

# Faculty of Engineering Mechatronics Engineering Department

# Design and Development of Automatic Visual Inspection System for Manufacturing

A thesis submitted in partial fulfillment of the requirements for the degree of

MASTER OF SCIENCE

in

MECHANICAL ENGINEERING (MECHATRONICS)

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## **Statement**

This thesis is submitted in the partial fulfillment of master degree in Mechanical Engineering in Ain-Shams University.

The author carried out the work included in this thesis, and no part of this thesis has been submitted for a degree or qualification at any other university.

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[سورة البقرة :172]

اللهم الد الممدحتي ترضي ولك الممدإذا رضيت ولك الممد بعد الرضاحمدا كما ينبغي

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#### **Abstract**

This study is paying special attention to Printed Circuit Boards (PCBs) manufacturing as one of the most important applications for Automatic Visual Inspection (AVI). It provides fast modified procedure to detect the components and the solder-joints of PCBs. In the Automatic Optical Inspection (AOI), one of the AVI approaches, the principal challenges in PCB analysis lie in the high reflectance of the surface, the un-even illumination, the specular nature of the solder joints, and the potential complexity of the background.

For industrial application, the feasibility and reliability form two major factors to keep the marketing competition. In case of the PCB, the minimization and the advancing in the PCB manufacturing multiplies the time-consuming for inspection.

The suggested methodology employs the Discrete Cosine Transform (DCT) to enhance the desired feature cohesion. Furthermore, the color disturbance is involved to illustrate the components. Finally, the detection has been done by employing a multi-stage segmentation. The classifier is designed to detect five different classes depicts the soldering conditions: good, missing, no-solder, exceed and bridged. The features of four different classes are extracted using a time-frequency localization wavelet.

The experiment expresses good results supported by the near optimality of the Log-Gabor filter bank. This allows the image to convolve with a Gabor atoms in the logarithmic prospective, whereas a zero DC component. The obtained results were undergone upon a fast time implemented algorithm in order to meet the flexibility conditions.

## Summary of the M.Sc. Thesis

# "Design and Development of Automatic Visual Inspection System for Manufacturing"

This piece of research has discussed a methodology for extracting solder joints from PCBs effectively under different illumination conditions and background disturbance in machine vision field.

Chapter one provides an introduction to the topic. In more details, the main challenges, the previous solutions for the PCB inspection problems and the accumulation of errors are discussed. The chapter illustrates the preliminaries of the suggested system as well.

Chapter two introduces the design phase of the complete Mechatronic system for the automated optical inspection of the PCB systems and the proposed algorithm.

In Chapter three the experimental setup is illustrated to measure the efficiency of the proposed methodology in addition to a complete definition for each of the subsystems and the component of the system. During this chapter the designed Graphical User Interface (GUI), which has been built-in by the suggested system, is discussed.

In Chapter four the experiments conducted are presented in order to examine the efficiency of the proposed system and implemented algorithms. Based on the above mentioned work, some recommendations and future research are introduced in Chapter five.

## Nomenclature

# **List of Symbols and Notations**

	The DCT coefficients
α	The DCT coefficients
$S_C$	Number of Log-Gabor filters bank scales
$o_r$	Number of Log-Gabor filters bank orientations
$ ho$ , $ ho_{s_c}$	Radial components of the log-polar coordinates
$ heta$ , $ heta_{s_c,o_r}$	Angular components of the log-polar coordinates
$\sigma_{\! ho}$ , $\sigma_{ heta}$	Bandwidth of log-polar coordinates
β	Log-Gabor filter bandwidth
$\kappa_{eta}$	Gaussian low-pass filter standard deviation
R, G, B	The channels of the RGB color space
$Y$ , $C_b$ , $C_r$	The channels of the YC <sub>b</sub> C <sub>r</sub> color space
L, a, b	The component of the CIEL*a*b color space
Sb, Sa	Designed salient components of the CIEL*a*b color space
$S_{ROI}$	ROI salient layer
$\omega_0,\omega_1$	Accumulative sums of the probabilities of bi-level threshold
$\mu_0, \mu_{1,}, \mu_T$	Mean intensities of the probabilities of bi-level threshold
$O_{s,t}$	Optimal threshold for bi-level
$C_k$	DCT frequency center
$F_{variance}$	DCT Average frequency variance
$A_h$	DCT hidebound area
$A_n$	DCT selected area
$C_n$	DCT center of the selected area
$F_R$	DCT Frequency variance ratio

$F_n$	DCT frequency total variance	
$Y_{SJ}, B_{SJ}, H_{SJ}$	The blue/yellow stimulus salient layer components	
$Y_{adj}$	Adjusted luminance layer	
$Y_{comp}$	The compensated and scaled luminance layer	
$m_{bg}$	Background average intensity value	
$\mathcal{S}_{SJ}$	Salient solder-joints layer	
$R_m$ , $G_m$ , $B_m$	The modified channels of the RGB color space	
$D_{mahal}$	Mahalanobis distance	

### **List of Acronyms**

AOI Automated Optical Inspection

AVI Automated Visual Inspection

ANN Artificial Neural Network

CCD Charge Coupled Device

CFA Color Filter Array

CIELab or

CIEL\*a\*b Comission Internationale de l'Eclairage

CV Computer Vision

DCT Discrete Cosine Transform

**DFT** Discrete Fourier Transform

DIP Digital Image Processing

**EXIF** Exchangeable Image File Format For Digital Still Cameras

FBT Functional Baseline Test

FDA Fisher Discriminant Analysis

FT Fourier Transform

FFT Fast Fourier Transform

FLA Fisher Linear Analysis

GIF Graphic Interchange Format

HT Hough Transform

IDCT Inverse Discrete Cosine Transform

IDFT Inverse Discrete Fourier Transform

IFT Inverse Fourier Transform

LVO Learning Vector Quantization

LDA Linear Discriminant Analysis

JPEG Joint Photographic Experts Group

MV Machine Vision

PCA Principal Component Analysis

PCB Printed Circuit Board

PNG Portable Network Graphics

RGB Red, Green and Blue Color Model

RIF Raster Image Format

SCARA Selective Compliant Articulated Robot for Assembly

TIFF Tagged Image File Format

XYZ The three stimulus of the color model

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