

Turtlebot Control & Sensor Data

ECE 4900/5900 Lecture Slides

Fall 2019

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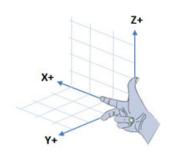
Summary and Quick Links

These slides contain the following concepts:

- ▶ ROS Coordinate Systems and Units (Slide 3)
- ▶ Running launch files (Slide 5)
- ▷ ROS Timers (Slide 9)
- ▷ Simulated Robots in Gazebo (Slide 11)
- ▷ Controlling the Turtlebot via teleoperation (Slide 16)
- ▶ Message headers (Slide 20)
- Controlling the Turtlebot via messages and writing classes in Python for ROS (Slide 22)
- ▷ Obtaining sensor data from the turtlebot (Slide 34)



ROS Coordinate Systems and Units



- ▶ ROS uses a right-hand convention for the orientation of coordinate axes
- ▶ For mobile robots this means:
 - > The x-axis is forwards
 - > The y-axis is left
 - > The z-axis is upwards



ROS Coordinate Systems and Units

Below are the standard units of measure in ROS:

Quantity	Unit
length	meter
mass	kilogram
$_{ m time}$	second
angle	radian
frequency	hertz
force	newton
linear velocity	$\mathrm{m/s}$
angular velocity	$\mathrm{rad/s}$



- ▶ Launch files are scripts to automate the running of a ROS system.
- ▶ They can be used to spawn any number of nodes, while also configuring parameters and topic names.
- ▶ All the vivid details can be found on the ROS wiki:
 - > Command line usage
 http://wiki.ros.org/roslaunch/Commandline%20Tools
 - > File syntax http://wiki.ros.org/roslaunch/XML



▶ Launch files follow XML syntax:

- ▶ This launch file runs a single node using the **node** tag:
 - > The compiled node name is **node_type**.
 - > The node is compiled in the package **package_name**.
 - > Its run-time name is changed to **node_name**.
 - > The optional **output="screen"** allows any console output to be displayed in the terminal.



- ▶ While the **name** property must be set, it can be the same name as the node type.
- ▶ However, when launching multiple instances of the same node, their run-time names have to be different:

```
<launch>
  <node pkg="package_name" type="node_type" name="inst_1" />
  <node pkg="package_name" type="node_type" name="inst_2" />
  </launch>
```



- ▶ Some of the common XML tags used in ROS launch files are:
 - > < node > Launches a particular node.
 - > <include> Used to include other launch files.
 - > <param> Sets a particular ROS parameter to a specific value.
 - > <rosparam> Used to load a set of parameters specified in a YAML file.
 - > <arg> Used to specify variable arguments to the launch file.



Timers

- ▶ Timers are used to execute code at periodic intervals.
- ▶ Node handles manage the timer. The user just specifies the desired period.
- ▶ Timers are usually instantiated in the main function of a node:

```
rospy.Timer(rospy.Duration(0.5), timer_callback)
```

- ▶ In this case, the timer is:
 - > Set to trigger at a frequency of 2 Hz (period = 0.5 sec).
 - > Set to call the **timer_callback** function when triggered.



Timers

➤ Timer callbacks are called with a "TimerEvent" structure argument:

```
def timer_callback(event):
    # Code for timer goes here
    print 'Timer called at ' + str(event.current_real)
```

- ▶ The TimerEvent contains four ROS time stamp values:
 - > current_real The system time as of when the callback function was called.
 - > last_real The system time at the *last* time the function was called.
 - > current_expected The scheduled time when the callback function was supposed to be called.
 - > last_expected When the last time this function was supposed to be called.



Simulated Robots in Gazebo

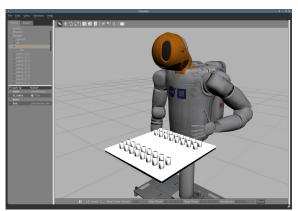
- ▶ Simulations have the advantage of:
 - > Reducing Cost No risk of damage when testing new apps, no need to purchase real physical hardware, no maintenance
 - > Reducing Time No need to charge a battery, run simulations in parallel (Great for ML!), no need to take time repairing hardware
 - > Experiments You can use any environment, robot, and sensors. Repeatable experiments for environment, hardware, and inputs



Simulated Robots in Gazebo

Simulations are limited because the:

- ▶ Cannot perfectly simulate the complexity of real-world environments, hardware failures, and noise
- $\,\rhd\,$ Cannot currently simulate human-robot interactions
- ▶ Make numerous assumptions



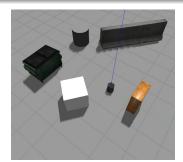


Running Turtlebot in Gazebo

There are numerous simulated robots available to be used in Gazebo which can be controlled through ROS. A list can be found here: ROS/Gazeo Robots

▶ If you have followed the class computer setup instructions we have already installed the Turtlebot simulation on your computer. Run the following in your terminal:

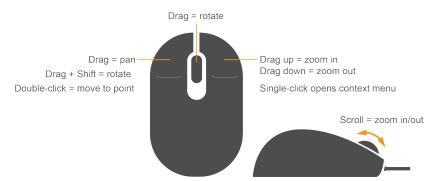
\$ roslaunch turtlebot_gazebo turtlebot_world.launch





Running Turtlebot in Gazebo

Below is a graphic explaining how to view the gazebo simulation using your mouse:





Controlling Turtlebot

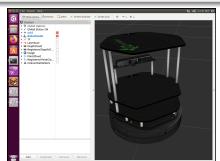
There are many ways to control the Turtlebot in ROS but we will discuss two as examples:

- \triangleright Teleoperation using RVIZ interactive markers or a keyboard
- Programmatically through the rostopic
 /cmd_vel_mux/input/teleop which uses a twist
 message type



- ▶ RVIZ is a visualization environment in ROS to understand what the robot is "seeing, thinking, and doing".
- ▶ It allows you to visualize and log sensor information for debugging and development.
- ▶ To run RVIZ type the following in a terminal with Gazebo running:

\$ roslaunch turtlebot_rviz_launchers view_robot.launch



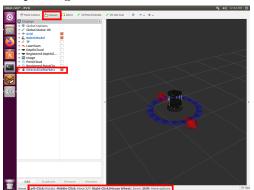


Now that RVIZ and Gazebo are running for Turtlebot you can control the robot using interactive markers by running the following:

\$ roslaunch turtlebot_interactive_markers
interactive_markers.launch



- ▶ Make sure that the "InteractiveMarkers" checkbox in RVIZ is checked and you have clicked on the "Interact" button.
- ▷ Once those have been completed the blue (circle) and red (arrow) interactive markers will show up in RVIZ.
- ▶ Dragging the arrow will make the robot move back and forward and spinning the circle will make it rotate.





You can also control Turtlebot using a keyboard by running the following node:

\$ roslaunch turtlebot_teleop keyboard_teleop.launch

▶ Instructions for use will pop up on the terminal for you to refer to



Message Headers

- ▶ Many messages published on ROS topics contain a header (std_msgs.msg.Header)
- ➤ A std_msgs.msg.Header is a structure that contains the following information:
 - > seq An unsigned 32-bit integer indicating the sequence number of the given message. This value is automatically incremented every time a message is published on the topic.
 - > stamp A ROS time stamp that is typically used to specify when the data contained in the message was generated.
 - > frame_id A string that indicates which reference frame the message's data is represented in (more on this later).



Message Headers

▶ Many ROS messages also have stamped versions, which means there is a std_msgs.msg.Header attached to the original message type.

```
Student@ros-vm:~
student@ros-vm:~
student@ros-vm:~$ rosmsg show geometry_msgs/Point float64 x
float64 y
float64 z
student@ros-vm:~$
```



The following slides will:

- ▶ Define a ROS Twist message
- ▶ Describe how to create a Python class to encapsulate a ROS node
- \triangleright Create a package to interact with the Turtlebot simulation
- ▷ Create a program where the robot plays red light/green light to demonstrate sending control commands to the turtlebot



➤ The Turtlebot movements can be controlled by publishing a ROS Twist message to the
 /cmd_vel_mux/input/teleop topic

```
geoff@ubuntu:~/hri-fall2019$ rosmsg show geometry_msgs/Twist
geometry_msgs/Vector3 linear
  float64 x
  float64 y
  float64 z
geometry_msgs/Vector3 angular
  float64 x
  float64 x
  float64 x
  float64 y
  float64 y
```



We've already discussed how to generate **package.xml** and **CMakeLists.txt** from scratch. There is a convenience function that automatically generates a ROS package for you.

▶ First go into your workspace **src** folder.

Now use the catkin_create_pkg command:

```
$ catkin_create_pkg hri_bot rospy geometry_msgs sensor_msgs
```

▶ The general syntax for the catkin_create_pkg command is:

```
$ catkin_create_pkg {pkg_name} {depend_1} .... {depend_n}
```



Since catkin_create_pkg only creates a src folder for C++ code you will still need to make a scripts folder and create the python file

```
geoff@ubuntu:~/hri-fall2019/ros/src/hri_bot$ mkdir scripts
geoff@ubuntu:~/hri-fall2019/ros/src/hri_bot$ cd scripts
geoff@ubuntu:~/hri-fall2019/ros/src/hri_bot/scripts$ touch simple_control.py
geoff@ubuntu:~/hri-fall2019/ros/src/hri_bot/scripts$ ls
simple_control.py
geoff@ubuntu:~/hri-fall2019/ros/src/hri_bot/scripts$
```



First we will setup our Python script with the necessary ROS specific libraries and messages

```
#!/usr/bin/env python
```

```
import rospy
from geometry_msgs.msg import Twist
```

This code snippet imports the:

- ▶ The ROS Python Libraries
- ➤ The necessary Twist message structure from the geometry_msgs packages

```
class RedGreenLightBot:
 def __init__(self):
   self.cmd_vel_pub = rospy.Publisher('cmd_vel', Twist,
                                    queue_size=1)
   self.green_light = True
   self.red_light_twist = Twist()
   self.green_light_twist = Twist()
   self.green_light_twist.linear.x = 0.5
   rospy.init_node('red_light_green_light')
   rospy.Timer(rospy.Duration(3),self.light_change_callback)
   rospy.Timer(rospy.Duration(0.1),self.pub_drive_command)
   rospy.spin()
 def light_change_callback(self, event):
   self.green_light = not self.green_light
 def pub_drive_command(self, event):
   if self.green_light:
     self.cmd_vel_pub.publish(self.green_light_twist)
   else:
     self.cmd_vel_pub.publish(self.red_light_twist)
```



Create a Python class with a constructor

The constructor:

 \triangleright Initializes a publisher which publishes a Twist command



▷ Initializes Twist messages which command the robot to go a different velocities depending on whether it is a "green" (0.5 m/s forward) or "red" (0.0 m/s) light

```
self.green_light = True
self.red_light_twist = Twist()
self.green_light_twist = Twist()
self.green_light_twist.linear.x = 0.5
```

▶ Initializes the ROS node

```
rospy.init_node('red_light_green_light')
```



▶ Initializes two Timers which change the "light" every 3 seconds and publish a velocity command every 0.1 seconds

```
rospy.Timer(rospy.Duration(3),self.light_change_callback)
rospy.Timer(rospy.Duration(0.1),self.pub_drive_command)
```

▶ Keep the node running and processing callbacks from the timers

```
rospy.spin()
```

▷ Define the light_change_callback which inverts the state of the light every time the callback is called:

```
def light_change_callback(self, event):
    self.green_light = not self.green_light
```

▷ Define the pub_drive_command callback to send commands depending on the current state of the light. We need to continually publish a stream of velocity command messages because most mobile base drivers will time out and stop the robot if they do not receive at least several messages per second.

```
def pub_drive_command(self, event):
   if self.green_light:
     self.cmd_vel_pub.publish(self.green_light_twist)
   else:
     self.cmd_vel_pub.publish(self.red_light_twist)
```



Finally, we can simply initialize the class in the function and catch for exceptions when the node has been closed:

```
if __name__ == "__main__":
    try:
    RedGreenLightBot()
    except rospy.ROSInterruptException:
    pass
```



We can now fire up and test our robot control program (Don't forget to chmod +x your python script!):

\$ roslaunch turtlebot_gazebo turtlebot_world.launch

\$ rosrun hri_bot simple_control.py
cmd_vel:=cmd_vel_mux/input/teleop

The second terminal command runs the ros node simple_control.py but also remaps the nodes "cmd_vel" topic to the "cmd_vel_mux/input/teleop" topic the Turtlebot software stack is subscribed to.



Sensor Data on the TurtleBot

The Turtlebot has numerous sensors on it including a 2D camera, bumper/cliff sensors, Depth camera, pseudo LIDAR, and encoders. A good way to find out what sensors are available is to use:

rostopic list

You can then find out more info about the topic using:

```
rostopic info {topic_name}
```

If there is a custom message you can then find out more info by:

```
rosmsg info {message_type}
```



Sensor Data on the TurtleBot: Bumper Sensors

The bumper sensors are located at the front left, right, and center of the robot. To access sensory information you need to subscribe to the topic "/mobile_base/events/bumper"

```
turtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rostopic info /mobile_base/events/bum
per
Type: kobuki_msgs/BumperEvent
Publishers:
 * /gazebo (http://turtlebot-Lenovo-FLEX-6-11IGM:42137/)
Subscribers: None
```

The topic publishes a custom msg with the event information described below

```
turtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rosmsg info kobuki_msgs/BumperEvent uint8 LEFT=0
uint8 CENTER=1
uint8 RIGHT=2
uint8 RELEASED=0
uint8 PRESSED=1
uint8 bumper
uint8 bumper
uint8 state
```



Sensor Data on the TurtleBot: Cliff Sensors

The cliff sensors are located at the front left, right, and center of the robot. To access sensory information you need to subscribe to the topic "/mobile_base/events/cliff"

```
turtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rostopic info /mobile_base/events/cli
ff
Type: kobuki_msgs/CliffEvent
Publishers:
 * /gazebo (http://turtlebot-Lenovo-FLEX-6-11IGM:42137/)
Subscribers: None
```

The topic publishes a custom msg with the event information described below

```
turtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rosmsg info kobuki_msgs/CliffEvent uint8 LEFT=0
uint8 CENTER=1
uint8 RIGHT=2
uint8 FLOOR=0
uint8 CLIFF=1
uint8 sensor
uint8 state
uint16 bottom
```



Sensor Data on the TurtleBot: Encoders Sensors

The Turtlebot has a set of encoders on its wheels which enables dead reckoning of the position of the robot and sensing the velocity of the robot. To access this information you can subscribe to the "/odom" topic.

```
turtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rostopic info /odom
Type: nav_msgs/Odometry
Publishers:
* /gazebo (http://turtlebot-Lenovo-FLEX-6-11IGM:42137/)
Subscribers: None
```



Sensor Data on the TurtleBot: Encoders Sensors

The topic publishes an Odometry message from the nav_msgs package

```
urtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rosmsg info nav msgs/Odometry:
std msgs/Header header
 uint32 sea
 time stamp
 string frame id
string child frame id
geometry msgs/PoseWithCovariance pose
 geometry msgs/Pose pose
   geometry msgs/Point position
     float64 x
     float64 v
     float64 z
   geometry msgs/Quaternion orientation
     float64 x
     float64 v
     float64 z
     float64 w
 float64[36] covariance
geometry_msgs/TwistWithCovariance twist
 geometry msgs/Twist twist
   geometry msgs/Vector3 linear
     float64 x
     float64 v
     float64 z
   geometry msgs/Vector3 angular
     float64 x
     float64 v
     float64 z
 float64[36] covariance
```



Sensor Data on the TurtleBot: Encoders Sensors

- ➤ The pose value of the message provides the estimated position and orientation of the robot in 3D space. The origin is where the Turtlebot software stack started in 3D space.
- ➤ The Twist message then provides the current linear and angular velocities of the robot.



Sensor Data on the TurtleBot: Pseudo Laser Sensor

Although the Turtlebot does not have a laser range finder, pseudo laser sensory information is generated from the Astra/Kinect/Xtion depth sensor mounted on the robot using the depthimage_to_laserscan package. The pseudo laser information is published on the scan topic.

```
turtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rostopic info /scan
Type: sensor_msgs/LaserScan
Publishers:
* /laserscan_nodelet_manager (http://turtlebot-Lenovo-FLEX-6-11IGM:34347/)
Subscribers: None
```



Sensor Data on the TurtleBot: Pseudo Laser Sensor

The topic publishes a LaserScan message from the sensor_msgs package

```
turtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rosmsg info sensor_msgs/LaserScan std_msgs/Header header uint32 seq time stamp string frame_id float32 angle_min float32 angle_min float32 angle_min float32 angle_min float32 string_increment float32 strine_increment float32 strine_increment float32 range_min float32 range_min float32 range_min float32 range_min float32 range_min float32 range_max float32[] ranges
```



Sensor Data on the TurtleBot: Pseudo Laser Sensor

The value we are most interested here is the **float32** ranges array. From this array we can estimate the bearing for a particular range estimate using the following equation:

```
bearing = msg.angle_min + i * msg.angle_max/len(msg.ranges)
```

To retrieve the range of the closest object we can simply use:

```
closest_range = min(msg.ranges)
```

To retrieve the range of an obstacle directly in front of the robot we can then use:

```
range_ahead = msg.ranges[len(msg.ranges)/2]
```



The following slides will:

- ▷ Create a program which reads LIDAR data
- > Actuate a robot to wander around without running into any objects
- ▶ Create a launch file which runs existing launch files and nodes



As usual we will first setup our Python script file with the necessary libraries and messages it wil be using

```
#!/usr/bin/env python
import rospy
from geometry_msgs.msg import Twist
from sensor_msgs.msg import LaserScan
```

Here we are using the:

- ▶ The Twist message from geometry_msgs



We will then a create a class which encapsulates a ROS node to perform the following functions:

- ▶ Prevent the robot from getting close to objects (<0.8m)
- ▶ Change the state of the robot to turning or going forward every 5 seconds

```
pass

class WanderBot():
    def __init__(self):
        #Class constructor code here

def scan_callback(self,msg):
        #Code for when a laser scan is received

def change_state_callback(self, event):
        #Code to change the state of the robot every 5 seconds
```



The WanderBot class constructor

```
def __init__(self):
 rospy.init_node('wander_bot')
 rospy.Timer(rospy.Duration(0.1),self.pub_drive_command)
 rospy.Timer(rospy.Duration(5),self.change_state_callback)
 self.scan_sub = rospy.Subscriber('scan', LaserScan,
                                 self.scan_callback)
 self.cmd_vel_pub = rospy.Publisher('cmd_vel', Twist,
                                   queue_size=1)
 self.twist_msg = Twist()
 self.g_range_ahead = -1
 self.driving_forward = True
 rospy.spin()
```



We first initialize the "wander_bot" ROS node

```
rospy.init_node('wander_bot')
```

We will then create our **Timers** for changing the state of the robot's wander behavior every 5 seconds and publish drive commands based on the current state of the robot every 0.1 seconds

```
rospy.Timer(rospy.Duration(0.1),self.pub_drive_command)
rospy.Timer(rospy.Duration(5),self.change_state_callback)
```



The WanderBot class constructor

```
def __init__(self):
 rospy.init_node('wander_bot')
 rospy.Timer(rospy.Duration(0.1),self.pub_drive_command)
 rospy.Timer(rospy.Duration(5),self.change_state_callback)
 self.scan_sub = rospy.Subscriber('scan', LaserScan,
                                 self.scan_callback)
 self.cmd_vel_pub = rospy.Publisher('cmd_vel', Twist,
                                   queue_size=1)
 self.twist_msg = Twist()
 self.g_range_ahead = -1
 self.driving_forward = True
 rospy.spin()
```



Initialize a subscriber to obtain LIDAR data from the scan topic and a publisher to output cmd_vel to the robot.

Initialize variables which tracks the twist messages to be published to the robot, closest object to the robot based on laser data, and the current driving state of the robot.

```
self.twist_msg = Twist()
self.g_range_ahead = -1
self.driving_forward = True
```



We now define a function that does the following when LaserData message is received by the subscriber:

- ▶ Determines the distance of the closest object in a field of view of the Pseudo Laser Sensor
- Changes the behavior of the robot to spin when the closest object is less than 80cm away.

```
def scan_callback(self,msg):
    self.g_range_ahead = min(msg.ranges)
    if self.g_range_ahead < 0.8:
        self.driving_forward = False</pre>
```



This function inverts the behavior of the robot to either spinning on the spot or moving forward when the Timer processes a callback every 5 seconds.

```
def change_state_callback(self, event):
    self.driving_forward = not self.driving_forward
```



This function then publishes the drive command to going forward at 1 m/s or spinning at 1 rad/s depending on the desired behavior of the robot at the initialized Timer rate (10hz)

```
def pub_drive_command(self,event):
    if self.driving_forward:
        self.twist_msg.linear.x = 1
        self.twist_msg.angular.z = 0
else:
    self.twist_msg.linear.x = 0
    self.twist_msg.angular.z = 1
    self.cmd_vel_pub.publish(self.twist_msg)
```



Finally, we initialize the class to run the node in the main function

```
if __name__ == "__main__":
    try:
    WanderBot()
    except rospy.ROSInterruptException:
    pass
```

We can then run the node with:

```
roslaunch turtlebot_gazebo turtlebot_world.launch
rosrun hri_bot wander_bot.py
```



Sensor Data on the TurtleBot: Image Data

The Turtlebot also publishes 2D RGB Camera Data and Depth Camera Data which you can process using OpenCV. This sensory information is published as sensor_msgs/Image messages on the topics:

- ⊳ RGB Image: /camera/rgb/image_raw
- ${\tt \triangleright} \ \, {\rm Depth} \ \, {\rm Image:} \ \, /{\rm camera}/{\rm depth}/{\rm image_raw}$







Sensor Data on the TurtleBot: Image Data

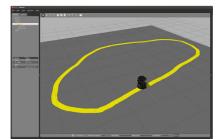
```
^Cturtlebot@turtlebot-Lenovo-FLEX-6-11IGM:~$ rosmsg info sensor_msgs/Image std_msgs/Header luint32 seq time stamp string frame_id luint32 height uint32 width string encoding luint32 stamp string encoding luint32 step luint32 step luint32 step luint32 step luint31 step luint32 step luint32 step luint8[] data
```

- ▶ height Height dimension of the image
- ▶ width Width dimension of the image
- encoding Encoding of pixels channel meaning, ordering, size
- ▶ is_bigendian Expresses order in which data is stores (LSB vs. MSB)
- ▶ step Full row length in bytes



The following slides will:

- ▷ Create a program which reads image sensor data
- Converts the ROS Image message to a OpenCV Mat structure
- $\,\triangleright\,$ Process the image using some OpenCV functions
- ▶ Control a robot to follow a yellow line





First, we will need to include the dependencies to work with images. These dependencies include:

- ▷ sensor_msgs
- ▷ cv_bridge
- \triangleright rospy
- ▷ std_msgs

In your ROS workspace **src** folder type:

\$ catkin_create_package opencv_bot sensor_msgs cv_bridge
rospy std_msgs

Also create your scripts folder in the package and the node file line_follower_bot.py



The cv_bridge package does all the heavy lifting for converting ROS Image messages to OpenCV processable formats (i.e. Mat). You simply need to import the CvBridge object into your python file and use the imgmsg_to_cv2 function. The generic usage of this is shown below:

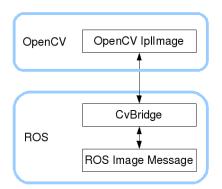
```
from cv_bridge import CvBridge, CvBridgeError
bridge = CvBridge()
bridge.cv2_to_imgmsg(mat_format_image, "bgr8")
```

You can also do the reverse (Mat->sensor_msgs/Image) with:

```
bridge.imgmsg_to_cv2(ros_image_msg, "bgr8")
```



- ▷ Once you have the image in the OpenCV Mat format you can play with all the capabilities of OpenCV
- ▶ For more OpenCV specific documentation you can refer to these two links:
 - > OpenCV Python Tutorials
 - > OpenCV Documentation





We will now import all the python packages we require for our node:

```
#!/usr/bin/env python
import rospy, cv2, cv_bridge, numpy
from sensor_msgs.msg import Image
from geometry_msgs.msg import Twist
```

- Numpy Package that efficiently deals with multidimensional data
- ▷ cv2 Package for computer vision
- ▷ cv_bridge Package to convert ROS messages to OpenCV Mat structures
- ▶ Image The message type used in ROS for images



Below is the basic class structure we will be using for our line follower robot:

```
class FollowBot:
    def __init__(self):
        # Sets up the ROS node, subscriber for images, publisher for
        # cmd_vels, and CvBridge

def image_callback(self, msg):
    # Takes a ROS Image message, processes it in OpenCV to find
    # the yellow line, and controls the robot motion
```

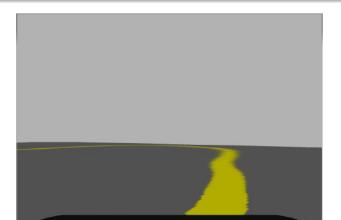


- ▶ Init the rospy node
- ▶ Init a subscriber to process the images published by the Turtlebot 2D camera
- $\,\triangleright\,$ Init a publisher to send command velocities to control the Turtlebot
- ▷ Init a Twist message that we will later populate with the robot motions
- \triangleright Keep the program running and callbacks to be processed_{62/70}



For the image_callback function, we need to first change the ROS Image message to a OpenCv Mat

```
def image_callback(self, msg):
   image = self.bridge.imgmsg_to_cv2(msg,desired_encoding='bgr8')
```





We then extract the yellow line from the image:

▶ We convert the color space from RGB to HSV to reduce challenges with illumination variance

```
hsv = cv2.cvtColor(image, cv2.COLOR_BGR2HSV)
```

➤ A simple threshold can then be applied to the 3 color channels to extract hues near yellow

```
lower_yellow = numpy.array([ 10, 10, 10])
upper_yellow = numpy.array([255, 255, 250])
mask = cv2.inRange(hsv, lower_yellow, upper_yellow)
```







We then remove all pixels that are not in a 20 row portion of the image corresponding to ~ 1 m in front of the robot:

```
h, w, d = image.shape
search_top = 3*h/4
search_bot = 3*h/4 + 20
mask[0:search_top, 0:w] = 0
mask[search_bot:h, 0:w] = 0
```



We then calculate the centroid of the blob for the binary image:

```
M = cv2.moments(mask)
if M['m00'] > 0:
    cx = int(M['m10']/M['m00'])
    cy = int(M['m01']/M['m00'])
    cv2.circle(image, (cx, cy), 20, (0,0,255), -1)
```

The **cv2.moments** function is used to obtain the "moments" for the binary image.

$$M_{0,0} = \sum_{n=0}^{w} \sum_{n=0}^{h} f(x,y)$$
 (1)

$$sum_x = \sum \sum x f(x, y) \tag{2}$$

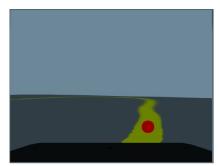
$$sum_y = \sum \sum x f(x, y) \tag{3}$$



$$M_{1,0} = sum_x/M_{0,0} (4)$$

$$M_{0,1} = sum_y/M_{0,0} (5)$$

Intuitively, these equations represent the centroid of a blob as the average of the x position and y position of all the pixels that are white in the image.





We then implement a basic proportional controller to control the movement of the robot

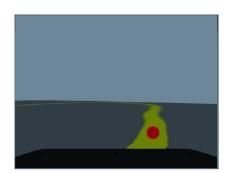
```
err = cx - w/2
self.twist.linear.x = 0.2
self.twist.angular.z = -float(err) / 100
self.cmd_vel_pub.publish(self.twist)
```

Namely, the control velocity command is always going $0.2~\mathrm{m/s}$ forward and the angular velocity or rate at which the robot turns is directly proportional to how far the yellow line is from the center of the image.



We also visualize the image processing done by the node to obtain the centroid of the line

```
cv2.imshow("window", image)
cv2.waitKey(3)
```





As usual we instantiate the class in the main function:

```
if __name__ == "__main__":
    try:
    follower_bot = FollowerBot()
    except rospy.ROSInterruptException:
    pass
```

We can then test our program by first bringing up a simulation of a course provided in the class repo:

```
roslaunch line_course course.launch
```

Then run the node we made:

```
roslaunch opencv_bot line_follower_bot.py
```