Operationalize a Machine Learning... Q SEARCH **Project Tasks** RESOURCES Assuming you have a terminal window open, you're in the project directory, and your .devops environment is activated, you can continue viewing and editing project files! CONCEPTS This section is quite dense and so, it is suggested that you approach one **task** at a time, carefully reading through the instructions and completing the task, then taking a break if you desire, and coming back to the next task. Task 1: Complete the Dockerfile Docker can build images automatically by reading the instructions from a **Dockerfile**. The Dockerfile contains all the commands a user could call on the command line to assemble an image. To view the contents of the Dockerfile type: cat Dockerfile. You can edit any file by opening it 5. Detailed Project Tasks in a text editor and saving it. Dockerfile You can see that you have been given a couple of lines of code in the **Dockerfile** and some instructions. **FROM** is provided for you; the FROM instruction initializes a new build stage and sets the **base image** for subsequent instructions. In this case, it specifies Python3 as the base image for this application. The Operationalize a Machine Learning... rest of the **Dockerfile** instructions are left for you to complete. You should have instructions that: Q SEARCH Specify a working directory. Copy the app.py source code to that directory RESOURCES • Install any dependencies in requirements.txt (do not delete the commented CONCEPTS # hadolint ignore statement). • Expose a port when the container is created; port 80 is standard. • Specify that the app runs at container launch. After you complete this file and save it, it is recommended that you go back to your terminal and run make lint again to see if hadolint catches any errors in your Dockerfile. You are required to pass these lint checks to pass the project. Task 2: Run a Container & Make a Prediction 4. Create the Project Environment In order to run a containerized application, you'll need to build and run the docker image that you defined in the Dockerfile, and then you should be able to test your application, locally, by having 5. Detailed Project Tasks the containerized application accept some input data and produce a prediction about housing prices. run_docker.sh Next, open and complete the file, run_docker.sh to be able to get Docker running, locally. Within run_docker.sh, complete the following steps: • Build the docker image from the Dockerfile; it is recommended that you use an optional -- tag parameter as described in the build documentation. List the created docker images (for logging purposes). Mentor Help Run the containerized Flask app; publish the container's port to a host port. The appropriate container and host ports are in the Dockerfile and make_prediction.sh files, Operationalize a Machine Learning... respectively. SEARCH You can find a list of all the docker commands you might need to use in the documentation. RESOURCES Running the complete script This file is a **shell script** which you can see from the extension . **sh** . To *run* a shell script from your CONCEPTS terminal, you type ./<scriptname>. To run and build a docker image, you'll type ./run_docker.sh . After typing this command, you should see something like the following in your terminal, followed by a number of build steps: [(.devops) Cezanne-2:project-ml-microservice-kubernetes cezannec\$./run_docker.sh Sending build context to Docker daemon 751.6kB After a brief waiting period, you should see messages indicating a successful build, along with some indications that your app is being served on port 80 (also, a warning about the development server is to be expected, here). 5. Detailed Project Tasks Successfully built <build id> Successfully tagged <your tag> This indicates a successful build and if you keep this application running you can make predictions! Making predictions Then, to make a prediction, you have to open a **separate tab or terminal window**. In this new window, navigate to the main project directory (some computers will do this automatically) and call Mentor Help ./make_prediction.sh. Project: Operationalize a Machine Learning... This shell script is responsible for sending some input data to your containerized application via the appropriate port. Each numerical value in here represents some feature that is important for Q SEARCH determining the price of a house in Boston. The source code is responsible for passing that data through a trained, machine learning model, and giving back a predicted value for the house price. RESOURCES In the prediction window, you should see the value of the prediction, and in your main window, where ∇ CONCEPTS it indicates that your application is running, you should see some log statements print out. You'll see that it prints out the input payload at multiple steps; when it is JSON and when it's been converted to a DataFrame and about to be scaled. After making a prediction, you can type CTRL+C (+enter) to quit running your **application.** You can always re-run it with a call to ./run docker.sh. Your next task will be to add a log statement in app.py that prints out the pre-trained model **prediction** as Log.info. The complete text output from these logs will be submitted as part of the complete project. 5. Detailed Project Tasks Task 3: Improve Logging & Save Output 6. Project: Operationalize a Machine ... Logging is an important part of debugging and understandability. Many times, logs will be how engineers figure out what an app is doing as it processes some input. In this case, app.py is responsible for 1. Accepting an input JSON payload, and converting that into a DataFrame. 2. Scaling the DataFrame payload. 3. Passing the scaled data to a pre-trained model and getting back a prediction. Mentor Help So far, the logs print out the JSON and DataFrame payloads, but do not have any statements for the scaled input or the resultant prediction. The prediction is an especially important piece of information Project: Operationalize a Machine Learning... and so you definitely want that value in the logs. Q SEARCH Add a prediction log statement Your task is to add at least one log statement to app.py that prints out the output RESOURCES \blacksquare **prediction** values. You can add more log statements than that, but that is what is required. ∇ CONCEPTS Once you have updated your app.py code, save it and ./run_docker.sh again and make the same prediction in a separate terminal window. Create docker_out.txt Copy and paste this terminal output, which has log info, in a text file docker_out.txt. A sample output is shown below. [2019-05-13 02:57:25,911] INFO in app: JSON payload:
{'CHAS': {'0': 0}, 'RM': {'0': 6.575}, 'TAX': {'0': 296.0}, 'PTRATIO': {'0': 15.3}, 'B': {'0': 396.0}, 'LSTAT': {'0': 4.98}}
[2019-05-13 02:57:25,933] INFO in app: inference payload DataFrame:

CHAS RM TAX PTRATIO B LSTAT

0 0 6.575 296.0 15.3 396.9 4.98
[2019-05-13 02:57:25,945] INFO in app: Scaling Payload:

CHAS RM TAX PTRATIO B LSTAT CHAS RM TAX PTRATIO 8 LSTAT
0 0 6.575 296.0 15.3 396.9 4.98
[2019-05-13 02:57:25,950] INFO in app: output prediction: [20.35373177134412]
172.17.0.1 - [13/May/2019 02:57:25] "POST /predict HTTP/1.1" 200 -5. Detailed Project Tasks Sample log output The docker_out.txt file should include all your log statements plus a line that reads something like "POST /predict HTTP/1.1" 200 - The 200 is a standard value indicating the good "health" of an interaction. The docker_out.txt file will be one of two, log output files that will be part of a passing, project submission. Again, after making a prediction, you can type CTRL+C (+enter) to quit running your application. You'll need to quit running before you can move on to the next steps and upload the built, docker image. Mentor Help Operationalize a Machine Learning... Task 4: Upload the Docker Image Now that you've tested your containerized image locally, you'll want to upload your built image to Q SEARCH docker. This will make it accessible to a Kubernets cluster. RESOURCES Upload your Docker image CONCEPTS To upload an image to docker, you'll need to complete the upload docker.sh file: • Define a dockerpath which will be "/path"; the path may be the same as the build tag you created in run_docker.sh or just some descriptive path name. Recall that your docker username is your unique docker ID. Authenticate and tag image; this step is responsible for creating a login step and ensuring that the uploaded docker image is tagged descriptively. 3. Project Structure & Files • Similar to how you might push a change to a Github repository, push your docker image to the **dockerpath** defined in step 1. This push may take a moment to complete. Assuming you've already built the docker image with ./run_docker.sh, you can now upload the image by calling the complete shell script ./upload docker.sh. 5. Detailed Project Tasks If you've successfully implemented authentication and tagging, you should see a successful login statement and a repository name that you specified, printed in your terminal. You should also be able 6. Project: Operationalize a Machine ... to see your image as a repository in your docker hub account. Task 5: Configure Kubernetes to Run Locally You should have a virtual machine like VirtualBox and minikube installed, as per the project environmet instructions. To start a local cluster, type the terminal command: minikube start. Mentor Help After minikube starts, a cluster should be running locally. You can check that you have one Project: cluster running by typing kubectl config view where you should see at least one cluster with a Operationalize a Machine Learning... certificate-authority and server. Q SEARCH This is a short task, but it may take some time to configure Kubernetes, and so this deserves its own task number. RESOURCES CONCEPTS Task 6: Deploy with Kubernetes and Save Output Logs Now that you've uploaded a docker image and configured Kubernetes so that a cluster is running, you'll be able to deploy your application on the Kubernetes cluster. This involves running your containerized application using kubectl, which is a command line interface for interacting with Kubernetes clusters. run kubernetes.sh To deploy this application using kubectl, open and complete the file, run kubernetes.sh: The steps will be somewhat similar to what you did in both run docker.sh and upload docker.sh but specific to kubernetes clusters. Within run kubernetes.sh, complete the 5. Detailed Project Tasks following steps: • Define a dockerpath which will be "/path", this should be the same name as your uploaded 6. Project: Operationalize a Machine ... repository (the same as in upload docker.sh) • Run the docker container with kubectl; you'll have to specify the container and the port List the kubernetes pods Forward the container port to a host port, using the same ports as before After completing the code, call the script ./run kubernetes.sh. This assumes you have a local cluster configured and running. This script should create a pod with a name you specify and you may Mentor Help get an initial output that looks as follows, with a cluster and status: Operationalize a Machine Learning... [(.devops) Cezanne-2:project-ml-microservice-kubernetes cezannec\$./run_kubernetes.sh < your pod name > created
READY STATUS < your pod name > 0/1 ContainerCreating 0 SEARCH error: unable to forward port because pod is not running. Current status=Pending RESOURCES Pending pod ∇ CONCEPTS Initially, your pod may be in the process of being created, as indicated by STATUS: ContainerCreating, but you just have to wait a few minutes until the pod is ready, then you can run the script again. **Waiting:** You can check on your pod's status with a call to kubectl get pod and you should see the status change to **Running**. Then you can run the full ./run_kuberenets.sh script again. Make a prediction After you've called run_kubernetes.sh, and a pod is up and running, make a prediction using a separate terminal tab, and a call to ./make_prediction.sh, as you did before. kubernetes.out.txt 5. Detailed Project Tasks After running a prediction via Kubernetes deployment, what do you see in your main terminal window? Copy the text output after calling run_kubernetes.sh and paste it into a file **kubernetes_out.txt**. This will be the second (out of two) text files that are required for submission. This output might look quite different from docker_out.txt; this new file should include your pod's name and status, as well as the port forwarding and handling text. Task 7: [Important] Delete Cluster Mentor Help After you're done deploying your containerized application and making test predictions via Kubernetes cluster, you should clean up your resources and **delete the kubernetes cluster** with a call to Operationalize a Machine Learning... minikube delete. SEARCH You can also pause your work and save the cluster state with a call to minikube stop. RESOURCES Almost Ready for Project Submission CONCEPTS Now, you are almost ready to submit your project! Check that you have all complete files Push your work to a Github repository One last step: CircleCl Integration Task 8: CircleCl Integration CircleCI is a tool that defines an automated **testing environment**; getting a CircleCI badge that reads "Passed" on a repository indicates that the project code has passed all lint tests. CircleCl uses a YAML file to identify how you want your testing environment set up and what tests you want to run. On 5. Detailed Project Tasks CircleCI 2.0, this file must be called config.yml and must be in a hidden folder called .circleci. On Mac, Linux, and Windows systems, files and folders whose names start with a period are treated as 6. Project: Operationalize a Machine ... system files that are hidden from users by default. To create the file and folder on GitHub, click the Create new file button on the repo page and type | .circleci/config.yml |. You should now have in front of you a blank | config.yml | file in a .circleci folder. Then you can paste the text from this yaml file into your file, and commit the change to your repository. It may help to reference this CircleCI blog post on Github integration. Mentor Help Project: Setting up and Building a Project Operationalize a Machine Learning... To test your repository with CircleCI, you will need a CircleCI account, which you can get via their signup Q SEARCH page + clicking "Start with GitHub." Once you have an account, you'll be able to build project using the CircleCI dashboard. RESOURCES On the dashboard, you will be given the option to set up a new project. To add your new repo, ensure CONCEPTS that your GitHub account is selected in the dropdown menu in the upper-left, find the project repository that you've created, and click the **Setup project** button next to it. You can leave all set up configurations as their default value then click Start building. You should see your build start to run, and if your project passes the lint tests, you'll see that the project passes! You can then add a status badge indicating that your project has "Passed" CircleCI tests, by looking at the markdown in the Notifications section of your project's settings > Status Badges. • Best practice is to add the badge via markdown into the Github project's README.md file. PASSED Operationalize a Machine Learning... Q SEARCH Task 9: README.md RESOURCES A complete README file should include: CONCEPTS 1. A summary of the project 2. Instructions on how to run the Python scripts and web app (simply listing command line calls will suffice), and 3. A short explanation of the files in the repository. The README should also include the "passed" status badge (shown above) at the **top** of the README. **Project Submission** Congratuations, you have successfully containerized and deployed a machine learning application using Kubernetes. And you are ready to submit your complete Github repo! 5. Detailed Project Tasks Check that you've passed all rubric items, then go to the next page and submit via a link to your Github repo. After submission, your project will be sent to one of our reviewers, who will give you feedback on your project. Supporting Materials Mentor Help Ask a mentor on our Q&A platform