

The Hong Kong Polytechnic University

Department of Computing

**External and Internal Nonlocal
Self-Similarity based Models
for Image Denoising**

Jun Xu

**A thesis
submitted in partial fulfilment of the requirements
for the degree of**

Doctor of Philosophy

July 11, 2017

CERTIFICATE OF ORIGINALITY

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Jun Xu

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Abstract

The nonlocal self-similarity (NSS) prior of natural images has been extensively studied in many image restoration methods. In this thesis, we exploit the NSS property of external natural images, external guided internal NSS property, and internal NSS property for image denoising tasks.

Acknowledgement

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Contents

1	Introduction	1
1.1	The Camera Imaging Pipeline	1
1.2	The Image Noise	1
1.3	The Proposed Methods	2
1.4	Thesis Structure	2
2	Literature Review	5
2.1	Synthetic Grayscale Image Denoising	5
2.2	Realistic Color Image Denoising	5
3	External Non-local Self-Similarity Prior for Additive White Gaussian Noise	7
3.1	Introduction	7
3.2	System Design	8
3.3	Demo System	9
3.4	Calibration	9
3.5	Conclusion	9
4	External Prior Guided Internal Prior Learning for Real Noisy Image Denoising	11
4.1	Learning External Nonlocal Self-Similarity Priors	11
4.2	System Design	12
4.3	Demo System	13
4.4	Calibration	13
4.5	Conclusion	13
5	Internal Nonlocal Self-Similarity Prior for Real Color Image Denoising: A Low Rank based Method	15
5.1	Introduction	15
5.2	Related Work	16
5.3	Method	16
5.4	Experimental Results	16

5.5	Summary	17
6	Internal Nonlocal Self-Similarity Prior for Real Color Image De-noising: A Sparse Coding based ethod	19
6.1	Introduction	19
6.2	Related Work	20
6.3	Summary	20
7	A Large Real Noisy Image Dataset, with A Comprehensive Evaluation of State-of-the-arts	21
7.1	Introduction	21
7.2	Related Work	22
7.3	Summary	22
8	Conclusions	23
8.1	Section 1	23
8.2	Section 2	23
8.3	Future Work	24

List of Figures

3.1	Figure example: (<i>a</i>) example part one, (<i>c</i>) example part two; (<i>c</i>) example part three	7
3.2	Another Figure example: (<i>a</i>) example part one, (<i>c</i>) example part two; (<i>c</i>) example part three	8
4.1	Figure example: (<i>a</i>) example part one, (<i>c</i>) example part two; (<i>c</i>) example part three	11
4.2	Another Figure example: (<i>a</i>) example part one, (<i>c</i>) example part two; (<i>c</i>) example part three	12

List of Tables

Introduction

” *"Mens cujusque is est Quisque" – "Mind
Makes the Man"*

— Samuel Pepys

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1.3 The Proposed Methods

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1.4 Thesis Structure

Chapter 2

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2.1 Synthetic Grayscale Image Denoising

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2.2 Realistic Color Image Denoising

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External Non-local Self-Similarity

Prior for Additive White Gaussian Noise

” *Innovation distinguishes between a leader and a follower.*

— Steve Jobs
(CEO Apple Inc.)

3.1 Introduction



Fig. 3.1: Figure example: (a) example part one, (c) example part two; (c) example part three

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Fig. 3.2: Another Figure example: (a) example part one, (c) example part two; (c) example part three

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3.2 System Design

Hello, here is some text without a meaning. This text should show what a printed text will look like at this place. If you read this text, you will get no information. Really? Is there no information? Is there a difference between this text and some nonsense like “Huardest gefburn”? Kjift – not at all! A blind text like this gives you information about the selected font, how the letters are written and an impression of the look. This text should contain all letters of the alphabet and it should be written in of the original language. There is no need for special content, but the length of words should match the language.

3.3 Demo System

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3.4 Calibration

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3.5 Conclusion

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External Prior Guided Internal Prior Learning for Real Noisy Image Denoising

“Innovation distinguishes between a leader and a follower.

— Steve Jobs
(CEO Apple Inc.)

4.1 Learning External Nonlocal Self-Similarity Priors



Fig. 4.1: Figure example: (a) example part one, (c) example part two; (c) example part three

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Internal Nonlocal Self-Similarity Prior for Real Color Image Denoising: A Low Rank based Method

“Users do not care about what is inside the box, as long as the box does what they need done.

— Jef Raskin

about Human Computer Interfaces

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5.2 Related Work

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5.3 Method

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5.4 Experimental Results

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5.5 Summary

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Conclusions

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8.1 Section 1

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8.2 Section 2

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8.3 Future Work

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