

## **Certificate**

This is to certify that the Dissertation entitled “**A Noble Approach to Detect Salient Region from Images**” by Mr. Krishan Sharma, student of Master of Technology (Signal Processing & Digital Design); Session [2012-2014], of Delhi Technological University, Delhi is hereby accepted and approved as a credible work. It is further certified that this work has not been submitted for similar purpose anywhere else.

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## **ABSTRACT**

Visual saliency is the perceptual quality that captures our attention and makes an object, person, or pixel stand out relative to its neighbors. The focus of this report is to design an algorithm for the automatic detection of visually salient regions in images, which is useful in applications such as adaptive content delivery, adaptive region-of-interest based image compression, image segmentation, object recognition, and content aware image resizing. In this work, an algorithm is designed to detect salient regions from images based on both global and local features and results are compared with several states of art methods given in literature. We found that our algorithm works best in term of precision, recall and f-measure. Also the computational complexity of our algorithm is very low so it can be used for real time applications.

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## List of Abbreviations

AC	Achanta Saliency Detection method
FT	Frequency Tuned Method
MS	Maximum System Surround Method
CD	Compressed Domain Saliency Detection Method
NP	Non parametric Low level Vision Method
CA	Context Aware Saliency Detection Method
SR	Spectral Residual Method