A background image showing four people in a professional setting. A man in a dark sweater is leaning over a desk, pointing at a laptop. A man in a light blue shirt is sitting at the desk, looking at the laptop. A woman in a grey sweater is sitting next to him, also looking at the laptop. A woman with curly hair in a light-colored top is sitting to the right, holding a green pen. The image is overlaid with a semi-transparent dark blue filter.

ONNX Development Lab: Develop support for a new/updated operator

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Outline

- ❖ Unit 1: Setup and verify development dependencies
- ❖ Unit 2: Develop support for a new/updated op

Unit 1: Setup development dependencies

- **Goal of the unit:** At the end of unit 1, you will learn how to install and verify the projects that are required for the ONNX Tensorflow converter development
- Development dependencies
 - System packages
 - ONNX master
 - Tensorflow 2.1
 - ONNX-TF master
- Step 1.1: setup system packages
 - Install python3, git, cmake, protobuf-compiler libprotoc-dev
 - Verify: python -V returns 3.x.x and check others are installed using dpkg -l

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- Step 1.2: setup ONNX master
 - Use git clone to download ONNX from <https://github.com/onnx/onnx.git>
 - Follow instructions for build from source on <https://github.com/onnx/onnx#source> (skip conda and pip install onnx)
 - Verify: `python -c "import onnx; print(onnx.__version__)"` returns 1.7.0
- Step 1.3: setup Tensorflow latest release
 - `pip install -U tensorflow`
 - `pip install -U tensorflow-addons`
 - Verify: `python -c "import tensorflow; print(tensorflow.__version__)"` returns 2.1.0
- Step 1.4: setup ONNX-Tensorflow master
 - Use git clone to download ONNX-TF from <https://github.com/onnx/onnx-tensorflow>
 - Follow instructions for development installation on <https://github.com/onnx/onnx-tensorflow#installation>
 - Verify: `python -c "import onnx_tf"` doesn't return errors

Unit 1: Setup development dependencies

- Step 1.5: final verification
 - cd to ~/onnx-tensorflow
 - python util/get_version.py

```
Python version:  
3.6.9 (default, Nov  7 2019, 10:44:02)  
[GCC 8.3.0]  
ONNX version:  
1.7.0  
ONNX-TF version:  
1.5.0  
Tensorflow version:  
2.1.0
```


Unit 2: Develop support for a new/updated operator

- **Goal of the unit:** At the end of unit 2, you will learn all the steps that required to add support for a new/updated ONNX operator to ONNX-Tensorflow converter. In this unit, we are going to use Constant operator in Opset 12 as our target operator to support.
- Step 2.1: Study the specification of Constant in ONNX to identify changes in opset 12 <https://github.com/onnx/onnx/blob/master/docs/Operators.md#Constant>
 - Compare Constant-12 with the previous version Constant-11 <https://github.com/onnx/onnx/blob/master/docs/Changelog.md#Constant-11>
 - Constant-12 accept python primitive type like float, int and string as input attributes in addition to tensor and sparse_tensor in Constant-11

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- Step 2.2: Identify the potential Tensorflow operator to support the new changes in Constant-12 https://www.tensorflow.org/api_docs/python/tf/constant
 - Argument “value” in `tf.constant` accept constant value or list of any Tensorflow `DataType`
 - Therefore `tf.constant` is still efficient to perform the same capability of ONNX Constant-12 op
- Step 2.3: Create your PR development workspace
 - Verify your ONNX package location is point to your ONNX directory not to an egg file
 - `pip list | grep onnx`
 - If the location is point to an egg file, then please reinstall it with the following commands
 - `cd <your-onnx-directory> ; pip install -e .`

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- If you didn't create a fork of ONNX-Tensorflow yet, please create one by clicking  button on the top right corner of ONNX-Tensorflow repository
- Clone your fork
 - `git clone https://github.com/<your-git-user-name>/onnx-tensorflow.git`
 - Verify: `cd onnx-tensorflow ; ls`
- Setup the upstream remote
 - `git remote add upstream https://github.com/onnx/onnx-tensorflow.git`
 - Verify: `git remote -v`
- Verify your fork master is up-to-date
 - `git checkout master`

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- If your master is out-of-date then run the following commands
 - `git fetch upstream`
 - `git merge upstream/master`
 - `git push origin master`
- Create a branch under your fork as your development workspace
 - `git checkout -b <your-branch-name>`
 - Verify: `git branch`
- Use your branch to build onnx-tf
 - `pip install -e .`
 - Verify: `pip list | grep onnx-tf`

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- Step 2.4: Update test_constant unit test in onnx-tensorflow/test/backend/test_node.py
 - Let's only focus on adding the int64 attribute support for Constant here
 - Add a test case in test_constant to check does the existing Constant handler accept a constant int64 value as an attribute
 - When you are ready to test run your updated test_constant, please run the following command:
 - `python test_node.py TestNode.test_constant`

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```
def test_constant(self):
    ...
    # test sparse tensor
    if not legacy_opset_pre_ver(11):
        ...
        result = b.numpy()
        np.testing.assert_equal(result, expected)
    # test int64
    if not legacy_opset_pre_ver(12):
        int_attr = np.int64(108)
        node_def = helper.make_node("Constant", [], ["Y"], value_int=int_attr)
        output = run_node(node_def, [])
        np.testing.assert_equal(output["Y"], int_attr)
```

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- Step 2.5: Update Constant handler in `onnx-tensorflow/onnx_tf/handlers/backend/constant.py`
 - Define `version_12` method to handle Constant in opset 12 and above
 - Need to handle everything opset 11 support
 - Plus the newly added attributes like “`value_int`”
 - Register your updated handler to `onnx-tensorflow/onnx_tf/opset_version.py` file
 - Run `onnx-tensorflow/onnx_tf/gen_opset.py`
 - `python gen_opset.py`
 - Verify: `cat opset_version.py | grep Constant`
 - Test/debug your updated handler by running your updated Constant unit test in `onnx-tensorflow/test/backend/TestNode.py` on step 2.4
 - `python test_node.py TestNode.test_constant`

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```
@classmethod
def version_12(cls, node, **kwargs):
    if "value" in node.attrs or "sparse_value" in node.attrs:
        return cls.version_11(node, **kwargs)
    elif "value_int" in node.attrs:
        value = node.attrs["value_int"]
        dtype = tf.int64
    return [
        cls.make_tensor_from_onnx_node(node,
                                         inputs=[value],
                                         attrs={"dtype": dtype})
    ]
```

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- After successfully run the unit test of Constant in test_node.py then please verify all the other tests under onnx-tensorflow/test/backend folder are pass too.
 - python test_node.py
 - python test_dynamic_shape.py
 - python test_model.py
 - python test_onnx_backend.py

Note: test_onnx_backend.py typically takes between 20 to 40 minutes to complete, depending on hardware configurations

- Step 2.6: Update support status report for Constant
 - Run onnx-tensorflow/onnx_tf/gen_status.py to update the support status
 - python gen_status.py -v master
 - Verify: cat ../doc/support_status.md | grep Constant

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- Step 2.7: Verify all changed files follow the recommended code format
 - Follow instructions for code standard format on <https://github.com/onnx/onnx-tensorflow#code-standard>
- Step 2.8: Commit all the changes to your branch in your fork
 - git status
 - git add *
 - git commit
 - git push origin <your-branch-name>

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- Step 2.9: Create Pull Request(PR) in ONNX-Tensorflow Repository
 - Navigate your browser to <https://github.com/onnx/onnx-tensorflow>,
 - Click on the “Compare and pull request” button
 - Click on the “Create pull request” button
 - Type a title and description of your pull request
 - Click on the “Create pull request” button to submit it

Note: If you can't find the “Compare and pull request” button then run the following steps:

- Click on the “Pull requests” tab on the top of the page
- Click on the “New pull request” button
- Click on the “compare across forks” link
- Leave the base repo as the master branch and change the head repo to your fork and your branch
- Click on the “Create pull request” button

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- Step 2.10: Wait for review and address comment
 - If changes is required in your PR, modify code in your branch then run the following git commands:
 - `git status`
 - `git add *`
 - `git commit --amend`
 - `git push -f origin <your-branch-name>`

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- If rebase is required, then run the following git commands
 - `git stash #` if there is uncommitted changes on the current branch then stash it else skip to next step
 - `git fetch upstream`
 - `git checkout master`
 - `git merge upstream/master`
 - `git push origin master`
 - `git checkout <your-branch-name>`
 - `git rebase origin/master`
 - `git stash pop #` if there is a stash then pop it now else skip to next step
 - `git commit --amend #` if there is no change to the commit then skip to next step
 - `git show -1`
 - `git push -f origin <your-branch-name>`