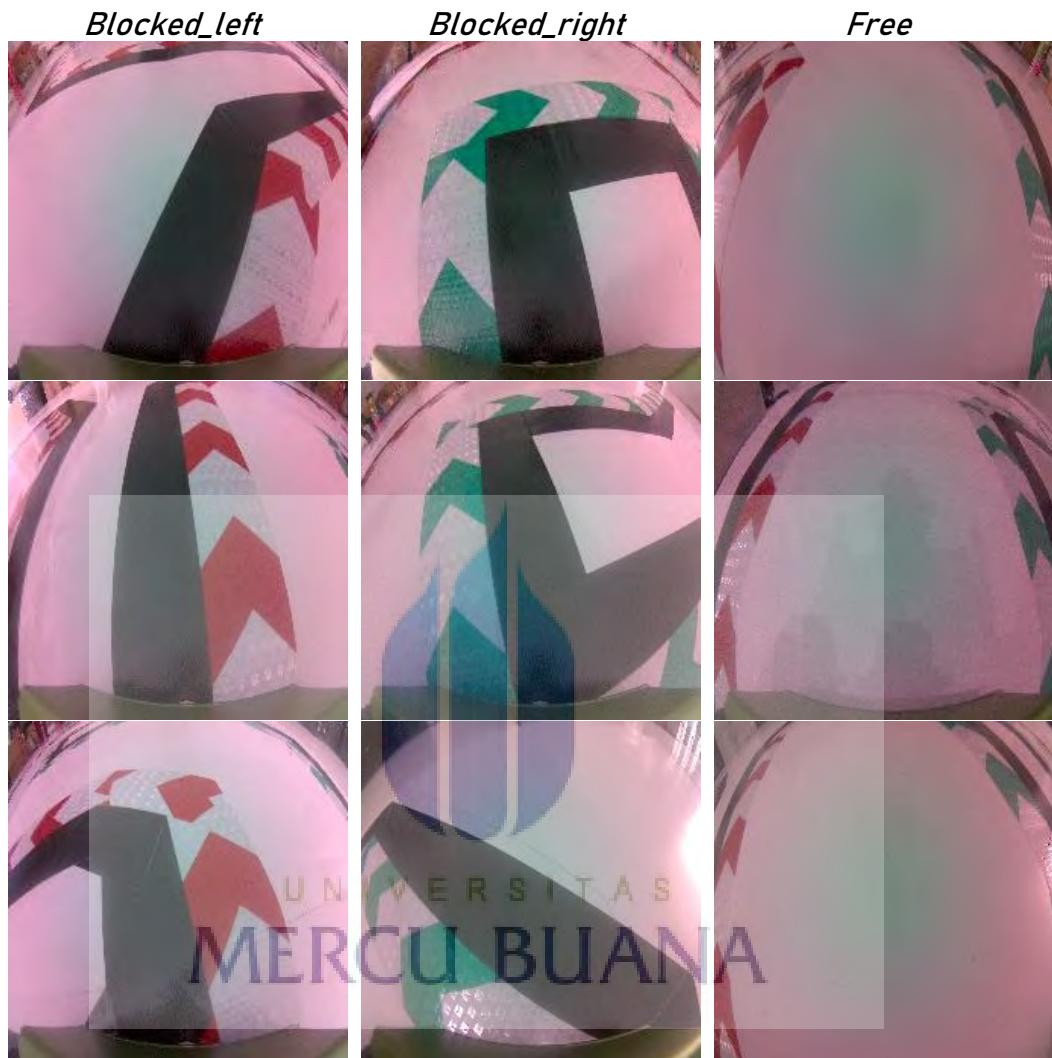


## LAMPIRAN

### 1. Jetbot Assembly Process



## 2. Samples Dataset



### 3. Coding (Dataset Collecting)

#### Display live camera feed

Initialize and display camera

Neural network takes a 224x224 pixel image as input. Set the camera to that size to minimize the filesize of dataset.

```
[1]: import traitlets
import ipywidgets.widgets as widgets
from IPython.display import display
from jetbot import Camera, bgr8_to_jpeg

camera = Camera.instance(width=224, height=224)

image = widgets.Image(format='jpeg', width=224, height=224) # this width and height doesn't necessarily have to match the camera
camera_link = traitlets.dlink((camera, 'value'), (image, 'value'), transform=bgr8_to_jpeg)

display(image)
```



#### Create Directory for dataset

```
[ ]: import os

blocked_left_dir = 'dataset/blocked_left'
blocked_right_dir = 'dataset/blocked_right'
free_dir = 'dataset/free'

# we have this "try/except" statement because these next functions can throw an error if the directories exist already
try:
    os.makedirs(free_dir)
    os.makedirs(blocked_left_dir)
    os.makedirs(blocked_right_dir)
except FileExistsError:
    print('Directories not created because they already exist')
```

#### Create UI for Camera capturing process

```
[3]: button_layout = widgets.Layout(width='128px', height='64px')
free_button = widgets.Button(description='add free', button_style='success', layout=button_layout)
blocked_left_button = widgets.Button(description='add blocked_left', button_style='danger', layout=button_layout)
blocked_right_button = widgets.Button(description='add blocked_right', button_style='danger', layout=button_layout)
free_count = widgets.IntText(layout=button_layout, value=len(os.listdir(free_dir)))
blocked_left_count = widgets.IntText(layout=button_layout, value=len(os.listdir(blocked_left_dir)))
blocked_right_count = widgets.IntText(layout=button_layout, value=len(os.listdir(blocked_right_dir)))

display(widgets.HBox([free_count, free_button]))
display(widgets.HBox([blocked_left_count, blocked_left_button]))
display(widgets.HBox([blocked_right_count, blocked_right_button]))
```

30	<input type="button" value="add free"/>
75	<input type="button" value="add blocked_left"/>
75	<input type="button" value="add blocked_right"/>

## Create Save snapshot to directory function

```
[4]: from uuid import uuid1

def save_snapshot(directory):
    image_path = os.path.join(directory, str(uuid1()) + '.jpg')
    with open(image_path, 'wb') as f:
        f.write(image.value)

def save_free():
    global free_dir, free_count
    save_snapshot(free_dir)
    free_count.value = len(os.listdir(free_dir))

def save_blocked_left():
    global blocked_left_dir, blocked_left_count
    save_snapshot(blocked_left_dir)
    blocked_left_count.value = len(os.listdir(blocked_left_dir))

def save_blocked_right():
    global blocked_right_dir, blocked_right_count
    save_snapshot(blocked_right_dir)
    blocked_right_count.value = len(os.listdir(blocked_right_dir))

# attach the callbacks, we use a 'Lambda' function to ignore the
# parameter that the on_click event would provide to our function
# because we don't need it,
free_button.on_click(lambda x: save_free())
blocked_left_button.on_click(lambda x: save_blocked_left())
blocked_right_button.on_click(lambda x: save_blocked_right())
```

```
[5]: display(image)
display(widgets.HBox([free_count, free_button]))
display(widgets.HBox([blocked_left_count, blocked_left_button]))
display(widgets.HBox([blocked_right_count, blocked_right_button]))
```



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30	<input type="button" value="add free"/>
75	<input type="button" value="add blocked_left"/>
75	<input type="button" value="add blocked_right"/>

## 4. Coding (Neural Networks Training)

### Collision Avoidance - Train Model

```
[1]: import torch
import torch.optim as optim
import torch.nn.functional as F
import torchvision
import torchvision.datasets as datasets
import torchvision.models as models
import torchvision.transforms as transforms
```

#### Create dataset instance

```
[2]: dataset = datasets.ImageFolder(
    'dataset',
    transforms.Compose([
        transforms.ColorJitter(0.1, 0.1, 0.1, 0.1),
        transforms.Resize((224, 224)),
        transforms.ToTensor(),
        transforms.Normalize([0.485, 0.456, 0.406], [0.229, 0.224, 0.225])
    ])
)
```

#### Split dataset into train and test sets

Split the dataset into *training* and *test* sets. The test set will be used to verify the accuracy of the model we train.

```
[3]: train_dataset, test_dataset = torch.utils.data.random_split(dataset, [len(dataset) - 50, 50])
```

#### Create data loaders to load data in batches 1

Create two `DataLoader` instances, which provide utilities for shuffling data, producing *batches* of images, and loading the samples in parallel with multiple workers.

```
[4]: train_loader = torch.utils.data.DataLoader(
    train_dataset,
    batch_size=16,
    shuffle=True,
    num_workers=4
)

test_loader = torch.utils.data.DataLoader(
    test_dataset,
    batch_size=16,
    shuffle=True,
    num_workers=4
)
```

#### Define the neural network

*torchvision* package pre-trained models.

In a process called *transfer learning*, we can repurpose a pre-trained model (trained on millions of images) for a new task that has available.

```
[5]: model = models.alexnet(pretrained=True)

#Change AlexNet final layer into 3 label classifier
```

```
[6]: model.classifier[6] = torch.nn.Linear(model.classifier[6].in_features, 3)
```

Transfer the model for execution on the GPU

```
[7]: device = torch.device('cuda')
model = model.to(device)
```

## Train the neural network

An epoch is a full run through our data.

```
[8]: from bokeh.io import push_notebook, show, output_notebook
from bokeh.layouts import row
from bokeh.plotting import figure
from bokeh.models import ColumnDataSource
from bokeh.models.tickers import SingleIntervalTicker
output_notebook()

colors = ['#1f77b4', '#ff7f0e', '#2ca02c', '#d62728']

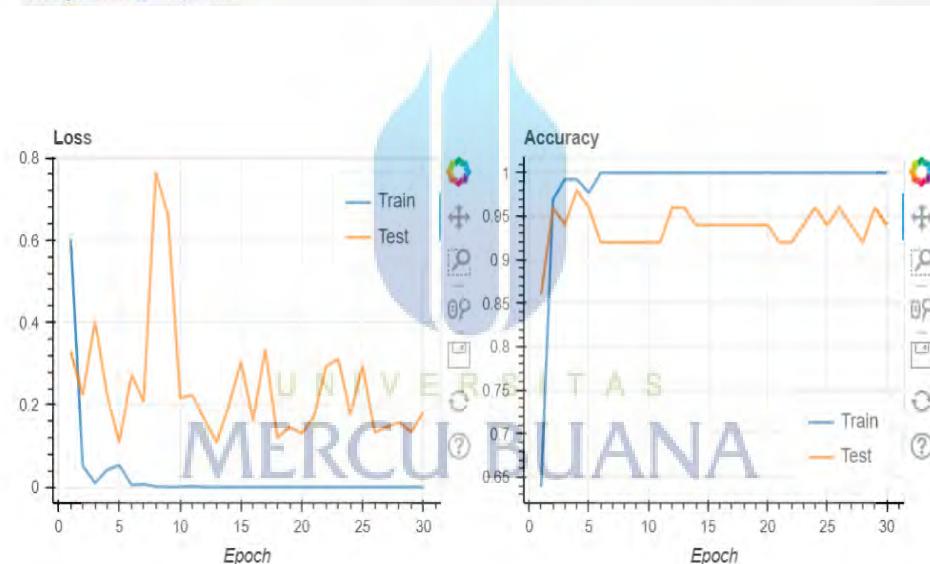
p1 = figure(title="Loss", x_axis_label="Epoch", plot_height=300, plot_width=360)
p2 = figure(title="Accuracy", x_axis_label="Epoch", plot_height=300, plot_width=360)

source1 = ColumnDataSource(data={'epochs': [], 'trainlosses': [], 'testlosses': []})
source2 = ColumnDataSource(data={'epochs': [], 'train_accuracies': [], 'test_accuracies': []})

#r = p1.multi_line(ys=['trainlosses', 'testlosses'], xs='epochs', color=colors, alpha=0.8, legend_label=['Training', 'Test'], source=source1)
r1 = p1.line(x='epochs', y='trainlosses', line_width=2, color=colors[0], alpha=0.8, legend_label="train", source=source1)
r2 = p1.line(x='epochs', y='testlosses', line_width=2, color=colors[1], alpha=0.8, legend_label="test", source=source1)

r3 = p2.line(x='epochs', y='train_accuracies', line_width=2, color=colors[0], alpha=0.8, legend_label="Train", source=source2)
r4 = p2.line(x='epochs', y='test_accuracies', line_width=2, color=colors[1], alpha=0.8, legend_label="Test", source=source2)

p1.legend.location = "top_right"
p1.legend.click_policy="hide"
```



```
1: 0.602306, 0.328046, 0.638462, 0.860000
2: 0.052278, 0.224863, 0.969231, 0.960000
3: 0.009738, 0.404261, 0.992308, 0.940000
4: 0.042524, 0.223551, 0.992308, 0.980000
5: 0.053239, 0.108321, 0.976923, 0.960000
6: 0.005829, 0.274450, 1.000000, 0.920000
7: 0.000000, 0.000000, 0.000000, 0.000000
```

## 5. Coding (ROS Operation)

### Create the preprocessing function

1. Convert from BGR to RGB
2. Convert from HWC layout to CHW layout
3. Normalize using same parameters as we did during training (our camera provides values in [0, 255] range and training loss so we need to scale by 255.0)
4. Transfer the data from CPU memory to GPU memory
5. Add a batch dimension

```
[4]: import cv2
import numpy as np

mean = 255.0 * np.array([0.485, 0.456, 0.406])
stdev = 255.0 * np.array([0.229, 0.224, 0.225])

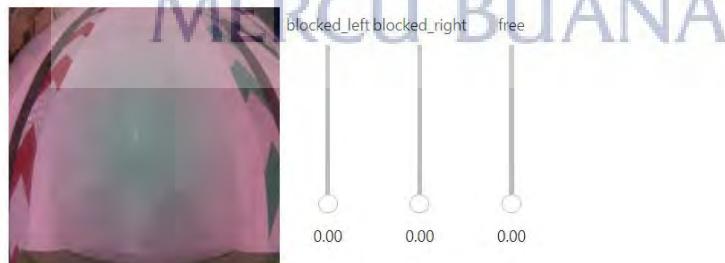
normalize = torchvision.transforms.Normalize(mean, stdev)

def preprocess(camera_value):
    global device, normalize
    x = camera_value
    x = cv2.cvtColor(x, cv2.COLOR_BGR2RGB)
    x = x.transpose((2, 0, 1))
    x = torch.from_numpy(x).float()
    x = normalize(x)
    x = x.to(device)
    x = x[None, ...]
    return x
```

```
camera = Camera.instance(width=224, height=224)
image = widgets.Image(format='jpeg', width=224, height=224)
blocked_left_slider = widgets.FloatSlider(description='blocked_left', min=0.0, max=1.0, orientation='vertical')
blocked_right_slider = widgets.FloatSlider(description='blocked_right', min=0.0, max=1.0, orientation='vertical')
free_slider = widgets.FloatSlider(description='free', min=0.0, max=1.0, orientation='vertical')
camera_link = traitlets.dlink((camera, 'value'), (image, 'value'), transform=bgr8_to_jpeg)

display(widgets.HBox([image, blocked_left_slider, blocked_right_slider, free_slider]))
```



```
[ 5]: from jetbot import Robot
robot = Robot()

[ 6]: import torch.nn.functional as F
import time

def update(change):
    global blocked_left_slider,blocked_right_slider,free_slider, robot
    x = change['new']
    x = preprocess(x)
    y = model(x)

    # we apply the 'softmax' function to normalize the output vector so it sums to 1 (which makes it a probability distribution)
    y = F.softmax(y, dim=1)

    prob_blocked_left = float(y.flatten()[0])
    prob_blocked_right = float(y.flatten()[1])
    prob_free = float(y.flatten()[2])
    blocked_left_slider.value = prob_blocked_left
    blocked_right_slider.value = prob_blocked_right
    free_slider.value = prob_free

    if prob_blocked_left > 0.5:
        robot.right(0.1)
    elif prob_blocked_right > 0.5:
        robot.left(0.1)
    else:
        robot.forward(0.125)

    time.sleep(0.001)
```



```
[ 6]: from jetbot import Robot
robot = Robot()

[ 7]: import torch.nn.functional as F
import time

def update(change):
    global blocked_left_slider,blocked_right_slider,free_slider, robot
    x = change['new']
```

## 6. ***LINK SITASI (GDRIVE)***

TYPE	LINK
<i>E-Book</i>	<a href="https://drive.google.com/drive/folders/1Yq_G1daUxLvOY7NuaG0fn_gN6_oXI7GE?usp=sharing">https://drive.google.com/drive/folders/1Yq_G1daUxLvOY7NuaG0fn_gN6_oXI7GE?usp=sharing</a>
<i>Journals</i>	<a href="https://drive.google.com/drive/folders/1MCWltVMsbWUttNW7zuX2JobR54URM6lI?usp=sharing">https://drive.google.com/drive/folders/1MCWltVMsbWUttNW7zuX2JobR54URM6lI?usp=sharing</a>

