



#### **About me**

- Cloud Technology Evangelist at Deepshore
- since 2019 at Deepshore
- founded the Analytics & ML Team
- Collaborator at MML@IKIM Essen
- main subjects:
  - Cloud Technology & Cloud Architecture
  - Life-Cycle-Management & Operations
  - Automation in Kubernetes
  - MLOps



#### **About Deepshore**

- OMI: associated partner / technical rollout partner
- Kubernetes Certified Service Provider (KCSP)
- Member of Cloud Native Computing Foundation
- Member of Innovation Park Artificial Intelligence (IPAI)
- Main subjects:
  - Cloud Technology
  - Distributed Systems
  - R&D in the field of AI, e.g.
    - Al optimized operations
    - Anomaly detection based on IoT data
    - Digital assistance for document management



Quelle: www.deepshore.de



# **Goal of this presentation**

Show how we can serve AI models in consideration of

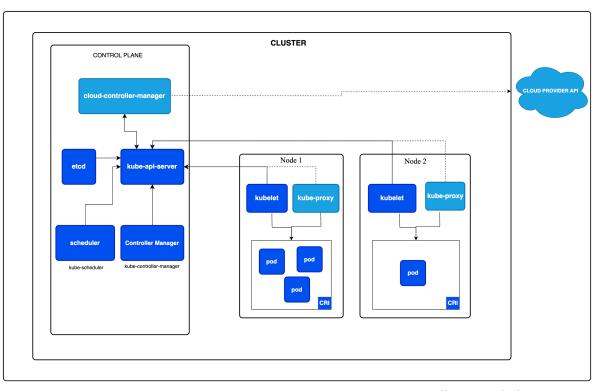
- High Availability
- Reliability
- BUT ALSO: Efficiency and Usability



#### What is Kubernetes?

"Kubernetes is a ...

- open-source
- container orchestration system
- for automating
- software deployment,
- scaling
- and management."



Quelle: www.kubernetes.io



## Why Kubernetes?

- High Availability:
  - K8s clusters consists of multiple nodes
  - K8s controllers enable service (pod) replication
  - K8s controllers provide self-healing mechanisms
- Resource Efficiency:
  - K8s comes with a powerful scheduling

Link: <a href="https://dzone.com/articles/kubernetes-advantages-and-disadvantages">https://dzone.com/articles/kubernetes-advantages-and-disadvantages</a>



## KServe: Model Inference platform on Kubernetes

#### KServe

- offers (auto)scaling, e.g.
  - if number of requests increases
  - if there is no load at all (scale to zero)
- standardized inference protocol across ML frameworks
- simplifies model deployment

Link: <a href="https://kserve.github.io/website/0.11/">https://kserve.github.io/website/0.11/</a>



#### **InferenceService**

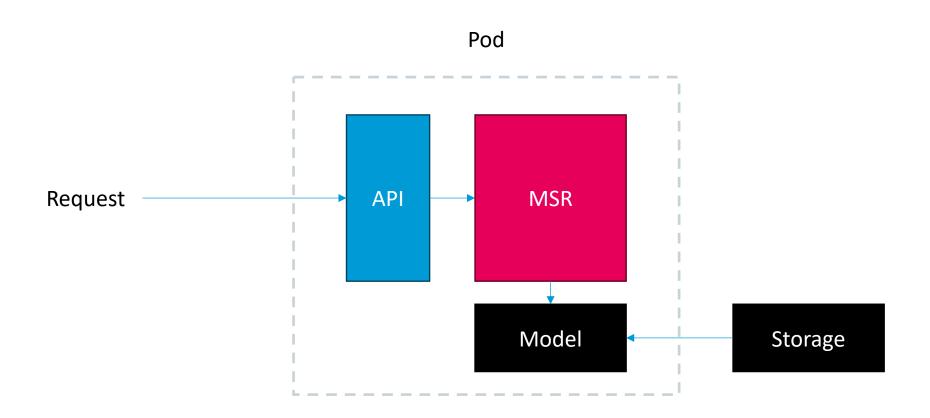
#### InferenceServices

- provide Inference APIs out-of-the-box
- support multiple ML frameworks/Model Serving Runtimes
- support for obtaining models from different storage locations
- provide Autoscaling, incl. Scale-To-Zero

"Since your model is being deployed as an InferenceService, not a raw Kubernetes Service, you just need to provide the storage location of the model and it gets some super powers out of the box %."



#### **InferenceService**

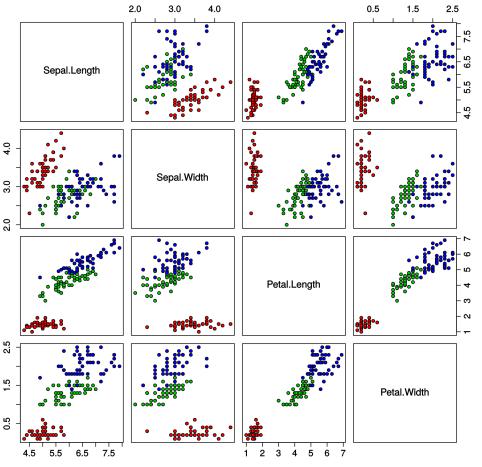




## **Setup Hands-On Demo**

- k8s cluster by minikube
- KServe is already installed
- the model classifies species of iris
   (see: <a href="https://en.wikipedia.org/wiki/Iris\_flower\_data\_set">https://en.wikipedia.org/wiki/Iris\_flower\_data\_set</a>)
- the model was already uploaded to MinIO

# Iris Data (red=setosa,green=versicolor,blue=virginica) 2.0 3.0 4.0 0.5 1.5 2





# **Inference API (data plane protocol)**

- Versions:
  - v1 (REST)
  - v2 (REST, grpc)
- v2 corresponds to OIP: <a href="https://github.com/open-inference/open-inference-protocol">https://github.com/open-inference/open-inference-protocol</a>



#### **Model Serving Runtimes**

MSR: Applications providing/serving models efficiently and quickly

#### Kserve supports

- TorchServe (Link: <a href="https://pytorch.org/serve/server.html">https://pytorch.org/serve/server.html</a>)
- Triton Inference Server (Link: <a href="https://github.com/triton-inference-server/server">https://github.com/triton-inference-server/server</a>)
- MLServer (Link: <a href="https://mlserver.readthedocs.io/en/latest/">https://mlserver.readthedocs.io/en/latest/</a>)
- Custom MSR



# **Model Storage**

Models can be provided by

- 53
- Azure Blob Storage
- URL
- PVC



# **Autoscaling**

#### Autoscaling

- Scales to zero if there is no request (given minReplicas is 0)
- Scales up to maxReplicas if more replicas are needed



### **Summary**

- Kubernetes + KServe support High Availability (multiple nodes, pod replication, self-healing)
- Kubernetes + KServe help to utilize resources efficiently (scheduling, autoscaling)
- KServe makes serving models very easy --> Usability
- KServe has features that improve reliability (versioning, monitoring etc.)



#### **Outlook**

- Perform autoscaling on GPUs
- Show model versioning in action
- Increase reliability by making use of GitOps
- Integration of FHIR resources in the Kubernetes-API
- ...



# Thank you for your attention

Contact: malte.groth@deepshore.de