



MACHINE LEARNING WORKFLOWS FOR APPLICATION DEVELOPERS

Sophie Watson • @sophwats • sophie@redhat.com

William Benton • @willb • willb@redhat.com

Michael McCune • @FOSSJunkie • elmiko@redhat.com

What you'll learn today

Processes and principles to solve problems with ML

Some tricks to visualize complex data

How to train, evaluate, and deploy ML models

How OpenShift makes it all easier



Legal disclaimer

The content set forth herein does not constitute in any way a binding or legal agreement or impose any legal obligation or duty on Red Hat. This information is provided for discussion purposes only and is subject to change for any or no reason.

Forecast

What is machine learning?

What workflow do machine learning practitioners use?

How can we incorporate machine learning into apps?

What do we have to look forward to?

The background is a solid red color with a pattern of diagonal lines and small dots, creating a sense of motion and depth.

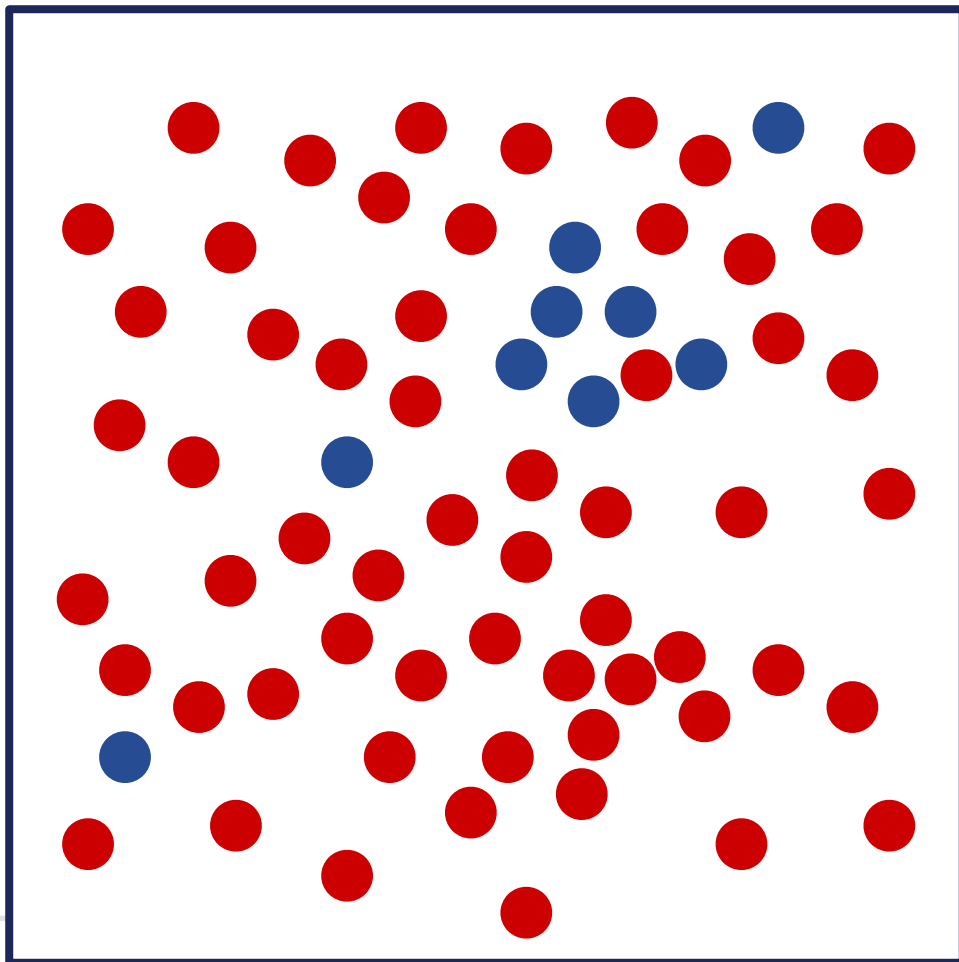
What is machine learning?

Machine learning is a family of techniques to automatically derive executable functions from example inputs and outputs.

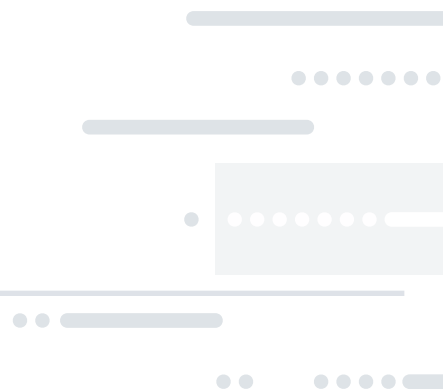


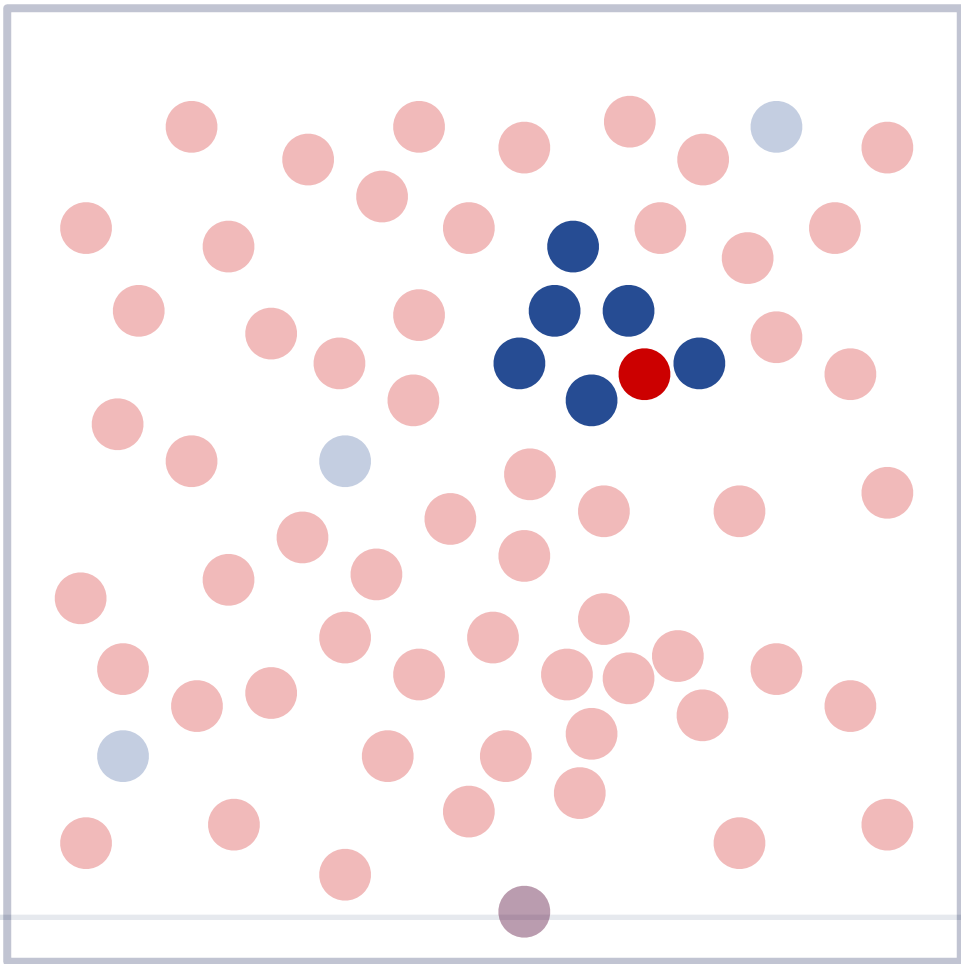


$$f(\text{✉}) = \begin{array}{|c|c|c|} \hline 0.67 & 0.57 & 0.84 \\ \hline \end{array} \dots \begin{array}{|c|c|c|} \hline 0.08 & 0.42 & 0.01 \\ \hline \end{array}$$

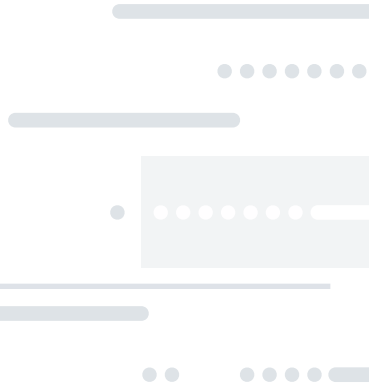


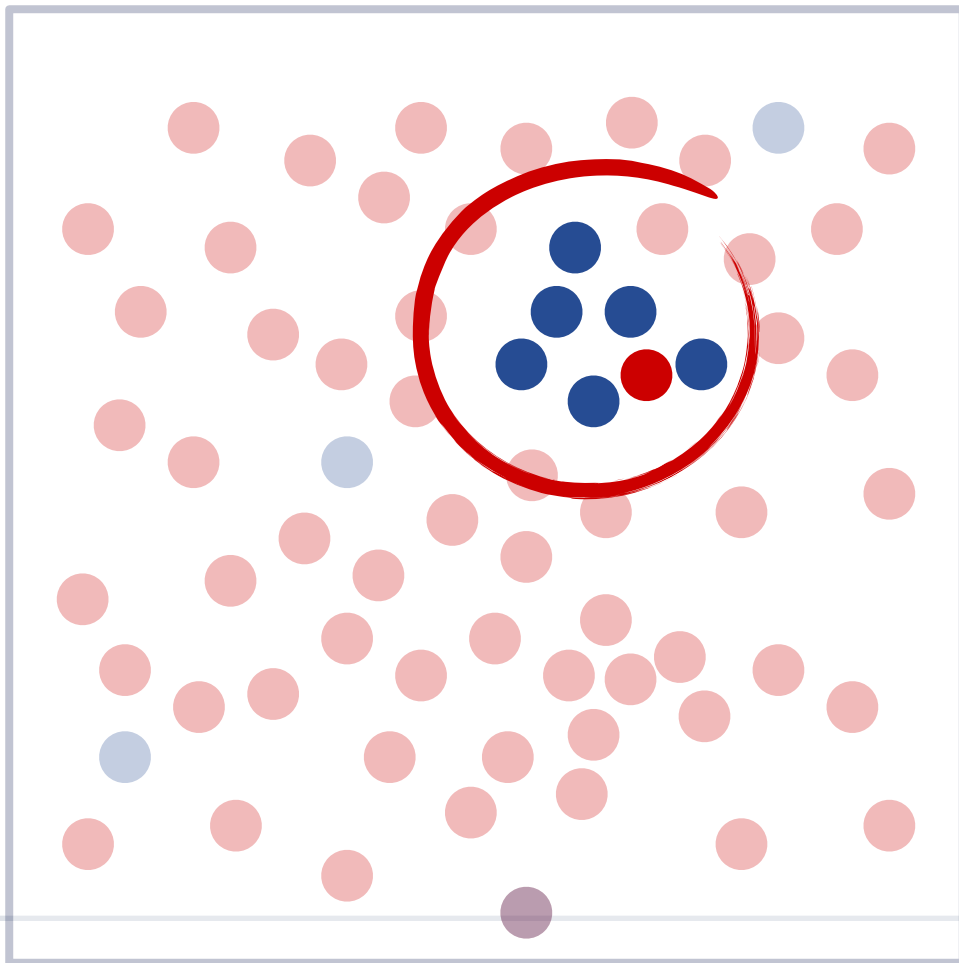
#redhat #rhsummit

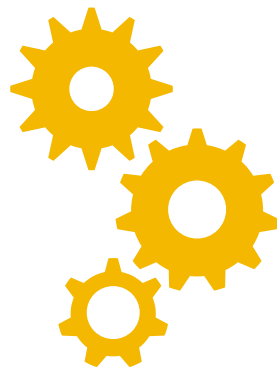
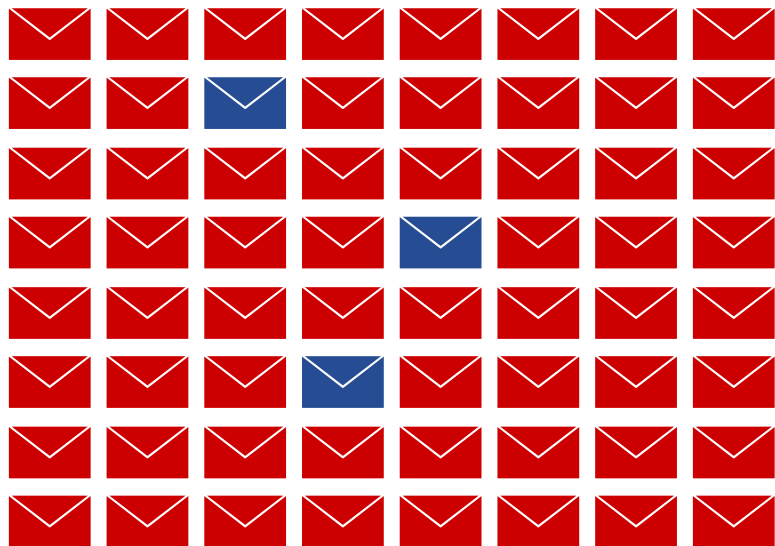


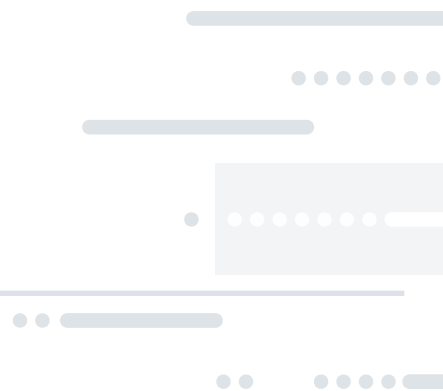
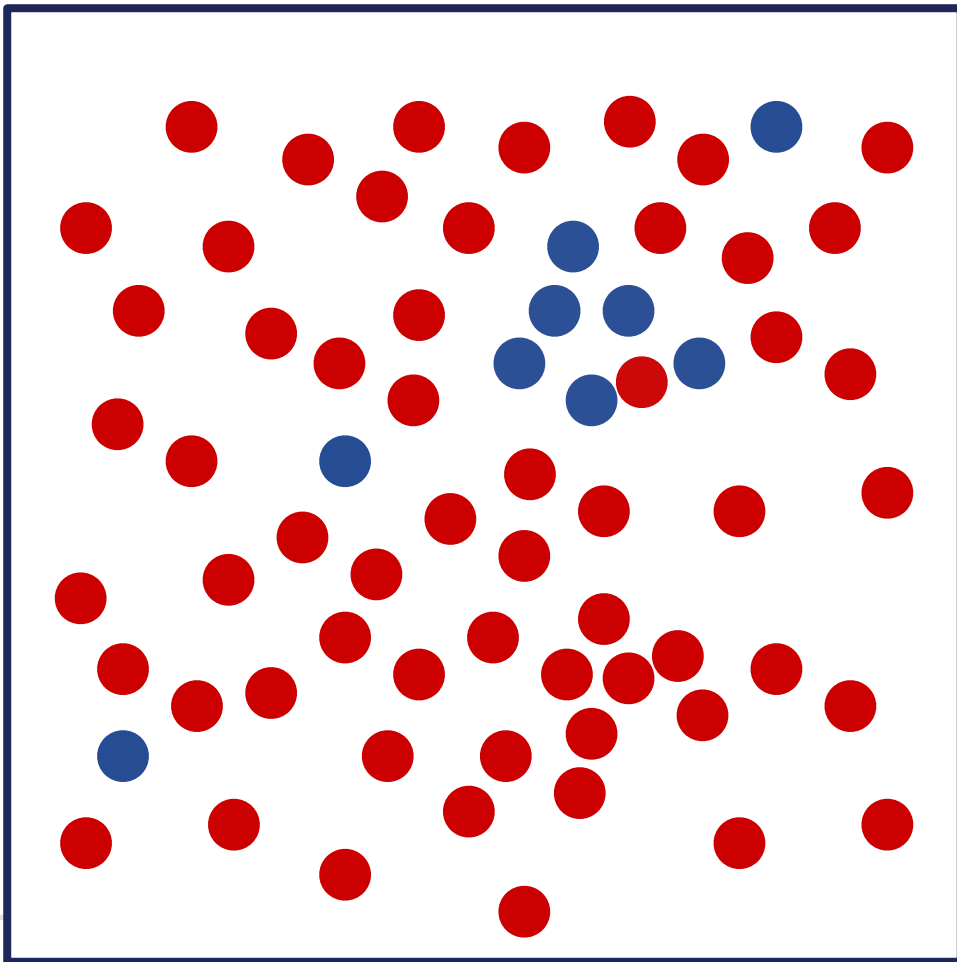


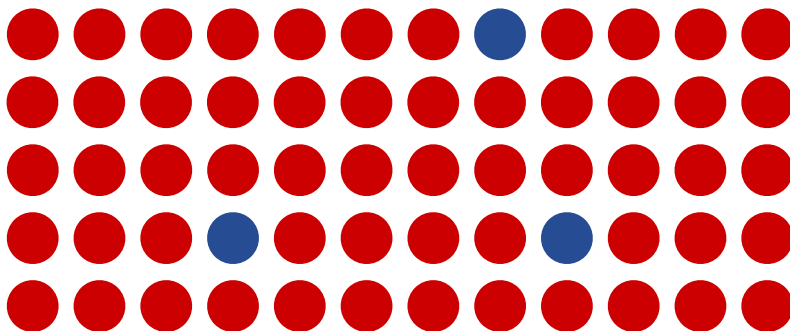
#redhat #rhsummit











Machine learning workflows

Machine learning checklist

Example data

A training objective and a business metric

A concrete learning technique

A way to encode data

**codifying problem
and metrics**



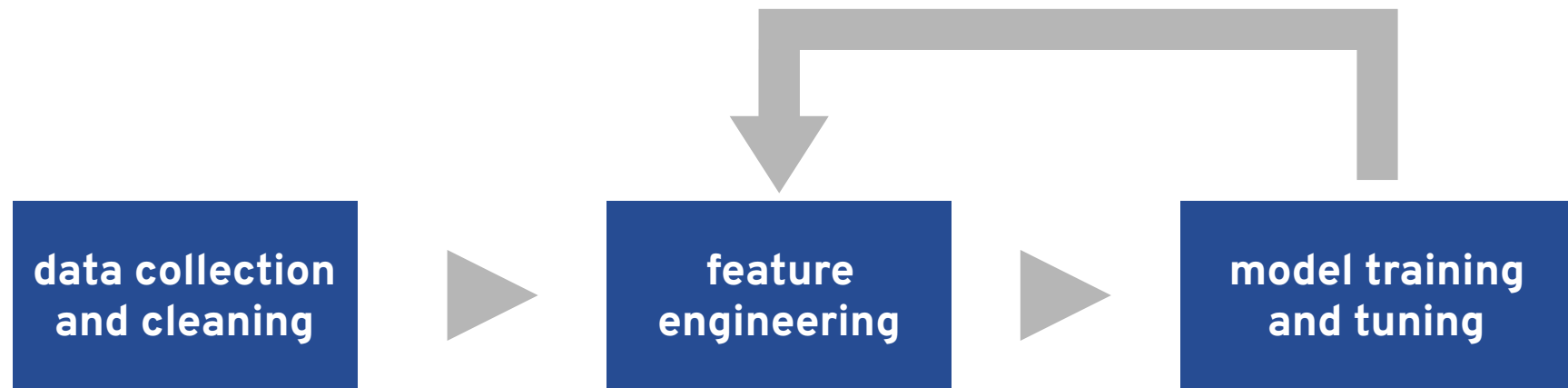
**data collection
and cleaning**

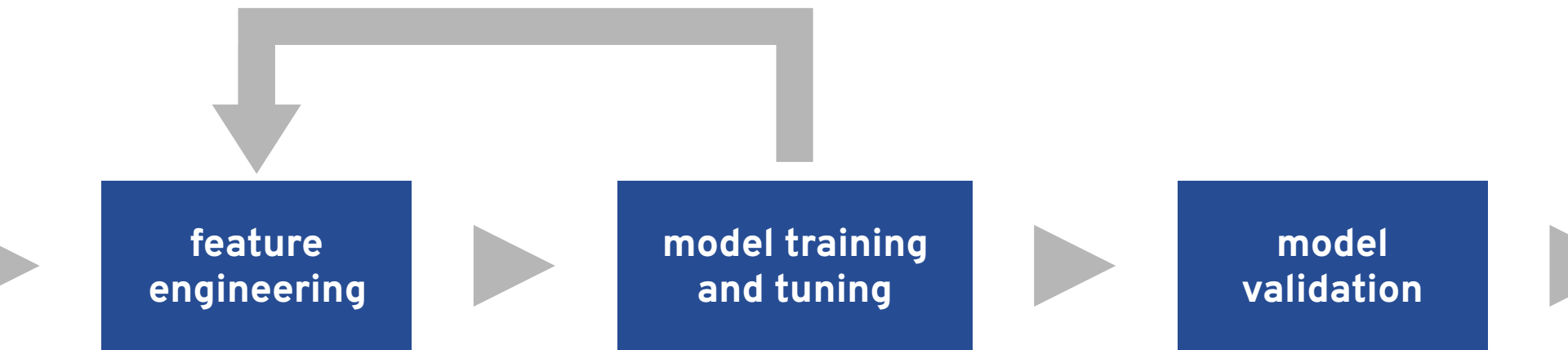


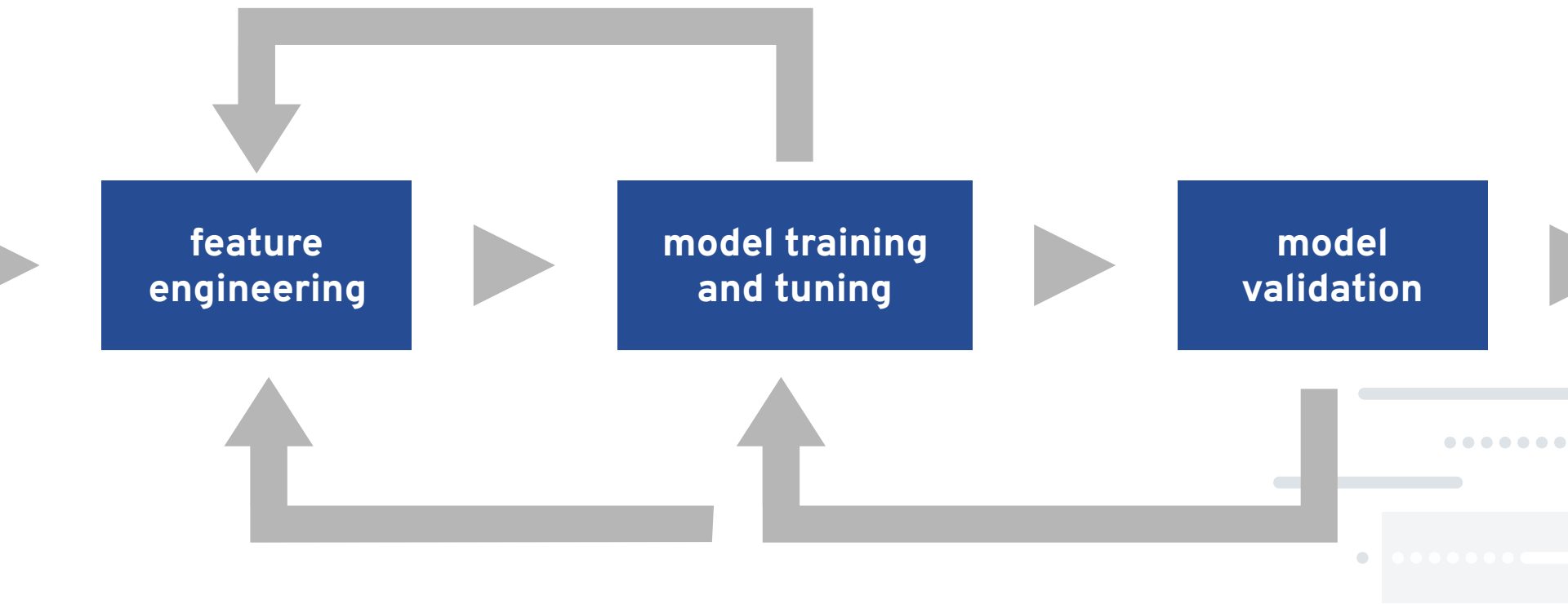
**data collection
and cleaning**

**feature
engineering**

**model training
and tuning**



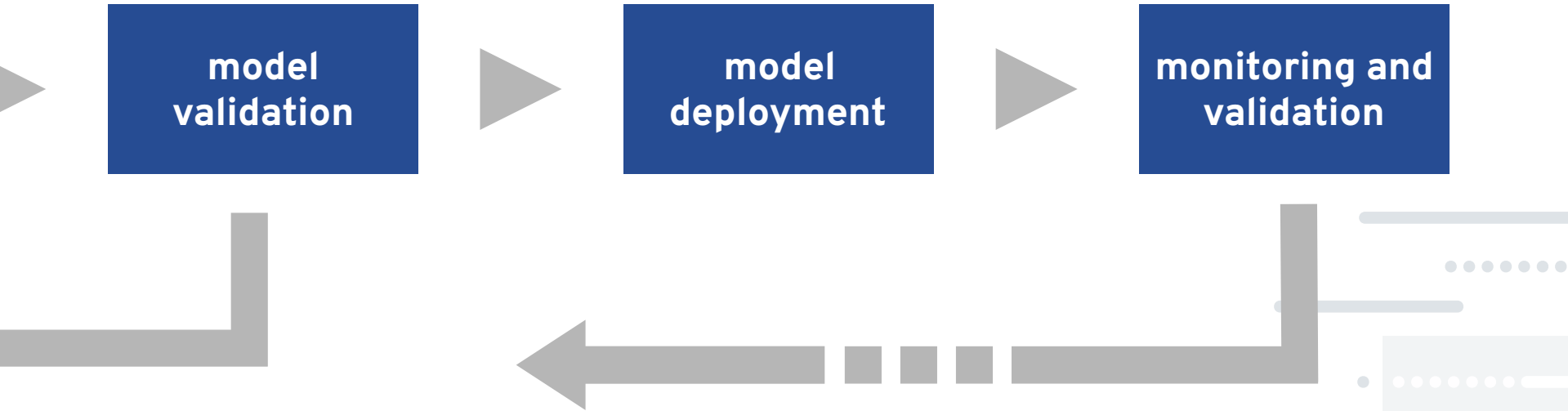


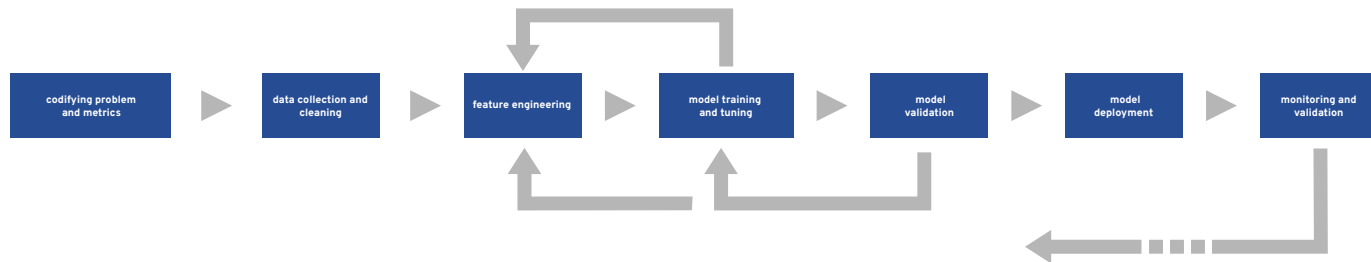


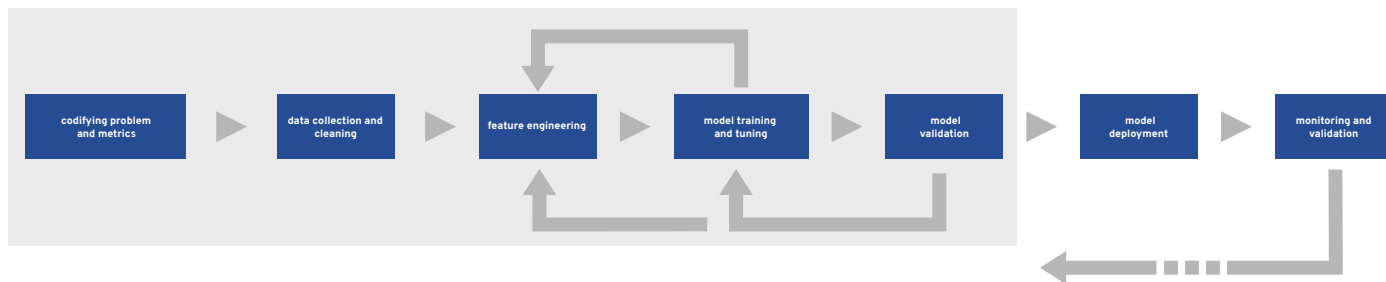
**model
validation**

**model
deployment**

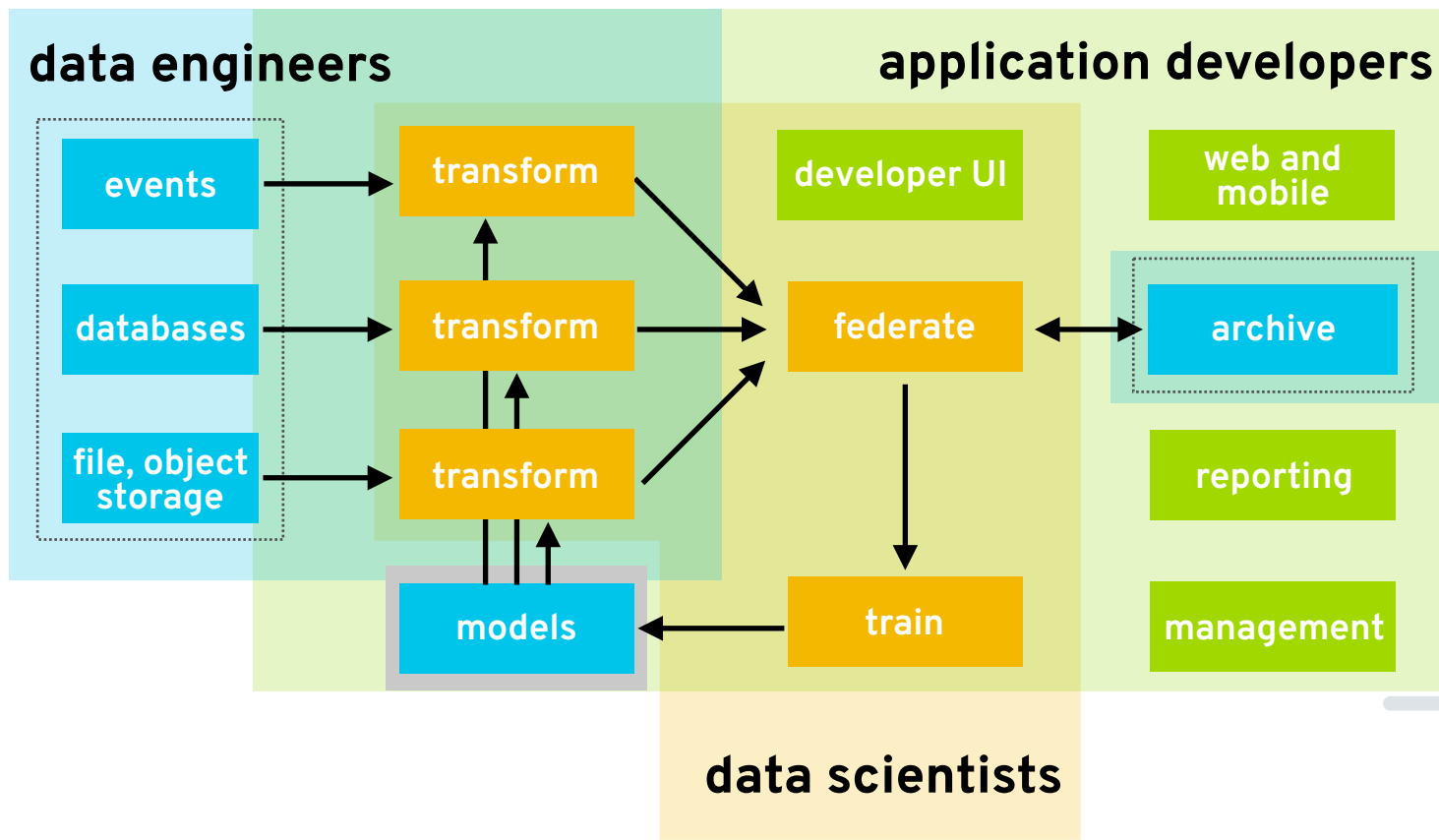
**monitoring and
validation**







Machine learning, apps, and OpenShift



Immutable images

user application code

a6afd91e
6b8cad3e

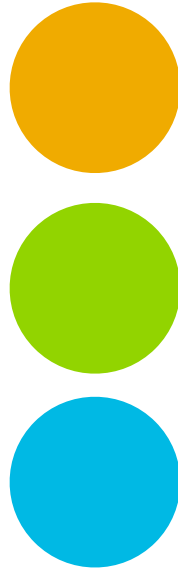
**configuration and
installation recipes**

33721112
e8cae4f6
2bb6ab16
a8296f7e

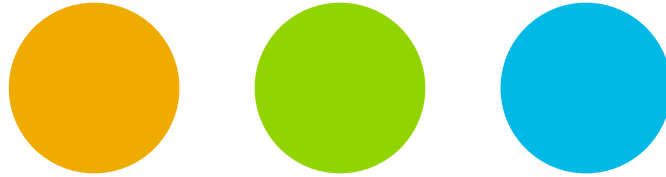
base image

979229b9

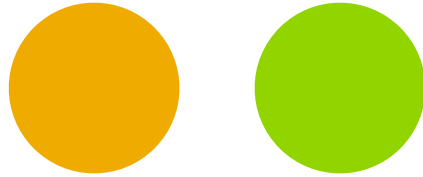
Stateless microservices



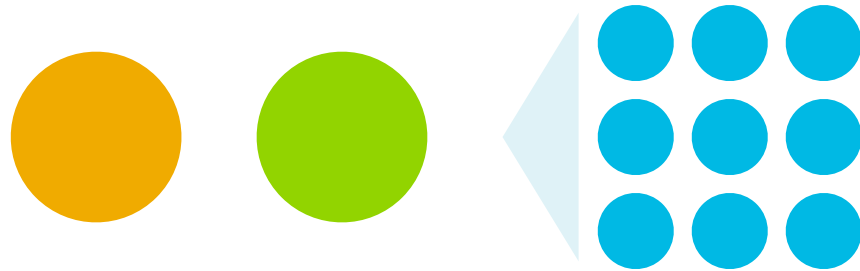
Stateless microservices



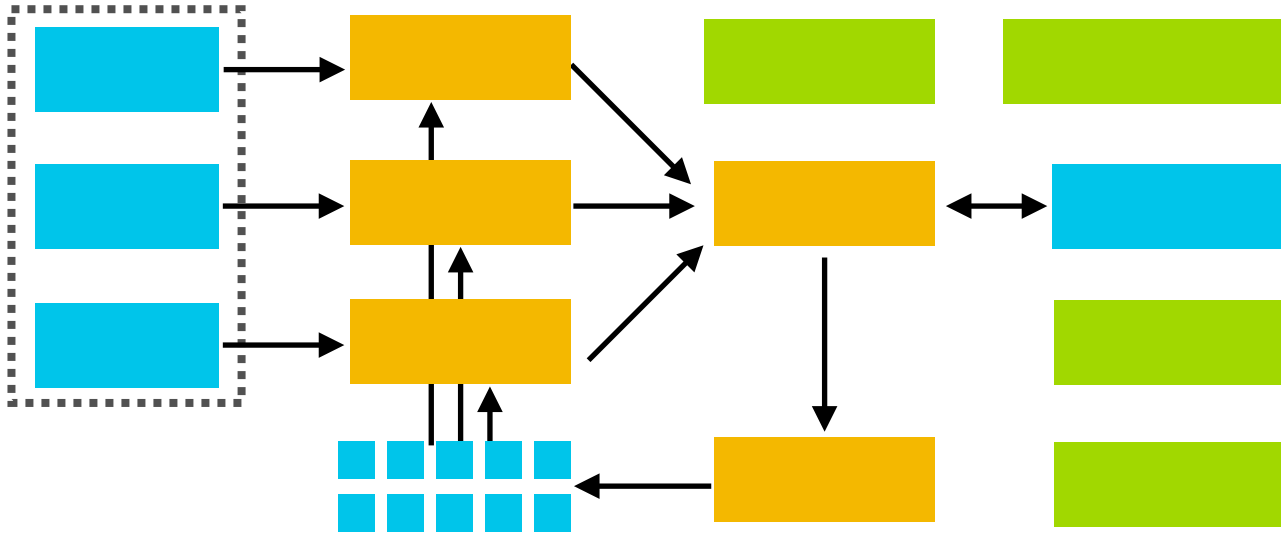
Stateless microservices



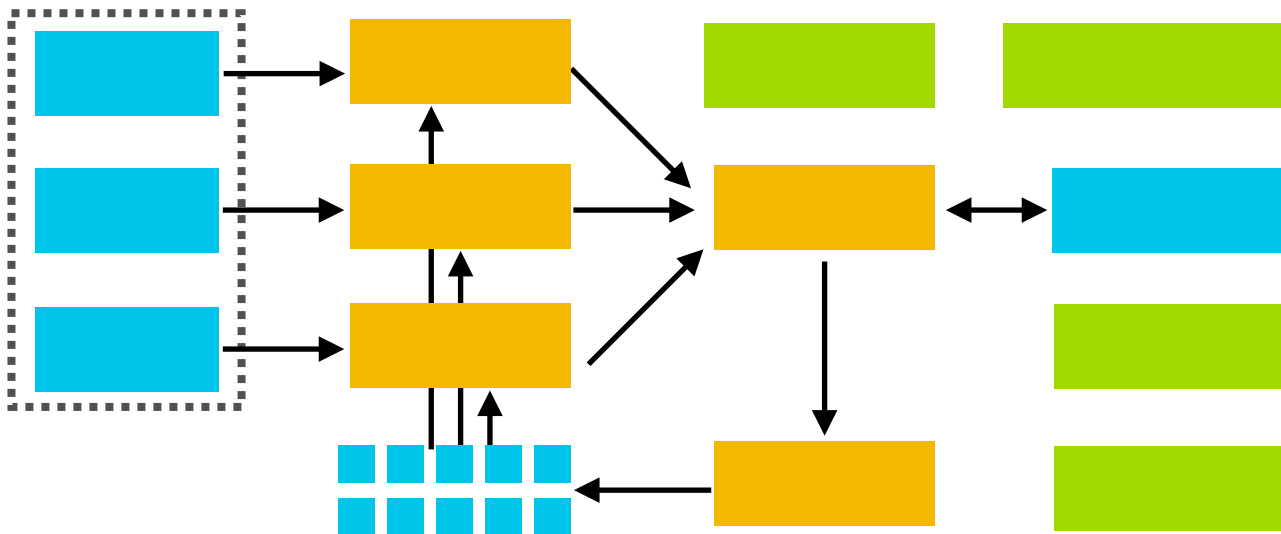
Stateless microservices



Declarative app configuration



Declarative app configuration



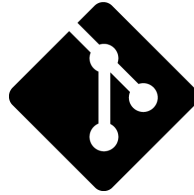
<https://summit.radanalyticslabs.io>

Integration and deployment



git

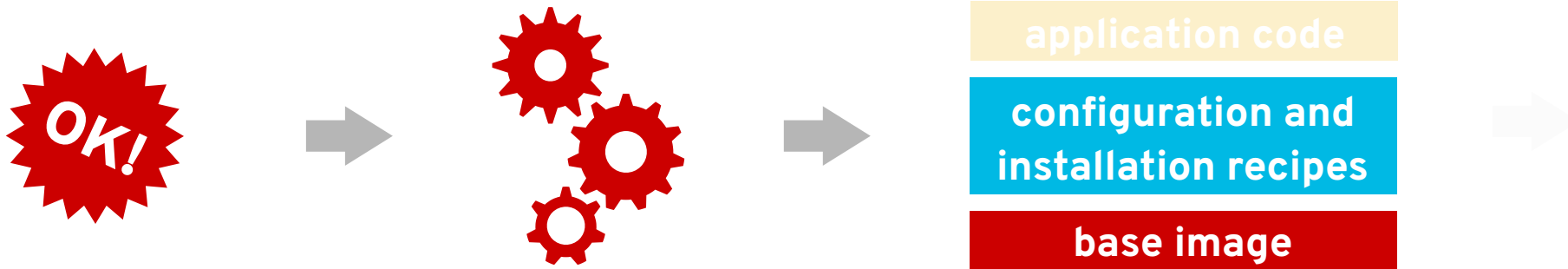
Integration and deployment



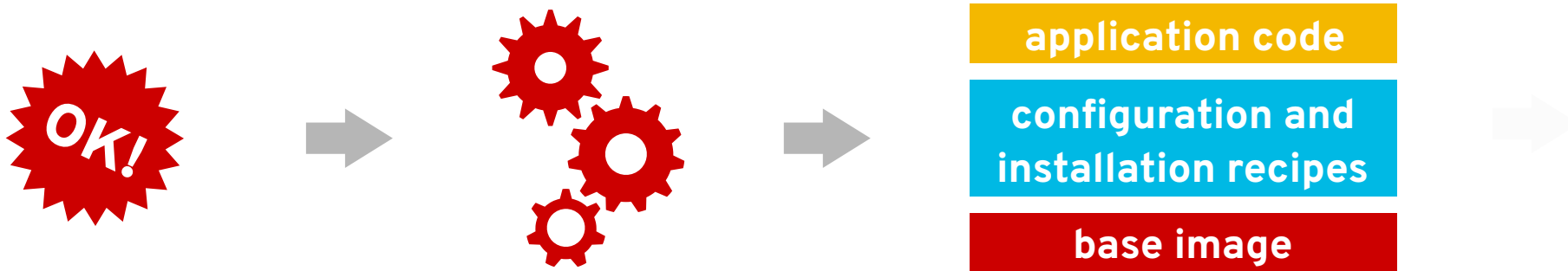
git



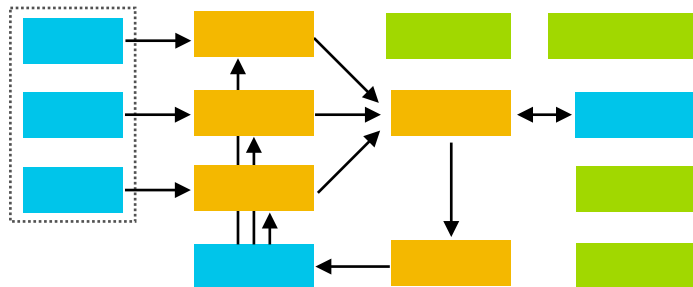
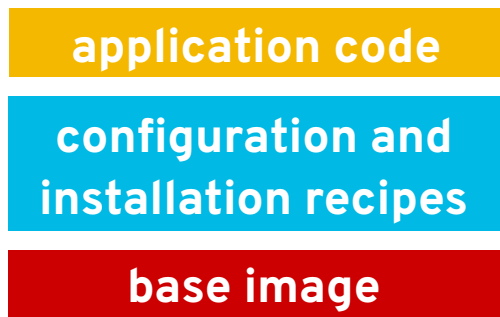
Integration and deployment

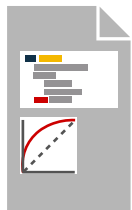


Integration and deployment

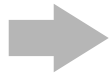
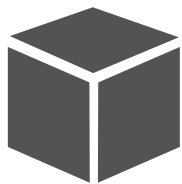
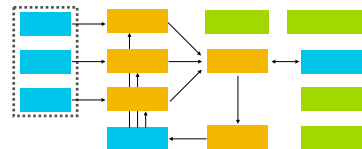


Integration and deployment

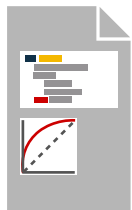
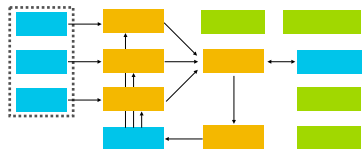
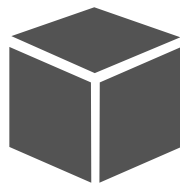
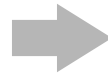




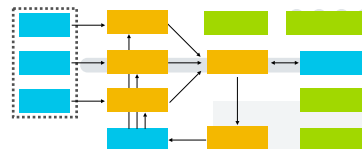
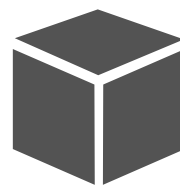
git



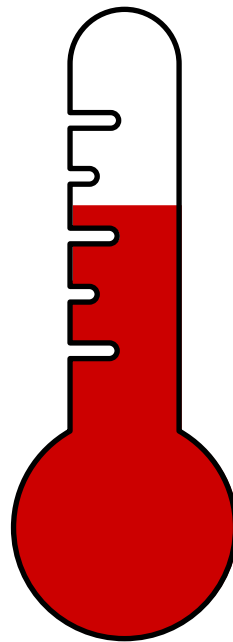
git



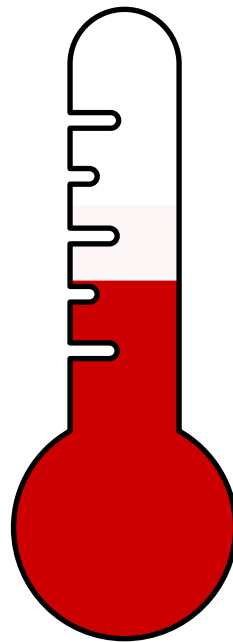
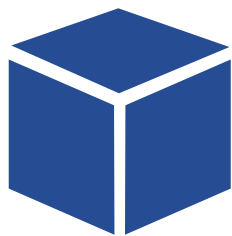
git



Data drift



Data drift

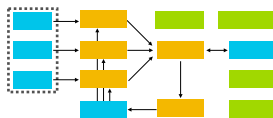


Looking forward

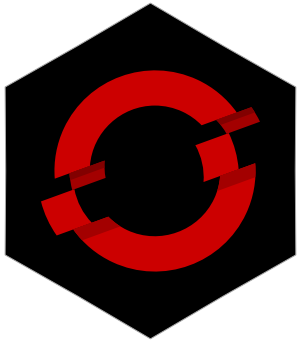
Other frameworks



radanalytics.io



Open Data Hub



Kubeflow



 jupyter

 PyTorch



Other technologies

$$\mathbf{x} \cdot \mathbf{y} = x_1 \cdot y_1 + \cdots + x_n \cdot y_n$$

Other technologies

$$\mathbf{x} \cdot \mathbf{y} = x_1 \cdot y_1 + \cdots + x_n \cdot y_n$$

```
def dot(xs, ys):  
    return sum([x * y for x, y in zip(xs, ys)])
```

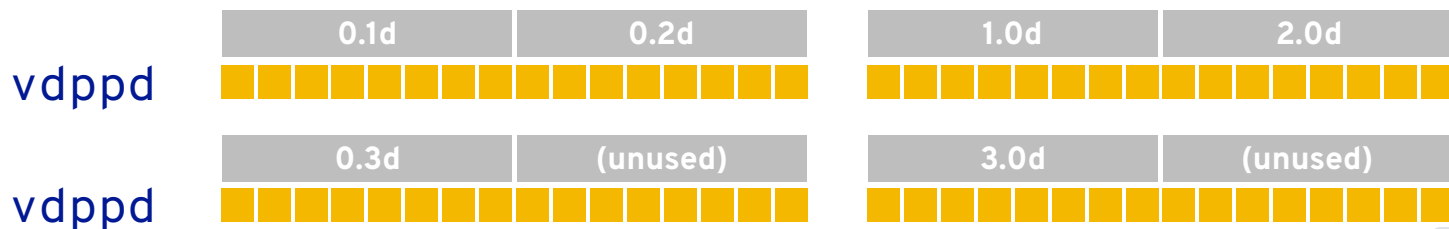
Other technologies

$$\mathbf{x} \cdot \mathbf{y} = x_1 \cdot y_1 + \cdots + x_n \cdot y_n$$

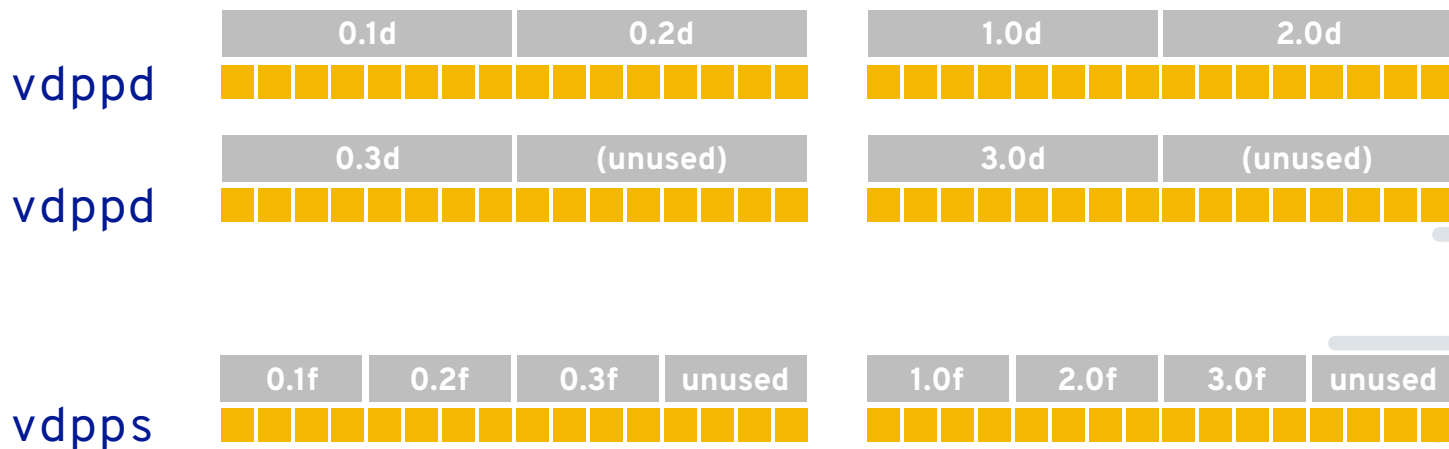
```
def dot(xs, ys):  
    return sum([x * y for x, y in zip(xs, ys)])
```

```
dot([0.1, 0.2, 0.3], [1.0, 2.0, 3.0])
```

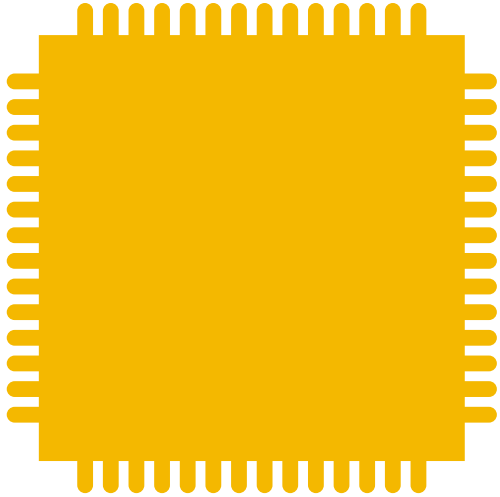
```
def dot(xs, ys):  
    return sum([x * y for x, y in zip(xs, ys)])
```



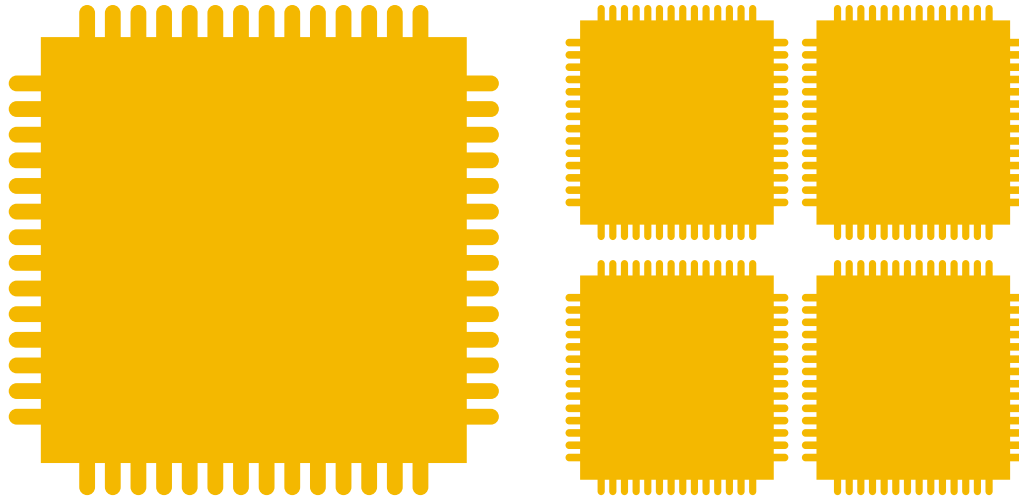
```
def dot(xs, ys):
    return sum([x * y for x, y in zip(xs, ys)])
```



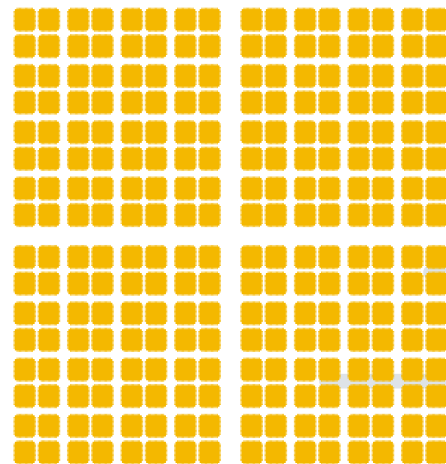
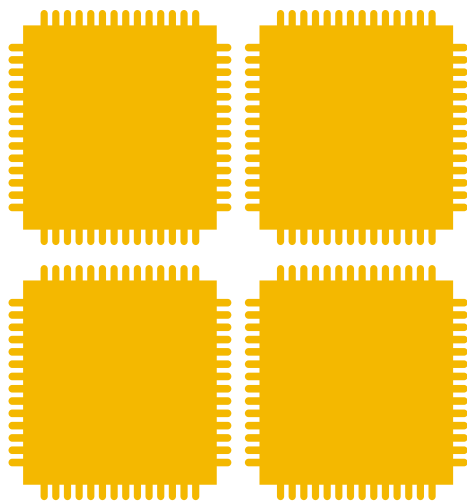
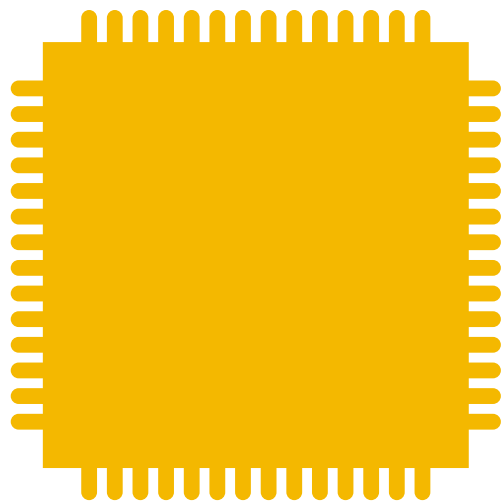
Other technologies



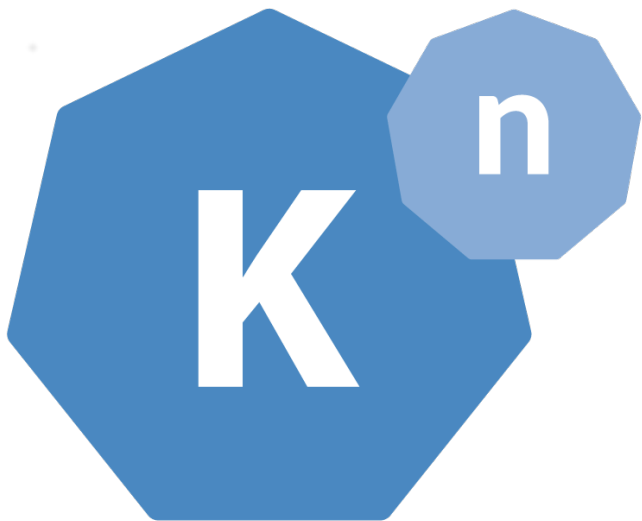
Other technologies



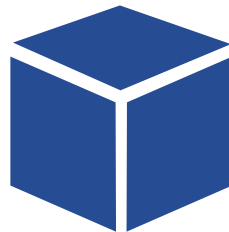
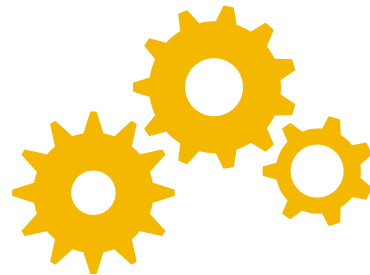
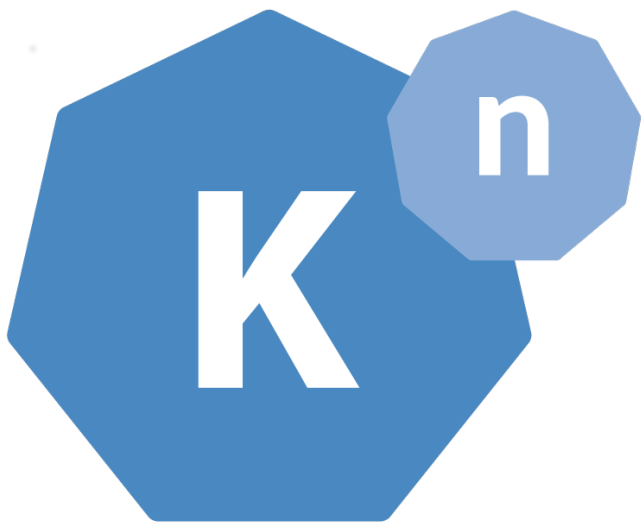
Other technologies



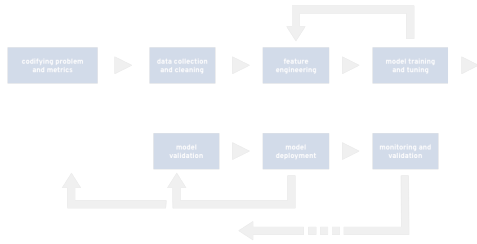
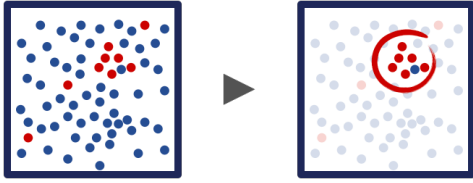
Other technologies

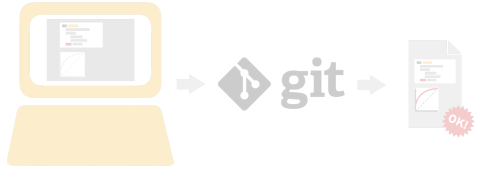
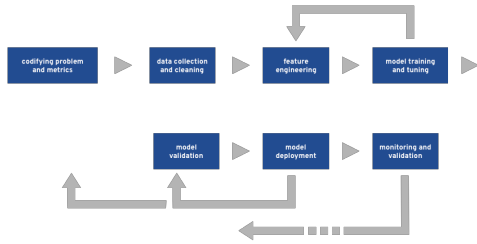
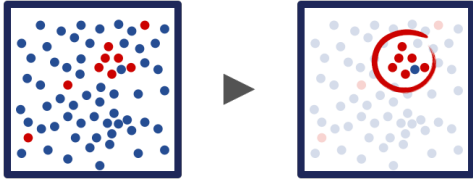


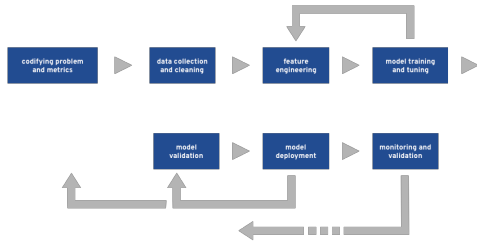
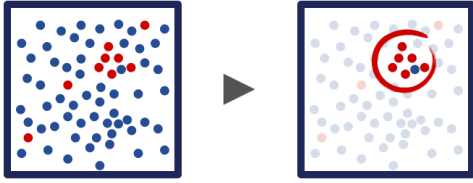
Other technologies

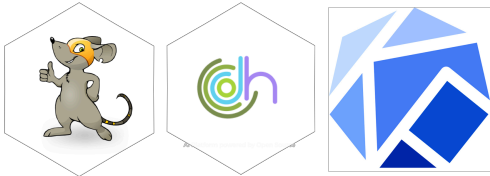
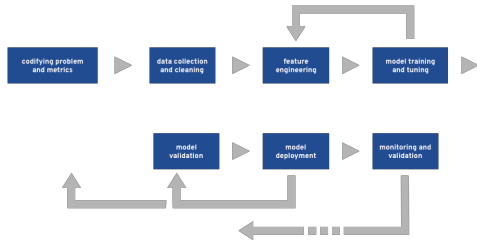
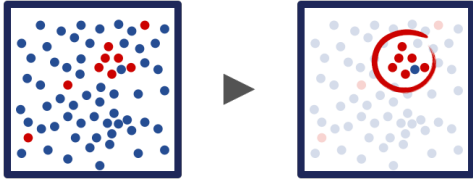


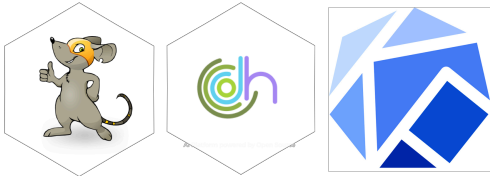
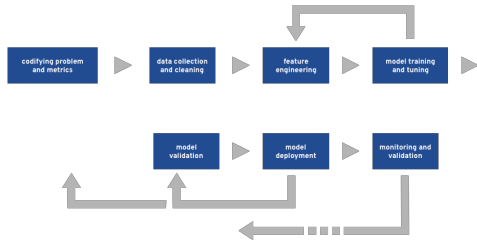
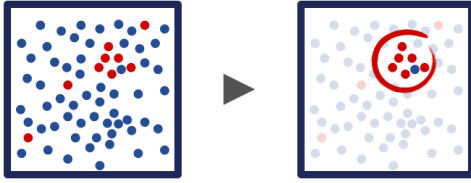
Conclusions











THANKS!

@sophwats • @willb • @FOSSJunkie