

## Multi-class support vector machines for paint condition assessment on the Sydney Harbour Bridge using hyperspectral imaging

Cong Phuoc Huynh<sup>1,2a</sup>, Samir Mustapha<sup>\*1,3</sup>, Peter Runcie<sup>1b</sup> and Fatih Porikli<sup>1,2c</sup>

<sup>1</sup>National ICT Australia (NICTA), Australia

<sup>2</sup>Research School of Engineering, Australian National University, Australia

<sup>3</sup>Department of Mechanical Engineering, American University of Beirut, Lebanon

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**Abstract.** Assessing the condition of paint on civil structures is an important but challenging and costly task, in particular when it comes to large and complex structures. Current practices of visual inspection are labour-intensive and time-consuming to perform. In addition, this task usually relies on the experience and subjective judgment of individual inspectors. In this study, hyperspectral imaging and classification techniques are proposed as a method to objectively assess the state of the paint on a civil or other structure. The ultimate objective of the work is to develop a technology that can provide precise and automatic grading of paint condition and assessment of degradation due to age or environmental factors. Towards this goal, we acquired hyperspectral images of steel surfaces located at long (mid-range) and short distances on the Sydney Harbour Bridge with an Acousto-Optics Tunable filter (AOTF) hyperspectral camera (consisting of 21 bands in the visible spectrum). We trained a multi-class Support Vector Machines (SVM) classifier to automatically assess the grading of the paint from hyperspectral signatures.

Our results demonstrate that the classifier generates highly accurate assessment of the paint condition in comparison to the judgement of human experts.

**Keywords:** paint assessment; civil structures; corrosion; multi-class SVM; hyperspectral imaging

### 1. Introduction

#### 1.1 Paint condition monitoring

Protective coatings are applied to the vast majority, if not all, steel structures located in outside environments. Coatings shield the structure from damaging aspects of the environment including sunlight, humidity, corrosive agents such as salts and windborne abrasives.

Without protective coatings the life of steel structures would be severely shortened. It is crucial

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\*Corresponding author, Assistant Professor, E-mail: [sm154@aub.edu.lb](mailto:sm154@aub.edu.lb)

<sup>a</sup> Ph.D., E-mail: [cong.huynh@nicta.com.au](mailto:cong.huynh@nicta.com.au)

<sup>b</sup> MBA, E-mail: [peter.runcie@nicta.com.au](mailto:peter.runcie@nicta.com.au)

<sup>c</sup> Professor, E-mail: [fatih.porikli@nicta.com.au](mailto:fatih.porikli@nicta.com.au)



































- Land, E.H. and McCann, J.J. (1971), "Lightness and retinex theory", *J. Opt. Soc. Am.*, **61**(1), 1-11.
- McCann, J.J., Hall, J.A. and Land, E.H. (1977), "Color Mondrian experiments: the study of average spectral distributions", *J. Opt. Soc. Am.*, **67**, 1380.
- NSW, G. (2011a), "Sydney Harbour Bridge: Rivets", Retrieved 9th of January, 2015, from <http://sydney-harbour-bridge.bos.nsw.edu.au/engineering-studies/rivets.php>.
- NSW, G. (2011), "Sydney Harbour Bridge: Corrosion", Retrieved 9th of January, 2015, from <http://sydney-harbour-bridge.bos.nsw.edu.au/engineering-studies/corrosion.php>.
- Platt, J.C. (1999), *Fast Training of Support Vector Machines using Sequential Minimal Optimization*, Advances in Kernel Methods: Support Vector Learning, Christopher J.C. Burges and A.J. Smola, Cambridge, MA, USA, MIT Press: 185-208.
- Poliskie, M. and Clevenger, J.O. (2008), "Fourier transform infrared (FTIR) spectroscopy for coating characterization and failure analysis", *Metal Finishing*, **106**(5), 44-47.
- Slater, D. and Healey, G. (1997), "Object recognition using invariant profiles", *Proceedings of the Computer Vision and Pattern Recognition*, IEEE.
- Suen, P.H. and Healey, G. (2001), "Invariant mixture recognition in hyperspectral images", *Int. Conference on Computer Vision*, IEEE.
- Tiong, U. and Clark, G. (2011), *Aircraft Joints and Corrosion Control*, ICAF 2011 Structural Integrity: Influence of Efficiency and Green Imperatives, J. Komorowski, Springer Netherlands, 625-634.
- Van de Weijer, J., Gevers, T. and Gijzenij, A. (2007), "Edge-based color constancy", *IEEE T. Image Process.*, **16**(9), 2207-2214.
- Wyszecki, G. and Stiles, W. (2000), *Color Science: Concepts and Methods, Quantitative Data and Formulae*. Wiley.