

Bridge of Doom^{dun^{dun}dun}

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The Challenge

Our goal was to program a simulated Neato robot to autonomously cross the Bridge of Doom^{dun^{dun}dun}, which is defined by the following curve (**Equation 1**):

$$r(u) = [0.3960 \cos(2.65(u + 1.4))\hat{i} - 0.99 \sin(u + 1.4)\hat{j}](u \in [0, 3.2]) \quad (1)$$

To do this, we needed to calculate the speed of each wheel of the Neato as it crossed the Bridge of Doom^{dun^{dun}dun}. We also collected encoder data from each of the Neato's wheels, which we then used to measure the path it actually took.

Methodology: Math

Path Prediction

The path of the centerline of the Bridge of Doom^{dun^{dun}dun} is given by the following **Equation 2**. We assume (or perhaps, declare) that the Neato will (aim to) follow this path exactly.

$$r_{\text{Bridge}}(u) = r_{\text{Neato}}(u) = [0.3960 \cos(2.65(u + 1.4))\hat{i} - 0.99 \sin(u + 1.4)\hat{j}](u \in [0, 3.2]) \quad (2)$$

First, we'll need to define u (**Equation 3**). We'll define u to be linearly correlated with t . This allows us to easily modulate the speed of the Neato by simply changing α :

$$u = \alpha t \quad (3)$$

Then, we can define the Neato's velocity (the rate of change of the Neato's position, **Equation 4**) and acceleration (the rate of change of the Neato's velocity, **Equation 5**):

$$v(u) = r'(u) \quad (4)$$

$$\text{Speed} = |v| \quad (5)$$

We can then calculate the unit tangent and unit normal vectors, as seen in **Equations 6 & 7**:

$$\hat{T} = \frac{v}{|v|} \quad (6)$$

$$\hat{N} = \frac{\hat{T}'}{|\hat{T}'|} \quad (7)$$

Next, we'll calculate the rotational velocity and speed, in **Equations 8 & 9**:

$$\omega = \hat{T} \times \hat{T}' \quad (8)$$

$$\text{Rotational Speed} = |\omega| \quad (9)$$

Finally, we'll compute the left and right wheel velocities (**Equations 10 & 11**, respectively), which are the things we can actually control:

$$v_L = v - \omega \frac{d}{2} \quad (10)$$

$$v_R = v + \omega \frac{d}{2} \quad (11)$$

Once those values have been calculated, we use the code below to send the velocity commands to the (simulated) Neato's wheels. This must happen on a very frequent basis to ensure that the Neato traces the appropriate path, so as to avoid falling to its Doom^{dun^{dun}dun}.

Encoders & Odometry

Once the Neato has traversed the Bridge of Doom^{dun^{dun}dun}, we collect data from each wheel's encoder and use that to plot the path that the Neato actually took—which, as with anything, won't be exactly what we told it to do.

First, we need to derive the wheel velocities from the encoder data, which is the absolute rotational position of the wheel (**Equations 12 & 13**).

$$v_{L, \text{measured}} = \frac{d}{dt} \text{Encoder}_L \quad (12)$$

$$v_{R, \text{measured}} = \frac{d}{dt} \text{Encoder}_R \quad (13)$$

Then we'll use **Equations 10 & 11** again to solve for the linear and rotational velocities of the Neato. Then, we can use **Equations 14 & 15** to calculate the absolute linear and angular positions of the Neato:

$$r_{\text{measured}} = \int v_{\text{measured}} dt \quad (14)$$

$$\theta_{\text{measured}} = \int \omega_{\text{measured}} dt \quad (15)$$

Finally, we'll use **Equations 16 & 17** to compute the unit tangent and normal vectors of the Neato's actual path:

$$\hat{T}_{\text{measured}} = \cos(\theta_{\text{measured}}) \hat{i} + \sin(\theta_{\text{measured}}) \hat{j} \quad (16)$$

$$\hat{N}_{\text{measured}} = -\cos(\theta_{\text{measured}}) \hat{i} - \sin(\theta_{\text{measured}}) \hat{j} \quad (17)$$

Methodology: MATLAB

The MATLAB implementations of our equations are shown below. For convinence, all code for this project (including this live script) can be found in non-PDF form on GitHub: <https://github.com/ariporad/QEA/tree/main/Robo/hw3>

Robot Setup

Before we can graph the robot's behavior, we need to define some physical parameters:

```
% alpha is a linear scalar with time, and controls the speed of the robot
% It's been approximately calibrated to keep the robot's maximum speed
% below the limit of 2 m/s
alpha = 1/5;

% d is the wheelbase of the robot
d = 0.235; % m

% The range of u is specified by the definition of the Bridge of Doom (dun
% dun dun)
U_RANGE = [0 3.2];

% We also convert the range of u into a range of t (u and t are linearly
% correlated) for convinence
T_RANGE = U_RANGE ./ alpha;

% N defines the number of points that will be used for calculating graphs.
% Higher Ns result in higher resolution graphs, but the difference is
% fairly minor.
N = 100;

% Define ranges of ts and us to use for graphs
us = linspace(U_RANGE(1), U_RANGE(2), N)';
ts = us ./ alpha;

% This loads the above equations again from the canonical equations.m
% file, which we use to ensure that this live script and the code we use to
% drive the neato in the simulator have exactly the same equations, in line
% with the programming principle of DRY (Don't Repeat Yourself)
%
% We've commented this out for our final submission so you can run this
% script by itself without it crashing. See the Methodology section below.

% equations
```

Calculations

We begin by setting up the symbolic variables we'll use to process the Bridge of Doom^{dun^{dun}dun}:

All code in this section should be in a file called `equations.m`, which is referenced by both this live script and the program that actually drives the robot across the Bridge of Doom^{dun^{dun}dun}. We use this pattern to ensure that both scripts use exactly the same equations, in line with the programming principle of DRY (Don't Repeat Yourself).

```
% First we must define the symbolic variables we will be using:
syms t omega v_l v_r

% Assumptions help MATLAB not go insane
```

```

assume(t, {'real', 'positive'})
assume(omega, 'real')
assume(v_l, 'real')
assume(v_r, 'real')

```

```

% This isn't actually a symbolic variable, but we'll set it up anyways
% This allows us to modulate the speed of the robot relative to time by
% adjusting alpha
u = t .* alpha;

```

```

% Define the curve of the Bridge of Doom (dun dun dun)
ri=4 * (0.3960 * cos(2.65 * (u + 1.4)));
rj=4 * (-0.99 * sin(u + 1.4));
rk=0*u;
r=[ri,rj,rk]

```

$$\mathbf{r} = (1.5840 \cos(0.5300 t + 3.7100) \quad -3.9600 \sin(0.2000 t + 1.4000) \quad 0)$$

```

% Calculate the robot's velocity (rate of change of position) and linear
% speed (magnitude of velocity)
v=diff(r,t)

```

$$\mathbf{v} = (-0.8395 \sin(0.5300 t + 3.7100) \quad -0.7920 \cos(0.2000 t + 1.4000) \quad 0)$$

```

speed = norm(v);

```

```

% Calculate the unit tangent and unit normal vectors
T_hat=simplify(v./norm(v))

```

$$\mathbf{T_hat} = \left(-\frac{53 \sin(0.5300 t + 3.7100)}{(2500 \cos(0.2000 t + 1.4000)^2 + 2809 \sin(0.5300 t + 3.7100)^2)^{0.5000}} \quad -\frac{50 \cos(0.2000 t + 1.4000)}{(2500 \cos(0.2000 t + 1.4000)^2 + 2809 \sin(0.5300 t + 3.7100)^2)^{0.5000}} \right)$$

```

dT_hat=simplify(diff(T_hat,t));
N_hat=simplify(dT_hat/norm(dT_hat))

```

$$\mathbf{N_hat} = \left(-\frac{0.0377 (96725 \cos(0.1300 t + 0.9100) + 140450 \cos(0.5300 t + 3.7100) + 43725 \cos(0.9300 t + 6.5100))}{\sigma_1} \quad \frac{0.0377 (96725 \sin(0.1300 t + 0.9100) + 140450 \sin(0.5300 t + 3.7100) + 43725 \sin(0.9300 t + 6.5100))}{\sigma_1} \right)$$

where

$$\sigma_1 = (2500 (73 \cos(0.1300 t + 0.9100) + 106 \cos(0.5300 t + 3.7100) + 33 \cos(0.9300 t + 6.5100))^2 + 2809 \sin^2(0.5300 t + 3.7100))^{0.5000}$$

```

% Calculate the rotational velocity and speed
omega = simplify(cross(T_hat, dT_hat))

```

$$\omega = \left(0 \quad 0 \quad -\frac{0.2500 (40540601 \cos(0.3300 t + 2.3100) - 10868021 \cos(1.3900 t + 9.7300) + 17375361 \cos(2.3900 t + 12.1500))}{(2500 \cos(0.2000 t + 1.4000)^2 + 2809 \sin(0.5300 t + 3.7100)^2)^{0.5000}} \right)$$

```
rotation_speed = omega(3);
```

```
% Calculate the wheel velocities
```

```
v_l = simplify(speed - (rotation_speed * (d / 2)))
```

```
v_l =
```

$$\frac{0.0294 (40540601 \cos(0.3300 t + 2.3100) - 10868021 \cos(1.3900 t + 9.7300) + 17375361 \cos(0.7300 t + 2.8000))}{(2500 \cos(0.4000 t + 2.8000))}$$

```
v_r = simplify(speed + (rotation_speed * (d / 2)))
```

```
v_r =
```

$$0.0158 \sqrt{2500 \cos(0.2000 t + 1.4000)^2 + 2809 \sin(0.5300 t + 3.7100)^2} - \frac{0.0294 (40540601 \cos(0.3300 t + 2.3100) - 10868021 \cos(1.3900 t + 9.7300) + 17375361 \cos(0.7300 t + 2.8000))}{(2500 \cos(0.4000 t + 2.8000))}$$

Encoders and Odometry

We load in the saved data from when we ran our code in the simulator, to plot the measured values side-by-side with the calculated ones here.

```
% We also load our saved encoder data from when we ran our code in the  
% simulator
```

```
load("encoder_data.mat");
```

```
%% The stored encoder data gives us total time and distance, but we also  
%% need the relative changes in each sample--so we calculate that here:
```

```
enc_dt = diff(enc_t);
```

```
enc_dl = diff(enc_l) ./ enc_dt;
```

```
enc_dr = diff(enc_r) ./ enc_dt;
```

```
%% We also need to derive the wheel, linear, and angular velocities from the  
%% measured encoder values.
```

```
% Define our symbolic variables
```

```
syms vl vr vlin vrot;
```

```
assume(vl, 'real');
```

```
assume(vr, 'real');
```

```
assume(vlin, 'real');
```

```
assume(vrot, 'real');
```

```
% Define our equations
```

```
vl_eqn = vl == vlin - (vrot .* (d ./ 2));
```

```
vr_eqn = vr == vlin + (vrot .* (d ./ 2));
```

```
% Have MATLAB solve them
```

```
[vrot, vlin] = solve([vl_eqn, vr_eqn], [vrot, vlin]);
```

```
% Substitute in our data and calculate the answers
```

```
vl = enc_dl;
```

```
vr = enc_dr;
```

```
vrots = double(subs(vrot));
```

```
vlins = double(subs(vlin));
```

```

%% Finally, we need to calculate the actual path that the robot took from these
%% encoder values

% Define our variables
enc_thetas = zeros(length(enc_t), 1);
enc_rxs = zeros(length(enc_t), 1);
enc_rys = zeros(length(enc_t), 1);

% We need to calculate our initial values differently, because encoders--by
% definition--cannot tell you your starting position. For that, we use our
% calculated path. That's OK because the first command of the neato's
% actual program is to use the magic of the simulator to move the neato to
% the starting position perscribed by the calculated solution.
that_0 = double(subs(T_hat, T_RANGE(1)));
enc_thetas(1) = atan(that_0(2)/that_0(1));
enc_rxs(1) = calculated_path(1, 1);
enc_rys(1) = calculated_path(1, 2);

% Then iteratively calculate each subsequent heading and position
for i=1:length(enc_dt)
    enc_thetas(i + 1) = enc_thetas(i) + (vrots(i) * enc_dt(i));
    enc_rxs(i + 1) = enc_rxs(i) + (vlins(i) * cos(enc_thetas(i + 1)) * enc_dt(i));
    enc_rys(i + 1) = enc_rys(i) + (vlins(i) * sin(enc_thetas(i + 1)) * enc_dt(i));
end

% Finally, calculate the Thats and Nhats from the headings
% We could technically optimize this step since we already do this math
% inside the loop, but Keep-It-Simple-Stupid/"premature optimization is the
% root of all evil"/etc.
enc_Thats = [cos(enc_thetas), sin(enc_thetas)];
enc_Nhats = [-cos(enc_thetas), -sin(enc_thetas)];

```

Neato Path Across the Bridge of Doom^{dun^{dun}dun} (Exercise 21.1)

Bridge of Doom^{dun^{dun}dun} *with the Neato on it*

```

figure(1); clf;

% Calculate and plot the Neato's path
calculated_path = double(subs(r, t, ts));
plot(calculated_path(:, 1), calculated_path(:, 2), 'k-'); axis equal; hold on;

% Calculate and plot unit tangent vectors at various points along the path

% First, pick the points at which to draw the unit tangent vectors
ts_for_arrows = linspace(T_RANGE(1), T_RANGE(2), N / 6)';
start_points_for_calc_arrows = double(subs(r, t, ts_for_arrows));

% Then, calculate vector lengths
calc_that_end_points = double(subs(T_hat, t, ts_for_arrows));
calc_nhat_end_points = double(subs(N_hat, t, ts_for_arrows));

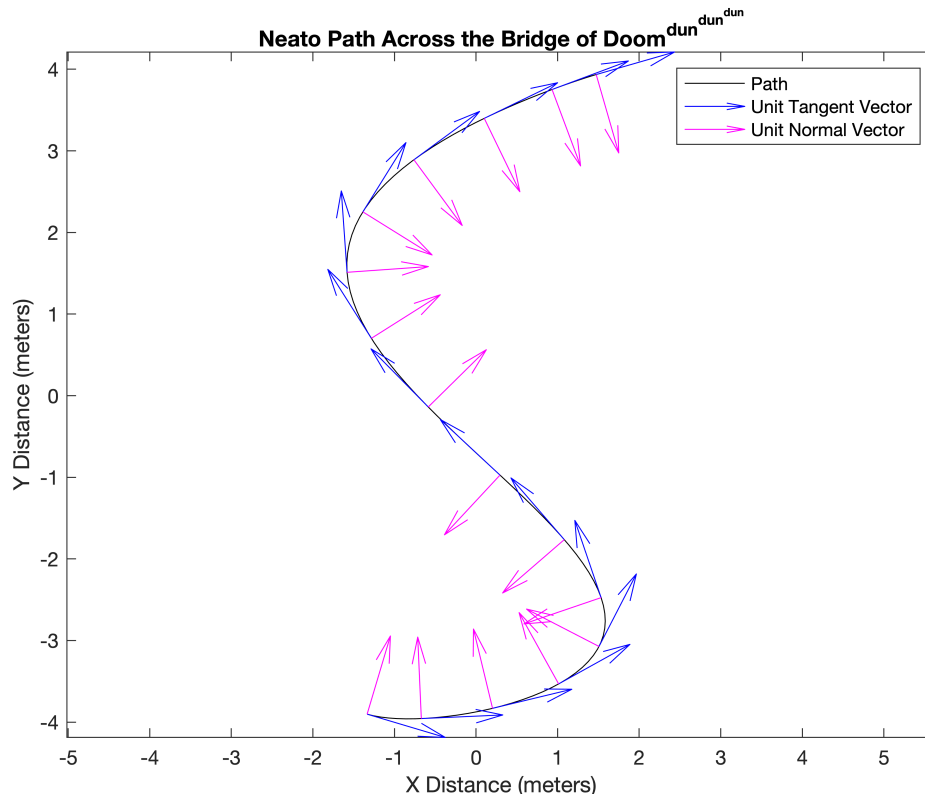
```

```
% Finally, plot the vectors
```

```
quiver( ...
    start_points_for_calc_arrows(:, 1), start_points_for_calc_arrows(:, 2), ...
    calc_that_end_points(:, 1), calc_that_end_points(:, 2), "off", 'filled', 'b');
quiver( ...
    start_points_for_calc_arrows(:, 1), start_points_for_calc_arrows(:, 2), ...
    calc_nhat_end_points(:, 1), calc_nhat_end_points(:, 2), "off", "filled", 'm');
```

```
% Don't forget to label your graphs!
```

```
legend("Path", "Unit Tangent Vector", "Unit Normal Vector")
xlabel("X Distance (meters)");
ylabel("Y Distance (meters)");
title("Neato Path Across the Bridge of Doomdundundun")
```



Neato Speed Across the Bridge of Doom^{dun^{dun}^{dun}} (Exercise 21.2)

```
% Calculate the linear and rotational velocities
```

```
speeds = double(subs(speed, t, ts));
rot_speeds = double(subs(rotation_speed, t, ts));
```

```
figure(2); clf;
```

```
% Plot the calculated and measured linear velocities
```

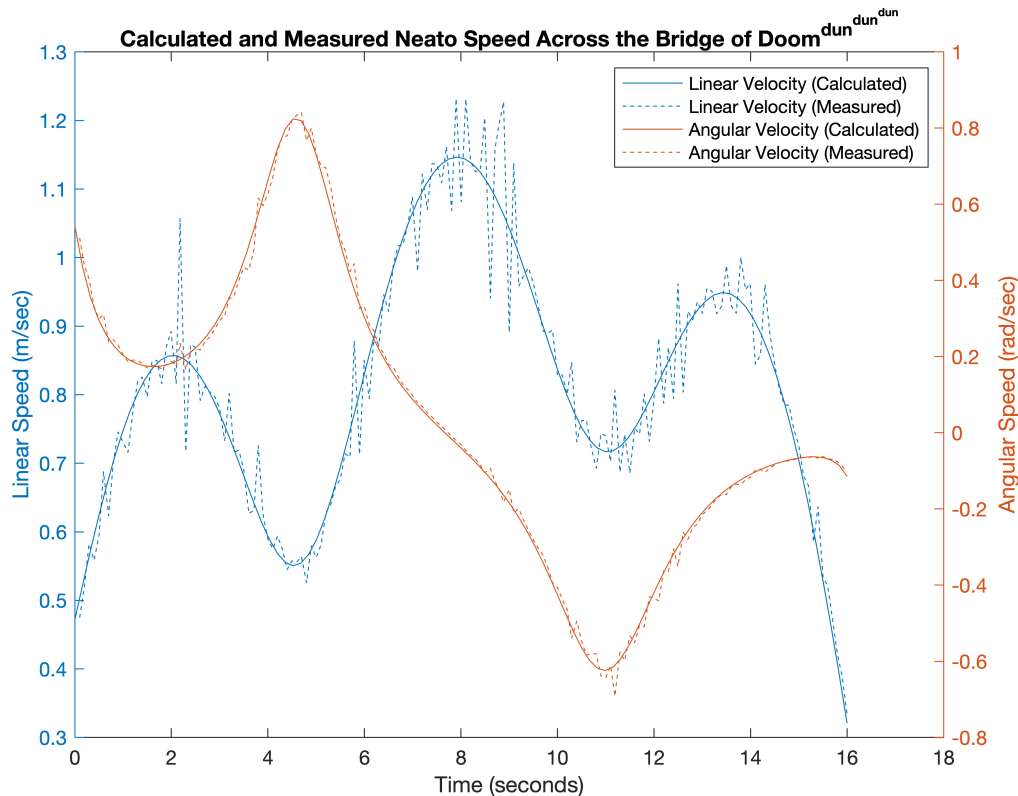
```
yyaxis left;
plot(ts, speeds, '-'); hold on;
plot(enc_t(2:end), vlins, '--'); hold off;
ylabel("Linear Speed (m/sec)");
```

```

% Plot the calculated and measured angular velocities
yyaxis right;
plot(ts, rot_speeds, '-'); hold on;
plot(enc_t(2:end), vrots, '--'); hold off;

% Don't forget to label your graphs!
xlabel("Time (seconds)");
ylabel("Angular Speed (rad/sec)");
title("Calculated and Measured Neato Speed Across the Bridge of Doom^{dun^{dun^{dun}}});
legend( ...
    "Linear Velocity (Calculated)", "Linear Velocity (Measured)", ...
    "Angular Velocity (Calculated)", "Angular Velocity (Measured)")

```



Neato Wheel Velocities Across the Bridge of Doom^{dun^{dun^{dun}}} (Exercise 21.4)

```

% Calculate the left and right wheel velocities
v_ls = double(subs(v_l, t, ts));
v_rs = double(subs(v_r, t, ts));

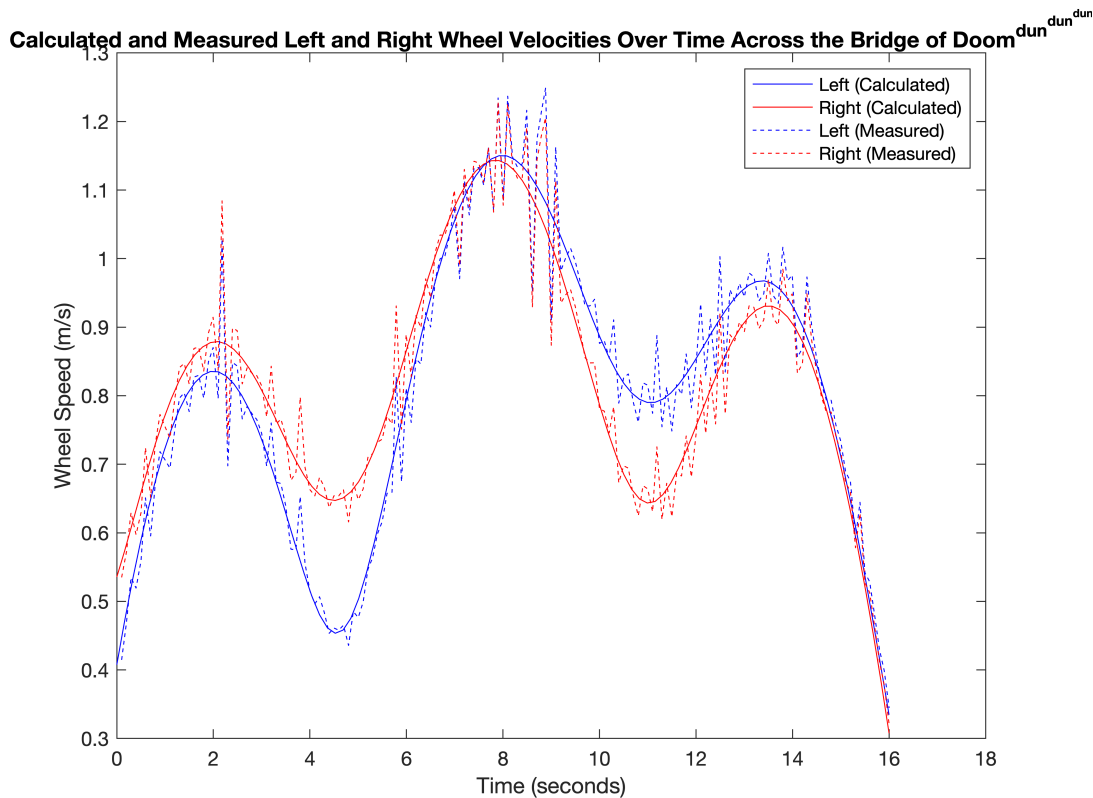
% Plot them
figure(3); clf;
plot(ts, v_ls, 'b-'); hold on;
plot(ts, v_rs, 'r-');
plot(enc_t(2:end), enc_dl, 'b--');
plot(enc_t(2:end), enc_dr, 'r--');

```



```
% Don't forget to label your graphs!
```

```
title("Calculated and Measured Left and Right Wheel Velocities Over Time Across the Bridge of Doom");
xlabel("Time (seconds)");
ylabel("Wheel Speed (m/s)");
legend("Left (Calculated)", "Right (Calculated)", "Left (Measured)", "Right (Measured)");
```



Calculated and Measured Neato Wheel Velocities Across the Bridge of Doom^{dun^{dun}dun} (Exercise 21.5)

Now that we've done our analysis, we can finally plot the calculated path against the plot our Neato actually took, along with the relevant unit tangent vectors.

```
figure(4); clf;

% Plot the paths themselves
plot(calculated_path(:, 1), calculated_path(:, 2), 'k-'); axis equal; hold on;
plot(enc_rxs, enc_rys, 'k--');

%% Plot the unit tangent vectors

% This defines how many unit tangent vectors to plot by plotting one every
% this many samples. It will offset the measured and calculated unit
% tangent vectors so they're both visible.
vector_spacing = 30;

% Calculate the predicted values for unit tangent vectors
ts_for_arrows = linspace(T_RANGE(1), T_RANGE(2), N / vector_spacing)';
start_points_for_calc_arrows = double(subs(r, t, ts_for_arrows));
```

```

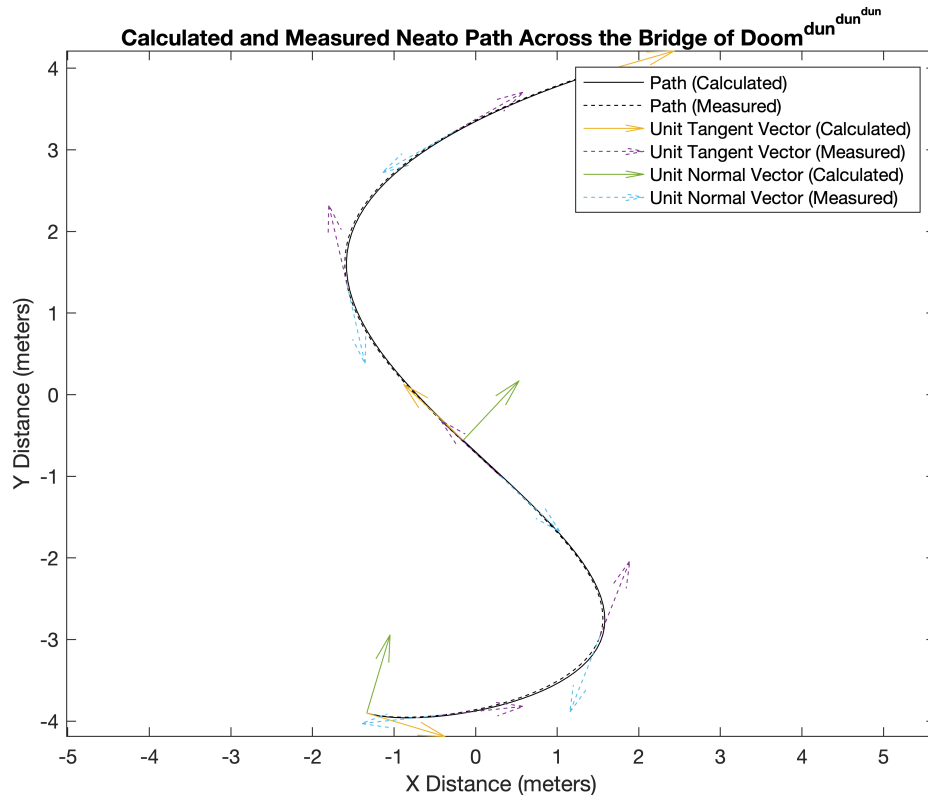
calc_that_end_points = double(subs(T_hat, t, ts_for_arrows));
calc_nhat_end_points = double(subs(N_hat, t, ts_for_arrows));

% Plot the unit tangent vectors
quiver( ...
    start_points_for_calc_arrows(:, 1), start_points_for_calc_arrows(:, 2), ...
    calc_that_end_points(:, 1), calc_that_end_points(:, 2), "off", 'filled', '-');
quiver( ...
    enc_rxs(round(vector_spacing / 2):vector_spacing:end), ...
    enc_rys(round(vector_spacing / 2):vector_spacing:end), ...
    enc_Thats(round(vector_spacing / 2):vector_spacing:end, 1), ...
    enc_Thats(round(vector_spacing / 2):vector_spacing:end, 2), "off", 'filled', '--')

% Plot the unit normal vectors
quiver( ...
    start_points_for_calc_arrows(:, 1), ...
    start_points_for_calc_arrows(:, 2), ...
    calc_nhat_end_points(:, 1), ...
    calc_nhat_end_points(:, 2), "off", "filled", '-');
quiver( ...
    enc_rxs(round(vector_spacing / 2):vector_spacing:end), ...
    enc_rys(round(vector_spacing / 2):vector_spacing:end), ...
    enc_Nhats(round(vector_spacing / 2):vector_spacing:end, 1), ...
    enc_Nhats(round(vector_spacing / 2):vector_spacing:end, 2), "off", "filled", '--')

% Don't forget to label your graphs!
legend( ...
    "Path (Calculated)", "Path (Measured)", ...
    "Unit Tangent Vector (Calculated)", "Unit Tangent Vector (Measured)", ...
    "Unit Normal Vector (Calculated)", "Unit Normal Vector (Measured)")
xlabel("X Distance (meters)");
ylabel("Y Distance (meters)");
title("Calculated and Measured Neato Path Across the Bridge of Doom^{dun^{dun^{dun}}}")

```



Robot Code for Driving Across the Bridge of Doom^{dun^{dun}dun} (Exercise 21.4)

A video of our Neato using the code below to successfully traverse the Bridge of Doom^{dun^{dun}dun} is available on YouTube: https://youtu.be/6AWX_qQ3ueE

This code should be in a file called `drive_bod.m`, and invoked from within the simulator. We've included it here for convinence.

```
function drive_bod()
    %% Configuration
    % alpha is a linear scalar with time, and controls the speed of the robot
    % It's been approximately calibrated to keep the robot's maximum speed
    % below the limit of 2 m/s
    alpha = 1/5;

    % d is the wheelbase of the robot
    d = 0.235; % m

    % The range of u is specified by the definition of the Bridge of Doom (dun
    % dun dun)
    U_RANGE = [0 3.2];

    % We also convert the range of u into a range of t (u and t are linearly
    % correlated) for convinence
    T_RANGE = U_RANGE ./ alpha;
```

```

% This loads the equations from the canonical equations.m file, which we
% use to ensure that this script and the main live script have exactly the
% same equations, in line with the programming principle of DRY (Don't
% Repeat Yourself).
equations;

% This is the format of the messages we send to the Neato. By packing it
% into a vector here and converting that from a symbolic value into a
% matlab function, it becomes much much faster to send commands to the
% Neato, which increases accuracy.
msgData = [v_l, v_r];

% generateMessageData(t) now returns a vector with the right v_l and v_r,
% without using the Symbolic Toolbox
generateMessageData = matlabFunction(msgData);

%% Connect to the Neato
disp("Connecting to Neato...")
pub = rospublisher('raw_vel');

%% Setup the Neato
disp("Stopping Neato...")

% stop the robot if it's going right now
stopMsg = rosmessage(pub);
stopMsg.Data = [0 0];
send(pub, stopMsg);

disp("Resetting Neato...")

bridgeStart = double(subs(r,t,0));
startingThat = double(subs(T_hat,t,0));
placeNeato(bridgeStart(1), bridgeStart(2), startingThat(1), startingThat(2));

% HACK: Wait a bit for robot to fall onto the bridge
pause(2);

%% Drive
disp("Starting to Drive...")

% Keep track of when we started so we can calculate t
rostic;

while 1 % We'll break out of the loop manually
    % Get the current time
    cur_t = rostoc;

    % If we've hit the end, stop the robot and exit the loop
    if cur_t >= T_RANGE(2)
        stopMsg = rosmessage(pub);
        stopMsg.Data = [0 0];
        send(pub, stopMsg);
        break
    end
end

```

```
    % Otherwise, calculate the speed the Neato should be at and tell it to  
    % go at that speed  
    speedMsg = rosmesssage(pub);  
    speedMsg.Data = generateMessageData(cur_t);  
    send(pub, speedMsg);  
end  
  
disp("Done!")  
end
```