

# Fourth Year Project Logbook

## Week 1

### 30/09/13 - Exploring simple case with PAM modulation

I received the *PAM.pdf* file outlining the case where a signal is sent through a channel with AWGN and received with a timing error at the receiver. I read through the file several times to get an understanding of the underlying equations.

Leaving the Gram-Charlier series aside for the moment, I started getting to grips with Mathematica and implementing the transmission system model:

$$X = \omega_0 g_0 + \sum_{k=1}^{40} (\omega_{-k} g_k + \omega_k g_k) + \nu$$

where  $g_k = g((\Delta + k)T)$ ,  $g(t) = (u_T * h_l * u_R)(t) \times \cos(\theta)$  and  $\nu$  is a zero-mean Gaussian random variate with  $\sigma_\nu^2 = N_0 \varepsilon_R$ .

I learnt the basics of the interface, and began implementing the filter and channel impulse responses (I.R.). I need to double-check the definition of the Root-Raised Cosine (RRC) Filter, as the impulse response wasn't as expected.

Later, I found the [correct form for the RRC](#) and double-checked it using Octave. The equation used is listed below. A plot showed that this equation is invalid at  $t = \left[-\frac{T_s}{4\beta}, 0, \frac{T_s}{4\beta}\right]$ , so I plan to find its limit at these points using Mathematica to obtain the complete solution.

$$h_{RRC}(t) = \frac{2\beta}{\pi\sqrt{T_s}} \frac{\cos\left[(1+\beta)\frac{\pi t}{T_s}\right] + \frac{\sin\left[(1-\beta)\frac{\pi t}{T_s}\right]}{\frac{4\beta t}{T_s}}}{1 - \left(\frac{4\beta t}{T_s}\right)^2}$$

## 01/10/13 - Implementing Raised Cosine functions

I implemented the function above in Mathematica, and using the `Limit` function found the value of the function at the following undetermined points:

$$h_{RRC}(t) = \begin{cases} \frac{4\beta + \pi(1 - \beta)}{2\pi\sqrt{T_s}} & t = 0 \\ \frac{\beta}{2\pi\sqrt{T_s}} \left( \pi \sin \left[ \frac{(1+\beta)\pi}{4\beta} \right] - 2 \cos \left[ \frac{(1+\beta)\pi}{4\beta} \right] \right) & t = \pm \frac{T_s}{4\beta} \\ \frac{2\beta}{\pi\sqrt{T_s}} \frac{\cos \left[ (1 + \beta) \frac{\pi t}{T_s} \right] + \frac{\sin \left[ (1 - \beta) \frac{\pi t}{T_s} \right]}{\frac{4\beta t}{T_s}}}{1 - \left( \frac{4\beta t}{T_s} \right)^2} & \text{otherwise} \end{cases}$$

I also implemented the Raised Cosine function for the channel function, using the impulse response below<sup>1</sup>. I was unable however to convolve the receiver and transmitter filter functions using the `Convolve` function, even when I limited the impulse response using a `UnitBox`.

$$h_{RC}(t) = \frac{\text{sinc} \left( \frac{\pi t}{T} \right) \cos \left( \beta \frac{\pi t}{T} \right)}{1 - \left( 2\beta \frac{t}{T} \right)^2}$$

I looked into Mathematica's treatment of the Gaussian distribution, and figured out how to generate random noise vectors following a Gaussian distribution, as well as how to generate a list of random binary symbols.

After discussing the convolution issue with David, he suggested that the channel should be initially modelled as ideal and therefore the overall channel and filter I.R.  $g(t)$  can be defined as a Raised Cosine function, as defined above. I should therefore be ready to implement the simple ISI model tomorrow.

## 02/10/13 - Wrapping Up the Initial PAM Model

I pulled together the Raised Cosine function and random number generator to implement the given simplified function for the PAM receiver output, given below. Playing around with the settings, I was able to show how the  $g_k$  function increases with the timing error. I decided to study the Mathematica environment a little more before carrying on with any programming.

$$X = \omega_0 g_0 + \sum_{k=1}^{40} (\omega_{-k} g_{-k} + \omega_k g_k) + \nu$$

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<sup>1</sup>Proakis, "Digital Communications"

## 03/10/13 - Delving deeper into Mathematica

I devoted some time into looking through Michael Quinlan's notebooks and better understanding the workings of the `Table` functions and the various plotting options. Fortunately my notebook was corrupted so I was able to rewrite it and understand the model a bit more. I need to figure out what variance value the noise PDF should take on, as the noise appears to be overwhelming the timing error effects. Translating the resulting PDF's into patterns is another question that needs some thought.

## Week 2

### 07/10/13 - Matrix manipulations

I decided to spend another day learning about the Mathematica environment, in particular matrix manipulation and generation. I looked into the `Apply`, `Map` and `Partition` functions and wrote some examples to figure out how to convert mathematical problems to Mathematica notation using matrices. I hope to convert the code to use matrices tomorrow to hopefully simplify and speed things up.

I also implemented David's equation for properly calculating the AWGN function variance from SNR<sup>2</sup>, from last Friday's meeting.

### 08/10/13 - Fixed I.R. and Kernel Density Estimation

The first job was to rewrite the code to make use of the simple dot operator to calculate all the ISI components<sup>3</sup>. With the new code I was able to carry out many more runs and get much more detailed output. In addition, when I was rewriting the code I noticed a typo in the Raised Cosine I.R. that was degrading performance in the perfectly synchronised case. With both of these changes made, I decided to use Kernel Density Estimation to see what effects the timing offset has.

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<sup>2</sup>See *davenotes.pdf*

<sup>3</sup>The ISI components are now calculated using:

$$\left[ \sum_{k=0}^{k=40} (g_k \omega_k^1 + g_{-k} \omega_{-k}^1) \cdots \sum_{k=0}^{k=40} (g_k \omega_k^m + g_{-k} \omega_{-k}^m) \right] = [g_{-40} \cdots g_{-1} g_1 \cdots g_{40}] \bullet \begin{bmatrix} \omega_{-40}^1 & \cdots & \omega_{-40}^m \\ \vdots & & \vdots \\ \omega_{-1}^1 & \cdots & \omega_{-1}^m \\ \omega_1^1 & \cdots & \omega_1^m \\ \vdots & & \vdots \\ \omega_{40}^1 & \cdots & \omega_{40}^m \end{bmatrix}$$

where  $\omega_k^j$  is the  $k$ 'th ISI with the  $j$ 'th timing offset.

Using offsets of  $10^{-15}$ , 0.05, 0.1 & 0.15, the following values of  $g_k, k \in \{-40 \dots -1, 1 \dots 40\}$  were calculated.

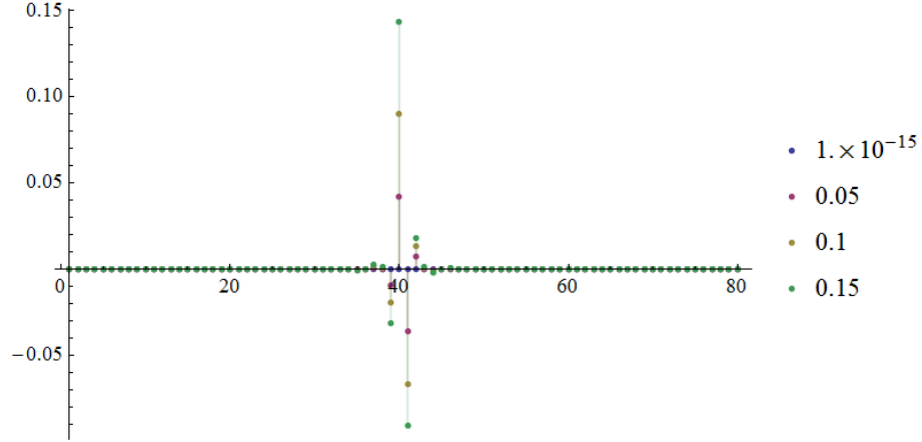


Figure 1:  $g_k$  linear plot

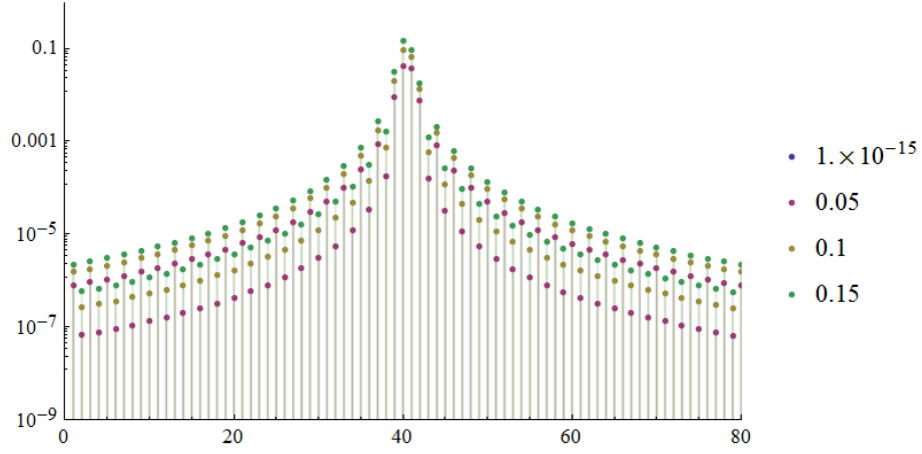


Figure 2:  $g_k$  log plot

Using `SmoothKernelDistribution` to perform Kernel Density Estimation with 1 million points produced the following estimated PDFs for both possible transmitted values. As the timing error increases, we note that the PDF spreads out, but the mean remains steady.

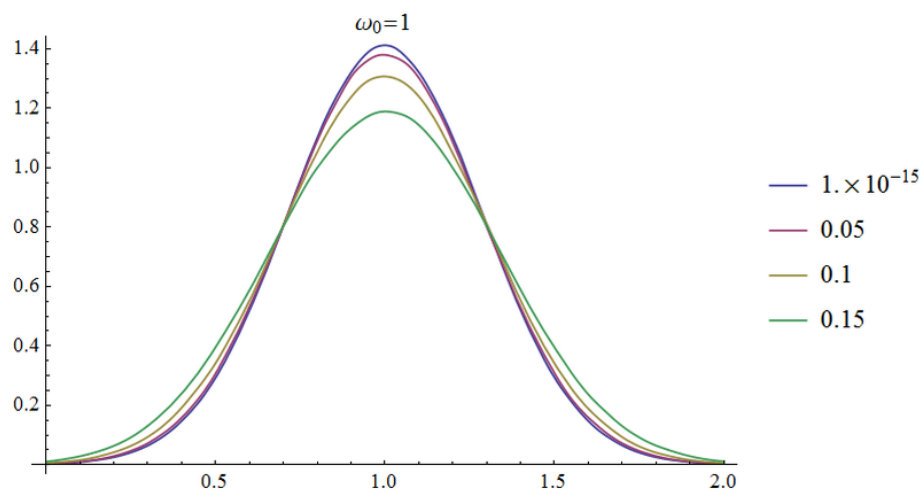


Figure 3: kernel density estimation  $\omega_0 = 1$

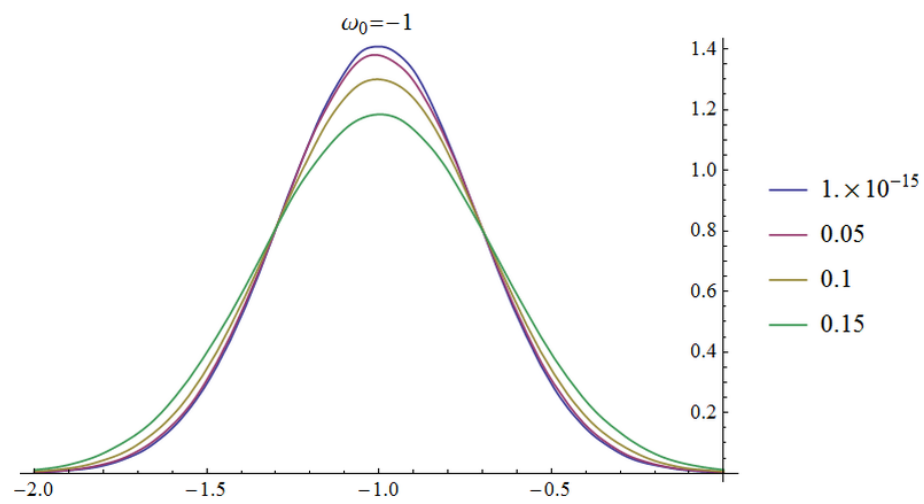


Figure 4: kernel density estimation  $\omega_0 = -1$