Comparison of CDMA and Modulation Schemes for UWB Radio in a Multipath Environment

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Abstract—This paper investigates three different performance metrics for three candidate combinations of multiple access and modulation schemes in ultra wideband radio. The schemes are compared for a single user, multipath channel at a fixed data rate. First, semi-analytic expressions are developed for the probability of error with arbitrary multiple-access coding and amplitude or pulse position modulation, which are then reduced for the special cases of time hopped with bit flipping modulation, time hopped with pulse-position modulation and direct sequence with bit flipping modulation. Using Monte-Carlo simulation the bit error rate, probability of outage and probability of best performance are found. The results show that the bit flipped schemes have a consistently lower average bit error rate and outage probabilities and the direct sequence, bit flipped, scheme has highest probability of outperforming both other schemes. In addition, the effect of multipath arrival clustering in channel models was examined and it was found that the same performance curves could be generated with nonclustered arrivals, and hence channel models with non-clustered arrivals can safely be used in performance prediction.

I. INTRODUCTION

Ultra-wideband radio systems are defined as those where the 10dB bandwidth is greater than 0.2 of the center frequency, or where the total bandwidth exceeds 500MHz [1]. One type of UWB system common in the literature is known as impulse radio, where communication is achieved using short, baseband pulses. Two popularly considered multiple access techniques for an impulse radio system are time hopping (TH), where users are distinguished by their pulse arrival time sequence, and direct sequence (DS) where users are distinguished by their pulse polarity sequence.

A number of researchers have investigated the multiple-access capacity of an UWB TH system with pulse-position modulation (PPM) [2] [3] [4], and with bit flipping modulation for both direct sequence and time-hopped multiple access [5], using a Gaussian approximation for the inter-symbol interference (ISI) and multiple-access interference. Monte Carlo simulations were used in [6] to calculate the BER of a time-hopped M-PAM system under a $\Delta-\delta$ channel model and in [7] to find the average BER of a direct sequence system in

This work was supported in part by the Integrated Media Systems Center, an NSF Research Engineering Research Center, and by the MURI Project under Contract DAAD19-01-1-0477.

the presence of multiple access and narrow band interference using measured multipath channels.

In this paper we first develop expressions to calculate the bit error rate of a Rake receiver for time hopped PPM, time hopped bit flipping and direct sequence bit flipping schemes over single user ISI multipath channels. Using these expressions in Monte Carlo simulations the average bit error rates, outage probabilities and probability of best performance are compared. Finally, it is shown that the same performance curves can be found by simulation using channel models without clustered arrivals.

II. UWB SIGNAL MODEL

The general transmitted UWB waveform of the user, representing the n^{th} data symbol, is described by

$$s_n(d_n, t) = \sqrt{\frac{E_s}{N_{pps}}} \sum_{k=nN_{max}}^{(n+1)N_{pps}-1} a_k^{(ds, d_n)} p(t - \tau_k^{(th, d_n)})$$
 (1)

where $a_k^{(ds,d_n)}$ is the amplitude modulation and $\tau_k^{(th,d_n)}$ the delay on pulse k due to the n^{th} data symbol d_n and the multiple access sequence of the user, N_{pps} is the number of pulses per data symbol, p(t) is the elemental, unit energy, transmitted UWB pulse function and E_s is the energy per symbol. The data and spreading sequence dependent parts of $a_k^{(ds,d_n)}$ and $\tau_k^{(th,d_n)}$ can be expressed explicitly as $a_k^{(ds,d_n)}=a_k^{(ds,d_n)}$ and $\tau_k^{(th,d_n)}=a_k^{th}+a_k^{th}=a_k^{th}T_c+a_k^{th}\delta_{mod}$, where T_c is called the chip period and δ_{mod} is a fixed time delay that can be optimised for the pulse shape p(t). We will restrict ourselves to binary modulation, i.e., $d_n \in \{0,1\}$, and to short code systems, where the spreading sequence period is equal to number of chips per symbol $N_{ssp}=N_{cps}$.

We will assume a discrete multipath channel without distortion, where the effects of fixed elements such as antennas are implicitly included in the pulse function p(t). The received UWB waveform due to the single transmitted waveform in (1) is

$$r_n(u, d_n, t) = \sum_{i=0}^{L-1} g_i(u) s_n(d_n, t - \tau_i(u))$$
 (2)

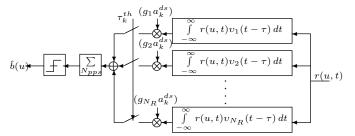


Fig. 1. Receiver model

where $g_i(u)$ is the real amplitude and $\tau_i(u)$ the time of arrival of the i^{th} multipath component. Dependence on u indicates a variable is random. We will assume that the channel is stationary over multiple symbol periods. Finally, the observed waveform at time t is the sum of the received waveforms due to all transmissions plus noise

$$r(u,t) = \sum_{n} r_n(u,d_n,t) + w(u,t)$$
 (3)

where w(u,t) is white gaussian noise with two-sided power spectral density $N_o/2$.

III. CORRELATION PROCESSING

The Rake combining technique we will consider here is maximal ratio combining (MRC), where each correlator output is weighted according to its SNR before summing. To simplify the analysis we will assume that the receiver is able to perfectly estimate the channel amplitude parameters and is perfectly synchronised to the received signal, i.e., selected g_i and τ_i are known. The template function for each correlator is given by

$$v_i(t) = \frac{\left(a_k^0 \tilde{p}(t - \tau_k^0 - \tau_{f(i)}) - a_k^1 \tilde{p}(t - \tau_k^1 - \tau_{f(i)})\right)}{\sqrt{N_{ms}}}$$
(4)

and the receiver model is shown in Figure 1.

In general the receiver template version $\tilde{p}(t)$ of the observed pulse p(t) will not be ideal due to distortions occurring in propagation and limitations of implementation. The receiver combines arrivals f(0) to $f(N_R-1)$, which are the N_R indices i in (3) with the largest coefficients $g_i(u)$. Hence the receiver uses the N_R strongest propagation paths for communication.

The output of each Rake finger can be separated into 3 signal and one noise term. The first signal term is due to the pulse to which the receiver is synchronised, the second term is due to the multipath components of the synchronised pulse and

the final term is due to multipath components of other pulses. Under the condition that the time between two consecutive transmitted pulses is equal to at least a pulse length it can be shown that the input to the decision device is $Z(u) = Z_d(u) + Z_{mpi}(u) + Z_{ipi}(u) + N(u)$ where

$$Z_{d}(u) = \frac{\sqrt{E_{s}}}{N_{pps}} \sum_{i=0}^{N_{R}-1} \sum_{k=nN_{pps}}^{(n+1)N_{pps}-1} g_{f(i)}^{2}(u) a_{k}^{d_{n}}$$

$$\times \left(a_{k}^{0} R_{p} (\tau_{k}^{0} - \tau_{k}^{d_{n}}) - a_{k}^{1} R_{p} (\tau_{k}^{1} - \tau_{k}^{d_{n}}) \right),$$

$$Z_{mpi}(u) = \frac{\sqrt{E_{s}}}{N_{pps}} \sum_{j=0}^{N_{R}-1} \sum_{\substack{i=0\\i\neq f(j)}}^{L-1} \sum_{k=nN_{pps}}^{(n+1)N_{pps}-1} g_{f(j)}(u) g_{i}(u) a_{k}^{d_{n}}$$

$$\times \left(a_{k}^{0} R_{p} (\tau_{f(j)}(u) - \tau_{i}(u) + \tau_{k}^{0} - \tau_{k}^{d_{n}}) - a_{k}^{1} R_{p} (\tau_{f(j)}(u) - \tau_{i}(u) + \tau_{k}^{1} - \tau_{k}^{d_{n}}) \right),$$

$$(6)$$

and Z_{ipi} is given in (7) at the bottom of the page. The cross-correlation term is $R_p(\tau) = \int\limits_{-\infty}^{\infty} \tilde{p}(t-\tau)p(t)$ and N(u) is gaussian noise with variance

$$\sigma^{2} = \frac{N_{o}}{2} \int_{-\infty}^{\infty} \left(\sum_{i=0}^{N_{R}-1} \sum_{k=nN_{pps}}^{(n+1)N_{pps}} g_{f(j)} a_{k}^{ds} v(t - \tau_{k}^{th}) \right)^{2} dt.$$
(8)

Passing the output of the correlator to a thresholding function the probability of receiver error over a given channel is

$$P_e = Q\left(\frac{Z_d(u) + Z_{mpi}(u) + Z_{ipi}(u)}{\sigma}\right)$$
(9)

where Q(x) is the Gaussian Integral Function. To find the total probability of error we must average over the statistics of the channel and the data.

A. TH-CDMA

For time hopping $a_k^{ds}=1$ and we let c_k^{th} be the k^{th} element of the $\{N_{cps},N_{pps},1\}$ difference set. The elements of a difference set are considered a potentially suitable spreading sequence for time hopping UWB systems due to the flatness of the spectrum of such a sequence, which is desirable from the perspective of co-existence with other systems [8]. The possible choices for v, k and λ are limited and in later simulations we choose $v=N_{cps}=993, k=N_{pps}=32$ and $\lambda=1$.

$$Z_{ipi}(u) = \frac{\sqrt{E_s}}{N_{pps}} \sum_{m} \sum_{j=0}^{N_R - 1} \sum_{\substack{i=0\\i \neq f(j)}}^{L - 1} \sum_{k'=nN_{pps}}^{(n+1)N_{pps} - 1} \sum_{\substack{k=mN_{pps}\\k \neq k'}}^{(m+1)N_{pps} - 1} g_{f(j)}(u)g_i(u)g_i(u)g_i^{ds} a_k^{ds} a_k^{ds} a_k^{ds} \left(a_{k'}^0 R_p(\tau_{f(j)}(u) - \tau_i(u) + \tau_{k'}^{(th,0)} - \tau_k^{(th,d_m)})\right) - a_{k'}^1 R_p(\tau_{f(j)}(u) - \tau_i(u) + \tau_{k'}^{(th,1)} - \tau_k^{(th,d_m)})).$$

$$(7)$$

Pulse position modulation is implemented as $c_k^{d_n} = (k + 1)^n$ d_n) mod 2. Choosing a PPM modulation code as described above, where the number of delayed and non-delayed pulses per symbol is the same for each data bit, ensures that the performance of the receiver is independent of the transmitted data symbol. Such a code is also desirable from a synchronisation perspective [9].

For TH-CDMA and pulse position modulation Z_d can be reduced to

$$Z_{d}(u) = (-1)^{d_{n}} \sqrt{E_{s}} \sum_{j=0}^{N_{R}-1} g_{f(j)}^{2}(u) (R_{p}(0) - \frac{R_{p}(\delta_{mod}) + R_{p}(-\delta_{mod})}{2}).$$

$$(10)$$

We will assume that the amplitude of all multipath arrivals are independent and furthermore that they are equally likely to be positive or negative. In this case the $(-1)^{d_n}$ factor becomes redundant in $Z_{mpi}(u)$ and we have

$$Z_{mpi}(u) = \sqrt{E_s} \sum_{j=0}^{N_R-1} \sum_{\substack{i=0\\i\neq f(j)}}^{L-1} g_{f(j)}(u)g_i(u) \left(R_p(\tau_{f(j)}(u) - \tau_i(u) -$$

Due to the fundamental property of $\{v, k, 1\}$ difference sets, in the expression for Z_{ipi} of (7) at most one term in the double sum over k and k' is non-zero. With some simplification we have

$$Z_{ipi}(u) = \frac{\sqrt{E_s}}{N_{pps}} \sum_{j=0}^{N_R-1} \sum_{\substack{i=0\\\alpha_{j,i} \neq 0}}^{L-1} g_{f(j)}(u)g_i(u) \left(R_p\left(\beta_{j,i}(u)\right) - \frac{R_p(\beta_{j,i}(u) + \delta_{mod}) + R_p(\beta_{j,i}(u) - \delta_{mod})}{2}\right)$$
(12)

where $\alpha_{j,i} = \left[\frac{\tau_{f(j)}(u) - \tau_i(u)}{T_c}\right]$, $\beta_{j,i}(u) = \tau_{f(j)}(u) - \tau_i(u) - \alpha_{j,i}T_c$ and [x] meaning the nearest integer to x.

For bit flipping modulation $a_k^{d_n} = (-1)^{d_n}$ and the terms of the correlator output are

$$Z_d(u) = (-1)^{d_n} \sqrt{E_s} \sum_{j=0}^{N_R - 1} g_{f(j)}(u)^2 2R_p(0)$$
(13)

$$Z_{mpi}(u) = \sqrt{E_s} \sum_{j=0}^{N_R-1} \sum_{\substack{i=0\\i\neq f(j)}}^{L-1} g_{f(j)}(u)g_i(u) 2R_p(\tau_{f(j)}(u) - \tau_i(u))$$

$$Z_{ipi}(u) = \frac{\sqrt{E_s}}{N_{pps}} \sum_{j=0}^{N_R-1} \sum_{\substack{i=0\\\alpha_{i,j}\neq 0}}^{L-1} g_{f(j)}(u)g_i(u)2R_p(\beta_{j,i}(u))$$

In comparing the Z_d components of PPM and bit flipping modulation in (13) and (10) respectively, note that $R_p(0)$ > $-\frac{R_p(\delta_{mod})+R_p(-\delta_{mod})}{2}$, so bit flipping modulation has an inherent advantage in signal separation over PPM modulation and will give better performance in the absence of multipath. However the difference between the multipath and inter-pulse interference terms is not so obvious and will depend on the channel and signal shape.

B. DS-CDMA

For direct sequence we will consider bit flipping modulation only. The $Z_d(u)$ and $Z_{mpi}(u)$ terms of the correlator output are independent of the multiple access scheme and therefore are the same as (13) and (14) for the time hopped bit flipping case. For the $Z_{ipi}(u)$ term, because there is a pulse present in every chip interval, every channel path causes interference to the reception of every pulse. For simplicity assume $d_m = d_n$ and $Z_{ipi}(u)$ becomes

$$Z_{mpi}(u) = \sqrt{E_s} \sum_{j=0}^{N_R-1} \sum_{\substack{i=0\\i\neq f(j)}}^{L-1} g_{f(j)}(u)g_i(u) \left(R_p(\tau_{f(j)}(u) - \tau_i(u))\right)$$

$$= \sqrt{E_s} \sum_{j=0}^{N_R-1} \sum_{\substack{i=0\\\alpha_{j,i}\neq 0}}^{L-1} g_{f(j)}(u)g_i(u)2R_p(\beta_{j,i})$$

$$- \frac{R_p(\tau_{f(j)}(u) - \tau_i(u) + \delta_{mod}) + R_p(\tau_{f(j)}(u) - \tau_i(u) - \delta_{mod})}{2} \right).$$

$$= \sum_{k'=nN_{pps}}^{(n+1)N_{pps}-1} a_{k'}^{ds} a_{k'+\alpha_{j,i}}^{ds}$$

$$= \sum_{k'=nN_{pps}}^{(n+1)N_{pps}-1} a_{k'}^{ds} a_{k'+\alpha_{j,i}}^{ds} a_{k'+\alpha_{j,i}}^{ds}$$

where $k' + \alpha_{j,i}$ is calculated mod N_{pps} and $\alpha_{j,i}$ is defined as before. Note that for sequences with good auto-correlation properties the summation over k' is small, in particular in this case we will use length 1023 Gold codes for which the sum is -1, so (16) takes the same form as (15) for time hopped bit flipping. There are two caveats, if we had not assumed $d_m = d_n$ then the sum over k' would be larger, but offsetting this is that in the case of direct sequence $N_{pps} = N_{cps}$ which is typically much larger than N_{pps} in the time hopping system.

IV. SIMULATION METHOD

The performance of each of the above schemes was simulated by generating sample propagation channels and calculating the probability of error according to (9). The channel model is that recommended by the IEEE 802.15.3a channel modelling subcommittee for use in evaluation of UWB PHY submissions [10]. The impulse response can be written as

$$c(t) = X(u) \sum_{n=0}^{N-1} \sum_{k=0}^{K-1} g_{n,k}(u) \delta(t - \tau_{n,k}(u))$$
 (17)

 $Z_{mpi}(u) = \sqrt{E_s} \sum_{j=0}^{N_R-1} \sum_{\stackrel{i=0}{i \neq f(j)}}^{L-1} g_{f(j)}(u) g_i(u) \, 2R_p(\tau_{f(j)}(u) - \tau_i(u)) \qquad \text{where } \tau_{n,k} = T_n + \zeta_{n,k} \text{ is the time of arrival and } g_{n,k} = p_{n,k} \xi_n \beta_{n,k} \text{ is the amplitude coefficient of the } k^{th} \text{ ray in the } th \text{ the clusters and intra-cluster rays have exponents.}$ nentially distributed inter-arrival times and the fading is lognormal. The polarity of each arrival is determined by $p_{n,k}$ and is ± 1 with equal probability. For any given channel realisation the total energy in the double sum over $g_{n,k}$ is normalised to

TABLE I
CHANNEL CHARACTERISTICS

Channel characteristic	CM 1	CM 3	CM 4
Mean delay spread (ns)	5	15.9	29.9
RMS delay spread (ns)	5	15	26
NP (85%)	22	84	193.7

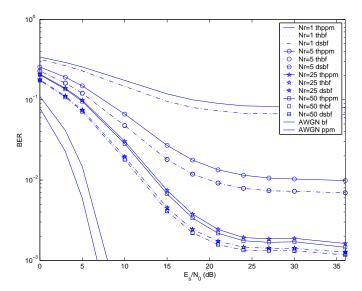


Fig. 2. BER performance of different schemes under multipath channel model CM1.

unity and the entire impulse response multiplied by the lognormal shadowing term X(u).

In [10] the authors suggest four sets of parameters that have been found to capture some of the key characteristics of observed UWB multipath channels. The models denoted CM1, CM3 and CM4 are used here and their channel characteristics are given in Table I. The channel characteristic NP (85%) is the number of paths capturing 85% of the energy in the channel and the mean and rms delay spreads are defined in the usual way.

The chip period was fixed at $T_c=5$ ns, the pulse duration is $T_p=1$ ns and $p(t)=\sqrt{2}\sin(2\pi t/T_p)$ with support $0\leq t < T_p$. For the monocycle pulse function used here the optimal delay for pulse position modulation is $\delta_{mod}=T_p/2$, when $-\frac{R_p(\delta_{mod})+R_p(-\delta_{mod})}{2}=\frac{1}{2}R(0)$. As discussed in section III-A, this is less than the R(0) which appears in the equivalent expression for bit flipping modulation and results in an inherent 1.25dB advantage when using bit flipping.

V. RESULTS

Figure 2 shows the average bit error rates for communication over channels of type CM1 against signal to noise ratio for different numbers of Rake fingers in the receiver, with the correlation receiver performance in a single path AWGN channel shown for reference.

Bit-flipping achieves lower average bit error rates over the entire range of the curve, and at low SNR in particular they show the expected 1.25dB advantage over pulse position

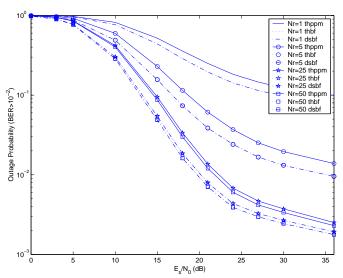


Fig. 3. Outage probabilities of different schemes under multipath channel model CM1.

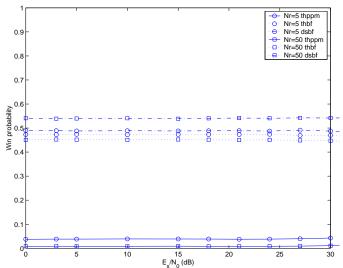


Fig. 4. Probability of achieving the best BER over a given channel for each scheme over CM1.

modulation. At the low SNR end of the curves we see much more significant BER improvement in adding correlators than from increasing SNR. Over the same range at the high SNR end the error floor is lowered almost two orders of magnitude. The 'win probability' is defined as the probability a scheme will achieve the lowest bit error rate out of all schemes over a given channel. Figures 3 and 4 show the outage probability and probability of win respectively for channel model CM1. Note that although the time-hopped and direct-sequence bit-flipping regimes are indistinguishable in terms of average bit error rate and outage probability, the direct sequence technique has a higher win probability due to its lower variance in $Z_{ipi}(u)$.

Figure 5 compares the average bit error rate over channel model CM1 to that over channel model CM4 using a 5 correlator Rake. In CM4 the channel energy is being spread

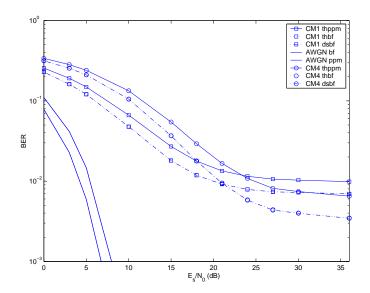


Fig. 5. Comparison of BER performance using models CM1 and CM4.

TABLE II

NON-CLUSTERED CHANNEL CHARACTERISTICS

Channel characteristic	NC
Mean delay spread (ns)	10
RMS delay spread (ns)	10
NP (85%)	87.5

over more paths, corresponding to lower mean energy per path and an increase in BER at low signal to noise ratio, while at high SNR the interference power is lower, delaying the onset of the error floor.

In Figure 6 the average bit error rate over channel CM3 is shown with the same measure over a channel without clustering. That is, the inter-arrival times were chosen according to a simple exponential distribution and the parameters of the arrival time and log-normal fading distributions were optimised to best fit the performance curves for the CM3 channel model. The channel characteristics are shown in Table II. The bit error rate curves over the different channels are nearly identical and the other performance curves show a similarly close fit.

VI. CONCLUSIONS

The average bit error rate and outage probability performance of three UWB multiple access and modulation combinations have been found for a single user, using the channel models for recommended for use in IEEE 802.15.3a evaluations.

As expected, bit flipped modulation demonstrated better performance than pulse position modulation in terms of average BER and outage probability due to it's lower correlation between symbols. It was expected that direct sequence coding should have an advantage over time hopping due to lower variance interpulse interference, but this advantage was not noticeable in terms of average BER or outage probability over channels with delay spreads of up to 5 times the chip period.

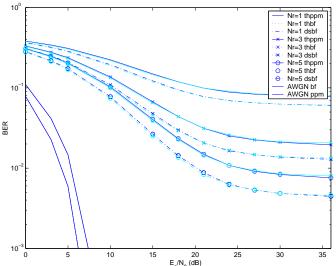


Fig. 6. Comparison of BER performance using model CM3 (dark line) and the non-clustered model (light line).

However, direct sequence multiple access coding was more likely to achieve the lowest BER for a fixed channel.

Finally, a comparison was made between using a channel model with clustered arrivals versus one with no clustering. It was found that with proper selection of parameters the models can be made equivalent in an average BER, outage probability and "win" probability sense. The ability to use equivalent nonclustered channels to analyse radio performance should make theoretical problems more tractable.

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