## PROBLEM 1 ANSWER

The problem is to code a message which is an i.i.d. sequence with values in $\{-1,0,1\}$ into a sequence of zeros and ones as efficiently as possible. The message has $\log _{2}(3)$ bits per "letter", while the channel (that transmits zeros and ones without error) can transmit only one bit per period. The Shannon bound on the rate of transmission is therefore $\log _{2}(3) / \log _{2}(2)=1.585$ periods per letter of the message.

Students presented two solutions. One is

$$
\begin{array}{clc}
-1 & \rightarrow & 0 \\
0 & \rightarrow & 10 \\
1 & \rightarrow & 11 .
\end{array}
$$

This has an expected number of periods per transmitted character of

$$
2 \cdot \frac{2}{3}+\frac{1}{3}=\frac{5}{3}=1.666667
$$

But

$$
1.05 * 1.585=1.664<\frac{5}{3}
$$

Everyone who put forward this answer nonetheless argued that the letters-per-unit time measure, which is

$$
\frac{3}{5}=.6>.95 \cdot 1 / \log _{2}(3)=.5994
$$

satisfies the "within $5 \%$ of the Shannon bound" criterion. You got full credit for this, though it is a rather slippery claim.

A safer answer along the same line would code the nine possible two-letter pairs into three or four bit sequences, e.g.

$$
\begin{array}{cc}
-1,-1 & 000 \\
-1,0 & 001 \\
-1,1 & 010 \\
0,-1 & 011 \\
0,0 & 100 \\
0,1 & 101 \\
1,-1 & 110 \\
1,0 & 1110 \\
1,1 & 1111 .
\end{array}
$$

This has expected periods per letter of

$$
\frac{1}{2} \cdot\left(\frac{7}{9} \cdot 3+\frac{2}{9} \cdot 4=\frac{29}{9}=1.61111\right)<1.05 * 1.585=1.664
$$

and of course also is well within $5 \%$ of the letters per unit time version of the limit also.
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Several students also thought of mapping $k$ letters of the original message into a subset of the possible $2^{m}$ sequences of zeros and ones, with $m$ chosen as small as possible, to minimize "wasted" sequences of zeros and ones. This approach produces a code that achieves 1.60 periods per letter when 5 letters of the original message are mapped into 8 letters of the telegraph key, so it gets much closer to the theoretical limit. Interestingly, this brute force approach does not get better with larger $k$ until $k=17$, which gives 1.5882 periods per letter. Note that 5 and 17 are prime numbers. The first value of $k$ that improves on $k=17$ is 41, also prime. Interesting question: Is every $k$ that improves on all smaller values of $k$ a prime number?

