

## I. ARTIFACT DESCRIPTION

We present the reproducibility artifact of our experimental validation. The source code is available in our GitHub repository<sup>1</sup>.

### A. Overview

- Matching game framework. See Section I-B;
- Dataset. See Section I-C;
- Software dependencies. See Section I-D;
- Run-time environment: Visual Studio Code IDE 1.65.2;
- Installation. See Section I-E;
- Testbed. See Section I-F.

### B. Matching game framework

Matching game is a Python-based framework<sup>2</sup> for solving matching game based models. We used YAML files containing device and microservice preference lists (DPL.yaml and MPL.yaml), and the schedules of microservices on devices (matching-testbed.yaml).

### C. Data sets

Two datasets for training neural network and machine learning models:

- Case study I: German traffic sign benchmark<sup>3</sup>;
- Case study II: Amazon reviews for sentiment analysis<sup>4</sup>.

### D. Software dependencies

#### 1) Model:

- Python libraries `networkx`, `operator`, `numpy`, `yaml`, `json`.

#### 2) Integrating C<sup>3</sup>-MATCH to Kubernetes scheduler:

- Docker v20.10.12<sup>5</sup> on all devices and instances;
- Orchestrating by Kubernetes v1.21;
- Measuring bandwidth and latency between the local Edge devices: `kube-latency`<sup>6</sup>;
- Monitoring local Edge cluster by the Prometheus operator v0.45.0<sup>7</sup>;
- Python script "scheduling.py" collects the monitoring information by Prometheus Python API<sup>8</sup> from the local Kubernetes Edge cluster, and then utilizes the Python client library

v17.17 for Kubernetes<sup>9</sup> to execute the customized C<sup>3</sup>-MATCH scheduler and deploy the application pods on the appropriate devices;

- Transmitting data through asynchronous message queue platforms: 1) a Kubernetes-based KubeMQ v2.2.10<sup>10</sup> for the local Edge cluster, and 2) ZeroMQ v22.3.0<sup>11</sup>, to receive data by the Cloud and Fog instances.
- Ping and iPerf3 tools to benchmark the latency, maximum achievable bandwidth, and effective downlink throughput between instances.

3) Case studies: We Dockerized all the microservices with Docker v19–20<sup>12</sup>.

a) Python libraries: `ffmpeg`, `scikit-learn`, `numpy`, `tensorflow`, `keras`, `matplotlib`, `opencv-python`, `pandas`.

b) Tensorflow API: Docker image `nvcv.io/nvidia/l4t-tensorflow` `r32.5.0-tf2.3-py3`<sup>13</sup> on Nvidia devices.

### E. Installation

- Matching library by package installer for Python 3.9 (pip3.9);
- Docker Engine on Ubuntu<sup>14</sup>, Kubernetes on Ubuntu<sup>15</sup>, and Kubernetes on (vanilla) Raspbian Lite<sup>16</sup>;
- NVIDIA Jetson Linux<sup>17</sup> and Raspberry Pi OS<sup>18</sup>.

### F. Testbed

- Three on-demand instances from the Exoscale provider<sup>19</sup>, hosted in the data center of the A1 network operator in Sofia, Frankfurt, and Vienna: large with four virtual cores and 8 GB of memory; medium with two virtual cores and 4 GB of memory; small with two virtual cores and 2 GB of memory.
- A private Cloud at the university campus and medium Edge instances, managed by an OpenStack v13.0 and Ceph v12.2 with support for block and S3-compatible object storage;
- Five NVIDIA Jetson Nano (NJN) running Linux for Tegra (L4T) OS, 10 Raspberry Pi-3 model B+ (RPi3) and 30 RPi4 running Raspberry Pi OS.
- Testbed components are interconnected by a managed layer-3 HP Aruba with 48 1 Gbit/s ports, 3.8 μs latency and aggregate throughput of 104 Gbit/s.

<sup>1</sup><https://github.com/anonymousuni/c3-match>

<sup>2</sup><https://github.com/daffidwilde/matching>

<sup>3</sup><https://www.kaggle.com/meowmeowmeowmeowmeow/gtsrb-german-traffic-sign>

<sup>4</sup><https://www.kaggle.com/bittlingmayer/amazonreviews>

<sup>5</sup><https://www.docker.com/>

<sup>6</sup><https://github.com/simonswine/kube-latency>

<sup>7</sup><https://github.com/prometheus-operator/prometheus-operator>

<sup>8</sup><https://pypi.org/project/prometheus-api-client/>

<sup>9</sup><https://github.com/kubernetes-client/python>

<sup>10</sup><https://github.com/kubemq-io/kubemq-community/releases/tag/v2.2.10>

<sup>11</sup><https://pypi.org/project/pyzmq/>

<sup>12</sup><https://www.docker.com/>

<sup>13</sup><https://catalog.ngc.nvidia.com/orgs/nvidia/containers/l4t-tensorflow>

<sup>14</sup><https://docs.docker.com/engine/install/ubuntu/>

<sup>15</sup><https://phoenixnap.com/kb/install-kubernetes-on-ubuntu>

<sup>16</sup><https://github.com/alexellis/k8s-on-raspbian/blob/master/GUIDE.md>

<sup>17</sup><https://developer.nvidia.com/embedded/linux-tegra>

<sup>18</sup><https://www.raspberrypi.com/software/>

<sup>19</sup><https://www.exoscale.com/compute/>