLoad = self.get_batch_property("load_type") == "incremental"  
16  
17         if query_info.get("predicate"):  
18             sql_strategy = DateIntervalSqlStrategy()  
19         elif isIncrementalLoad:  
20             sql_strategy = IncrementalSqlStrategy()  
21  
22         return Retriever(sql_strategy)  
23  
24     def get_mapped_task_intervals(self, query_info):  
25         return self.get_fetch_strategy(query_info).get_interval_values(  
26             query_info=query_info  
27         )  
28  
29
```

STRATEGY PATTERN



80 MPH

ORCHESTRATE INGESTION



```
37     def generate_dags():
38         config_data = config_data,
39         source_hook=config_data.get_connection_property("source_conn_",
40         target_hook=config_data.get_connection_property("target_conn_",
41         current_run_scheduled_date="{{ data_interval_end | ds }}",
42         previous_run_scheduled_date="{{ data_interval_start | ds }}",
43         ).expand(query_clip_range=mapped_tasks)
44
45
46
47
48
49
50
51
52
53
54
55         sql_tasks.append(execute_sql_task)
56
57         databricks_run_task = DatabricksRunNowOperator(
58             databricks_conn_id="databricks",
59             task_id="databricks_run_task",
60             job_name="databricks_job_name",
61             notebook_params={
62                 "storage_container": "{{ get_variable('landing_zone') }}",
63                 "storage_account": "{{ conn.azure.login }}",
64                 "airflow_environment_path": "{{ reverse_domain(urlparse(config['airflow_environment'].get('url'))[0]) }}",
65             },
66         )
67
68         sql_tasks >> databricks_run_task
69
```



```
20 def create_dags_from_config(config_data):
21     @dag(
22         dag_id=config_data.get_dag_property("name"),
23         start_date=datetime.strptime(
24             config_data.get_dag_property("start_date"), "%Y-%m-%d"
25         ),
26         schedule=config_data.get_dag_property("schedule_interval"),
27         default_args=config_data.get_default_args(),
28         user_defined_macros={
29             "urlparse": urlparse,
30             "reverse_domain": reverse_domain,
31             "get_variable": Variable.get,
32         },
33     )
34     def generate_dags():
35         """
36             This DAG was generated to ingest all MIS APPS tables to the landing
37             zone. The configuration definition can be found under the
38             "config/mis/apps" directory.
39         """
40         sql_tasks = []
41
42         for query_info in config_data.queries:
```

Press shift + / for Shortcuts

Duration
01:01:24
00:30:42
00:00:00

DAG Run 2024-09-03, 10:43:36 CDT / Task databricks_run_task

Details Graph Gantt Code Logs XCom

More Details Rendered Template K8s Pod Spec List Instances, all runs

Task Instance Notes:

Extra Links

See Databricks Job Run

Task Instance Details

Status	success
Task ID	databricks_run_task
Run ID	manual_2024-09-03T15:43:36.000335+00:00
Operator	DatabricksRunNowOperator
Trigger Rule	all_success

The screenshot shows the Airflow UI for a task instance named 'databricks_run_task'. The task has a duration of 01:01:24. The 'Details' tab is selected. A red box highlights the 'See Databricks Job Run' button under the 'Extra Links' section. The 'Task Instance Details' table includes columns for Status, Task ID, Run ID, Operator, and Trigger Rule. The status is 'success', the task ID is 'databricks_run_task', the run ID is 'manual_2024-09-03T15:43:36.000335+00:00', the operator is 'DatabricksRunNowOperator', and the trigger rule is 'all_success'.

ORCHESTRATE INGESTION





100 MPH



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EVERYTHING**

- **Config-driven API DAGs**
- **ExternalTaskSensors for silver jobs**
- **Improved DLT job integration**

ORCHESTRATE EVERYTHING



FINISH LINE

DATA AT BURNS & MCDONNELL



SCALEABLE



RELIABLE



EVOLVABLE

THANK YOU!



Slide Deck and Resources