# Information Embedding and Extraction for Electrophotographic Printing Processes

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# ABSTRACT

In today's digital world securing different forms of content is very important in terms of protecting copyright and verifying authenticity. One example is watermarking of digital audio and images. We believe that a marking scheme analogous to digital watermarking but for documents is very important. In this paper we describe the use of laser amplitude modulation in electrophotographic printers to embed information in a text document. In particular we describe an embedding and detection process which allows the embedding of 1 bit in a single line of text. For a typical 12 point document, 33 bits can be embedded per page.

Keywords: document security, secure printing, printer identification

# 1. INTRODUCTION

In today's digital world securing different forms of content is very important in terms of protecting copyright and verifying authenticity.<sup>1–7</sup> One example is watermarking of digital audio and images. We believe that a marking scheme analogous to digital watermarking but for documents is very important.<sup>1</sup> Printed material is a direct accessory to many criminal and terrorist acts. Examples include forgery or alteration of documents used for purposes of identity, security, or recording transactions. In addition, printed material may be used in the course of conducting illicit or terrorist activities. Examples include instruction manuals, team rosters, meeting notes, and correspondence. In both cases, the ability to identify the device or type of device used to print the material in question would provide a valuable aid for law enforcement and intelligence agencies. We also believe that average users need to be able to print secure documents, for example boarding passes and bank transactions.

There currently exist techniques to secure documents such as bank notes using paper watermarks, security fibers, holograms, or special inks.<sup>8,9</sup> The problem is that the use of these security techniques can be cost prohibitive. Most of these techniques either require special equipment to embed the security features, or are simply too expensive for an average consumer. Additionally, there are a number of applications in which it is desirable to be able to identify the technology, manufacturer, model, or even specific unit that was used to print a given document.

We propose to develop two strategies for printer identification based on examining a printed document. The first strategy is passive. It involves characterizing the printer by finding intrinsic features in the printed document that are characteristic of that particular printer, model, or manufacturer's products. We refer to this as the *intrinsic signature*. The intrinsic signature requires an understanding and modeling of the printer mechanism, and the development of analysis tools for the detection of the signature in a printed page with arbitrary content.

The second strategy is active. We embed an *extrinsic signature* in a printed page. This signature is generated by modulating the process parameters in the printer mechanism to encode identifying information such as the printer serial number and date of printing. To detect the extrinsic signature we use the tools developed

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for intrinsic signature detection. We have successfully been able to embed information into a document with electrophotographic (EP) printers by modulating an intrinsic feature known as "banding".<sup>10</sup>

We have previously reported techniques that use the print quality defect known as *banding* in electrophotographic (EP) printers as an intrinsic signature to identify the model and manufacturer of the printer.<sup>11–13</sup> We showed that different printers have different sets of *banding frequencies* which are dependent upon brand and model. This feature is relatively easy to estimate from documents with large midtone regions. However, it is difficult to estimate the banding frequencies from text. The reason for this is that the banding is present in only the process direction and in printed areas. The text acts as a high energy noise source upon which the low energy banding signal is added.

One solution which we have previously reported  $in^{14-16}$  is to find a feature or set of features which can be measured over smaller regions of the document such as individual text characters. If the print quality defects are modeled as a texture in the printed areas of the document then texture features can be used to classify the document. These types of features can be more easily measured over small areas such as inside a text character. A similar technique is also described  $in^{17}$  for identifying ink jet printers.

Embedding extrinsic features into the document also requires knowledge of the specific print mechanism. During the past few years, many techniques to reduce banding artifacts have been successfully demonstrated by modulating various process parameters such as laser intensity/timing/pulse width (exposure modulation),<sup>18</sup> motor control,<sup>19</sup> and laser beam steering.<sup>20</sup> These techniques can also be used to inject "artificial" banding signals that are not intrinsic to the printer. The technological understanding and capability to implement these techniques are not easily obtained meaning it will be difficult for someone to "hack" it.

One issue with embedding extrinsic signatures is that the information should not be detectable by the human observer but needs to be detectable by suitable detection algorithms.<sup>10</sup> This can be accomplished by exploiting the band-pass characteristics of the human visual system with regard to contrast sensitivity. An HP Color LaserJet 4500 is used as the experimental platform for this study. Although a color engine is used as the experimental system, we will be focused only on the monochrome results for this study.

Previously we have demonstrated this ability to embed an extrinsic signature in documents which contain halftone images.<sup>10</sup> In the following sections we will present our current work on embedding in documents containing only text. Some preliminary work on this topic has been presented in.<sup>21</sup> Building upon those results we will present an embedding and detection scheme which allows us to realiably embed 1 bit in a line of text.

## 2. EP EMBEDDING TECHNIQUES

Figure 1 shows a side view of a typical EP printer. The print process has six steps. The first step is to uniformly charge the optical photoconductor (OPC) drum. Next a laser scans the drum and discharges specific locations on the drum. This is the "exposure" step. The discharged locations on the drum attract toner particles which are then attracted to the paper which has an opposite charge. Next the paper with the toner particles on it passes through a fuser and pressure roller which melts and permanently affixes the toner to the paper. Finally a blade or brush cleans any excess toner from the OPC drum.

In EP printing, artifacts are created in the printed output due to electromechanical imperfections in the printer such as fluctuations in the angular velocity of the OPC drum, gear eccentricity, gear backlash, and polygon mirror wobble. In previous work we have shown that these imperfections are directly related to the electromechanical properties of the printer. This property allows the corresponding fluctuations in the developed toner on the printed page to be treated as an intrinsic signature of the printer.

The most visible print quality defect in the EP process is banding, which appears as cyclic light and dark bands most visible in midtone regions of the document. Many banding reduction techniques have been successfully demonstrated. These techniques, three of which are laser intensity/timing/pulse width,<sup>18</sup> motor control,<sup>19</sup> and laser beam steering,<sup>20</sup> actively modulate certain process parameters.

It is desirable to inject signals with high spatial frequency where the human visual system has relative low contrast sensitivity. Among the methods mentioned above, motor control has difficulty controlling the EP process at high spatial frequencies due to inherent electro-mechanical limitations. Laser beam steering requires additional



Figure 1. Diagram of the EP process: (A) charging, (B) exposure, (C) development, (D) transfer, (E) fusing, (F) cleaning



Figure 2. Process block diagram for embedding extrinsic banding signature using laser intensity modulation

process capability that is not found in typical EP engines. However, modulating various laser parameters to affect exposure, such as laser power, is common practice in typical EP process controls.

As we have shown in,<sup>10</sup> these techniques can be used to inject an "artificial" banding signal into the document. In particular, we presented a system shown in Figure 2 using laser intensity modulation which allowed per-scanline changes in laser intensity. The signals used for embedding include a set of sinusoids at various frequencies and amplitudes such that they lie below the human visual sensitivity threshold curve. If the embedded document has any large midtone gray patches, the signal is easily detectable using Fourier analysis techniques. See Figure 3.

A similar technique can be used to embed information in text. In the next few sections, our embedding and detection techniques for text will be presented.

#### **3. RELATIONSHIP BETWEEN LASER POWER AND EXPOSURE**

During the EP printing process, the image to appear on paper is first written onto an OPC drum by a laser. The intensity profile of the laser beam is modeled as a 2-D Gaussian envelope,<sup>22, 23</sup> which is given by

$$I(x, y, t) = I_0(t) \exp(-\frac{y^2}{2\alpha^2} - \frac{x^2}{2\beta^2}) \quad \frac{W}{m^2}$$
(1)

where  $I_0(t)$  represents the laser power, and  $\alpha$  and  $\beta$  are the standard deviations of the laser beam profile in the process y and scan x directions respectively. Assume the laser is switched on at time t = 0 and off at time



Figure 3. Embedding and detecting extrinsic banding signal

Figure 4. Laser power profile

 $t = t_{off}$  and the rise and fall transition are modeled as an exponential function, see Figure 4. Then the laser power can be expressed as

$$I_{0}(t) = \begin{cases} 0 , & t < 0 \\ I_{max}(1 - e^{-\frac{t}{t_{r}}}) , & 0 \le t \le t_{off} \\ I_{max}(1 - e^{-\frac{t_{off}}{t_{r}}})e^{-\frac{(t - t_{off})}{t_{f}}} , & t > t_{off} \end{cases}$$
(2)

where  $I_{max}$  is the maximum allowable laser power. This parameter,  $I_{max}$ , is directly related to and controlled by a voltage  $V_{ref}$  on the driver chip of the laser and is not shown in the equations.

Let the nominal values of the printed pixel width in the scan direction and process direction be X and Y, respectively. Assume the laser beam translates along the scan direction x at a velocity V which is extremely high compared with the motion of the photoconductor surface. Then the exposure energy at any arbitrary point (x, y) due to the pixel [m, n] being turned on is found by integrating Equation 2 with respect to time.

$$E_{mn}(x,y) = \int I_0(t) \exp\left(-\frac{(y-y_n)^2}{2\alpha^2} - \frac{(x-(x_m-\frac{X}{2})-Vt)^2}{2\beta^2}\right) dt \quad \frac{J}{m^2}$$
(3)

Since the exposure of each printed pixel is additive, the overall exposure at any given point on the OPC is the sum of exposures contributed from each neighboring pixel.

$$E(x,y) = \sum_{m,n} E_{mn}(x,y) \tag{4}$$

The exposure can be controlled by adjusting  $I_{max}$  (amplitude modulation), or adjusting the duration of the laser pulses (pulse width modulation or PWM).<sup>18</sup> Both methods control  $I_0(t)$ , the laser power. In this study, we used amplitude modulation to control exposure. As shown in Figure 4, when  $I_{max}$  is increased, the laser power  $I_0(t)$  and the total exposure energy are also increased.

After the photoconductor is exposed by the laser beam, a latent image is produced on the photoconductor surface. Charged toner particles are attracted to the latent image and then transferred and fused to the paper. Based on the discharged electric potential, the tone value adhered on the photoconductor can be estimated. Here the photoconductor surface voltage after exposure, the light voltage  $V_L$ ,<sup>22</sup> can be written as

$$V_L = V_{sat} + (V_D - V_{sat}) \exp\left(-\frac{E}{E_a}\right) \quad Volts \tag{5}$$

where  $V_{sat}$  is the voltage obtained for very high exposure energy,  $V_D$  is the dark voltage, E is the exposure energy, and  $E_a$  is the energy constant that describes the sensitivity of the photoconductor. By modulating the



(a) Dot profiles for different  $V_{ref}$  (b) Dot size versus  $V_{ref}$ 

**Figure 5.** Effect of  $V_{ref}$  on dot size

laser power, the exposure energy and the associated photoconductor contrast voltage are modulated, with the results being varying dot sizes.

As mentioned earlier in this section, modulation of the laser power is performed through modulation of the voltage  $V_{ref}$ . For our test printer, the nominal value for  $V_{ref}$  is 1.5V. The allowable range for  $V_{ref}$  is from 1.0V to 2.0V.

Figure 5(a) shows the average dot profile of 16 dots when  $V_{ref}$  is held constant at 1.1, 1.3, 1.5 and 1.7 volts. Figure 5(b) shows relationship between the input voltages and dot sizes. The dot size is determined by counting the number of pixels with absorptance greater than 0.1 in one dot cell. As the input voltage increases, the dot size increases. However, as seen in Figure 5(b), instabilities in the EP process cause variations in the dot sizes developed on the paper. This behaviour can create the potential for ambiguity if the chosen detection technique relies heavily on particular embedding levels or dot sizes.

# 4. LASER MODULATION FOR TEXT

In the following sections we will consider modulating  $V_{ref}$  with sinusoidal functions. Because  $V_{ref}$  has a DC bias of 1.5V, we will consider instead the voltage  $V_{mod}$ , such that

$$V_{ref}(y) = 0.5 * V_{mod}(y) + 1.5 \tag{6}$$

where y is the current scanline in the process direction. Using this notation we can consider signals of the type

$$V_{mod}(y) = Asin\left(\frac{2\pi f y}{R_p}\right) \tag{7}$$

with amplitude  $A\epsilon[0,1]$ , frequency f cycles/inch, and native printer resolution  $R_p$  cycles/inch, without worrying about the actual voltages being sent to the printer.

 $In^{21}$  we derived relationships between embedding amplitude/frequency and human perceptibility for sinusoidal embedding in halftone images using this amplitude modulation technique. Because the printed area comprising a text character is already saturated, any slight variation in exposure will not make it perceptibly darker or lighter. On the other hand, certain turn on and turn off behaviours of the laser under different exposure settings cause a different artifact on the edges of the text characters which will be used to gague perceptibility of the embedded signal.



Figure 6. Large amplitude exposure modulation. 1st line no modulation, 2nd line 20 cycles/in, 3rd line 40 cycles/in



Figure 7. Determination of the R60 transition point

## 4.1. The Effects of Laser Intensity Modulation

Figure 6 shows the effect of modulating laser intensity in different types of images. The first line is printed without any modulation,  $V_{mod}=0$ . The second is modulated with a sinusoidal signals of the form in Equation 6 with frequency 20 cycles/in and amplitude 1. The third line is also modulated with a sinusoidal signal, but with frequency 40 cycles/in and amplitude 1. These signals can be easily seen in the halftone patches of Figure 6. This is because the frequency/amplitude combination of the signals are above the threshold developed in<sup>21</sup> below which human perceptibility is low. However, this same signal is not perceptible in the interior region of the text characters of Figure 6 because of the saturation. This is not true for the edges of the text characters, specifically the left and right edges where the existence of the embedded signal is clearly seen in the enlarged character 'I' from the third line. This is partially due to the small change in laser turn on and turn off time with respect to laser power as shown in Figure 4 as well as higher order behaviours of the laser control circuitry which are currently being investigated for inclusion into our model.

#### 4.2. Modulation Parameters and Image Quality

Some measure of image quality must be used to determine what embedding parameters will produce printed output in which the embedded signal is not easily visible. Since the visible distortion affects only the edges of the characters, the metric chosen is a "raggedness" measure defined by ISO-13660.<sup>24</sup>

This standard defines the edge contour of a line to be the 60% transition from substrate reflectance to the colorant reflectance, as given by the following equation:

$$R_{60} = R_{max} - 0.6(R_{max} - R_{min}) \tag{8}$$

where  $R_{max}$  is the maximum reflectance of the substrate and  $R_{min}$  is the minimum reflectance of the colorant. The edge contour r(y) is found by estimating the locations of these R60 transition points on a per scan line basis. To find r(y) for the region of interest (ROI) outlined in Figure 6, the R60 transition point for each scanline is estimated by linear interpolation between the two closest pixel values as shown in Figure 7. An ideal straight line is fitted in the least-squares sense to the contour of the printed edge. The raggedness is then defined as the geometric distortion of the edge profile from an ideal straight line defined as the standard deviation of the residuals of the R60 profile to the fitted straight line.

To obtain the mapping between modulation amplitude A and the resulting raggedness, a test page composed of 8 letter 'I's with 12 pt Arial font, is designed and printed with modulation frequencies in the range of 20-160 cycle/inch in 20 cycle/inch increments. For each frequency, each test page is printed with one modulation amplitude A from 0.2 to 1.0 volts. Additionally, one test page is printed with no modulation to provide a baseline measure of raggedness.



Figure 8. Relation between amplitude modulation parameters and raggedness



Figure 9. Modulation scheme for text documents

Each page is scanned at 600dpi and edge segments of 60 samples are hand segmented from each character. The raggedness of each of these edges is found and averaged over the entire test page. These measurements are plotted in Figure 8 along with the baseline raggedness which is shown as a dashed line. If the modulation parameters are chosen such that the resulting raggedness is less than the baseline raggedness, then it should be difficult to visually distinguish an edge with embedding from one without. From Figure 8 we can see that if  $A \leq 0.2$ , then a wide range of frequencies can be chosen while preserving edge quality.

#### 5. EMBEDDING AND DETECTION

Each line of text in a document is treated as a signaling period during which one of three symbols is transmitted. These symbols,  $V_{mod} = \{B_N, B_0, B_1\}$ , are defined in Equations 9-11. In these equations, y is the current scan line number in the process direction relative to the first scanline in a line of text.  $R_p$  is the resolution of the printer in scanlines per inch.  $B_0$  and  $B_1$ , which can be considered 0 and 1 bits respectively, are square waves with frequencies  $f_0$  and  $f_1$  respectively defined in cycles/inch, and amplitude  $A\epsilon[0,1]$ . The periods of these signals are  $T_0^p$  and  $T_1^p$  scanlines respectively in terms of printer resolution  $R_p$ .  $B_N$  is the null signal with which no laser modulation is performed. This will be used to allow the detector to estimate certain channel parameters.

$$B_N(y) = 0 \tag{9}$$

$$B_0(y) = A * sign\left(sin\left(\frac{2\pi f_0 y}{R_p}\right)\right)$$
(10)

$$B_1(y) = A * sign\left(sin\left(\frac{2\pi f_1 y}{R_p}\right)\right)$$
(11)

The reason for using a square instead of a sinusoidal signal is to escape the dot size instability shown in Figure 5(b). The dot size variations shown were measured for dots separated by a relatively large distance compared to the dot size, as would be the case in a halftone. On the edge of a text character these dots will be very close together, 1/600 in for a 600dpi printer. At this distance, electrostatic forces may cause interaction between the toner particles which make up these dots. This interaction could affect the dot sizes before the toner is fixed to the paper in the fusing step.

Figure 8 implies that a wide range of frequencies are available for embedding when  $A \leq 0.2$ . This range is not fully usable and is bounded by other variables related to the document being printed, the printer, and the scanner used for detection. The font size of the document will impart a lower bound on the usable frequency



Figure 10. Process for extracting embedded information

range. If the document font size is fs points and the print process resolution is  $R_p$ , then the longest vertical edge possible on a character is

$$L_{max} = R_p \frac{fs}{72} \quad \frac{scanlines}{inch} \tag{12}$$

Since we want to be able to detect these signals from the edges of both upper and lowercase characters, this length is further reduced by 2/3. The lowest usable frequency to ensure at least one cycle is present in each character with a full vertical edge is then

$$f_{min} = \frac{R_p}{\frac{1}{3}L_{max}} = 3\left(\frac{72}{fs}\right) \quad \frac{cycles}{inch} \tag{13}$$

The embedding frequency is also upper bounded by the combined modulation transfer function (MTF) of the printer and scanner.

The embedding scheme used will be  $B_N B_x B_y$ ,  $x, y \in \{0, 1\}$ , as shown in Figure 9. Every three lines will carry one null symbol and two information symbols. The null symbol  $B_N$  is important because the characteristics of our channel will change as a function of location in the process direction. This is due to various cyclic print quality defects such as low frequency banding and ghosting which can change the average graylevel value of each line of text and which may interfere with our chosen embedding frequencies and signal designs. Ghosting, in addition, can cause *ghosts* or attenuated copies of signals embedded in a text line to appear in subsequent lines further down the page.

The decoding process to extract and decode the embedded signals is outlined in Figure 10. First the document is scanned at some scan resolution  $R_s$ . Individual lines of text are then extracted and processed individually in the following blocks to determine what symbol was embedded in it.

All characters in the line of text are segmented out using techniques developed in.<sup>11</sup> Each character is then filtered using a threshold edge detector and a morphological dilation operation to find all the left edges of the characters. See Figure 11. Any vertical path which is marked as an edge and is less than  $\alpha T_{max}^s$  is removed, where  $T_{max}^s$  is the larger of  $T_0^s$  and  $T_1^s$ .  $T_x^s$  is the corresponding number of samples per inch for frequencies  $f_0$ and  $f_1$  at the scan resolution  $R_s$ . What remains is every vertical edge which contains at least  $\alpha$  periods of the lowest frequency signal. Currently  $\alpha$  is chosen such that  $\alpha T_{max}^s$  is equal to the height of a lower case character for a given font size fs. This means

$$\alpha = \frac{\frac{1}{3}L_{max}}{T_{max}^s R_s} \tag{14}$$

If a character has at least one vertical edge, then an edge profile is estimated from the leftmost edge using the technique outlined in Section 4. The extracted signal is normalized to lie between -1 and 1. In the notation



Figure 11. Process steps to find edges from which to extract edge profile

 $r_{l,c}(y)$ , *l* is the text line number and *c* is the character position on that text line from which this signal is obtained. Also let  $C_l$  be the set of character positions on line *l* from which these signals have been extracted.

Each  $r_{l,c}(y)$  is then correlated with the original embedding signals using  $M \leq L_{l,c}$  samples, where  $M = nT_{max}$ and n is the largest integer satisfying  $nT_{max} \leq L_{l,c}$ . This ensures orthogonality between the two signals assuming the two frequencies chosen are such that  $f_1 = 2f_0$ . The exact phase of each  $r_{l,c}$  are not known, so the correlations performed are the maximum among all phases.

$$\rho_{l,c}^{0} = \max_{0 \le \theta \le T_{max}} \frac{1}{M} \sum_{i=1}^{M} r_{l,c}[i] B_0[(i+\theta) \mod T_{max}]$$
(15)

$$\rho_{l,c}^{1} = \max_{0 \le \theta \le T_{max}} \frac{1}{M} \sum_{i=1}^{M} r_{l,c}[i] B_{1}[(i+\theta) \mod T_{max}]$$
(16)

Finally, if the line number l satisfies  $(l-1) \mod 3 = 0$ , then according to the embedding model  $B_N$  was embedded in it. If this is the case, then two thresholds,  $\gamma_l^0$  and  $\gamma_l^1$ , are defined as baseline correlation values for the following two lines l + 1 and l + 2.

$$\gamma_l^0 = \gamma_{l+1}^0 = \gamma_{l+2}^0 = \frac{1}{|C_l|} \sum_{c \in C_l} \rho_{l,c}^0$$
(17)

$$\gamma_l^1 = \gamma_{l+1}^1 = \gamma_{l+2}^1 = \frac{1}{|C_l|} \sum_{c \in C_l} \rho_{l,c}^1$$
(18)

If the text line number l does not correspond to a line with  $B_N$  embedded, then a majority vote of each of the individual character correlations compared with the baseline correlation values defined above, decides the symbol which was embedded. This is done by first finding the percentage of characters in line l with correlations  $\rho_{l,m}^0$  and  $\rho_{l,m}^1$  greater than  $\gamma_l^0$  and  $\gamma_l^1$  respectively as defined in Equations 19 and 20. The relationships between these correlations then decides the embedded symbol as defined in Equation 21.

$$p_l^0 = \frac{1}{|C_l|} \sum_{c \in C_l} \mathbb{1}_{\{\rho_{l,c}^0 > \gamma_l^0\}}$$
(19)

$$p_l^1 = \frac{1}{|C_l|} \sum_{c \in C_l} \mathbb{1}_{\{\rho_{l,c}^1 > \gamma_l^1\}}$$
(20)

**Table 1.** Decoding error at character level (%)

$(f_0/f_1)\backslash A$	0.1V	0.2V	0.3V
15/30	3.6	0.2	0.0
30/60	7.9	2.1	0.2
60/120	14.5	8.2	3.0

**Table 2.** Decoding error at line level; Symbol error forcurrent embedding model (%)

$(f_0/f_1)\backslash A$	0.1V	0.2V	0.3V
15/30	12.1	3.0	0.0
30/60	3.0	0.0	0.0
60/120	36.4	6.1	3.0

$$\hat{B} = \begin{cases} (p_l^0 > p_l^1) &, B_0 \\ (p_l^0 < p_l^1) &, B_1 \\ otherwise &, B_N \end{cases}$$
(21)

## 6. RESULTS

To test the technique presented in Section 5, we use a page of text from a random document generated by our forensic monkey text generator (FMTG).<sup>11</sup> These documents are written in PostScript using a 12 point Times Roman font. A page of text is printed for each of nine different combinations of  $f_0$ ,  $f_1$ , and A.  $(f_0, f_1)$  are chosen from the set {(15, 30), (30, 60), (60, 120)}, and A is chosen from the set {0.1V, 0.2V, 0.3V}. The pattern embedded is  $B_N B_0 B_0 B_N B_0 B_1 B_N B_1 B_0 B_N B_1 B_1$ .

The results for each of these embedding parameters are shown in Tables 1 and 2. Let us first consider the underlying error rate at the character level. For each pair of embedding frequencies, as the embedding amplitude increases, the probability of error decreases. For a fixed amplitude, the probability of error increases as the embedding frequency increases. This can be attributed to the MTF of the printer which causes a decrease in measured signal power for higher frequencies.

Assuming that every text line has the same number of characters and that the underlying character decoding errors are uniformly distributed throughout the document, the underlying character level error probabilities should have the same trend as the line level probabilities. As shown in Table 2 this does not appear to be the case. In a typical text document, such as those generated by the FMTG, every line of text has a different number of characters in it. The most obvious instance of this is the last line of a paragraph, which is typically less than a full page or column width across. The assumption that the character decoding errors are uniformly distributed spatially is also incorrect because of the cyclic nature of the print quality defects. Also, for the lower 15 cycle/inch frequency, not all characters with straight edges will have at least one cycle in it. According to Equation 13, for a 12 point font size, the minimum usable frequency is 18 cycles/inch. Because of this, fewer characters were usable in the decision process. Specifically, for the results shown in Tables 1 and 2, the decoder chose about 616 characters from the test document when  $f_0 = 15$ , compared to about 970 characters for each of the other cases.

Figure 12 shows  $p_l^0$ ,  $p_l^1$ , and the decision value  $p_l^0 - p_l^1$  for each line in the text document for two different sets of embedding parameters. Both plots clearly show greater ambiguity in deciding the embedded values for the higher frequency pair. It is reasonable to expect that the 60 cycle/inch signal would perform as well in both cases, but clearly this is not the case since  $p_l^1$  has much greater variance in Figure 12(a) and  $p_l^0$  in Figure 12(b).

#### 7. CONCLUSIONS

Using laser amplitude modulation and the process outlined in Figure 10 we have demonstrated the ability to embed 2 bits in every three lines of text. For a 12 point document this means about 33 bits per page of text.

There are some simple changes which can be made to the proposed process which should greatly improve the detection accuracy. In Section 5 it was mentioned that the reason to have a line with  $B_N$ , or no modulation, was to "normalize" the detector to account for any changes, such as graylevel, which can change in the process direction. Clearly since this training symbol is not on the same line as the two other information symbols, the detector does not have exact knowledge of the print characteristics on the following lines. One possibility which we are investigating is to embed  $B_N$  in the first few characters of a line of text and embed the remaining



(a) Line level results for  $(f_0, f_1) = (30, 60), A = 0.2$ 

(b) Line level results for  $(f_0, f_1) = (60, 120), A = 0.2$ 

Figure 12. Line level results for two sets of embedding parameters. Embedded value is labeled on second plot showing what was decoded.

characters with the desired symbol  $B_X$ . This ensures that the detector knows the print characteristics for the exact line that  $B_0$  or  $B_1$  is embedded in.

There are a few issues which were pointed out in Section 6 which will be further investigated to improve the system performance. First, a more formal characterization of the embedding channel needs to be performed. The effects of the intrinsic banding frequency of the printer, as well as ghosting need to be modelled to understand exactly why and where certain errors are occurring.

Secondly, a more precise model of the laser behaviour is currently being developed. Our current embedder introduces a shift in the dot position for varying laser power. If the cause of this shift can be determined and modeled, we may be able to detach the two from one another and increase the degrees of freedom of our embedder by being able to control both independently.

We are currently in the process of modifying many other types of EP printers to accept our embedding system and will be investigating the performance of this embedding process using these printers.

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