

# **RESILIENCE OF DIGITAL WATERMARKS UNDER TRANSFORMATION ATTACKS**

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Degree of Master of Science

Department of Computer Science & Engineering

University of Moratuwa  
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Dissertation submitted in partial fulfillment of the requirements for the  
degree Master of Science in Computer Science

Department of Computer Science & Engineering

University of Moratuwa  
Sri Lanka

April 2015

# Declaration

I declare that this is my own work and this dissertation does not incorporate without acknowledgement any material previously submitted for a Degree or Diploma in any other University or institute of higher learning and to the best of my knowledge and belief it does not contain any material previously published or written by another person except where the acknowledgement is made in the text.

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The above candidate has carried out research for the Masters Dissertation under my supervision.

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Date

*Dr. Chandana Gamage*

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# Abstract

Digital watermarking of electronic data has become a popular research area over last several years. The research work presented in this thesis blends a more practical perspective of digital watermarking schemes against transformation/geometric attacks with theoretical studies presented in past literature. Main objective of this dissertation is to come up with an attack success/failure evaluation metric against chosen watermarking schemes and with set of attacks. “Success” or “Failure” is defined as per given criteria: If there is a legitimate owner for the image, *success* of image attack would be determined if recovery of the watermark is denied given the fact that attacked image lies within the perceptual range. Otherwise it would be depicted as a *failure* of image attack.

In this thesis, limits that preserve perceptual quality of subjected images were analyzed for different types of attacks. Both PSNR and Histogram Analysis provide a foundation for meaningful measurement. We have shown that coupling such measurements with a perceptual quality measurement provide meaningful values for effectiveness of a watermarking scheme.

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