

Building a Resilient Control Scheme over Unreliable Wireless Networks

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Spring–Fall 2019

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I. INTRODUCTION

The purpose of this study is to develop a method of network communication and control of a remotely drivable research robot to enable effective network control. This can be thought of as a specific example of the general problem of establishing reliable communication over an unreliable network, such a last-mile internet connection over failing cable or a satellite internet connection, and will build off other efforts to minimize the effects of latency such as those applied in game development[1] and in other cases such as Voice over IP calling[2].

Specifically, in our use case, we have difficulty reliably traversing campus with the robot, as it must transition between access points. This task can take potentially ten to fifteen seconds, in which time control and communication to the robot are lost. The way the robot’s control system was designed at the time of the beginning of this research meant that the robot would continue to drive even after connection was lost, potentially running into obstacles or otherwise causing itself damage.

With the end goal of navigating across campus with resilience to changing wireless access points, we will attempt to both minimize the time and the effect of the transition between those access points by changing the hardware and software networking configuration of the Raspberry Pi acting as a network server for the robot.

II. METHODS

Of the seven layers in the OSI networking model, there are several which we can attempt to improve. We can refine the physical layer by providing additional or more powerful wireless hardware, which should increase the duration we will remain successfully connected to one access point, and minimize the frequency and duration of such transitions. Secondly, because we have written our own control protocol on top of the WebSocket protocol[3], we also explored modifications which can be made at the protocol layer to minimize the disruptive effects of access point handovers.

We obtained three adapters for the hardware portion of this test. First, we use the Canakit-branded wireless adapter that came bundled with a purchased Raspberry Pi[4], which is built around a MediaTek RT5370 chipset, and supported natively

by the Linux kernel. Initially this adapter had been directly connected to the Raspberry Pi inside the frame. However, given the detrimental effect which the metal frame is likely to have on wireless performance from inside, the adapter was moved to use a USB extension and to sit outside of the robot. Tests were run with this adapter both inside and outside of the robot. Secondly, we purchased a BrosTrend high-gain dual-band wireless adapter as a higher-end model to test[5] (built around the Realtek 8812au chipset, which is supported natively by the Linux kernel as of v4.19). To gain additional diversity in selection, we purchased a third adapter: a TP-Link Archer T2UHP [6]. However, we were unable to get this adapter to work with the Raspberry Pi, nor with any other computer we tried, and so this was not used in any of the following experiment.

With each adapter configuration (Canakit adapter inside the frame; Canakit adapter mounted on the top of the robot; BrosTrend adapter mounted on top of the robot), we proceeded to make runs down the length of the third floor of Heller Hall. Runs were conducted during weekends, where there were fewer people present to create additional traffic to potentially disturb results. At a consistent speed of approximately one mile per hour (so chosen due to this being approximately the top speed of the robot), the robot was pushed down the hall while sending ICMP `echo` packets to a computer on the building’s wired network. From this, the response time, wall clock time, and currently connected access point were measured, 5 times per second, until the end of the hallway was reached. Each adapter was tested over the course of four runs using a custom-written script[7].

We also tested protocol-layer improvements. This was done by adding a watchdog timer function[8] into the Raspberry Pi’s web server, where if a command was not received in 200 milliseconds (commands are normally issued ten times per second, or every 100 milliseconds) the drive system would be disabled until a new command was received. It is noteworthy that the robot’s hardware controller does have a watchdog timer built in. However, this is of limited use to use in attempting to stop the robot, as the documentation does not suggest that it is configurable from its default value of ten seconds, during which time the robot can travel a dangerous distance. While the full code is available on GitHub[8], reproduced here is a simplification of the main portion of the watchdog timer:

```

import time
from threading import timer

last_cmd_received = time.time()
WATCHDOG_THRESHOLD = 0.100 # seconds

# Runs every (100 plus the time elapsed
# in the function)ms
def run_watchdog():
    elapsed = time.time() - last_cmd_received
    if elapsed > WATCHDOG_THRESHOLD:
        set_robot_drive(0,0)
        Timer(0.1,run_watchdog).start()

def on_cmd(cmd):
    global last_cmd_received
    last_cmd_received = time.time()
    ...

def set_robot_drive(x,y):
    ...

```

Evaluation of the effectiveness of this method was done by driving the robot at its full speed down the hall. When it passed a marked "starting line", the connection to the robot was cut (specifically, the websocket server which connects the client to the robot was interrupted from the console from which it was run), and the distance that the robot proceeded to travel from that starting line was measured, and averaged over eight runs. This was done for both the software as it had previously existed, and for the software with the watchdog code added. To reduce the effect of other variables like battery level on the collection of this data, the runs of watchdog enabled and watchdog disabled were alternated.

III. RESULTS

The full set of data can be found and browsed at the GitHub repository containing this research[9]. The first section, packet loss testing, is available in the directory `hallway-packet-loss-test`, and the second, the watchdog timer comparison, is located in `watchdog-timer-data`.

The hallway packet loss testing showed moderate but consistent improvements when utilizing the Canakit adapter as mounted outside of robot's metal frame as compared to using it internally.

The internal adapter resulted in the following data:

Run	Total	Failed	Succeeded	Success Rate
1	593	242	351	59.2%
2	578	236	342	59.2%
3	591	263	328	55.5%
4	557	278	279	50.1%

Average Success Rate: 56.0%

While the external adapter showed the following data:

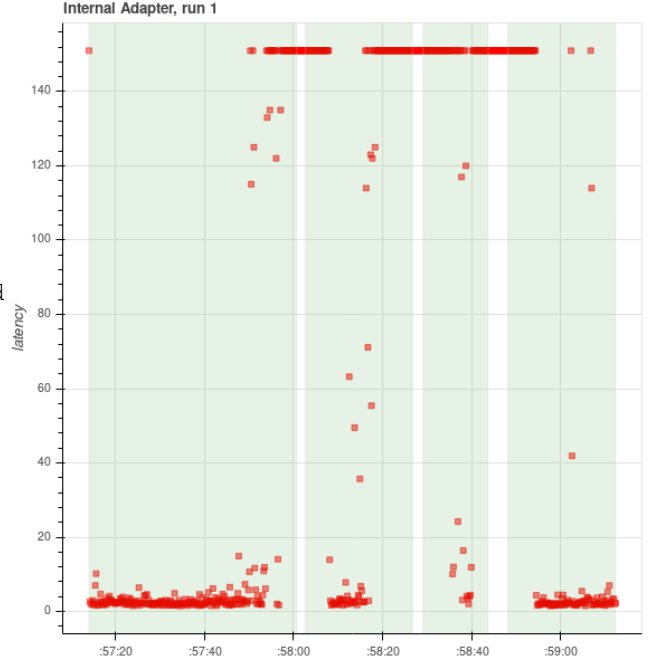


Fig. 1. Internal Adapter, run 1

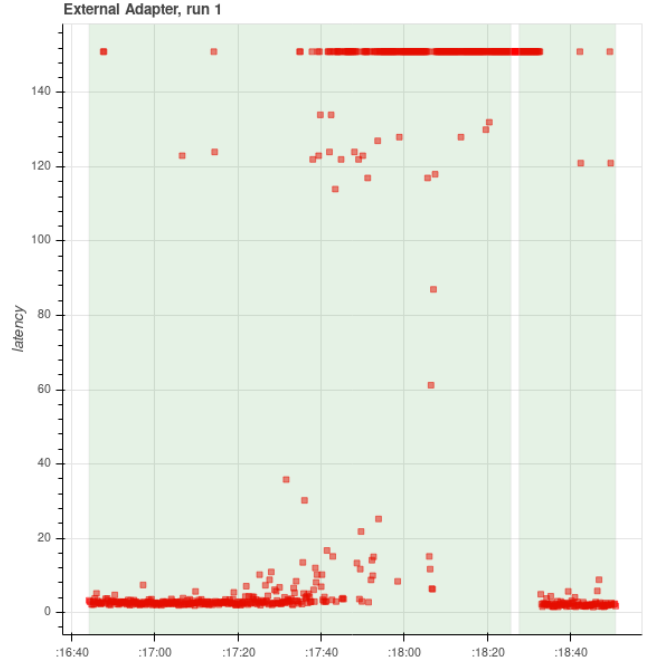


Fig. 2. External Adapter, run 1

Run	Total	Failed	Succeeded	Success Rate
1	635	227	408	64.3%
2	730	226	464	63.6%
3	600	141	459	76.5%
4	552	193	359	65.0%

Average Success Rate: 67.3%

Additionally, we plotted the latency for each packet vs time on each run. Shown are the first run of the internally-mounted Canakit adapter (Figure 1), and the first run of the externally-mounted Canakit adapter (Figure 2). In these figures, the

lightly shaded green background represents the connection to an access point, with the white indicating that the robot is not connected at that time. Response times along the top of the graph indicate timeouts at 150 milliseconds or greater.

Meanwhile, for the watchdog testing, we took the following runs, eight each with the watchdog enabled and with it disabled:

Run	Enabled	Disabled
1	10	198
2	13	144
3	15	156
4	15	192
5	14	198
6	8	156
7	8	192
8	4	168
Average:	10.9	176

For many of the runs with the watchdog disabled, the robot did not drive straight ahead. Rather than estimating the distance that it travelled along a curve, I instead opted to measure the straight line distance. Therefore, measurements of the watchdog disabled should be regarded as minimums. On runs where the robot drove straight, it consistently drove between 16 and 17 feet (192-204 inches).

For the measurements taken with the watchdog timer enabled (measuring 0 inches to 20 inches) I measured with precision to the nearest inch. For the measurements taken with the watchdog timer disabled (measuring 10 feet or more), I measured with precision to the half foot, or six inches.

IV. DISCUSSION

From the data obtained here, we see that substantial improvements can be made to the reliable control of the robot by simply improving the placement and selection of the wireless adapter. Simply relocating the adapter to the outside of the metal enclosure reduced packet loss by over ten percent in the tests performed. Of note when looking at the figures provided, as well as the additional graphs displayed on the GitHub repository[9] is the observation that the internally-mounted adapter disconnected from and reconnected the wifi three times, as compared to the externally-mounted adapter, which only disconnects and reconnects once. Furthermore, this is also perhaps not an entirely fair comparison, as we are comparing the best run of the internally-mounted adapter with the second-worst run of the externally-mounted adapter, which just serves to exemplify the effect that the shielding from the metal casing of the robot has on the performance of the wireless adapters.

Further, we note that in these graphs, we see an increase in packet times as some amount of time before the before all packets are lost and the connection is dropped. Presumably, the increased loss (and therefore decreased goodput) correlate with decreasing signal strength.

With regard to the watchdog, we notice much more dramatic improvements, with stop times after signal is lost being an order of magnitude smaller. This will lead to much easier regain of control after the signal is lost, and drastically reduce the chances of damage happening to a robot when signal is

lost. During several of the test runs without the watchdog timer enabled, if the robot was not started perfectly straight, it had to be intercepted before it ran into the wall or another obstacle, which was fairly likely with a fifteen foot range. The watchdog effectively removed these demands from the robot's operator.

V. CONCLUSIONS

Based on the data gathered over the course of the research, it appears that the combination of improved hardware selection and placement with the added improvement of a low-threshold watchdog timer to stop the robot in the absence of a connection results in a stable robot connection. This serves to both minimize the amount of interruption perceived in connection as the robot navigates across the coverage regions of various access points on-campus, as well as minimize the negative impacts that this interruption in a consistent wireless control connection might otherwise provide. Together, these changes as designed and tested provide a qualitatively much more pleasant user experience for remote control and navigation of the robot, and, indeed, driving after the changes were implemented was subjectively a much easier task than previously.

However, driving the robot is still not a perfect experience, and there are many avenues left for possible continued improvement. At the physical layer, adding a second network card would provide failover capability, and could potentially be configured such that one network is always connected at a time, with packets routed over the strongest (or over both). At the TCP/IP layers, tuning the protocol parameters such as the TCP retry window could potentially make for less delay and perceived latency when the robot does reconnect to the network. Also, prioritizing the control data over the video with Quality-of-Service scheduling would reduce packet congestion during periods of low goodput, such as when there is a high signal-to-noise ratio. Finally, the methods we used in this experiment could be repeated, but gathering additional data such as the signal-to-noise ratio as reported by the wireless cards.

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