

# Fetal Weight Estimation using Canny Segmented Ultrasound Images

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*Abstract:* - Estimation of fetal weight is significant in the assessment of high risk pregnancies. Sonographer estimates fetal weight with combination of various fetal biometric measurements. The precision and accuracy of fetal biometric measurements is highly dependent on the skill and experience of the sonographer or even the quality of medical ultrasound images. Thus, in this paper, a method for enhancing the ultrasound images is suggested to make the estimation of fetal weight less subjective. For that, various edge detection techniques have been performed to extract the edges by detecting the sharp changes of fetal ultrasound images brightness along the boundaries of interest region. The results were compared based on the quality performance of detected edges. Measurements for three parameters, femur length, biparietal diameter and, abdominal circumference, have been computed from the segmented images. Then, fetal weight is calculated based on the measured parameters obtained through (a) original fetal ultrasound images and (b) segmented fetal ultrasound images, then both methods have been compared and the difference is 40grams.

*Key-Words:* -Fetal weight, Segmentation, Fetal biometry, Edge detection, Binary segmentation.

## 1 Introduction

Evaluating the fetal growth is important as it is associated with an increased neonatal morbidity and mortality[1]. One indicator for the fetal growth is the fetal weight. Estimating the fetal weight enables the early planning of the delivery. The accuracy of the estimated value is vital to make the resulting clinical advice reliable. Fetal biometric measurements that are obtained in obstetric sonographic assessment for the purpose of predicting fetal weight has been integrated into the mainstream of obstetric practice during the past quarter century[2].

The assessment of fetal size and growth has essentially been based on predictive formulae derived from two-dimensional (2D) ultrasound measurements[1]. Michael G. Pinette[3] stated that there were several equations having been developed for estimating the fetal weight in the late second and third trimester. The equations were based on fetal parameters such as femur length (FL), Biparietal diameter (BPD) and, Abdominal Circumference (AC). Manual estimation based on ultrasound images is highly dependent on the skill and experience of the sonographer [2]. So, the poor quality of

ultrasound images resulted in a low accuracy of fetal weight estimation[4]. Moreover, the outcome of the pregnancy's high risk assessment will be unreliable if the estimated fetal weight is determined based on subjective measurements. This is a challenge in obstetric care services. As proposed in[5], image processing has been applied to enhance the quality of the medical ultrasound images. To prevent any subjective data, the measurements of the needed fetal parameters were done based on the enhanced images. In this study, image segmentation technique has been proposed to enhance the quality of medical images by edge-detection. The difference between the estimated fetal weight of the segmented fetal ultrasound images and the original fetal ultrasound images was determined.

## 2 Methodology

### 2.1 Overall Work Flow

For implementing the part of image processing, Matlab was used. Edge detection algorithms have been used to process the fetal ultrasound images and ensure the more clarity images are produced. The

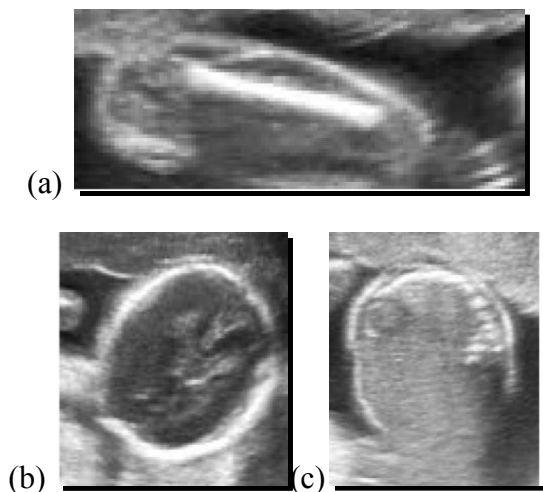
measurements for each parameter were computed after the images have been processed. Then, fetal weight for both methods was calculated based on the parameters obtained through original fetal ultrasound images and segmented fetal ultrasound images.

## 2.2 Data Collection

Toshiba Aplio-MX Ultrasound is used in this study to collect the two-dimensional (2-D) images. A convex transducer with a frequency of 3.5MHz was used.

The subject is a woman in the 23th week of gestation. The transabdominal ultrasound scanning was done by a sonographer to ensure the correct images are taken. One image for each of the three parameters was collected.

Parameter measurements were performed based on the standardized obstetric practice. FL was measured with a linear array which includes only ossified diaphysis. BPD was measured from the outer edge of the proximal parietal bone to the inner edge of the distal parietal bone. AC was measured from the outer diameter to outer diameter at the level of portal sinus and stomach.



**Figure 1** Ultrasound images  
(a) FL, (b) BPD, (c) AC.

Fig.1 shows the 2-D medical ultrasound images for FL, BPD and AC. Manual measurement of the previous three parameters used for fetal weight estimation is subjective. The result highly depends on the experience of the sonographer. Using image processing analysis, the estimation of the fetal weight could be more accurate and feasible. So, it can be applied by a technician.

## 2.3 Segmentation

Segmentation is typically used to locate boundaries in an object of interest[6]. In[7], a segmentation technique is described to isolate biological structures of interest. Segmenting the image makes the analysis easier.

In[8], there are two classes of segmentation techniques: (1) edge-based approaches and (2) region-based approaches. The concept of edge-based approaches is to detect the boundaries of an object using an edge-detector[6]. In order to avoid any subjective behavior during the measurement of fetal biometric, the edges of the interest object must be performed clearly.

In this study, the edge-based approach has been applied to enhance the quality of ultrasound images for segmenting the boundaries of objects of interest. Since there is a large number of edge detection operators available, but only six commonly used operators were applied in this study. These are Laplacian, Sobel, Prewitt, Roberts, Zero-cross and Canny. Each edge detector was designed to be sensitive to certain types of edges. In order to study the effect of edge detection methods on fetal ultrasound images, a comparison was made based on the quality of the detected edges.

Edge detection processes the image by identifying the abrupt changes or discontinuity in pixel intensity which characterizes boundaries of objects. The purpose of detecting sharp changes in image brightness is to capture important features and changes in properties[9]. By applying edge detection algorithms, the noise or irrelevant information of the image would significantly be reduced and the desired part on the image will be preserved. If the edge detection is successful, it will be easier to further process the image and compute the measurement for each parameter.

## 2.4 Computation of Parameters

Parameters measurement for FL and BPD were computed using Matlab. In order to measure the FL and BPD of the edge-detected images, the images were displayed using image tool. Image tool provides a distance tool which allows the FL and BPD to be measured. This tool measures the distance between two pixels. However, the computed measurements in unit pixels were converted to millimetres. Computation of AC is different from FL and BPD. Before the AC is determined, the edge-detected image needs to be

further processed by using binary segmentation. First, an ellipse was used and put into the overlay of the image to determine the abdominal region. A binary mask was formed from the determined region. “imellipse” uses rasterization to calculate the position of the indices and that the “createMask” function formed the pixel 1 for the enclosed region along the perimeter of the ellipse by rounding the fractions of pixels. The mean pixels for the binary mask region were computed. By assuming the binary mask is of circular shape, a formula to calculate the circumference of a circle was applied to compute the AC. Moreover, the AC in pixels was converted to millimetres.

### 2.5 Fetal Weight Estimation

Akinola, R.A[2] describes that fetal weight can be estimated using fetal biometric measurements. Using multiple parameters gives the most accurate prediction of fetal weight, especially when using AC, BPD and, FL[2]. In this study, the fetal weight was calculated based on the parameters measurement of FL, BPD and AC. The formula shown in (1) is used[10]. BPD, AC and FL are to be given in cm and the resulting Estimated Fetal Weight is in g.

The difference between the estimated fetal weights for both methods was determined.

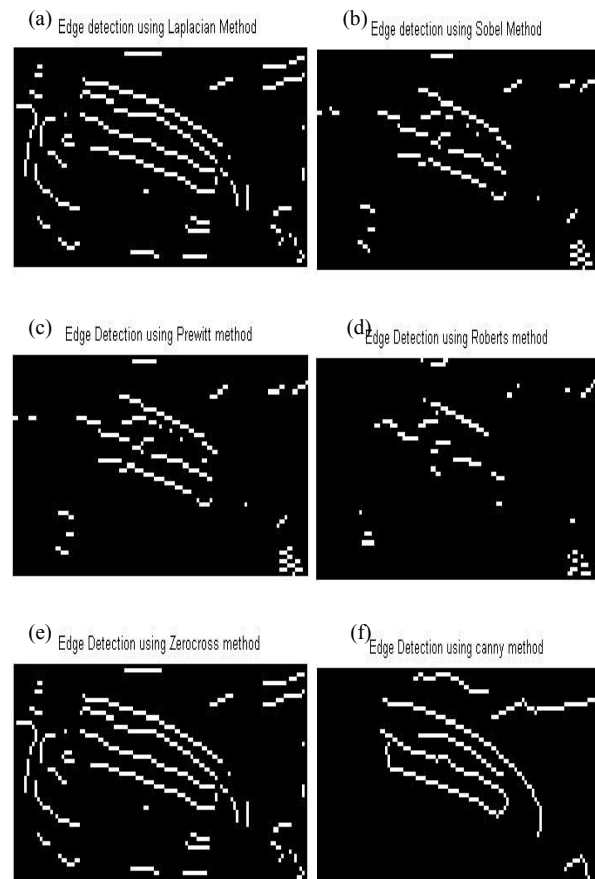
$$EFW = (1.07 \times BPD^3) + (0.3 \times AC^2 \times FL) \quad (1)$$

Where: BPD is Biparietal diameter  
AC is abdominal circumference  
FL is femur length

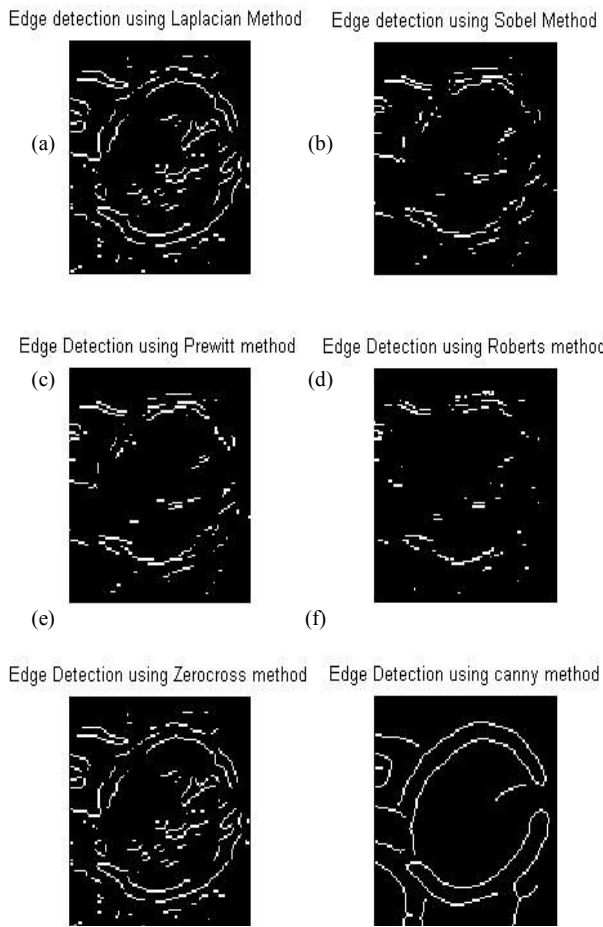
### 3 Results and Discussion

Various edge detection methods have been used for segmenting the collected fetal ultrasound images. The results for each image were shown below.

Fig.3, 4 and 5 show the results of the six edge detection methods for image of FL, BPD and AC. By visual comparison, Canny edge detection shows the most effective method in detecting the edges of the region of interest. Since this method is hardly affected by noise, this method segments most of the edges with low noise appearing in the result.



**Figure 2** Edge-detection results for image of FL using (a) Laplacian (b) Sobel (c) Prewitt (d) Roberts (e) Zerocross (f) Canny

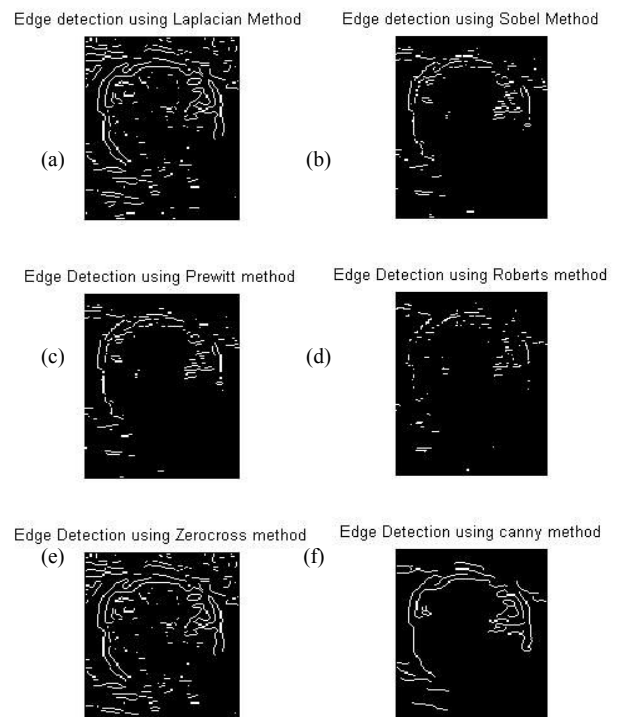


**Figure 4** Edge-detection results for image of BPD using (a) Laplacian (b) Sobel (c) Prewitt (d) Roberts (e) Zerocross (f) Canny

Although Laplacian and Zerocross techniques show clear detected edges, those methods were sensitive to noise. However, the results performed by methods of Sobel, Prewitt and Roberts were not acceptable as the edges of the region of interest were not clearly detected and information about the needed edges were lacking.

Based on the concept of Canny edge detection, Ehsan Nadernejad[11] defines that edges occur at points where the gradient is at a maximum. In Fig. 1 (a)-(c), the images show a high pixel intensity along the boundaries of each parameter compared to the surrounding pixels. Thus, this characteristic enables the Canny Edge detector performing well in fetal ultrasound images.

The results indicate that the Canny edge detector is sensitive in segmenting and detecting the edges of fetal ultrasound images compared to others.



**Figure 5** Edge-detection results for image of AC using (a) Laplacian (b) Sobel (c) Prewitt (d) Roberts (e) Zerocross (f) Canny

### 3.1 Computation of Fetal Parameters

The best edge-detected fetal ultrasound images produced by using the Canny edge detector were further processed to compute the measurements of FL, BPD and, AC.



**Figure 6** Measurement of FL image after Canny edge detection

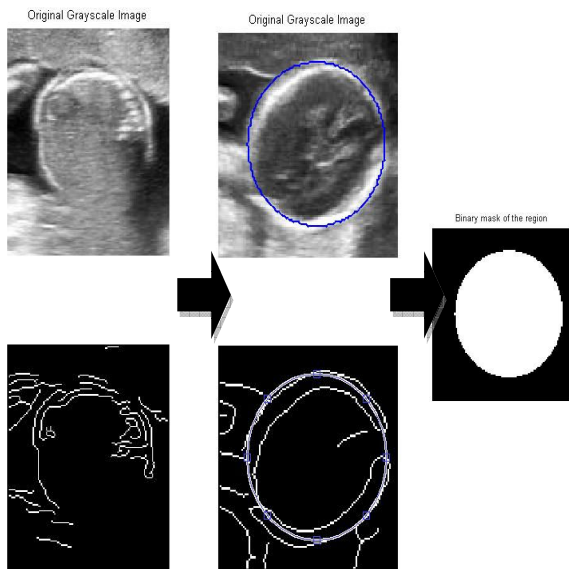
Fig.6 shows how the Matlab distance tool was used to measure FL. The computed measurement for FL is 39.7mm.



**Figure 7** Measurement of BPD image after Canny edge detection

As shown in Fig.7, the same measurement tool was used to measure the BPD. The measured value for BPD is 51.3mm.

Fig.8 shows how the ellipse tool was used to select the region of interest and how the binary image was formed. The white pixels of the binary image show the region enclosed along the perimeter of the ellipse. The computed mean pixels for the binary mask region was further computed to determine the AC. The measurement of AC was converted from pixel to mm and the result is 183.0mm.



**Figure 8** The segmented binary image using eclipse.

**3.2 Fetal Weight Estimation**

By inserting the measured parameters, FL=3.83cm, BPD=5.12cm and, AC=17.62cm, taken by the sonographer from the original fetal ultrasound images into the equation (5), the estimated fetal weight is 500.0grams.

However, the estimated fetal weight is 543.3grams when inserting the measured parameters done with the enhanced images into the same equation. Those parameters are FL=3.97cm, BPD=5.13cm and AC=18.3cm which obtained from segmented fetal ultrasound images.

In Table 1, it is obvious that the fetal weight calculated from the segmented ultrasound image is different to the value based on the original ultrasound images. The difference is about 40grams.

	Measurement (cm)			Estimated Fetal Weight
	FL	BPD	AC	
<b>Original Images</b>	3.83	5.12	17.62	500.3grams
<b>Segmented Images</b>	3.97	5.13	18.30	543.3grams

**Table 1** Measured parameters and the estimated fetal weight.

**4 Conclusion**

From the various edge detection techniques, the results indicate that the Canny detector is most sensitive in segmenting and detecting the edges of fetal ultrasound images compared to others. The results for fetal weight calculated based on the measured parameters obtained through (a) original fetal ultrasound images and (b) segmented fetal ultrasound images show a difference of 40 grams. In conclusion, the difference of the estimated fetal weight shows that the accuracy of fetal weight estimation is affected by the quality of the medical ultrasound images but the accuracy of method (b) cannot be proved from this study due to limited data. In future study, more data are needed to improve the reliability of the result. Moreover, investigation on the accuracy for both methods in estimating the fetal weight is recommended.

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## REFERENCES

- [1] BENNINI, J.R., Birth-weight prediction by two- and three-dimensional ultrasound imaging. *Ultrasound Obstet Gynecol* 2010, 2009. 35:p.426-433.
- [2] Akinola, R.A., O.I. Akinola, and O.O. Oyekan, Sonography in fetal birth weight estimation. *Educational Research and Review*, 2009. **4 (1)**: p.016-020.
- [3] Pinette, M.G., Estimation of Fetal Weight:Mean Value from Multiple Formulas. *J Ultrasound Med*, 1999: p. 8:813–817.
- [4] Yu, J., Fetal ultrasound image segmentation system and its use in fetal weight estimation. *Medical & Biological Engineering & Computing*, 2008. **46**: p. 1227-1237
- [5] Gustavo Carneiro, P.D., Bogdan Georgescu, PH.D., Sara Good, RDMS Siemens Medical Solutions, USA, Inc., Ultrasound, Mountain View, CA USA, Knowledge-based Automated Fetal Biometrics
- [6] Somkantha, K., Boundary Detection in Medical Images Using Edge Following Algorithm Based on Intensity Gradient and Texture Gradient Features. *IEEE Transactions on Biomedical Engineering*, 2011. **58(3)**.
- [7] Guerrero, J., Real-time vessel segmentation and tracking for ultrasound imaging applications. *IEEE Trans. Med. Imag.*, Aug. 2007. **26(8)**: p. 1079–1090.
- [8] Parker, J.R., *Algorithms for Image Processing and Computer Vision*. New York: Wiley, 1997.
- [9] Senthilkumaran, N., Edge Detection Techniques for Image Segmentation – A Survey of Soft Computing Approaches. *International Journal of Recent Trends in Engineering*, May 2009. **1 (2)**.
- [10] Shinozuka, N., Fetal biometry and fetal weight estimation: JSUM standardization. *The Ultrasound Review of Obstetrics and Gynecology*, 2002. **2 (3)**: p. 156-161.
- [11] Nadernejad, E., Edge Detection Techniques: Evaluations and Comparisons. *Applied Mathematical Sciences*, 2008. **2(31)**: p. 1507 - 1520.