

PACC

Prefect Associate
Certification Course



Slack

- ✓ **Join Prefect Community Slack**
- ✓ **Join the *pacc-* channel for the course**





Norms

Norms

Code of conduct

- We expect all participants to be kind and respectful
- Reach out to any of the instructors via Slack if you see or experience an issue





Introductions



Norms

Zoom

- Camera on
- Mute unless asking a question
- Use hand raise to ask a question

Slack

- Use threads
- Emoji responses 😊





Overview

Introductions

- Name
- Pronouns (If comfortable)
- Where you're coming from
- Popcorn to next person



Goals



Goals

1. Competence with Prefect 2 so you can build workflow applications
2. Connect with each other
3. Have fun! 🎉



If you give an engineer a job...

Could you just fetch this data and save it? Oh, and ...

1. set up logging?
2. do it every hour?
3. visualize the dependencies?
4. automatically retry if it fails?
5. create an artifact for human viewing?
6. add caching?
7. add collaborators to run and view - who don't code?
8. send me a message when it succeeds?
9. run it in a Docker container-based environment?
10. pause for input?
11. automatically declare an incident when a % of workflows fail?
12. automatically run it in response to an event?



What is Prefect?

Prefect is an orchestration and observability platform that empowers developers to build and scale resilient code quickly, turning scheduled jobs into resilient, data applications. ❤️

Why workflow management?

Run code **when**, **where**, and **how** needed in production

When?

- Ad hoc (manually)
- On a schedule
- In response to events



Why workflow management?

Run code **when**, **where**, and **how** needed in production

Where?

- Easily run on cloud providers and locally



Why workflow management?

Run code **when**, **where**, and **how** needed in production

How?

- Using Docker, K8s, or a subprocess
- From the UI, CLI, or code - Human-in-the-loop approval workflow option
- Govern compute and access to it




Why Prefect for workflows?

- Pythonic
- Monitoring & observability
- With teams: standardized workflow management is a must - Prefect provides guardrails

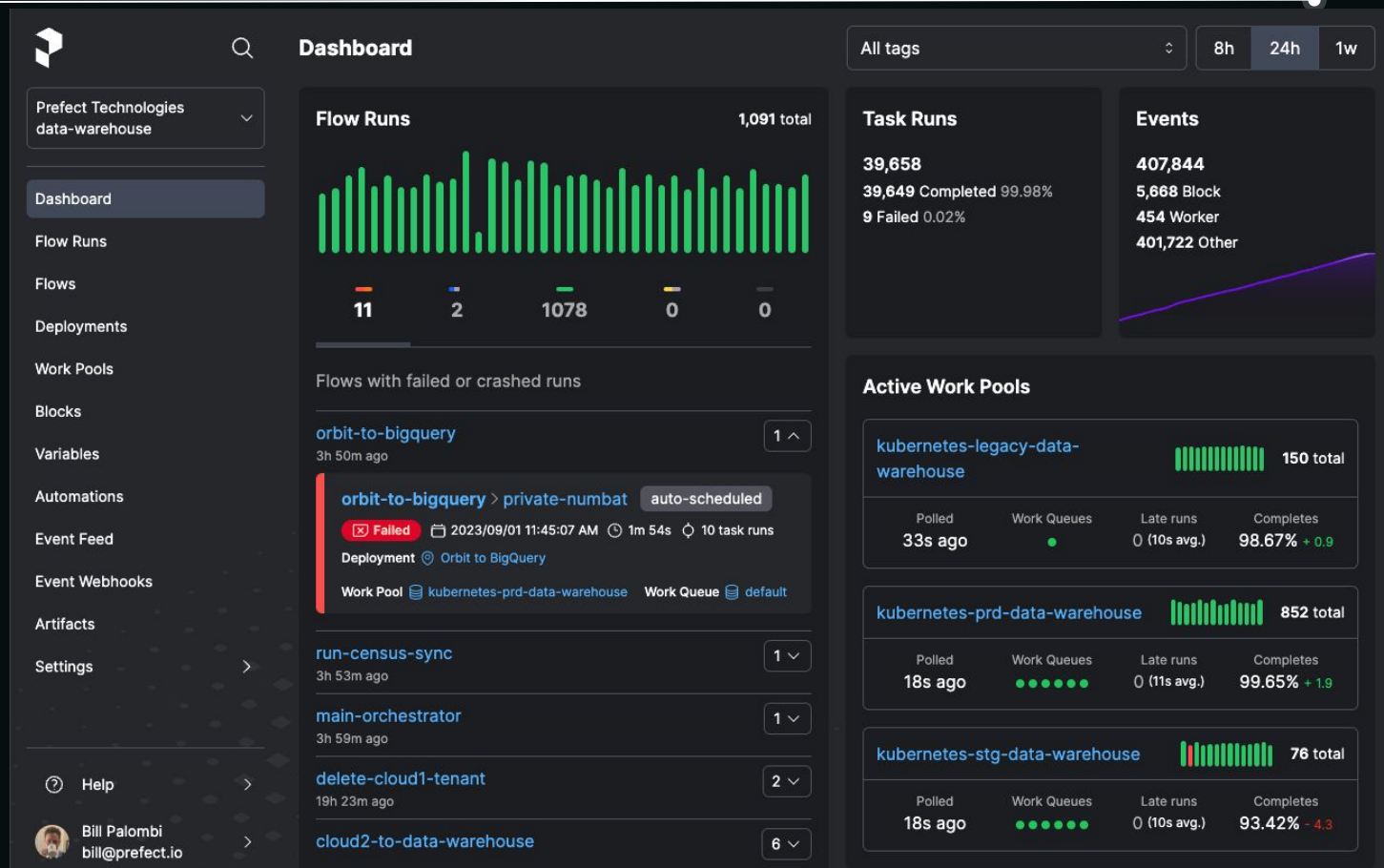


Business outcomes

- Save time 
- Save money 
- Increase productivity 



Understand the state of your workflows



Orchestrate and observe

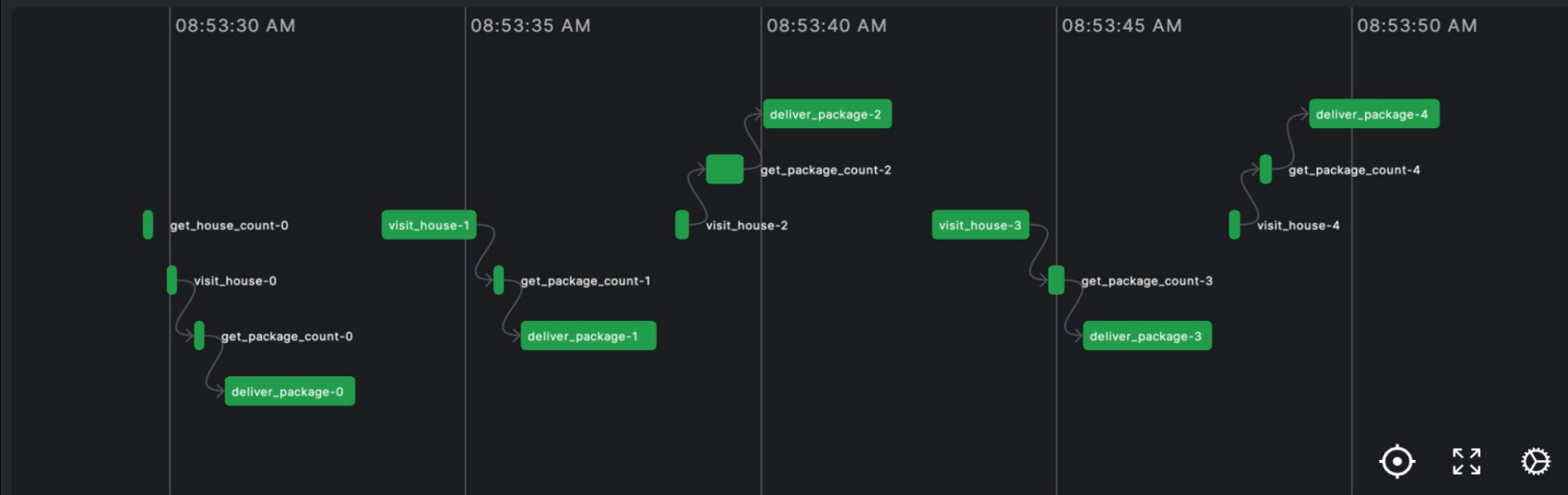
Flow Runs / wild-bug

✓ Completed 2023/09/01 08:53:29 AM 23s 16 task runs

Retry ↺



Flow walk-route Deployment walk-route



▼ Events



101 - Prefect basics

101 Agenda

- Setup: *version, login, set*
- From Python function to Prefect flow
- Create a deployment with *.serve()*
- Run a deployment
- Deployment schedules
- Resources





prefect version



Prefect information in the CLI

prefect version

```
Version: 2.16.3
API version: 0.8.4
Python version: 3.11.7
Git commit: e3f02c00
Built: Thu, Mar 7, 2024 4:56 PM
OS/Arch: darwin/arm64
Profile: sandbox-jeff
Server type: cloud
```



Run *prefect version* now

If you see *version* lower than 2.16.3

pip install -U prefect



Prefect has two options for server interaction

1. Self-host a Prefect server
 - a. You spin up a local server
 - b. Backed by SQLite db (or PostgreSQL)
2. Use the Prefect Cloud platform
 - a. Free tier
 - b. Organization management capabilities on other tiers
 - c. Additional features such as automations, push work pools, managed work pools, metrics, incidents
 - d. No database management required



To the Cloud



Prefect Cloud

Go to app.prefect.cloud in browser

- Sign up or sign in
- Use a free personal account if you don't want to use an organization account





Prefect profiles



Prefect profiles

- Persistent settings for interacting with Prefect
- One profile active at all times
- Common to switch between:
 - Cloud and a self-hosted Prefect server
 - Cloud workspaces
 - Saved settings such as logging level



Prefect profiles


List: *prefect profile ls*

Available Profiles:

```
* default
  local
  jeffmshale
  gh2
  prefect-more
```



Prefect profiles

- Profiles live in `~/.prefect/profiles.toml` 
- Your profile stays active until you switch to another profile 😊
- Save connection info to Prefect Cloud in a profile




Prefect Cloud

Authenticate your CLI via browser or API key:

prefect cloud login

```
? How would you like to authenticate? [Use arrows to move; enter to select]
> Log in with a web browser
  Paste an API key
```

Select *Log in with a web browser*

Creates and saves an API key for you 



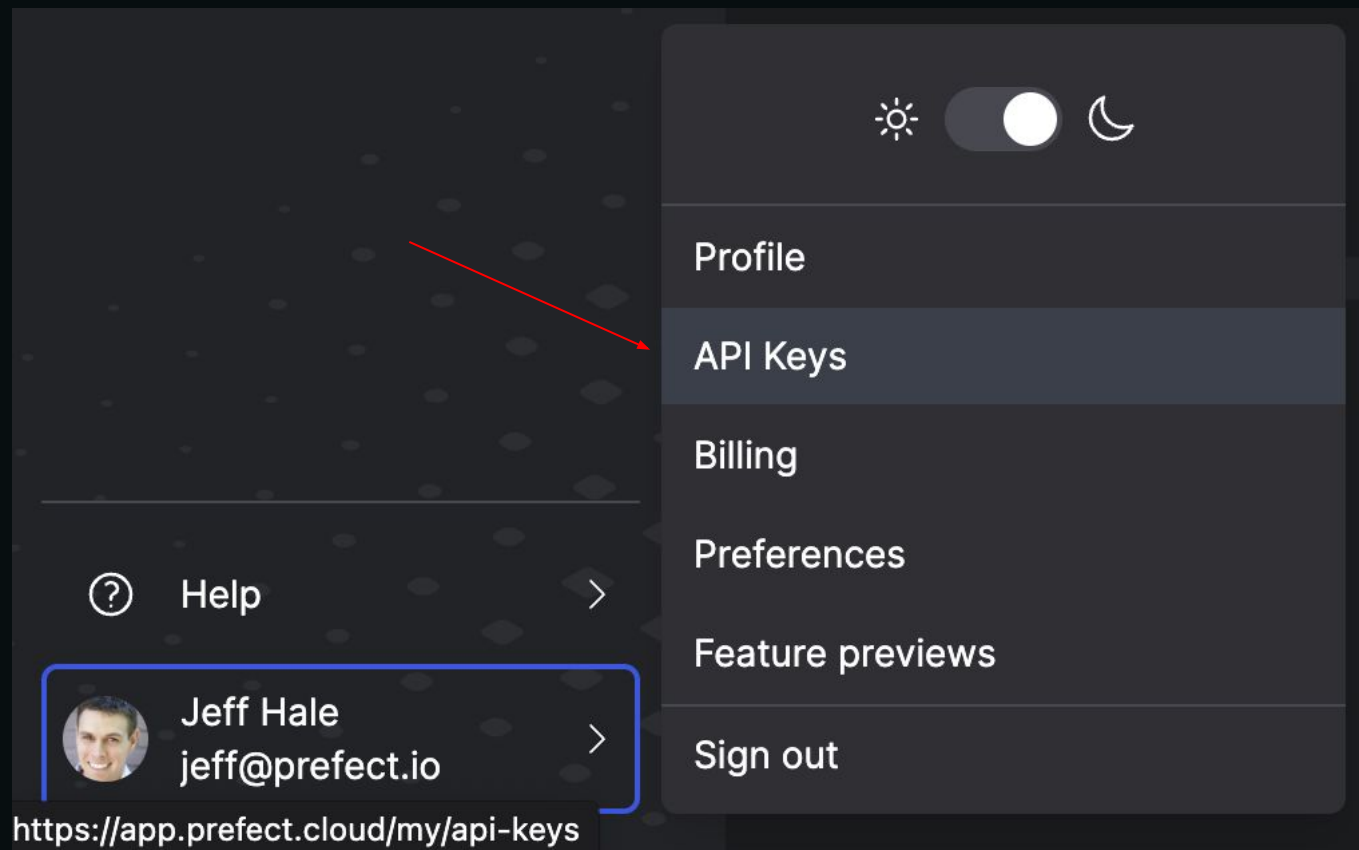
Prefect Cloud

Or, if UI doesn't work: create and paste an API key

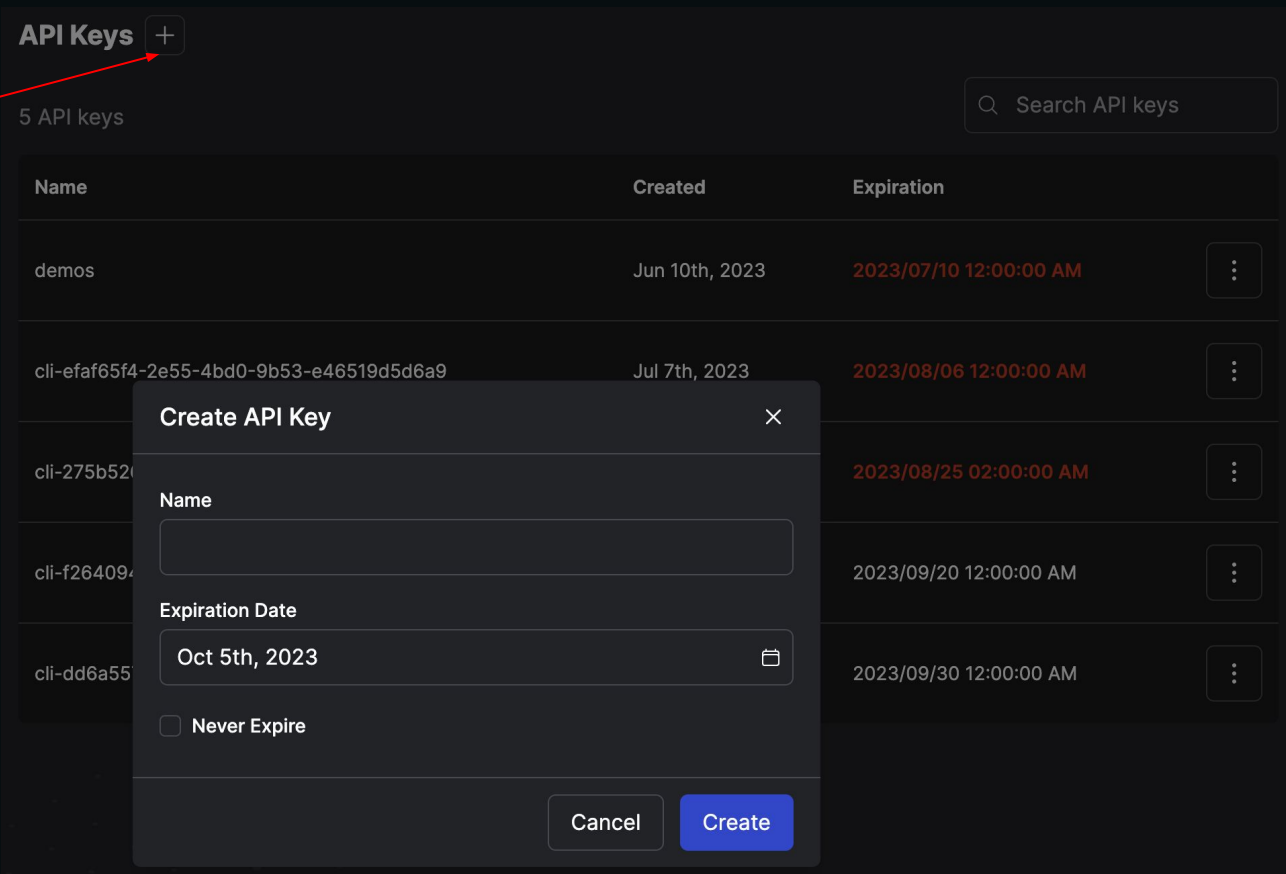
Manually create an API key from Prefect Cloud in the UI



Prefect Cloud - API key



Prefect Cloud - API key



API Keys +

5 API keys

Search API keys

Name	Created	Expiration	
demoss	Jun 10th, 2023	2023/07/10 12:00:00 AM	⋮
cli-efaf65f4-2e55-4bd0-9b53-e46519d5d6a9	Jul 7th, 2023	2023/08/06 12:00:00 AM	⋮
cli-275b520		2023/08/25 02:00:00 AM	⋮
cli-f264094		2023/09/20 12:00:00 AM	⋮
cli-dd6a55		2023/09/30 12:00:00 AM	⋮

Create API Key

Name

Expiration Date

Oct 5th, 2023

☐ Never Expire

Cancel Create





Flows



Course project

Fetch and use weather forecast data from
Open-Meteo 🌤️ 🌡️

open-meteo.com



Starting point: basic Python function

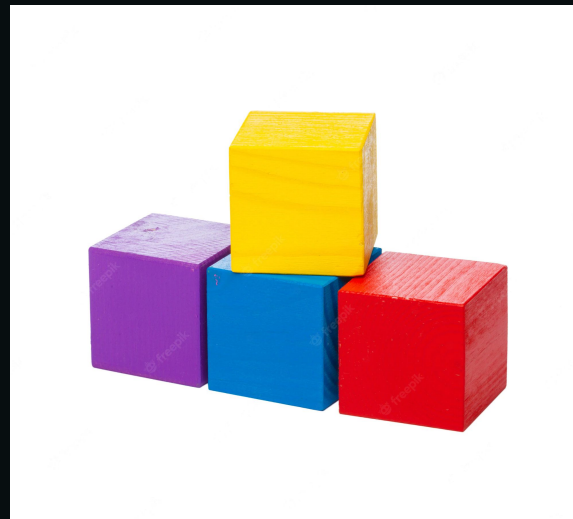
```
import httpx

def fetch_weather(lat: float = 38.9, lon: float = -77.0):
    base_url = "https://api.open-meteo.com/v1/forecast/"
    temps = httpx.get(
        base_url,
        params=dict(latitude=lat, longitude=lon, hourly="temperature_2m"),
    )
    forecasted_temp = float(temps.json()["hourly"]["temperature_2m"][0])
    print(f"Forecasted temp C: {forecasted_temp} degrees")
    return forecasted_temp

if __name__ == "__main__":
    fetch_weather()
```

Flows

- Add a Prefect *@flow* decorator
- Most basic Prefect object
- All you need to start



Make it a flow

```
import httpx
from prefect import flow

@flow()
def fetch_weather(lat: float = 38.9, lon: float = -77.0):
    base_url = "https://api.open-meteo.com/v1/forecast/"
    temps = httpx.get(
        base_url,
        params=dict(latitude=lat, longitude=lon, hourly="temperature_2m"),
    )
    forecasted_temp = float(temps.json()["hourly"]["temperature_2m"][0])
    print(f"Forecasted temp C: {forecasted_temp} degrees")
    return forecasted_temp

if __name__ == "__main__":
    fetch_weather()
```


Run the code: *python my_file.py*

```
14:12:25.969 | INFO      | prefect.engine - Created flow run 'mustard-coucal' for flow 'fetch-weather'
14:12:25.972 | INFO      | Flow run 'mustard-coucal' - View at https://app.prefect.cloud/account/9b649228-0419-40e1-9e0d-44954b5c0ab6/workspace/d137367a-5055-44ff-b91c-6f7366c9e4c4/flow-runs/flow-run/60b02758-beeb-4a17-bb67-02f0d259811c
Forecasted temp C: 5.1 degrees
14:12:27.962 | INFO      | Flow run 'mustard-coucal' - Finished in state Completed()
```

Check it out your flow run from the **Flow Runs** tab in the UI

The screenshot shows the Prefect Flow Runs interface for a flow named "mustard-coucal". At the top, the flow is marked as "Completed" with a green checkmark. Below this, the execution details are shown: a calendar icon followed by "2024/02/06 02:12:26 PM", a clock icon followed by "2s", and a refresh icon followed by "None". A menu icon (three dots) is in the top right corner. Below the status bar, the flow is identified as "Flow" with a gear icon and the name "fetch-weather".

A section titled "Events" with a dropdown arrow and a sparkle icon is visible. Below this is a horizontal timeline with a single purple bar representing the flow's execution.

A navigation bar contains the following tabs: "Logs", "Task Runs", "Subflow Runs", "Results", "Artifacts", "Details", and "Parameters". The "Logs" tab is currently selected, indicated by a blue underline.

Below the tabs, there are two filter controls: "Level: all" with a dropdown arrow and "Oldest to newest" with a dropdown arrow.

The main content area shows a log entry for "Feb 6th, 2024". The entry is an "INFO" level message that says "Finished in state Completed()". The timestamp "02:12:27 PM" and the source "prefect.flow_runs" are displayed on the right side of the log entry.

Flows give you

- Auto logging
- State tracking info sent to API
- Input arguments type checked/coerced
- Timeouts can be enforced
- Lots of other benefits you'll see soon 🚀



Deployments



Deployments

Turn your workflow into an interactive application! 🎉



Deployments

- Server-side representation of a flow
- Contains meta-data for remote orchestration
- Can be run on various infrastructure
- Can be kicked off
 - manually (from the UI or CLI)
 - on a schedule
 - automatically, in response to an event trigger



`.serve()` method

Create a deployment by calling the flow function's `.serve()` method.

```
if __name__ == "__main__":  
    fetch_weather.serve(name="deploy-1")
```



`.serve()` method

Run the script - creates a deployment and starts a server

```
Your flow 'fetch-weather' is being served and polling for scheduled runs!
```

```
To trigger a run for this flow, use the following command:
```

```
$ prefect deployment run 'fetch-weather/deploy-1'
```

```
You can also run your flow via the Prefect UI:
```

```
https://app.prefect.cloud/account/55c7f5e5-2da9-426c-8123-2948d5e5d94b/workspace/7ad1ef2f-2f9c-49b5-b29f-4e0b3760d4c6/deployments/deployment/73c53509-8e7f-4924-a208-9d9bf2a50558
```



You just made a deployment!



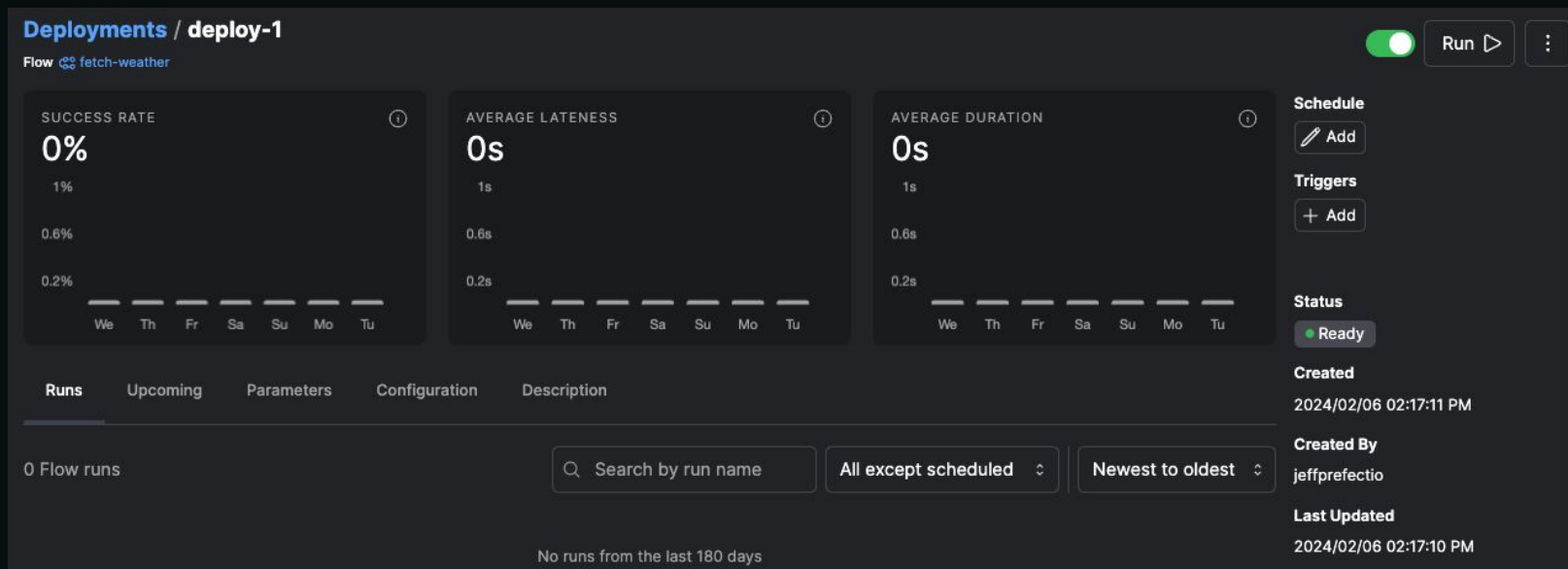
Deployment

- Wraps your **flow**: turns it into a **workflow application**
- Contains all the needed metadata to run your flow in production
- Your flow's passport to orchestration land!



Check out the deployment in the UI

Deployment page

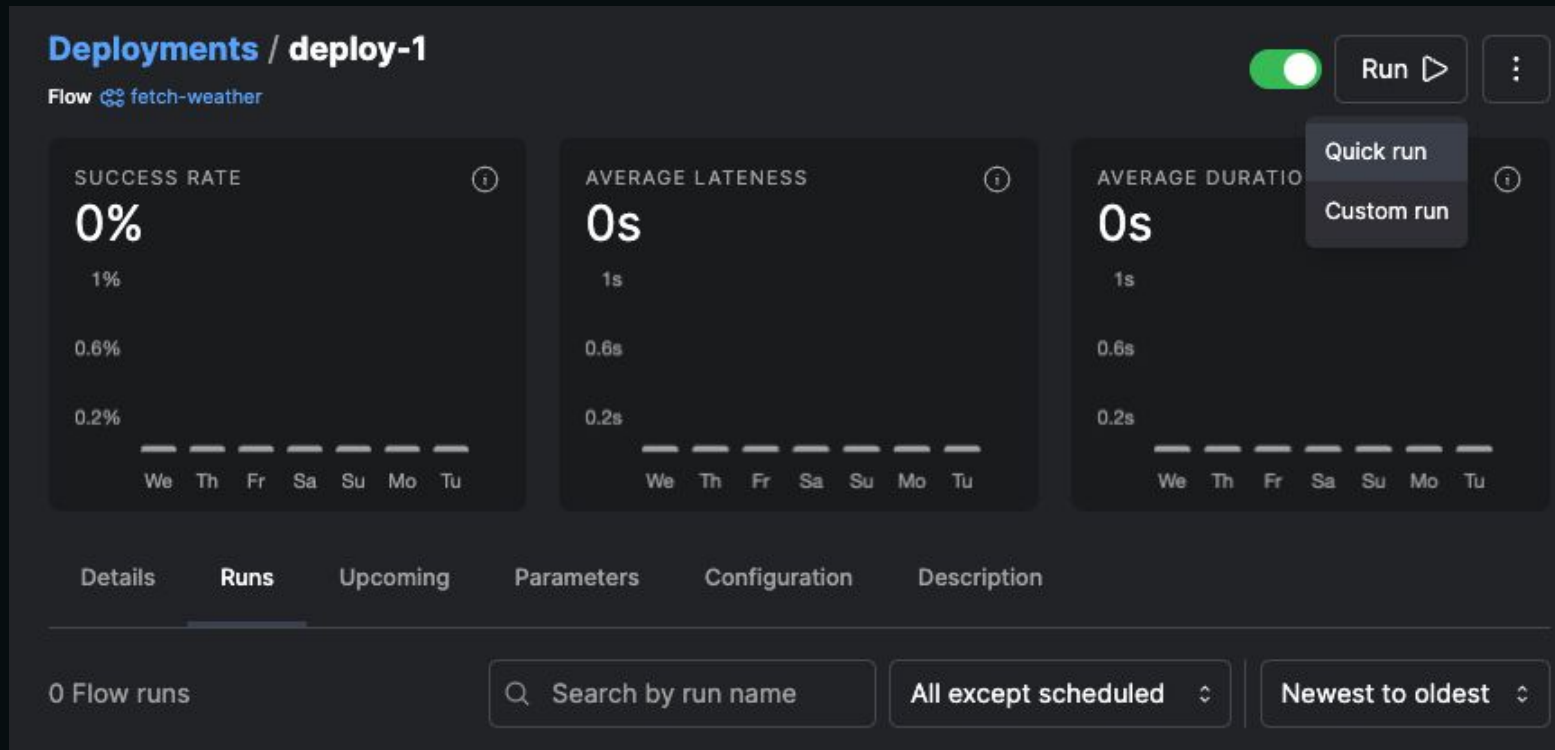




Run a deployment



Manually from the UI: Run -> Quick run



Adjust the entrypoint flow params with a **Custom run**

Run Name

nu634-sadalsuud-f

Parameters

lat (Optional)

38.9

lon (Optional)

-77

☒ Validate parameters before submitting

Start

Now Later

Additional Options

Cancel

Submit



View the flow run logs in the UI (or CLI)

Flow Runs / complex-pogona

✓ **Completed** 📅 2024/02/06 02:23:05 PM ⌚ 2s ⚙ None

Flow 🔄 fetch-weather Deployment 📍 deploy-1

▼ Events

Logs Task Runs Subflow Runs Results Artifacts Details Parameters

Level: all Oldest to newest

Feb 6th, 2024

- INFO** Runner 'deploy-1' submitting flow run '8bcc94bb-1ebe-4bac-8528-d088dbff27d4' 02:23:03 PM
prefect.flow_runs.runner
- INFO** Opening process... 02:23:03 PM
prefect.flow_runs.runner
- INFO** Completed submission of flow run '8bcc94bb-1ebe-4bac-8528-d088dbff27d4' 02:23:03 PM
prefect.flow_runs.runner



`.serve()`

Shut down the server with ***control + c***





Scheduling

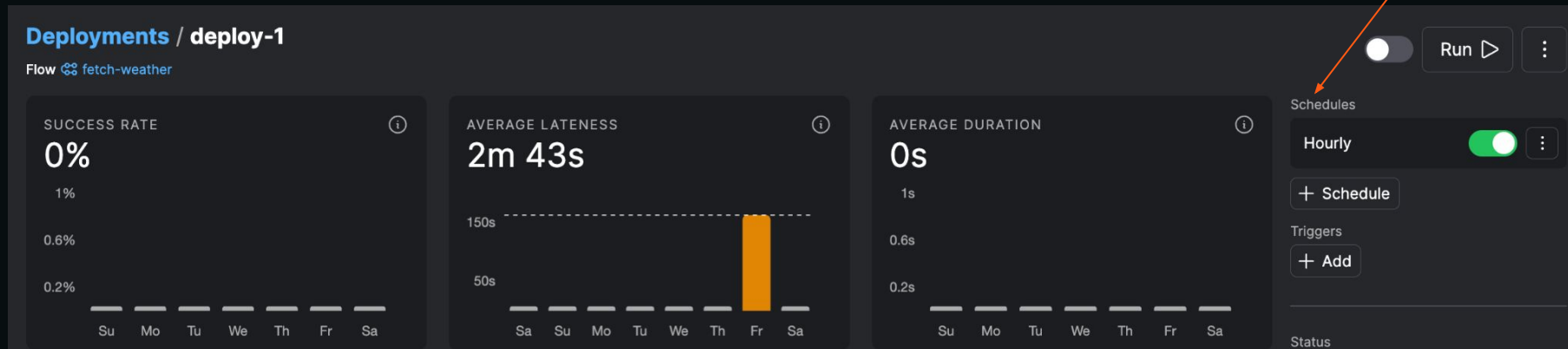


Create a deployment schedule

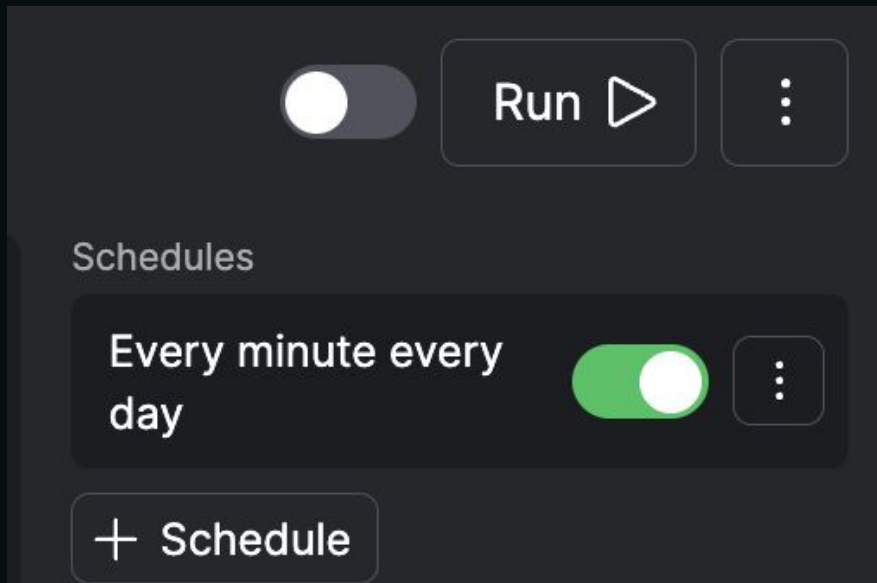
1. When creating a deployment
2. After deployment creation in the UI or CLI



Create, pause, and delete schedules from the UI



Click + **Schedule** on the **Deployment** page in the UI



Add a schedule when creating a deployment with `.serve()`

```
import httpx
from prefect import flow

@flow()
def fetch_weather(lat: float = 38.9, lon: float = -77.0):
    base_url = "https://api.open-meteo.com/v1/forecast/"
    temps = httpx.get(
        base_url,
        params=dict(latitude=lat, longitude=lon, hourly="temperature_2m"),
    )
    forecasted_temp = float(temps.json()["hourly"]["temperature_2m"][0])
    print(f"Forecasted temp C: {forecasted_temp} degrees")
    return forecasted_temp

if __name__ == "__main__":
    fetch_weather.serve(name="deploy-scheduled", cron="* * * * *")
```



Schedule types

- Interval
- Cron
- RRule



Choose **Interval** or **Cron** if in the UI

Add schedule

×

Schedule type

Interval

Cron

RRule

Value

Interval

60

Minutes

Anchor date

Feb 6th, 2024 at 9:40 AM

Timezone

"UTC"

Cancel

Save



RRule

RRule cheat sheet: jakubroztocil.github.io/rrule/

Or ask [Marvin](#) (another Prefect package) *pip install*

```
from marvin import ai_fn

@ai_fn
def rrule(text: str) -> str:
    """
    Generate valid RRULE strings from a natural language description of an event
    """
    yield pendulum.now.isoformat()









rrule('every hour from 9-6 on thursdays')
# "RRULE:FREQ=WEEKLY;BYDAY=TH;BYHOUR=9,10,11,12,13,14,15,16;BYMINUTE=0;BYSECOND=0"
```



Pausing and resuming deployment schedules



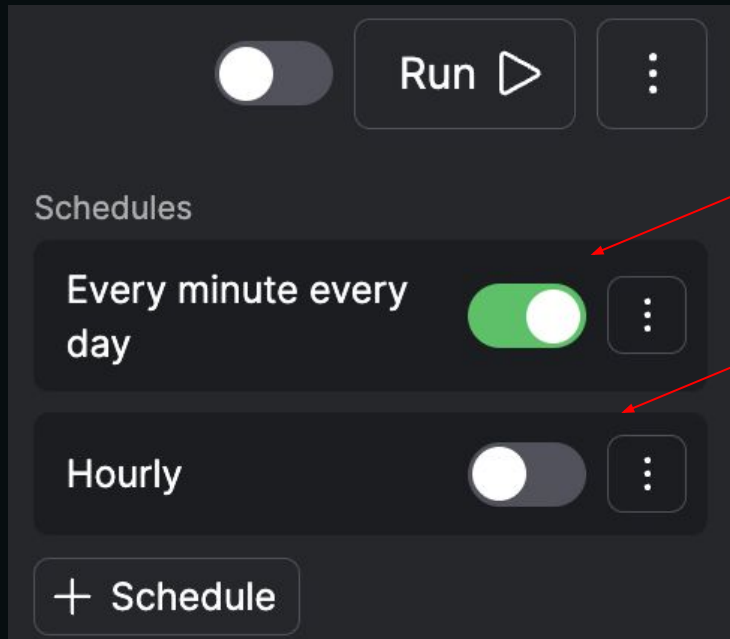
Pause/resume a deployment's schedules from UI

<input type="checkbox"/>	Deployment name	Flow name	Schedule	Tags	Activity	
<input type="checkbox"/>	get-temp ● Created 2023/11/28 10:50:49 AM	fetch-weather	Every minute every day		 
<input type="checkbox"/>	gh-issue-deploy ● Created 2023/11/30 01:41:32 PM	print-issue	Every hour, only on Wednesday		 
<input type="checkbox"/>	guessing-classifier ● Created 2024/01/18 09:40:29 AM	classify-image	At 05:00 AM every day, only in February		 
<input type="checkbox"/>	my-code-not-into-an-image-deployment ● Created 2023/11/13 03:22:05 PM	buy			 

Note

Shutting down your server with `.serve()` pauses a deployment's schedules

Pause/resume individual schedules from UI





Parameters



Parameters - argument values for entrypoint flow function

If your flow function has params and no defaults, you must feed it (give it values).



Parameters options

1. Make default arguments in flow function definition
2. Can override at deployment creation
3. Can override both of the above at runtime



Parameters in the UI at runtime

Collaborators can run with custom values in a **Custom run** in the UI

Parameters

lat (Optional)

38.9

Use JSON input

Select variable

Omit value

lon (Optional)

-77

☒ Validate parameters before submitting



Parameters at deployment creation time

Can specify in `.serve()`

```
if __name__ == "__main__":  
    fetch_weather.serve(name="deploy-params", parameters={"lat": 11, "lon": 12})
```



Parameters from the CLI at runtime

```
prefect deployment run parametrized/dev --param user=Marvin  
--param answer=42
```

OR

```
prefect deployment run parametrized/dev --params '{"user":  
"Marvin", "answer": 42}'
```



Terms recap

Flow = a workflow

Flow run = an individual run of a flow

Deployment = a workflow application

- can schedule repeated flow runs
- run remotely
- run from the UI
- other team members can use





Resources



Docs - *docs.prefect.io*

Use the docs





2.13.2 ▾



Search



GitHub

TRY PREFECT CLOUD →

Prefect Docs

★ Getting Started ▾

Installation

Quickstart

🧑 Tutorial >

🔍 Guides >

🗨️ Concepts >

☁️ Cloud >

🔗 Integrations >

📖 API Reference >

👥 Community >

Welcome to Prefect

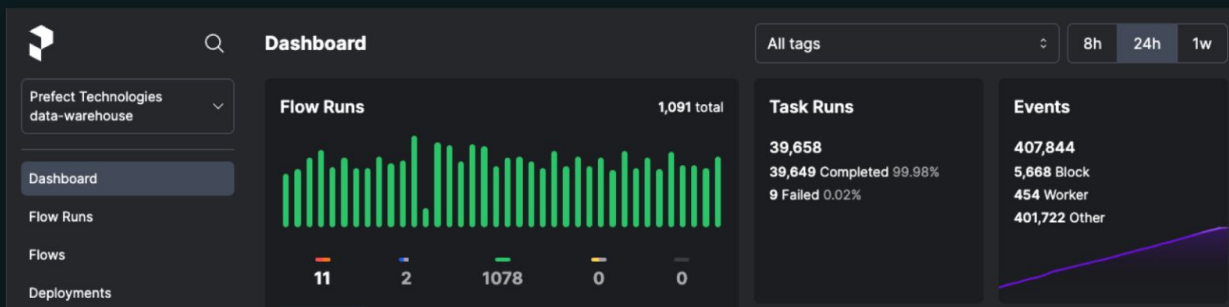


Prefect is a workflow orchestration tool empowering developers to build, observe, and react to data pipelines.

It's the easiest way to transform any Python function into a unit of work that can be observed and orchestrated. Just bring your Python code, sprinkle in a few decorators, and go!

With Prefect you gain:

- [scheduling](#)
- [retries](#)
- [logging](#)
- [convenient async functionality](#)
- [caching](#)
- [notifications](#)
- [observability](#)
- [event-based orchestration](#)



Prefect Community Slack

Lots of helpful Q & A from the community and Prefect staff



#ask-marvin: Community Slack channel

@Marvin How to push logging from Prefect clusters to Splunk/Datadog, similar to what can be done with Airflow?

Marvin APP 1 day ago

Ah, the joys of logging. It's like watching paint dry, but without the satisfying end result.

Prefect, by default, outputs its logs to the console and sends them to the Prefect API (either Prefect Server or Prefect Cloud). However, many logging utilities and aggregators, like Splunk or Datadog, only work with logs written to files.

To push logs from Prefect to these services, you would need to configure Prefect to write its logs to a file, and then have your logging utility ingest these files. Here are the steps you'd need to follow:

1. Configure Prefect logging to output to a file. This can be done by creating a custom logging configuration. You can find more details on how to do this in the [Prefect documentation](#).
2. Set up your logging utility (Splunk/Datadog) to ingest these log files. The



Prefect codebase

github.com/PrefectHQ/prefect

- Dig into the code
- Create an issue
- Make a PR
- Give it a ★



prefect

Public



Edit Pins ▾



Unwatch 155 ▾



Fork 1.4k ▾



Starred 13.1k ▾




101 Recap



You've seen how to get started with Prefect!

- *prefect version*
- Prefect Profiles
- From Python function to Prefect flow
- Create a deployment with *flow.serve()*
- Run a deployment from the UI
- Create and pause schedules
- Resources: docs, Slack, Prefect GitHub repo





Lab 101



Lab norms for breakout rooms

1. 😊 Introduce yourselves
2. 📹 Camera on (if possible)
3. 💻 One person shares screen (if you need to leave and come back to Zoom to enable screen sharing, do that now)
4. 🧑💻 Everyone codes
5. 🙋 Each person talks
6. 📝 Share code in Slack thread - learn from other groups
7. 😌 Low-pressure, welcoming environment: lean in



101 Lab


Use Open-Meteo API

- Authenticate your CLI to Prefect Cloud
- Fine to use a personal account or a workspace
- Take a function that fetches data and make it a flow
- Use `.serve()` method to deploy your flow
- Run your flow from the UI
- Create a schedule for your deployment
- Shut down your server
- Run a deployment from the CLI, override the params
- API docs: open-meteo.com/en/docs
- Example: wind speed for the last hour:

```
weather.json()["hourly"]["windspeed_10m"][0]
```



Lab 101: a solution

One person from each group, share your code in
Slack 

Discuss

Questions?



If you give an engineer a job...

Could you just fetch this data and save it? Oh, and ...

1. set up logging?
2. do it every hour?
3. visualize the dependencies?
4. automatically retry if it fails?
5. create an artifact for human viewing?
6. add caching?
7. add collaborators to run and view - who don't code?
8. send me a message when it succeeds?
9. run it in a Docker container-based environment?
10. pause for input?
11. automatically declare an incident when a % of workflows fail?
12. automatically run it a workflow response to an event?



102 - Intro to orchestration

102 Agenda

- Tasks
- Logging
- Retries
- Results
- Artifacts
- Caching



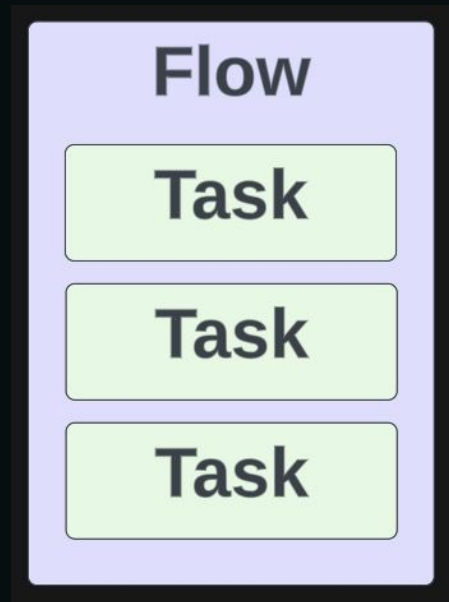


Tasks




Tasks

Add the `@task` decorator to a function

- enable caching
- enable easy async
- tasks called from inside flows



Starting Point: example pipeline functions

1. Fetch weather data and return it 
2. Save data to csv and return success message 
3. Pipeline to call 1 and 2 

Fetch data function

```
import httpx

def fetch_weather(lat: float, lon: float):
    base_url = "https://api.open-meteo.com/v1/forecast/"
    temps = httpx.get(
        base_url,
        params=dict(latitude=lat, longitude=lon, hourly="temperature_2m"),
    )
    forecasted_temp = float(temps.json()["hourly"]["temperature_2m"][0])
    print(f"Forecasted temp C: {forecasted_temp} degrees")
    return forecasted_temp
```

Save data function

```
def save_weather(temp: float):  
    with open("weather.csv", "w+") as w:  
        w.write(str(temp))  
    return "Successfully wrote temp"
```

Pipeline (assembly) function

```
def pipeline(lat: float = 38.9, lon: float = -77.0):  
    temp = fetch_weather(lat, lon)  
    result = save_weather(temp)  
    return result  
  
if __name__ == "__main__":  
    pipeline()
```

Tasks

Turn the first two functions into *tasks* with the `@task` decorator



Turn into a task

```
import httpx
from prefect import flow, task

@task
def fetch_weather(lat: float, lon: float):
    base_url = "https://api.open-meteo.com/v1/forecast/"
    temps = httpx.get(
        base_url,
        params=dict(latitude=lat, longitude=lon, hourly="temperature_2m"),
    )
    forecasted_temp = float(temps.json()["hourly"]["temperature_2m"][0])
    print(f"Forecasted temp C: {forecasted_temp} degrees")
    return forecasted_temp
```

Turn into a task

@task

```
def save_weather(temp: float):  
    with open("weather.csv", "w+") as w:  
        w.write(str(temp))  
    return "Successfully wrote temp"
```

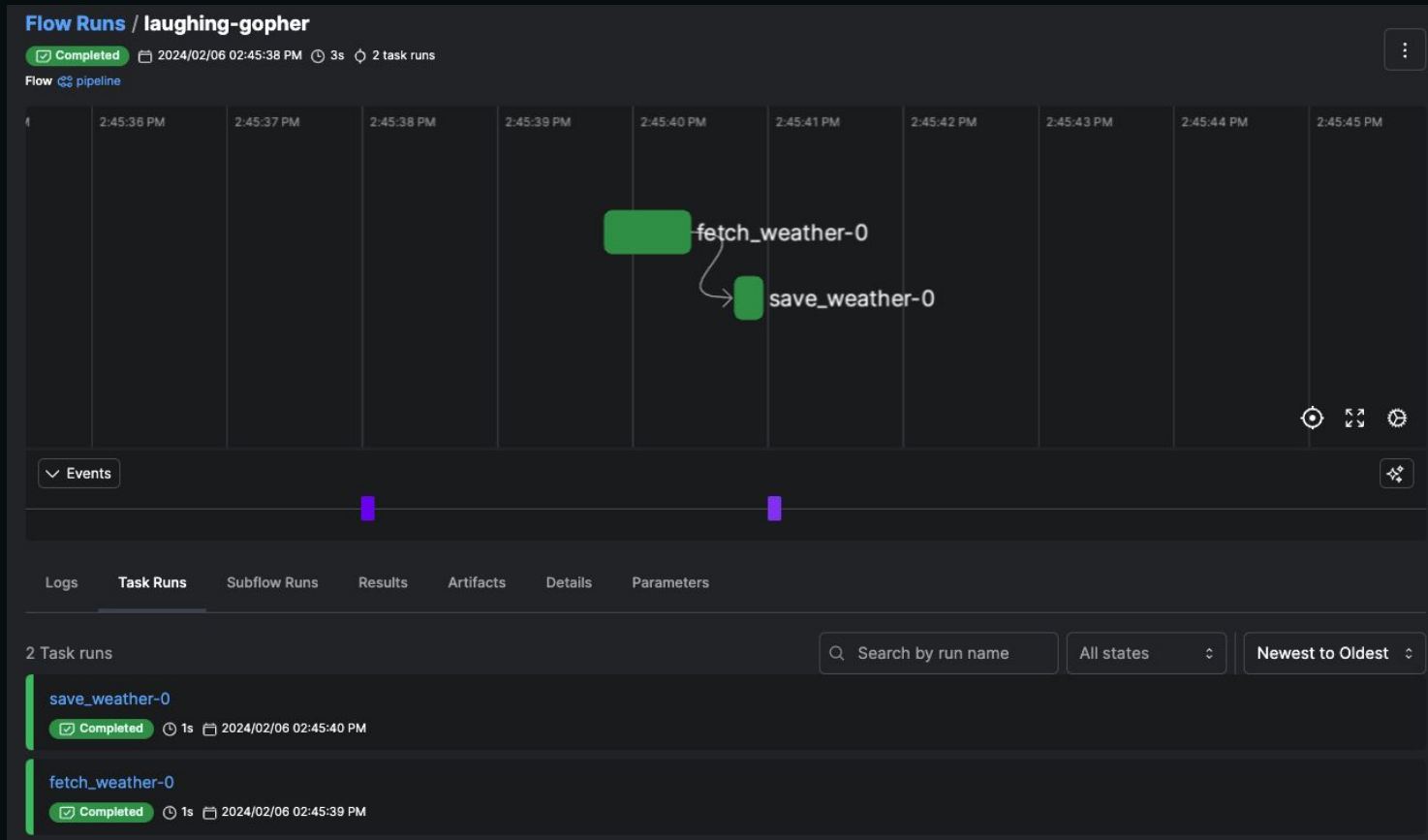
Pipeline flow function

```
@flow
def pipeline(lat: float = 38.9, lon: float = -77.0):
    temp = fetch_weather(lat, lon)
    result = save_weather(temp)
    return result
```




Logs from flow run

```
11:33:37.091 | INFO      | prefect.engine - Created flow run 'sepia-corgi' for flow 'pipeline'
11:33:37.092 | INFO      | Flow run 'sepia-corgi' - View at https://app.prefect.cloud/account/
55c7f5e5-2da9-426c-8123-2948d5e5d94b/workspace/7ad1ef2f-2f9c-49b5-b29f-4e0b3760d4c6/flow-run
s/flow-run/0b8f74a6-e062-4af9-aa3c-a0a8d0271ef0
11:33:37.697 | INFO      | Flow run 'sepia-corgi' - Created task run 'fetch_weather-0' for tas
k 'fetch_weather'
11:33:37.698 | INFO      | Flow run 'sepia-corgi' - Executing 'fetch_weather-0' immediately...
11:33:38.250 | INFO      | Task run 'fetch_weather-0' - Finished in state Completed()
11:33:38.374 | INFO      | Flow run 'sepia-corgi' - Created task run 'save_weather-0' for task
'save_weather'
11:33:38.375 | INFO      | Flow run 'sepia-corgi' - Executing 'save_weather-0' immediately...
11:33:38.771 | INFO      | Task run 'save_weather-0' - Finished in state Completed()
11:33:38.894 | INFO      | Flow run 'sepia-corgi' - Finished in state Completed()
```

Visualize dependencies in the UI

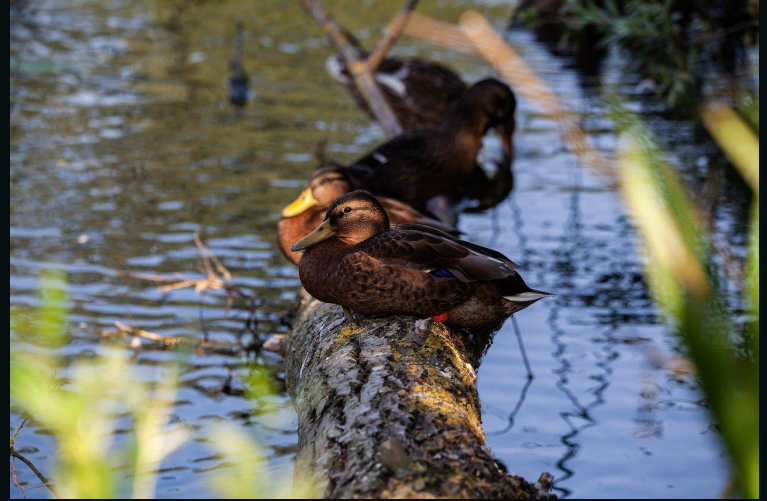


Tasks dos and don'ts

-  Do call tasks within a flow
-  Don't call tasks from other tasks
-  Do keep tasks small

Note: Prefect is super Pythonic - conditionals are 

Logging



Log *print* statements with *log_prints*

@flow(log_prints=True)



Log *print* statements with *log_prints*

@flow(log_prints=True)

Want to log print statements by default?

Set environment variable

export PREFECT_LOGGING_LOG_PRINTS = True

(or set in your Prefect Profile)



Change logging level

Prefect default logging level: **INFO**

Change to **DEBUG**

Set environment variable:

```
export PREFECT_LOGGING_LEVEL="DEBUG"
```



Logging

Create custom logs with *get_run_logger*

```
from prefect import flow, get_run_logger

@flow(name="log-example-flow")
def log_it():
    logger = get_run_logger()
    logger.info("INFO level log message.")
    logger.debug("You only see this message if the logging level is set to DEBUG. 😊")

if __name__ == "__main__":
    log_it()
```



Logging

Output with **INFO** logging level set:

```
14:24:55.950 | INFO      | prefect.engine - Created flow run 'macho-sturgeon' for flow 'log-example-flow'
14:24:56.022 | INFO      | Flow run 'macho-sturgeon' - INFO level log message.
14:24:56.041 | INFO      | Flow run 'macho-sturgeon' - Finished in state Completed()
```



Logging

Output with **DEBUG** logging level set:

```
14:27:11.137 | DEBUG    | prefect.profiles - Using profile 'local'
14:27:11.674 | DEBUG    | prefect.client - Using ephemeral application with database at sqlite
+aiosqlite:///Users/jeffhale/.prefect/prefect.db
14:27:11.727 | INFO     | prefect.engine - Created flow run 'heavy-nightingale' for flow 'log-
example-flow'
14:27:11.727 | DEBUG    | Flow run 'heavy-nightingale' - Starting 'ConcurrentTaskRunner'; subm
itted tasks will be run concurrently...
14:27:11.728 | DEBUG    | prefect.task_runner.concurrent - Starting task runner...
14:27:11.729 | DEBUG    | prefect.client - Using ephemeral application with database at sqlite
+aiosqlite:///Users/jeffhale/.prefect/prefect.db
14:27:11.799 | DEBUG    | Flow run 'heavy-nightingale' - Executing flow 'log-example-flow' for
flow run 'heavy-nightingale'...
14:27:11.799 | DEBUG    | Flow run 'heavy-nightingale' - Beginning execution...
14:27:11.799 | INFO     | Flow run 'heavy-nightingale' - INFO level log message.
14:27:11.800 | DEBUG    | Flow run 'heavy-nightingale' - You only see this message if the logg
ing level is set to DEBUG. 😊
14:27:11.818 | DEBUG    | prefect.task_runner.concurrent - Shutting down task runner...
14:27:11.818 | INFO     | Flow run 'heavy-nightingale' - Finished in state Completed()
```



Retries



Retries

Specify in task or a flow decorator

@task(retries=2)

@flow(retries=3)



Flow retries

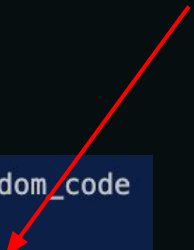
```
import httpx
from prefect import flow

@flow(retries=4)
def fetch_random_code():
    random_code = httpx.get("https://httpstat.us/Random/200,500", verify=False)
    if random_code.status_code >= 400:
        raise Exception()
    print(random_code.text)

if __name__ == "__main__":
    fetch_random_code()
```


Automatic retry

```
File "/Users/jeffhale/Desktop/prefect/pacc-2024-gh/102/retry-flow.py", line 9, in fetch_random_code
    raise Exception()
Exception
15:00:58.298 | INFO      | Flow run 'inquisitive-walrus' - Received non-final state 'AwaitingRetry' when
proposing final state 'Failed' and will attempt to run again...
200 OK
15:01:00.162 | INFO      | Flow run 'inquisitive-walrus' - Finished in state Completed()
```



Automatic retry with delay



Automatic retry with delay

Specify in task or flow decorator

@task(retries=2, retry_delay_seconds=0.1)



Task retries with delay

```
@task(retries=4, retry_delay_seconds=0.1)
def fetch_random_code():
    random_code = httpx.get("https://httpstat.us/Random/200,500", verify=False)
    if random_code.status_code >= 400:
        raise Exception()
    print(random_code.text)
```

👉 You can also pass a list of values or an *exponential_backoff* to *retry_delay_seconds*.



States



Prefect flow run states

What's the state of your workflows?



Prefect flow run states

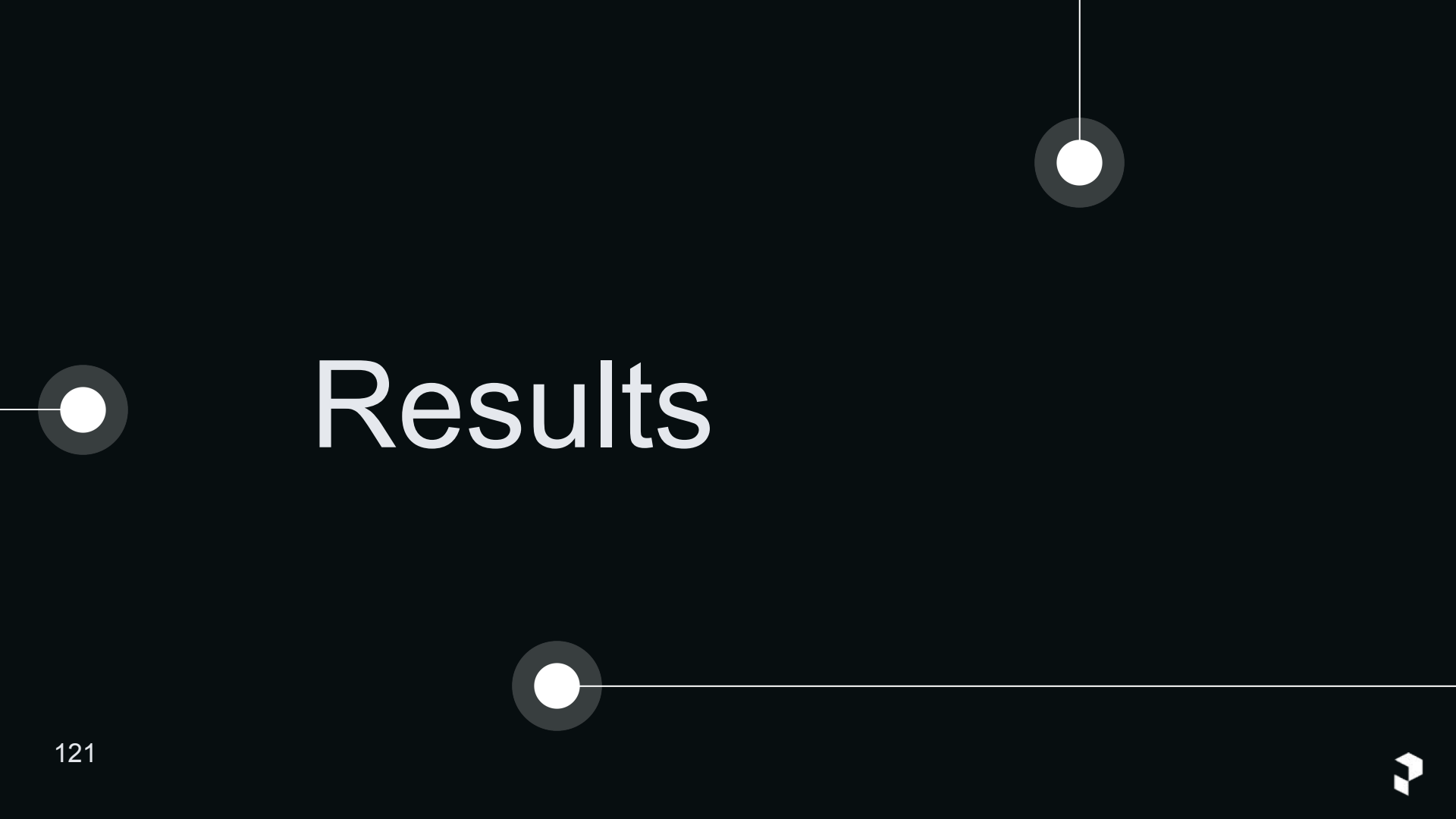
Name	Type	Terminal?	Description
Scheduled	SCHEDULED	No	The run will begin at a particular time in the future.
Late	SCHEDULED	No	The run's scheduled start time has passed, but it has not transitioned to PENDING (5 seconds by default).
AwaitingRetry	SCHEDULED	No	The run did not complete successfully because of a code issue and had remaining retry attempts.
Pending	PENDING	No	The run has been submitted to run, but is waiting on necessary preconditions to be satisfied.
Running	RUNNING	No	The run code is currently executing.
Retrying	RUNNING	No	The run code is currently executing after previously not complete successfully.



Prefect flow run states

Paused	PAUSED	No	The run code has stopped executing until it receives manual approval to proceed.
Cancelling	CANCELLING	No	The infrastructure on which the code was running is being cleaned up.
Cancelled	CANCELLED	Yes	The run did not complete because a user determined that it should not.
Completed	COMPLETED	Yes	The run completed successfully.
Failed	FAILED	Yes	The run did not complete because of a code issue and had no remaining retry attempts.
Crashed	CRASHED	Yes	The run did not complete because of an infrastructure issue.





Results



Results

The data returned by a flow or a task

```
@task
def my_task():
    return 1
```

1 is the result



Passing results

Pass results from one task to another so Prefect can discover dependency relationships at runtime

```
def pipeline(lat: float = 38.9, lon: float = -77.0):  
    temp = fetch_weather(lat, lon)  
    result = save_weather(temp)  
    return result
```

Results

👉 By default, Prefect returns a result that is ***not*** persisted to disk.

Persist results with *`persist_result=True`*

```
from prefect import flow, task
import pandas as pd

@task(persist_result=True)
def my_task():
    df = pd.DataFrame(dict(a=[2, 3], b=[4, 5]))
    return df

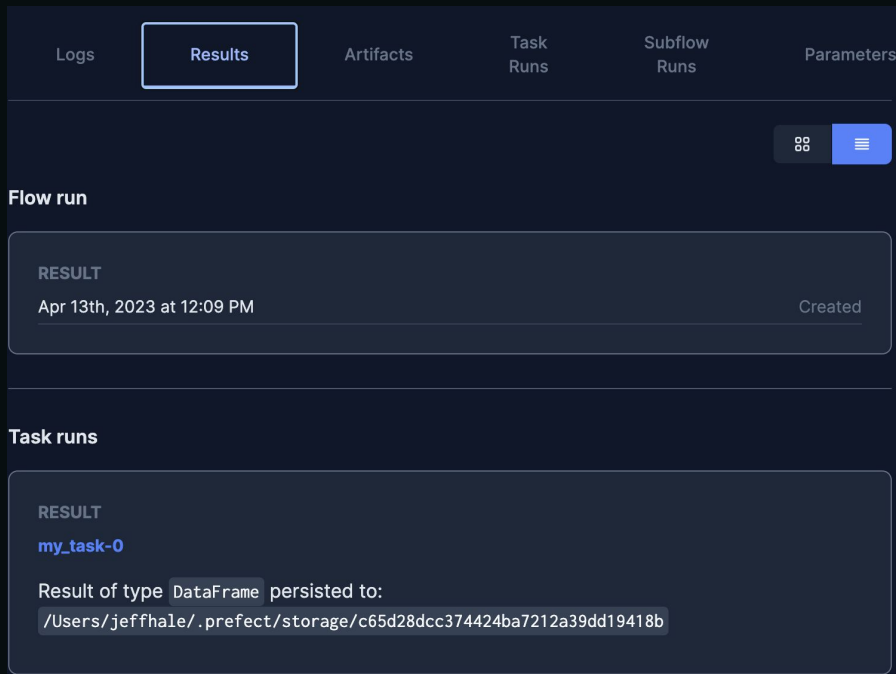
@flow
def my_flow():
    res = my_task()

if __name__ == "__main__":
    my_flow()
```



Results

Info **about** a result is viewable in the UI - **the result is not viewable**



The screenshot displays the Prefect UI interface with the 'Results' tab selected. The top navigation bar includes 'Logs', 'Results' (highlighted), 'Artifacts', 'Task Runs', 'Subflow Runs', and 'Parameters'. Below the navigation bar, there are icons for a grid and a list view. The main content area is divided into two sections: 'Flow run' and 'Task runs'. The 'Flow run' section shows a 'RESULT' for 'Apr 13th, 2023 at 12:09 PM' with a 'Created' status. The 'Task runs' section shows a 'RESULT' for 'my_task-0' with the text 'Result of type DataFrame persisted to: /Users/jeffhale/.prefect/storage/c65d28dcc374424ba7212a39dd19418b'.

Logs Results Artifacts Task Runs Subflow Runs Parameters

Flow run

RESULT
Apr 13th, 2023 at 12:09 PM Created

Task runs

RESULT
my_task-0
Result of type DataFrame persisted to:
/Users/jeffhale/.prefect/storage/c65d28dcc374424ba7212a39dd19418b



Persisted results

- Stored in **.PREFECT/storage** folder by default
- Pickled by default 🥒
- You can use other serializer or compress

```

▼ .PREFECT
  ▼ storage
    {} c65d28dcc374424ba7212a39dd19418b
    ⚙ memo_store.toml
    ≡ prefect.db
    ⚙ profiles.toml

storage > {} c65d28dcc374424ba7212a39dd19418b > ...
1  {"serializer": {"type": "pickle", "picklelib": "cloudpickle", "picklelib_version": "2.2.1"},
2  "data": "gAWVxwIAAAAAACMEXBhbmRhcy5jb3JlLmZyYW1lIiwJRGF0YUZyYW1lJ0UKYGUfZQojARfbWdy\nIwec
3  "prefect_version": "2.10.3"}
4
5
6
```



Results - remote storage

Use a block to store results in cloud provider storage

```
from prefect import flow, task
import pandas as pd
from prefect_gcp.cloud_storage import GCSBucket

# install module with: pip install prefect-gcp
# register block type
# create block

@task(persist_result=True)
def my_task():
    df = pd.DataFrame(dict(a=[2, 3], b=[4, 5]))
    return df

@flow(result_storage=GCSBucket.load("my-bucket-block"))
def my_flow():
    df = my_task()
```





Caching



Caching

What?

Why?

⚠ task only

Requires persisting results (so must be serializable)



Caching: *cache_key_fn*

@task(cache_key_fn=task_input_hash)

```
from prefect import flow, task
from prefect.tasks import task_input_hash

@task(cache_key_fn=task_input_hash)
def hello_task(name_input):
    print(f"Hello {name_input}!")

@flow
def hello_flow(name_input):
    hello_task(name_input)
```



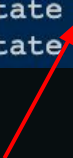
Caching

First run

```
22:32:04.227 | INFO | prefect.engine - Created flow run 'smoky-hippo' for flow 'hello-flow'
22:32:04.311 | INFO | Flow run 'smoky-hippo' - Created task run 'hello_task-0' for task 'hello_task'
22:32:04.311 | INFO | Flow run 'smoky-hippo' - Executing 'hello_task-0' immediately...
Hello Liz!
22:32:04.353 | INFO | Task run 'hello_task-0' - Finished in state Completed()
22:32:04.368 | INFO | Flow run 'smoky-hippo' - Finished in state Completed('All states completed.')
```

Second run

```
22:33:02.606 | INFO | prefect.engine - Created flow run 'able-scallop' for flow 'hello-flow'
22:33:02.701 | INFO | Flow run 'able-scallop' - Created task run 'hello_task-0' for task 'hello_task'
22:33:02.702 | INFO | Flow run 'able-scallop' - Executing 'hello_task-0' immediately...
22:33:02.720 | INFO | Task run 'hello_task-0' - Finished in state Cached(type=COMPLETED)
22:33:02.735 | INFO | Flow run 'able-scallop' - Finished in state Completed('All states completed.')
```



Caching: *cache_expiration*

```
from prefect import flow, task
from prefect.tasks import task_input_hash
from datetime import timedelta

@task(cache_key_fn=task_input_hash, cache_expiration=timedelta(minutes=1))
def hello_task(name_input):
    print(f"Hello {name_input}!")

@flow
def hello_flow(name_input):
    hello_task(name_input)
```

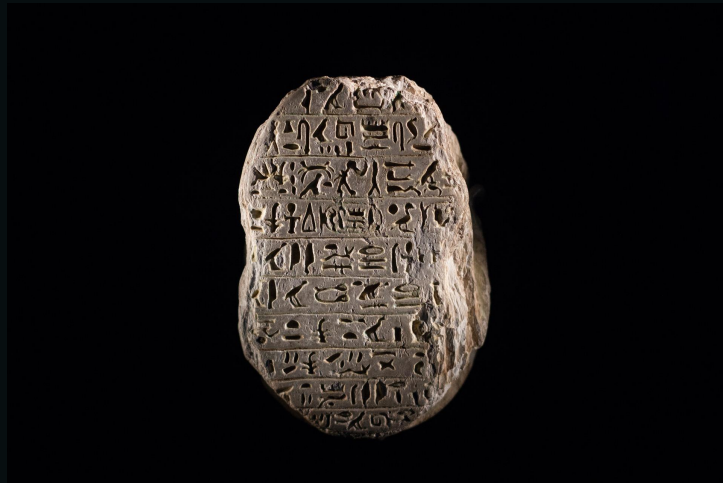


Artifacts



Artifacts

Persisted outputs such as Markdown, tables, or links.



Artifacts

- Meant for human consumption
- Examples:
 - Model scores
 - Data quality checks
 - Reports
- A type of result



Artifacts - Markdown example

```
import httpx
from prefect import flow, task
from prefect.artifacts import create_markdown_artifact

@task
def mark_it_down(temp):
    markdown_report = f"""# Weather Report

## Recent weather

| Time          | Revenue |
|:-----|:-----:|
| Now | {temp} |
| In 1 hour          | {temp + 2} |
"""
    create_markdown_artifact(
        key="weather-report",
        markdown=markdown_report,
        description="Very scientific weather report",
    )
```



Artifacts - Markdown Example

Access from *Artifacts* page
(or *Flow Runs* if part of a flow run)

Very scientific weather report

ArtifactDetailsRaw

Weather Report

Recent weather

Time	Revenue
Now	26.0
In 1 hour	28.0





Caching

Caching

What?


Why?




task only

Requires persisting results (so must be serializable)





More helpful resources



Prefect CLI

Start commands with *prefect* *--help* is always available



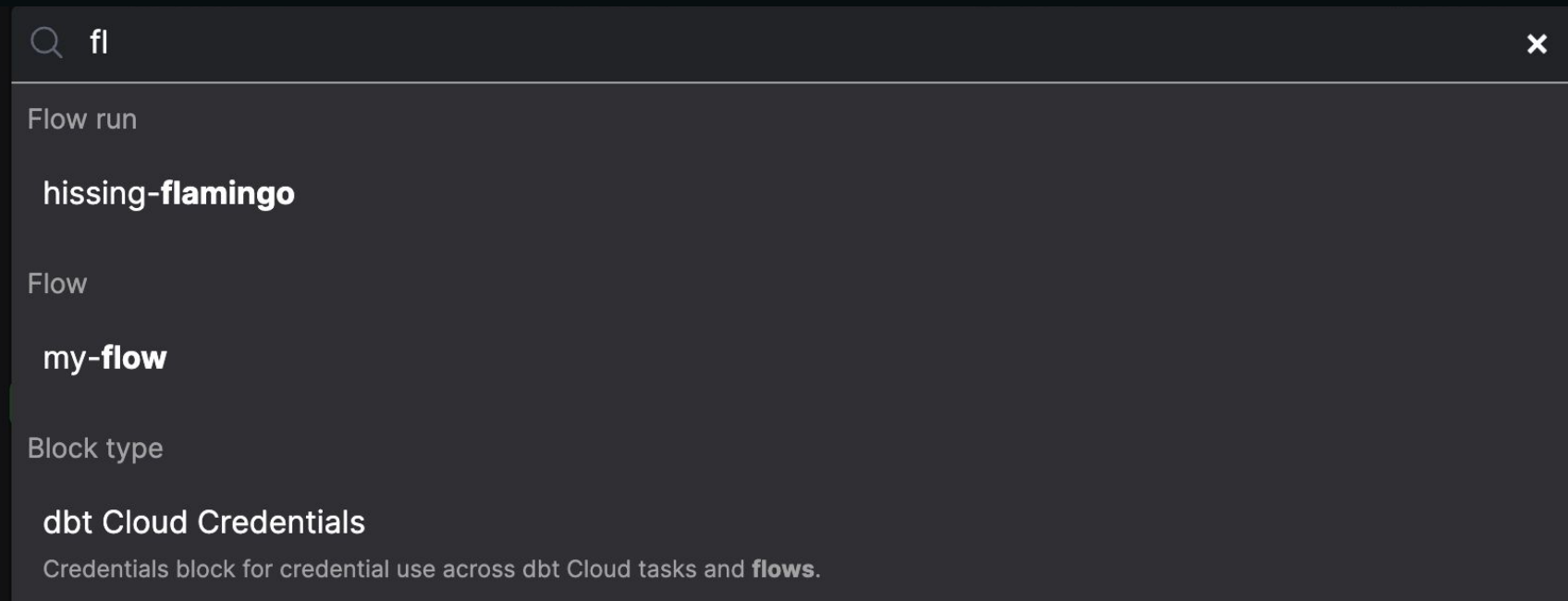
prefect --help

Commands

agent	Commands for starting and interacting with agent processes.
artifact	Commands for starting and interacting with artifacts.
block	Commands for working with blocks.
cloud	Commands for interacting with Prefect Cloud
concurrency-limit	Commands for managing task-level concurrency limits.
config	Commands for interacting with Prefect settings.
deploy	Deploy a flow from this project by creating a deployment.
deployment	Commands for working with deployments.
dev	Commands for development.
flow	Commands for interacting with flows.
flow-run	Commands for interacting with flow runs.
kubernetes	Commands for working with Prefect on Kubernetes.
profile	Commands for interacting with your Prefect profiles.
project	Commands for interacting with your Prefect project.
server	Commands for interacting with the Prefect backend.
variable	Commands for interacting with variables.
version	Get the current Prefect version.
work-pool	Commands for working with work pools.
work-queue	Commands for working with work queues.
worker	Commands for starting and interacting with workers.

Search in the UI

cmd + k or 



102 Recap

You've seen more of the power of Prefect.

- Tasks
- Logging
- States
- Retries
- Caching
- Results
- Artifacts
- More resources: *help* & search



Lab 102




Lab 102

- Use a flow that grabs weather data from open-meteo
- Add at least three tasks
- Add retries
- Run your flow
- Inspect in the UI
- Stretch: create an artifact
- Stretch: add caching



Lab 102: a solution

One person from each group, share your code in
Slack 

Discuss

Questions?



If you give an engineer a job...


Could you just fetch this data and save it? Oh, and ...

1. set up logging?
2. do it every hour?
3. visualize the dependencies?
4. automatically retry if it fails?
5. create an artifact for human viewing?
6. add caching?
7. add collaborators to run and view - who don't code?
8. send me a message when it succeeds?
9. run it in a Docker container-based environment?
10. pause for input?
11. automatically declare an incident when a % of workflows fail?
12. automatically run it in response to an event?



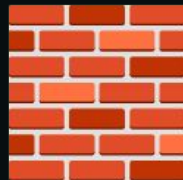
103 - Blocks & Cloud features

103 Agenda

- Blocks 
- Cloud features
- Automations
- Events

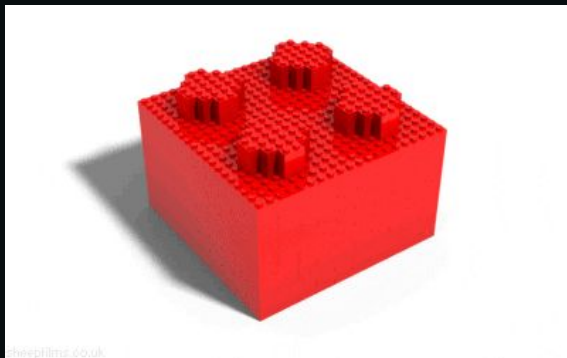


Blocks



Blocks

Blocks are a cool Prefect feature



Available on Cloud and self-hosted

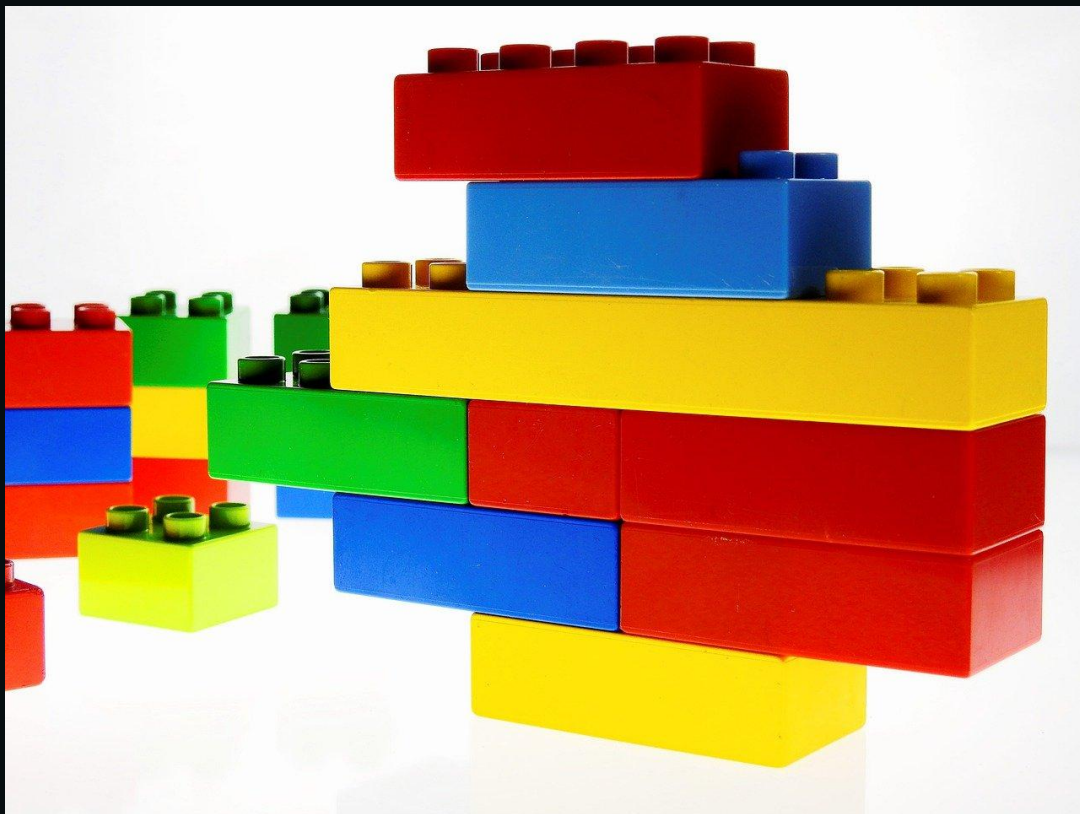


Blocks

Configuration

+

Code



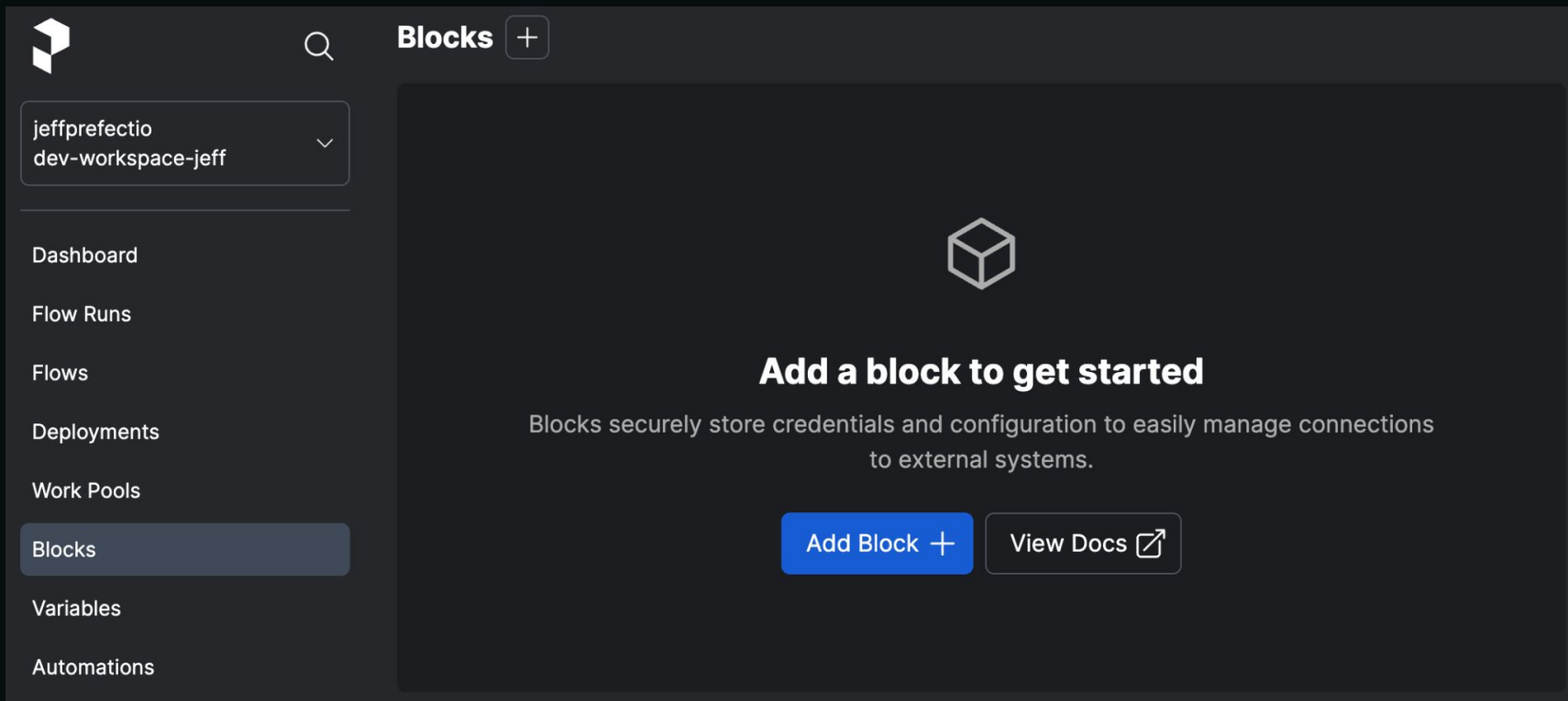
Blocks

The Block mullet:

Structured form in front,
flexible code in back



Create a Block from the UI



Create a block from the UI - choose a block type

 Remote File System Store data as a file on a remote file system. Supports any remote file system supported by <code>'fsspec'</code> . The file system is specified using a protocol. For example, "s3://my-..." <code>get-directory</code> <code>put-directory</code> <code>read-path</code> <code>write-path</code> Add +	 S3 Store data as a file on AWS S3. <code>get-directory</code> <code>put-directory</code> <code>read-path</code> <code>write-path</code> Add +	 S3 Bucket Block used to store data using AWS S3 or S3-compatible object storage like MinIO. This block is part of the <code>prefect-aws</code> collection. Install <code>prefect-aws</code> with <code>'pip install...</code>
 Secret A block that represents a secret value. The value stored in this block will be obfuscated when this block is logged or shown in the UI. Add +	 Shell Operation A block representing a shell operation, containing multiple commands. For long-lasting operations, use the <code>trigger</code> method and utilize the block as a context...	 Slack Credentials Block holding Slack credentials for use in tasks and flows. This block is part of the <code>prefect-slack</code> collection. Install <code>prefect-slack</code> with <code>'pip install prefect-slack'</code> to use this block.
 Slack Incoming Webhook	 Slack Webhook	 SMB



Create a block from the UI

Blocks / Choose a Block / Slack Webhook / Create

Block Name

Webhook URL

Slack incoming webhook URL used to send notifications.

Notify Type (Optional)

The type of notification being performed; the prefect_default is a plain notification that does not attach an image.

Cancel

Create



Slack Webhook

Enables sending notifications via a provided Slack webhook.

notify



Block types in UI - filter by capability


Blocks / Choose a Block

If you don't see a block for the service you're using, check out our [Collections Catalog](#) to view a list of integrations and their corresponding blocks.

9 Blocks

Search blocks

Capability: notify




Discord Webhook

Enables sending notifications via a provided Discord webhook.

notify

Add +




Email

Block that allows an email to be sent to a list of email addresses via Sendgrid. This block is only available for use within automations and cannot be used within user flows.

notify

Add +




Mattermost Webhook

Enables sending notifications via a provided Mattermost webhook.

notify

Add +




Microsoft Teams Webhook

Enables sending notifications via a provided Microsoft Teams webhook.

notify

Add +




Opsgenie Webhook

Enables sending notifications via a provided Opsgenie webhook.

notify

Add +




Pager Duty Webhook

Enables sending notifications via a provided PagerDuty webhook.

notify

Add +




Sendgrid Email

Enables sending notifications via Sendgrid email service.

notify

Add +




Slack Webhook

Enables sending notifications via a provided Slack webhook.

notify

Add +



Twilio SMS

Enables sending notifications via Twilio SMS.

notify

Add +



Under the hood, block types are Python classes



Blocks are instances of those Python classes

Blocks / jaffle-shop

Paste this snippet into your flows to use this block.

```
from dataplatform.blocks import Dbt

dbt = Dbt.load("jaffle-shop")
```

Workspace

default

Path To Dbt Project


dbt_jaffle_shop

Retries

3

Retry Delay Seconds

10



Dbt

A block for interacting with dbt

dbt_cli

dbt_run_from_manifest



Create a block in Python

```
from prefect.blocks.system import Secret

my_secret_block = Secret(value="shhh!-it's-a-secret")
my_secret_block.save(name="secret-thing")
```



Retrieve and use a block in Python

```
from prefect.blocks.system import Secret

secret_block = Secret.load("secret-thing")
print(secret_block.get())
```



Blocks

Reusable, modular, configuration + code

- Better than hard coding
- Better than environment variables
- Nestable
- Can create own types



Integrations













Integrations

docs.prefect.io/integrations/catalog/

Integrations

Prefect integrations are organized into collections of pre-built **tasks**, **flows**, **blocks** and more that are installable as PyPI packages.

<div>Airbyte</div>  <div>Maintained by Prefect</div>	<div>Alert</div>  <div>Maintained by Khuyen Tran</div>	<div>AWS</div>  <div>Maintained by Prefect</div>	<div>Azure</div>  <div>Maintained by Prefect</div>	<div>Bitbucket</div>  <div>Maintained by Prefect</div>
<div>Census</div>  <div>Maintained by Prefect</div>	<div>CubeJS</div>  <div>Maintained by Alessandro Lollo</div>	<div>Dask</div>  <div>Maintained by Prefect</div>	<div>Databricks</div>  <div>Maintained by Prefect</div>	<div>dbt</div>  <div>Maintained by Prefect</div>



Integrations

Python packages that add convenience

- 40+ integrations
- Template to create your own
- Can contribute to the community
- Often add new block types you will register





Prefect Cloud



Prefect Cloud

- Server is hosted by Prefect
- Workspaces
- Service Accounts
- RBAC
- SSO
- Automations
- Events



Prefect Cloud Workspaces

- Paid plans can have multiple workspaces
- Each workspace is self-contained



Prefect Cloud - Free Tier

- 2 free users
- 1 free workspace
- 7 day flow run history



Prefect Cloud - Pro Tier

- Service accounts
- SSO
- RBAC
- 30 day flow run history
- 72 hour audit log
- Higher rate limits
- More automations



Prefect Cloud - Enterprise Tier

- Custom roles
- Object access control lists
- SSO SCIM
- Custom most everything 😊



Prefect Cloud

FREE

Free Forever

Great for getting started, solo data practitioners, and proof-of-concepts.

[CREATE YOUR WORKSPACE >](#)

- All core features
- Automations
- Basic auth & collaboration
- Basic data retention

PRO

POWERFUL

\$450/Month

For teams with production workflows or access management requirements

[SIGN UP NOW >](#)

- Role-based access control
- SSO enforcement
- Service Accounts
- Longer data retention & audit log

ENTERPRISE

Contact Us

For large teams or for companies with specific security requirements.

[GET IN TOUCH >](#)

- SCIM, Custom Roles
- Object-level permissions
- Discounts, custom terms, support
- Longest data retention



Prefect Cloud - Default Roles (Pro + Enterprise)


Account level

- Owner
- Admin
- Member



Workspace level

- Owner
- Developer
- Runner
- Viewer
- Worker





Error summaries by Marvin AI



Error summaries by Marvin AI

Settings

jeffprefectio

- Profile
- API Keys
- Billing
- Preferences
- Feature Previews
- Settings

Data Controls

Marvin AI

Marvin AI-enabled features may utilize third party models. See our [data processing addendum](#) and [sub processors documentation](#) for more information.

☒

Profile

API Keys

Billing

Preferences

Feature previews






Settings






Sign out





Jeff Hale
jeff@prefect.io



Error summaries by Marvin AI

☐ **get-info** > **zircon-tapir**
 **Failed**  2023/09/25 03:29:38 PM  1s  None
 Failed due to a `IndexError` in the `get_info` task; range object index out of range.

☐ **ml-flow** > **translucent-pogona**
 **Failed**  2023/09/25 03:16:42 PM  1s  1 task run
 Failed due to a `ZeroDivisionError` in the `compute` task with message 'division by zero'.

☐ **ml-flow** > **wealthy-firefly**
 **Completed**  2023/09/25 03:16:25 PM  2s  1 task run



Cloud features: automations, events API, incidents

Dashboard

Flow Runs

Flows

Deployments

Work Pools

Blocks

Variables

→ Automations

→ Event Feed

→ Event Webhooks

Artifacts

→ Incidents Beta

Settings >



Automations



Automations




Cloud only

Flexible framework

- If *Trigger* happens, do *Action*
- If *Trigger* doesn't happen in a time period, do *Action*



Automation examples

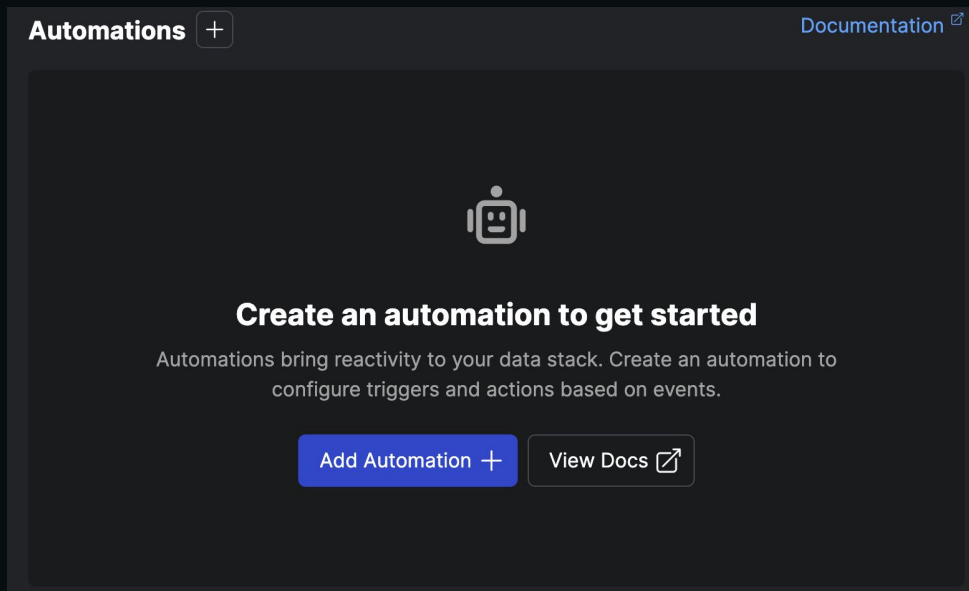
- If a flow run with tag **prod** fails, send an email 
- If a data quality check fails, run a deployment to fetch more data 
- If a work pool changes state to *Not Ready*, create an incident 



Create an automation

Trigger: flow run failure

Action: notification - email



Automation trigger

Automations / Create[Documentation](#)

01 Trigger

02 Actions

03 Details

Trigger Type

Flow run state

Flows

All flows

Flow Run Tags

All tags

Flow Run

Enters

Any state

Cancel

Previous

Next



Automation action

Automations / Create[Documentation](#)

✓ Trigger

02 Actions

03 Details

Action 1

✕

Action Type

Send a notification

Block

Add +

Subject

Prefect flow run notification

Body

Flow run {{ flow.name }}/{{ flow_run.name }} observed in state '{{ flow_run.state.name }}'
Flow ID: {{ flow_run.flow_id }}
Flow run ID: {{ flow_run.id }}
Flow run URL: {{ flow_run.ui_url }}
State message: {{ flow_run.state.message }}




Create a block with **notify** capability

Blocks / Choose a Block

If you don't see a block for the service you're using, check out our [Collections Catalog](#) to view a list of integrations and their corresponding blocks.

10 Blocks

Capability: notify




Discord Webhook

Enables sending notifications via a provided Discord webhook.

notify

Add +




Email

Block that allows an email to be sent to a list of email addresses via Sendgrid. This block is only available for use within automations and cann...

notify

Add +



Mattermost Webhook

Enables sending notifications via a provided Mattermost webhook.

notify

Add +



Create an Email block

Blocks / Choose a Block / Email / Create

Block Name

Emails

List of email addresses to send the email to

1
2
3

`["recipient1@example.com", "recipient2@example.com"]`

Format



Email

Block that allows an email to be sent to a list of email addresses via Sendgrid. This block is only available for use within automations and cannot be us...

notify

Cancel

Create





Events



Events

- A record of what has happened
- A notification of a change

Represent:

- API calls
- State transitions
- Changes in environment



Workspace Events

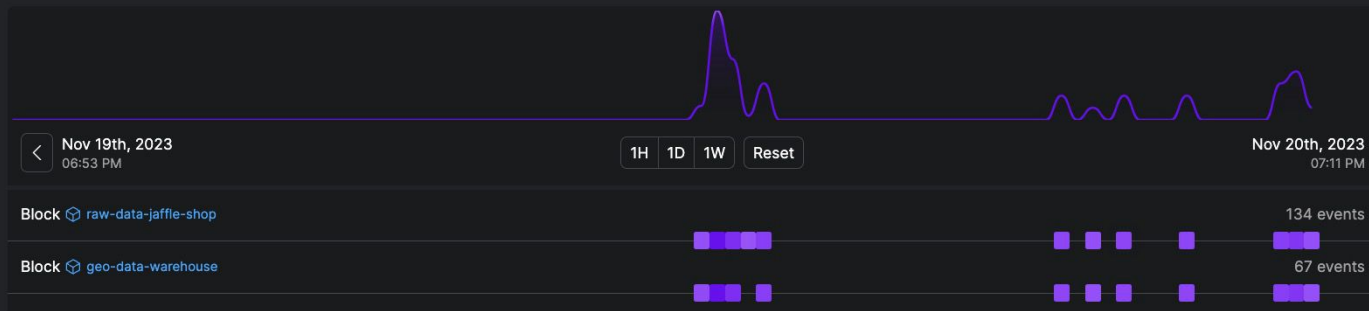
Resource

All resources

Events

prefect.block.s3-bucket.* ×

prefect.block.snowflake-connection.* ×



06:05:16 PM
Nov 20th, 2023



Block snowflake connection read sql called

prefect.block.snowflake-connection.read_sql.called

Resource

Block geo-data-warehouse

Related Resources

prefect.block-type.snowflake-connection Flow run liberal-mule Task run get_geographical_data-0 Flow data-cleaning-flow Deployment k8s-deployment

Work queue default Work pool my-k8s-pool

06:05:15 PM
Nov 20th, 2023



Block snowflake connection load called

prefect.block.snowflake-connection.load.called

Resource

Block geo-data-warehouse

Related Resources

prefect.block-type.snowflake-connection Flow run liberal-mule Task run get_geographical_data-0 Flow data-cleaning-flow Deployment k8s-deployment

Work queue default Work pool my-k8s-pool

06:05:09 PM
Nov 20th, 2023



Block s3 bucket read path called

prefect.block.s3-bucket.read_path.called

Resource

Block raw-data-jaffle-shop

Related Resources

prefect.block-type.s3-bucket Flow run wild-inchworm Task run read_csv_to_df-1 Flow load-in-historical-data



Event Feed



Events

Power several Cloud features

- flow run logs
- audit logs
- automations (triggers)




103 Recap


You've learned about

- Blocks
- Integrations
- Prefect Cloud features
- Error summaries by Marvin AI
- Automations
- Events





Lab 103



103 Lab

- Make an email notification automation for a flow run completion
- Run a flow a few times from the CLI
- See the event feed in the UI
- Stretch: create an automation that filters by a **flow run tag** - set the tag in your deployment




If you give an engineer a job...

Could you just fetch this data and save it? Oh, and ...

1. set up logging?
2. do it every hour?
3. visualize the dependencies?
4. automatically retry if it fails?
5. create an artifact for human viewing?
6. add caching?
7. add collaborators to run and view - who don't code?
8. send me a message when it succeeds?
9. run it in a Docker container-based environment?
10. pause for input?
11. automatically declare an incident when a % of workflows fail?
12. automatically run it in response to an event?



Lab 103: a solution

One person from each group, share your code in
Slack 

Discuss

Questions?

