

Second Edition

# Digital Watermarking and Steganography

FUNDAMENTALS AND TECHNIQUES



Frank Y. Shih



Digital Watermarking and Steganography:
Fundamentals and
Techniques
(Second Edition)



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Frank Y. Shih New Jersey Institute of Technology



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# Dedication

To my loving wife and children, to my parents who encouraged me through the years, and to those who helped me in the process of writing this book.



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## **Preface**

Digital watermarking and steganography are important topics because digital multimedia is widely used and the Internet is rapidly growing. This book intends to provide a comprehensive overview of the different aspects, mechanisms, and techniques of information security. It is written for students, researchers, and professionals who take the related courses, want to improve their knowledge, and want to gain experience in digital watermarking and steganography.

Digital watermarking technology can be used to guarantee authenticity and as proof that the content has not been altered since insertion. Steganographic messages are often first encrypted by some traditional means, and then a covert text is modified in some way to contain the encrypted message. The need for information security exists everywhere, everyday.

This book aims to provide students, researchers, and professionals with technical information regarding digital watermarking and steganography, as well as instruct them on the fundamental theoretical framework for developing the extensive advanced techniques. By comprehensively considering the essential principles of the digital watermarking and steganographic systems, one can not only obtain novel ideas about implementing advanced algorithms but also discover new problems. The principles of digital watermarking and steganography in this book are illustrated with plentiful graphs and examples in order to simplify the problems, so readers can easily understand even complicated theories.

Several robust algorithms are presented in this book to illustrate the framework and to provide assistance and tools for understanding and implementing the fundamental principles. The combined spatial and frequency domain watermarking technique provides a new method of enlarging the embedding capacity of watermarks. The genetic algorithm (GA)-based watermarking technique solves the rounding error problem and is an efficient approach to embedding. The adjusted-purpose watermarking technique simplifies the selection of different types, and can be integrated into other watermarking techniques. The robust high-capacity watermarking technique successfully enlarges the hiding capacity while maintaining the watermark's robustness. GA-based steganography provides a new way of developing a robust steganographic system by artificially counterfeiting statistical features instead of using the traditional strategy of avoiding the alteration of statistical features.

#### OVERVIEW OF THE BOOK

In Chapter 1, digital watermarking and digital steganography are briefly introduced. Then, the difference between watermarking and steganography is addressed. Next, a brief history along with updates on recently published resources is provided. The rest of the book is broken into two parts: Chapters 2 through 10 cover digital watermarking, and Chapters 11 and 12 cover digital steganography.

In Chapter 2, digital watermarking techniques are categorized, based on their characteristics, into five pairs: blind versus nonblind, perceptible versus imperceptible,

private versus public, robust versus fragile, and spatial domain versus frequency domain. Digital watermarking techniques are classified, based on their applications, into five types: copyright protection, data authentication, fingerprinting, copy control, and device control. In Chapter 3, the basic mathematical preliminaries are introduced, including least-significant-bit substitution, the discrete Fourier transform, the discrete cosine transform, the discrete wavelet transform, random sequence generation, chaotic maps, error correction code, and set partitioning in hierarchical trees. In Chapter 4, the fundamentals of digital watermarking are introduced. The subject is divided into four classes: spatial domain, frequency domain, fragile, and robust. In the spatial domain class, substitutive watermarking and additive watermarking are introduced. In the frequency domain class, substitutive watermarking, multiplicative watermarking, vector quantization watermarking, and the rounding error problem are introduced. In the fragile watermark class, block-based watermarks, their weaknesses, and hierarchy-based watermarks are described. In the robust watermark class, the redundant embedding approach and spread spectrum are discussed.

In Chapter 5, the issue of watermarking attacks is explored. The attacks are summarized into four types: image-processing attacks, geometric attacks, cryptographic attacks, and protocol attacks. Then, they are further divided into four classes: filtering, remodulation, JPEG coding distortion, and JPEG 2000 compression. Next, geometric attacks are divided into nine classes: image scaling, rotation, image clipping, linear transformation, bending, warping, perspective projection, collage, and templates. After that, the cryptographic and protocol attacks are explained, and the available watermarking tools are provided. In the end, an efficient block-based fragile watermarking system is presented for tamper localization and the recovery of images. In Chapter 6, the technique of combinational digital watermarking is introduced. The combination of the spatial and frequency domains is described, and its advantages and experimental results are provided. The further encryption of combinational watermarks is explained. Chapter 7 shows how GAs can be applied to digital watermarking. The concept and basic operations of GAs are introduced and fitness functions are discussed. Then, GA-based rounding error correction watermarking is introduced. Next, the application of GA-based algorithms to medical image watermarking is presented. At the end of the chapter, the authentication of JPEG images based on GAs is described.

In Chapter 8, the technique of adjusted-purpose digital watermarking is introduced. Following an overview, the morphological approach to extracting pixel-based features, strategies for adjusting the variable-sized transform window (VSTW), and the quantity factor (QF) are presented. How VSTW is used to determine whether the embedded strategy should be in the spatial or the frequency domain and how the QF is used to choose fragile, semifragile, or robust watermarks are explained. An optimal watermarking solution is presented that considers imperceptibility, capacity, and robustness by using particle swarm optimization. Chapter 9 introduces a technique for robust high-capacity digital watermarking. After the weaknesses of current robust watermarking are pointed out, the concept of robust watermarking is introduced. Following this, the processes of enlarging the significant coefficients and breaking the local spatial similarity are explained. Next, new concepts are presented concerning block-based chaotic maps and the determination of embedding locations.

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The design of intersection-based pixel collection, reference registers, and containers is described. A robust high-capacity watermarking algorithm and its embedding and extracting procedures are introduced. Experimental results are provided to explore capacity enlargement, robust experiments, and performance comparisons. At the end of the chapter, the technique of high-capacity multiple-regions-of-interest watermarking for medical images is presented. Chapter 10 introduces a novel fragile watermark-based reversible image authentication scheme. The chaotic hash value of each image block is computed as the watermark, which ensures that there is complicated nonlinear and sensitive dependence within the image's gray features, the secret key, and the watermark. Reversible watermark embedding allows the original image to be recovered exactly after the authentication message has been extracted. An improved reversible data-hiding algorithm using multiple scanning techniques and histogram modification is presented.

Chapters 11 and 12 cover the topic of digital steganography. In Chapter 11, three types of steganography are introduced: technical, linguistic, and digital. Some applications of steganography are illustrated, including convert communication and one-time pad communication. Concerns about embedding security and imperceptibility are explained. Four examples of steganography software are given: S-Tools, StegoDos, EzStego, and JSteg-Jpeg. Next, the concept of steganalysis, which intends to attack steganography, is discussed. The statistical properties of images, the visual steganalytic system (VSS), and the IQM-based steganalytic system are described. Three learning strategies—support vector machines, neural networks, and principle component analysis—are reviewed. At the end of the chapter, the frequency domain steganalytic system (FDSS) is presented. In Chapter 12, steganography based on GAs and differential evolution (DE) is introduced, which can break steganalytic systems. The emphasis is shifted from traditionally avoiding the alteration of statistical features to artificially counterfeiting them. An overview of GA-based breaking methodology is first presented. Then, GA-based breaking algorithms in the spatial domain steganalytic system (SDSS) are described. How one can generate stego-images in the VSS and in the IQM-based steganalytic system are explained. Next, the strategy of GA-based breaking algorithms in the FDSS is provided. Experimental results show that this algorithm can not only pass the detection of steganalytic systems but also increase the capacity of the embedded message and enhance the peak signalto-noise ratio of stego-images. At the end of the chapter, we present the techniques of DE-based steganography. DE is a relative latecomer, but its popularity has been catching up. It is fast in numerical optimization and is more likely to find the true optimum.

#### FEATURES OF THE BOOK

- New state-of-the-art techniques for digital watermarking and steganography
- Numerous practical examples
- A more intuitive development and a clear tutorial on the complex technology
- An updated bibliography
- Extensive discussion on watermarking and steganography
- The inclusion of steganalytic techniques and their counterexamples

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#### FEEDBACK ON THE BOOK

It is my hope that there will be opportunities to correct any errors in this book; therefore, please provide a clear description of any errors that you may find. Your suggestions on how to improve the book are always welcome. For this, please use either e-mail (shih@njit.edu) or regular mail to the author: Frank Y. Shih, College of Computing Sciences, New Jersey Institute of Technology, University Heights, Newark, NJ 07102-1982.

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**Frank Y. Shih** received a BS from National Cheng-Kung University, Taiwan, in 1980, an MS from the State University of New York at Stony Brook in 1984, and a PhD from Purdue University, West Lafayette, Indiana, in 1987, all in electrical and computer engineering. He is jointly appointed as a professor in the Department of Computer Science, the Department of Electrical and Computer Engineering, and the Department of Biomedical Engineering at the New Jersey Institute of Technology, Newark. He currently serves as the director of the Computer Vision Laboratory.

Dr. Shih is currently on the editorial boards of the *International Journal of Pattern Recognition*, the *International Journal of Pattern Recognition Letters*, the *International Journal of Pattern Recognition and Artificial Intelligence*, the *International Journal of Recent Patents on Engineering*, the *International Journal of Recent Patents on Computer Science*, the *International Journal of Internet Protocol Technology*, and the *Journal of Internet Technology*. Dr. Shih has contributed as a steering member, committee member, and session chair for numerous professional conferences and workshops. He was the recipient of the Research Initiation Award from the National Science Foundation in 1991. He won the Honorable Mention Award for Outstanding Paper from the International Pattern Recognition Society and also won the Best Paper Award at the International Symposium on Multimedia Information Processing. He has received several awards for distinguished research at the New Jersey Institute of Technology. He has served several times on the Proposal Review Panel of the National Science Foundation.

Dr. Shih started his mathematical morphology research with applications to image processing, feature extraction, and object representation. His *IEEE Transactions on Pattern Analysis and Machine Intelligence (PAMI)* article "Threshold Decomposition of Grayscale Morphology into Binary Morphology" was a breakthrough solution to the bottleneck problem in grayscale morphological processing. His several articles in *IEEE Transactions on Image Processing* and *IEEE Transactions on Signal Processing* were innovations in fast exact Euclidean distance transformation and robust image enhancement and segmentation, using the *recursive soft morphological operators* he developed.

Dr. Shih further advanced the field of solar image processing and feature detection. In cooperation with physics researchers, he has made incredible contributions to bridge in the gap between solar physics and computer science. He and his colleagues have used these innovative computation and information technologies for real-time space weather monitoring and forecasting, and have received over \$1 million in National Science Foundation grants. They have developed several methods to automatically detect and characterize filament/prominence eruptions, flares, and coronal mass ejections. These techniques are currently in use at the Big Bear Observatory in California as well as by NASA.

He has made significant contributions to mathematical morphology, pattern recognition, and information hiding, focusing on the security and robustness of digital watermarking and steganography. He has developed several novel methods to

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increase embedding capacity, enhance robustness, integrate different watermarking platforms, and break steganalytic systems. His recent article published in *IEEE Transactions on Systems, Man, and Cybernetics* is the first to apply GA-based methodology to breaking steganalytic systems.

Dr. Shih has so far published 130 journal papers, 100 conference papers, and 22 book chapters. The journals in which he has been published are top ranked in the professional societies. He has authored/edited four books: Digital Watermarking and Steganography, Image Processing and Mathematical Morphology, Image Processing and Pattern Recognition, and Multimedia Security: Watermarking, Steganography, and Forensics. He has overcome many difficult research problems in multimedia signal processing, pattern recognition, feature extraction, and information security. Some examples are robust information hiding, automatic solar feature classification, optimum feature reduction, fast accurate Euclidean distance transformation, and fully parallel thinning algorithms.

Dr. Shih is a research fellow for the American Biographical Institute and is a senior member of the IEEE. His current research interests include digital water-marking and steganography, digital forensics, image processing, computer vision, sensor networks, pattern recognition, bioinformatics, information security, robotics, fuzzy logic, and neural networks.

# 1 Introduction

Digital information and data are transmitted more often over the Internet now than ever before. The availability and efficiency of global computer networks for the communication of digital information and data have accelerated the popularity of digital media. Digital images, video, and audio have been revolutionized in the way they can be captured, stored, transmitted, and manipulated. This gives rise to a wide range of applications in education, entertainment, the media, industrial manufacturing, medicine, and the military, among other fields [1].

Computers and networking facilities are becoming less expensive and more widespread. Creative approaches to storing, accessing, and distributing data have generated many benefits for digital multimedia, mainly due to properties such as distortion-free transmission, compact storage, and easy editing. Unfortunately, free-access digital multimedia communication also provides virtually unprecedented opportunities to pirate copyrighted material. Therefore, the idea of using a digital watermark to detect and trace copyright violations has stimulated significant interest among engineers, scientists, lawyers, artists, and publishers, to name a few. As a result, research into the robustness of watermark embedding with respect to compression, image-processing operations, and cryptographic attacks has become very active in recent years, and the developed techniques have grown and been improved a great deal.

In this chapter, we introduce digital watermarking in Section 1.1 and digital steganography in Section 1.2. The differences between watermarking and steganography are given in Section 1.3. Finally, a brief history is described in Section 1.4.

#### 1.1 DIGITAL WATERMARKING

Watermarking is not a new phenomenon. For nearly a thousand years, watermarks on paper have been used to visibly indicate a particular publisher and to discourage counterfeiting in currency. A watermark is a design impressed on a piece of paper during production and used for copyright identification (as illustrated in Figure 1.1). The design may be a pattern, a logo, or some other image. In the modern era, as most data and information are stored and communicated in digital form, proving authenticity plays an increasingly important role. As a result, digital watermarking is a process whereby arbitrary information is encoded into an image in such a way as to be imperceptible to observers.

Digital watermarking has been proposed as a suitable tool for identifying the source, creator, owner, distributor, or authorized consumer of a document or an image. It can also be used to detect a document or an image that has been illegally distributed or modified. Another technology, encryption, is the process of obscuring information to make it unreadable to observers without specific keys or knowledge. This technology is sometimes referred to as *data scrambling*. Watermarking, when



**FIGURE 1.1** A paper watermark.

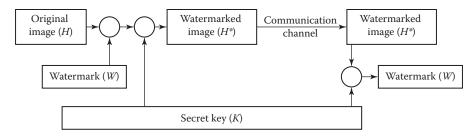
complemented by encryption, can serve a vast number of purposes including copyright protection, broadcast monitoring, and data authentication.

In the digital world, a watermark is a pattern of bits inserted into a digital medium that can identify the creator or authorized users. Digital watermarks—unlike traditional printed, visible watermarks—are designed to be invisible to viewers. The bits embedded into an image are scattered all around to avoid identification or modification. Therefore, a digital watermark must be robust enough to survive detection, compression, and other operations that might be applied to a document.

Figure 1.2 depicts a general digital watermarking system. A watermark message W is embedded into a media message, which is defined as the host image H. The resulting image is the watermarked image  $H^*$ . In the embedding process, a secret key K—that is, a random number generator—is sometimes involved to generate a more secure watermark. The watermarked image  $H^*$  is then transmitted along a communication channel. The watermark can later be detected or extracted by the recipient.

Imperceptibility, security, capacity, and robustness are among the many aspects of watermark design. The watermarked image must look indistinguishable from the original image; if a watermarking system distorts the host image to the point of being

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**FIGURE 1.2** A general digital watermarking system.

perceptible, it is of no use. An ideal watermarking system should embed a large amount of information perfectly securely, but with no visible degradation to the host image. The embedded watermark should be robust, with invariance to intentional (e.g., noise) or unintentional (e.g., image enhancement, cropping, resizing, or compression) attacks. Many researchers have focused on security and robustness, but rarely on watermarking capacity [2,3]. The amount of data an algorithm can embed in an image has implications for how the watermark can be applied. Indeed, both security and robustness are important because the embedded watermark is expected to be imperceptible and unremovable. Nevertheless, if a large watermark can be embedded into a host image, the process could be useful for many other applications.

Another scheme is the use of keys to generate random sequences during the embedding process. In this scheme, the cover image (i.e., the host image) is not needed during the watermark detection process. It is also a goal that the watermarking system utilizes an asymmetric key, as in public or private key cryptographic systems. A public key is used for image verification and a private key is needed for embedding security features. Knowledge of the public key neither helps compute the private key nor allows the removal of the watermark.

For user-embedding purposes, watermarks can be categorized into three types: *robust*, *semifragile*, and *fragile*. Robust watermarks are designed to withstand arbitrary, malicious attacks such as image scaling, bending, cropping, and lossy compression [4–7]. They are usually used for copyright protection in order to declare rightful ownership. Semifragile watermarks are designed for detecting any unauthorized modifications, while at the same time enabling some image-processing operations [8]. In other words, selective authentication detects illegitimate distortion while ignoring the applications of legitimate distortion. For the purpose of image authentication, fragile watermarks [9–13] are adopted to detect any unauthorized modification at all.

In general, we can embed watermarks in two types of domains: the spatial domain or the frequency domain [14–17]. In the spatial domain we can replace the pixels in the host image with the pixels in the watermark image [7,8]. Note that a sophisticated computer program may easily detect the inserted watermark. In the frequency domain, we can replace the coefficients of a transformed image with the pixels in the watermarked image [19,20]. The frequency domain transformations most commonly used are discrete cosine transform, discrete Fourier transform, and discrete wavelet transform. This kind of embedded watermark is, in general, difficult to detect.

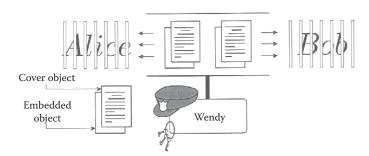
However, its embedding capacity is usually low, since a large amount of data will distort the host image significantly. The watermark must be smaller than the host image; in general, the size of a watermark is one-sixteenth the size of the host image.

#### 1.2 DIGITAL STEGANOGRAPHY

Digital steganography aims at hiding digital information in covert channels so that one can conceal the information and prevent the detection of the hidden message. Steganalysis is the art of discovering the existence of hidden information; as such, steganalytic systems are used to detect whether an image contains a hidden message. By analyzing the various features of stego-images (those containing hidden messages) and cover images (those containing no hidden messages), a steganalytic system is able to detect stego-images. Cryptography is the practice of scrambling a message into an obscured form to prevent others from understanding it, while steganography is the practice of obscuring the message so that it cannot be discovered.

Figure 1.3 depicts a classic steganographic model presented by Simmons [21]. In it, Alice and Bob are planning to escape from jail. All communications between them are monitored by the warden Wendy, so they must hide the messages in other innocuous-looking media (cover objects) in order to obtain each other's stego-objects. The stego-objects are then sent through public channels. Wendy is free to inspect all messages between Alice and Bob in one of two ways: passively or actively. The passive approach involves inspecting the message in order to determine whether it contains a hidden message and then to take proper action. The active approach involves always altering Alice's and Bob's messages even if Wendy may not perceive any traces of hidden meaning. Examples of the active method would be image-processing operations such as lossy compression, quality-factor alteration, format conversion, palette modification, and low-pass filtering.

For digital steganographic systems, the fundamental requirement is that the stego-image be perceptually indistinguishable to the degree that it does not raise suspicion. In other words, the hidden information introduces only slight modifications to the cover object. Most passive wardens detect the stego-images by analyzing their statistical features. In general, steganalytic systems can be categorized into two classes: spatial domain steganalytic systems (SDSSs) and frequency domain steganalytic systems (FDSSs). SDSSs [22,23] are adopted for checking lossless compressed



**FIGURE 1.3** A classic steganographic model.

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images by analyzing the statistical features of the spatial domain. For lossy compressed images, such as JPEG files, FDSSs are used to analyze the statistical features of the frequency domain [24,25]. Westfeld and Pfitzmann have presented two SDSSs based on visual and chi-square attacks [23]. A visual attack uses human eyes to inspect stego-images by checking their lower bit planes, while a chi-square attack can automatically detect the specific characteristics generated by the least-significant-bit steganographic technique.

# 1.3 DIFFERENCES BETWEEN WATERMARKING AND STEGANOGRAPHY

Watermarking is closely related to steganography; however, there are some differences between the two. Watermarking mainly deals with image authentication, whereas steganography deals with hiding data. Embedded watermarking messages usually pertain to host image information such as copyright, so they are bound with the cover image. Watermarking is often used whenever the cover image is available to users who are aware of the existence of the hidden information and may intend to remove it. Hidden messages in steganography are usually not related to the host image. They are designed to make extremely important information imperceptible to any interceptors.

In watermarking, the embedded information is related to an attribute of the carrier and conveys additional information about or the properties of the carrier. The primary object of the communication channel is the carrier itself. In steganography, the embedded message usually has nothing to do with the carrier, which is simply used as a mechanism to pass the message. The object of the communication channel is the hidden message. As with the application of watermarking, a balance between image perceptual quality and robustness is maintained. Constraints in maintaining image quality tend to reduce the capacity of information embedded. As the application of steganography is different, dealing with covert message transfer, the embedded capacity is often viewed with as much importance as robustness and image quality.

#### 1.4 A BRIEF HISTORY

The term *watermarking* is derived from the history of traditional papermaking. Wet fiber is pressed to expel the water, and the enhanced contrast between the watermarked and nonwatermarked areas of the paper forms a particular pattern and becomes visible.

Watermarking originated in the paper industry in the late Middle Ages—roughly, the thirteenth century. The earliest known usage appears to record the paper brand and the mill that produced it so that authenticity could be clearly recognized. Later, watermarking was used to certify the composition of paper. Nowadays, many countries watermark their paper, currencies, and postage stamps to make counterfeiting more difficult.

The digitization of our world has supplemented traditional watermarking with digital forms. While paper watermarks were originally used to differentiate between

different manufacturers, today's digital watermarks have more widespread uses. Stemming from the legal need to protect the intellectual property of the creator from unauthorized usage, digital watermarking technology attempts to reinforce copyright by embedding a digital message that can identify the creator or the intended recipients. When encryption is broken, watermarking is essentially the technology to protect unencrypted multimedia content.

In 1989, Komatsu and Tominaga proposed digital watermarking to detect illegal copies [26]. They encoded a secret label into a copy using slight modifications to redundant information. When the label matches that of the registered owner, the provider can ensure that the document holder is the same person. As a method, digital watermarking has a long history, but it was only after 1990 that it gained large international interest. Today, a great number of conferences and workshops on this topic are held, and there are a large number of scientific journals on watermarking in publication. This renewed scientific interest in digital watermarking has quickly grabbed the attention of industry. Its widely used applications include copyright protection, labeling, monitoring, tamper proofing, and conditional access.

Watermarking or information embedding is a particular embodiment of steganography. The term *steganography* is derived from the Greek words for "covered or hidden" and "writing." It is intended to hide the information in a medium in such a manner that no one except the anticipated recipient knows the existence of the information. This is in contrast to cryptography, which focuses on making information unreadable to any unauthorized persons.

The history of steganography can be traced back to ancient Greece, where the hidden-message procedure included tattooing a shaved messenger's head, waiting for his hair to grow back, and then sending him out to deliver the message personally; the recipient would then shave the messenger's head once again in order to read the message. Another procedure included etching messages onto wooden tablets and covering them with wax. Various types of steganography and cryptography also thrived in ancient India, and in ancient China, military generals and diplomats hid secret messages on thin sheets of silk or paper. One famous story on the successful revolt of the Han Chinese against the Mongolians during the Yuan dynasty demonstrates a steganographic technique. During the Yuan dynasty (AD 1280–1368), China was ruled by the Mongolians. On the occasion of the Mid-Autumn Festival, the Han people made mooncakes (as cover objects) with a message detailing an attack plan inside (as hidden information). The mooncakes were distributed to members to inform them of the planned revolt, which successfully overthrew the Mongolian regime.

#### **REFERENCES**

- Berghel, H. and O'Gorman, L., Protecting ownership rights through digital watermarking, *IEEE Computer Mag.*, 29, 101, 1996.
- 2. Barni, M. et al., Capacity of the watermark channel: How many bits can be hidden within a digital image?, in *Proc. SPIE*, San Jose, CA, 1999, 437.

Introduction 7

3. Shih, F. Y. and Wu, S.Y., Combinational image watermarking in the spatial and frequency domains, *Pattern Recognition*, 36, 969, 2003.

- 4. Cox, I., et al. Secure spread spectrum watermarking for images audio and video, in *Proc. IEEE Int. Conf. Image Processing*, Lausanne, Switzerland, 1996, 243.
- Cox, I., et al. Secure spread spectrum watermarking for multimedia, *IEEE Trans. Image Processing*, 6, 1673, 1997.
- 6. Lin, S. D. and Chen, C.-F., A robust DCT-based watermarking for copyright protection, *IEEE Trans. Consumer Electronics*, 46, 415, 2000.
- 7. Nikolaidis, N. and Pitas, I., Robust image watermarking in the spatial domain, *Signal Processing*, 66, 385, 1998.
- 8. Acharya, U. R. et al., Compact storage of medical image with patient information, *IEEE Trans. Information Technology in Biomedicine*, 5, 320, 2001.
- 9. Caronni, G., Assuring ownership rights for digital images, in *Proc. Reliable IT Systems*, Vieweg, Germany, 1995, pp. 251–263.
- 10. Celik, M. et al., Hierarchical watermarking for secure image authentication with localization, *IEEE Trans. Image Processing*, 11, 585, 2002.
- 11. Pitas, I. and Kaskalis, T., Applying signatures on digital images, in *Proc. IEEE Workshop Nonlinear Signal and Image Processing*, Halkidiki, Greece, 1995, 460.
- Wolfgang, R. and Delp, E., A watermarking technique for digital imagery: Further studies, in *Proc. Int. Conf. Imaging Science, Systems and Technology*, Las Vegas, NV, 1997.
- 13. Wong, P. W., A public key watermark for image verification and authentication, in *Proc. IEEE Int. Conf. Image Processing*, Chicago, IL, 1998, 425.
- 14. Langelaar, G. et al., Watermarking digital image and video data: A state-of-the-art overview, *IEEE Signal Processing Magazine*, 17, 20, 2000.
- 15. Cox, I. J. et al., Secure spread spectrum watermarking for multimedia, *IEEE Trans. Image Processing*, 6, 1673, 1997.
- Petitcolas, F., Anderson, R., and Kuhn, M., Information hiding: A survey, *Proceedings of the IEEE*, 87, 1062, 1999.
- 17. Cox, I. and Miller M., The first 50 years of electronic watermarking, *J. Applied Signal Processing*, 2, 126, 2002.
- 18. Bruyndonckx, O., Quisquater, J.-J, and Macq, B., Spatial method for copyright labeling of digital images, in *Proc. IEEE Workshop Nonlinear Signal and Image Processing*, Neos Marmaras, Greece, 1995, 456.
- 19. Huang, J., Shi, Y. Q., and Shi, Y., Embedding image watermarks in DC components, *IEEE Trans. Circuits and Systems for Video Technology*, 10, 974, 2000.
- Lin, S. D. and Chen, C.-F., A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.
- 21. Simmons, G. J., Prisoners' problem and the subliminal channel, in *Proc. Int. Conf. Advances in Cryptology*, Santa Barbara, CA, 1984, 51.
- 22. Avcibas, I., Memon, N., and Sankur, B., Steganalysis using image quality metrics, *IEEE Trans. Image Processing*, 12, 221, 2003.
- 23. Westfeld, A. and Pfitzmann, A., Attacks on steganographic systems breaking the steganographic utilities EzStego, Jsteg, Steganos, and S-Tools and some lessons learned, in *Proc. Int. Workshop Information Hiding*, Dresden, Germany, 1999, 61.
- 24. Farid, H., Detecting steganographic messages in digital images, Technical Report, TR2001-412, Computer Science, Dartmouth College, 2001.
- Fridrich, J., Goljan, M., and Hogea, D., New methodology for breaking steganographic techniques for JPEGs, in *Proc. SPIE*, Santa Clara, CA, 2003, 143.
- 26. Komatsu, N. and Tominaga H., A proposal on digital watermark in document image communication and its application to realizing a signature, *Trans. of the Institute of Electronics, Information and Communication Engineers*, J72B-I, 208, 1989.

#### Introduction

- Berghel, H. and O'Gorman, L., Protecting ownership rights through digital watermarking, IEEE Computer Mag., 29, 101, 1996.
- Barni, M. et al., Capacity of the watermark channel: How many bits can be hidden within a digital image?, in Proc. SPIE, San Jose, CA, 1999, 437.
- Shih, F. Y. and Wu, S.Y., Combinational image watermarking in the spatial and frequency domains, Pattern Recognition, 36, 969, 2003.
- Cox, I. et al., Secure spread spectrum watermarking for images audio and video, in *Proc. IEEE Int. Conf.* Image Processing, Lausanne, Switzerland, 1996, 243.
- Cox, I. et al., Secure spread spectrum watermarking for multimedia, IEEE Trans. Image Processing, 6, 1673, 1997.
- Lin, S. D. and Chen, C.F., A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.
- Nikolaidis, N. and Pitas, I., Robust image watermarking in the spatial domain, Signal Processing, 66, 385, 1998.
- Acharya, U. R. et al., Compact storage of medical image with patient information, IEEE Trans. Information Technology in Biomedicine, 5, 320, 2001.
- Caronni, G., Assuring ownership rights for digital images, in *Proc. Reliable IT Systems*, Vieweg, Germany, 1995, pp. 251–263.
- Celik, M. et al., Hierarchical watermarking for secure image authentication with localization, IEEE Trans. Image Processing, 11, 585, 2002.
- Pitas, I. and Kaskalis, T., Applying signatures on digital images, in *Proc. IEEE Workshop Nonlinear Signal and Image Processing*, Halkidiki, Greece, 1995, 460.
- Wolfgang, R. and Delp, E., A watermarking technique for digital imagery: Further studies, in *Proc. Int. Conf. Imaging Science, Systems and Technology*, Las Vegas, NV, 1997.
- Wong, P. W., A public key watermark for image verification and authentication, in *Proc. IEEE Int. Conf. Image Processing*, Chicago, IL, 1998, 425.
- Langelaar, G. et al., Watermarking digital image and video data: A state-of-the-art overview, IEEE Signal Processing Magazine, 17, 20, 2000.
- Cox, I. J. et al., Secure spread spectrum watermarking for multimedia, IEEE Trans. Image Processing, 6, 1673, 1997.
- Petitcolas, F., Anderson, R., and Kuhn, M., Information hiding: A survey, Proceedings of the IEEE, 87, 1062, 1999.
- Cox, I. and Miller M., The first 50 years of electronic watermarking, J. Applied Signal Processing, 2, 126, 2002.
- Bruyndonckx, O. , Quisquater, J.J. , and Macq, B. , Spatial method for copyright labeling of digital images, in *Proc. IEEE Workshop Nonlinear Signal and Image Processing*, Neos Marmaras, Greece, 1995, 456.
- Huang, J., Shi, Y. Q., and Shi, Y., Embedding image watermarks in DC components, IEEE Trans. Circuits and Systems for Video Technology, 10, 974, 2000.
- Lin, S. D. and Chen, C.F., A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.
- Simmons, G. J., Prisoners' problem and the subliminal channel, in *Proc. Int. Conf.* Advances in Cryptology, Santa Barbara, CA, 1984, 51.
- Avcibas, I., Memon, N., and Sankur, B., Steganalysis using image quality metrics, IEEE Trans. Image Processing, 12, 221, 2003.
- Westfeld, A. and Pfitzmann, A., Attacks on steganographic systems breaking the steganographic utilities EzStego, Jsteg, Steganos, and S-Tools and some lessons learned, in *Proc. Int. Workshop Information Hiding*, Dresden, Germany, 1999, 61.
- Farid, H. , Detecting steganographic messages in digital images, Technical Report , TR2001-412, Computer Science, Dartmouth College, 2001.
- Fridrich, J., Goljan, M., and Hogea, D., New methodology for breaking steganographic techniques for JPEGs, in *Proc. SPIE*, Santa Clara, CA, 2003, 143.
- Komatsu, N. and Tominaga H., A proposal on digital watermark in document image communication and its application to realizing a signature, *Trans. of the Institute of Electronics, Information and Communication Engineers*, J72B-I, 208, 1989.

Arnold, M., Wolthusen, S., and Schmucker, M., *Techniques and Applications of Digital Watermarking and Content Protection*, Norwood, MA: Artech House, 2003.

Baldoza, A., Data Embedding for Covert Communications, Digital Watermarking, and Information Augmentation, Washington, DC: Storming Media, 2000.

Barni, M. and Bartolini, F., Watermarking Systems Engineering: Enabling Digital Assets

Security and Other Applications, Boca Raton, FL: CRC Press, 2004.

Chandramouli, R., Digital Data-Hiding and Watermarking with Applications, Boca Raton, FL: CRC Press, 2003.

Cole, E. and Krutz, R., Hiding in Plain Sight: Steganography and the Art of Covert

Communication, New York: John Wiley, 2003.

Cox, I., Miller, M., and Bloom, J., *Digital Watermarking: Principles and Practice*, San Francisco: Morgan Kaufmann, 2001.

Cox, I., Miller, M., Bloom, J., Fridrich, J., and Kalker, T., *Digital Watermarking and Steganography*, 2nd edn., San Francisco: Morgan Kaufmann, 2007.

Cvejic, N. and Seppanen, T., Digital Audio Watermarking Techniques and Technologies:

Applications and Benchmarks, New York: Information Science, 2007.

Eggers, J. and Girod, B., Informed Watermarking, New York: Springer, 2002.

Furht, B. and Kirovski, D., Digital Watermarking for Digital Media, New York: Information Science, 2005.

Furht, B. and Kirovski, D. , Fundamentals of Digital Image Watermarking, New Jersey: John Wiley, 2005.

Furht, B. and Kirovski, D., Multimedia Watermarking Techniques and Applications, Boca Raton, FL: Auerbach, 2006.

Furht, B., Muharemagic, E., and , Socek, D., Multimedia Encryption and Watermarking, New York: Springer, 2005.

Gaurav, R., Digital Encryption Model Using Embedded Watermarking Technique in ASIC Design, Ann Arbor, MI: ProQuest/UMI, 2006.

Johnson, N., Duric, Z., and Jajodia, S., *Information Hiding: Steganography and Watermarking: Attacks and Countermeasures*, Norwell, MA: Kluwer Academic, 2001.

Katzenbeisser, S. and Petitcolas, F. , Information Hidding Techniques for Steganography and

Digital Watermarking, Norwell, MA: Artech House, 2000.

Kinner G. Investigator's Guide to Steganography, Boca Raton, El: CRC Press, 2003.

Kipper, G., Investigator's Guide to Steganography, Boca Raton, FL: CRC Press, 2003. Kirovski, D., Multimedia Watermarking Techniques and Applications, Boca Raton, FL:

Auerbach, 2006.

Kwok, S. et al. , Multimedia Security: Steganography and Digital Watermarking Techniques for Protection of Intellectual Property, Hershey, PA: Idea Group, 2004.

Kwok, S. , Yang, C. , Tam, K. , and Wong, J. , Intelligent Watermarking Techniques, New Jersey: World Scientific, 2004.

Lu, C., Multimedia Security: Steganography and Digital Watermarking Techniques for Protection of Intellectual Property, Hershey, PA: Idea Group, 2005.

Pan, J., Huang, H., and Jain, L., Intelligent Watermarking Techniques, New Jersey: World Scientific, 2004.

 $P fitzmann,\,A.\,\,,\,Information\,\,Hiding,\,New\,\,York:\,\,Springer,\,2000.$ 

Seitz, J., Digital Watermarking for Digital Media, Hershey, PA: Idea Group, 2005.

Shih, F. Y., Multimedia Security: Watermarking, Steganography, and Forensics, Boca Raton, FL: CRC Press, 2013.

Su, J. , Digital Watermarking Explained, New York: John Wiley, 2003.

Wayner, P., Disappearing Cryptography: Information Hiding; Steganography and Watermarking, 2nd edn., San Francisco: Morgan Kaufmann, 2002.

#### Classification in Digital Watermarking

Barni, M. et al., A DCT-domain system for robust image watermarking, Signal Processing, 66, 357, 1998.

Nikolaidis, N. and Pitas, I., Robust image watermarking in the spatial domain, Signal Processing, 66, 385, 1998.

Cox, I. J. et al. , Secure spread spectrum watermarking for multimedia, IEEE Trans. Image Processing, 6, 1673, 1997.

Swanson, M. D., Zhu, B., and Tewfik, A. H., Transparent robust image watermarking, in *Proc. IEEE Int. Conf. Image Processing*, Lausanne, Switzerland, 1996, 211.

Lin, S. D. and Chen, C.F., A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.

Deguillaume, F., Voloshynovskiy, S., and Pun, T., Secure hybrid robust watermarking resistant against tampering and copy attack, Signal Processing, 83, 2133, 2003.

Sun, Q. and Chang, S.F., Semi-fragile image authentication using generic wavelet domain features and ECC, in *Proc. IEEE Int. Conf. Image Processing*, 2002, 901.

Wong, P. W., A public key watermark for image verification and authentication, in *Proc. IEEE Int. Conf. on Image Processing*, Chicago, IL, 1998, 425.

Celik, M. U. et al., Hierarchical watermarking for secure image authentication with localization, IEEE Trans. Image Processing, 11, 585, 2002.

Wolfgang, R. and Delp, E., A watermarking technique for digital imagery: Further studies, in *Proc. Int. Conf. Imaging Science, Systems and Technology*, Las Vegas, NV, 1997, 279.

Pitas, I. and Kaskalis, T., Applying signatures on digital images, in *Proc. IEEE Workshop Nonlinear Signal and Image Processing*, Neos Marmaras, Greece, 1995, 460.

Caronni, G., Assuring ownership rights for digital images, in *Proc. Int. Conf. Reliable IT Systems*, Vieweg, Germany, 1995, pp. 251–263.

Berghel, H. and O'Gorman, L., Protecting ownership rights through digital watermarking, IEEE Computer Mag., 101, 1996.

Cox, I. et al., Secure spread spectrum watermarking for images audio and video, in *Proc. IEEE Int. Conf. Image Processing*, 1996, 243.

Chambers, W. G. , Basics of Communications and Coding, Oxford Science, Clarendon Press, Oxford, 1985.

#### **Mathematical Preliminaries**

Johnson, N. and Jajodia, S., Exploring steganography: Seeing the unseen, IEEE Computer, 31, 26, 1998.

Brigham, E., The Fast Fourier Transform and Its Applications, Prentice-Hall, Englewood Cliffs, NJ. 1988.

Yip, P. and Rao, K., Discrete Cosine Transform: Algorithms, Advantages, and Applications, Academic Press, Boston, MA, 1990.

Lin, S. and Chen, C. , A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.

Falkowski, B. J., Forward and inverse transformations between Haar wavelet and arithmetic functions, Electronics Letters, 34, 1084, 1998.

Grochenig, K. and Madych, W. R., Multiresolution analysis, Haar bases, and self-similar tilings of Rn, IEEE Trans. Information Theory, 38, 556, 1992.

Knuth, D., The Art of Computer Programming, vol. 2, Addison-Wesley, Reading, MA, 1981.

Ott, E., Chaos in Dynamical Systems, Cambridge University Press, New York, 2002.

Zhao, D., Chen, G., and Liu, W., A chaos-based robust wavelet-domain watermarking algorithm, Chaos, Solitons and Fractals, 22, 47, 2004.

Schmitz, R., Use of chaotic dynamical systems in cryptography, J. Franklin Institute, 338, 429, 2001.

Devaney, R., An Introduction to Chaotic Dynamical Systems, 2nd edn., Addison-Wesley, Redwood City, CA, 1989.

Peterson, W. and Weldon, E., Error-Correcting Codes, MIT Press, Cambridge, MA, 1972. Said, A. and Pearlman, W. A., A new, fast, and efficient image code based on set partitioning in hierarchical trees, IEEE Trans. Circuits and Systems for Video Technology, 6, 243, 1996. Shapiro, J., Embedded image coding using zerotrees of wavelet coefficients, IEEE Trans. Signal Processing, 41, 3445, 1993.

#### **Digital Watermarking Fundamentals**

Podilchuk, C. I. and Delp, E. J. , Digital watermarking: Algorithms and applications, IEEE Signal Processing Mag., 18, 33, 2001.

Pitas, I., A method for watermark casting on digital images, IEEE Trans. Circuits and Systems for Video Technology, 8, 775, 1998.

Wolfgang, R. and Delp, E., A watermarking technique for digital imagery: Further studies, in *Int. Conf. Imaging Science, Systems and Technology*, Las Vegas, NV, 1997, 279.

Shih, F. Y. and Wu, Y., Combinational image watermarking in the spatial and frequency domains, Pattern Recognition, 36, 969, 2003.

Wong, P., A watermark for image integrity and ownership verification, in *Proc. Int. Conf. IS&T PICS*, Portland, OR, 1998, 374.

Wolfgang, R. and Delp, E., A Watermark for digital images, in *Proc. IEEE Int. Conf. Image Processing*, Lausanne, Switzerland, 1996, 219.

Lin, E. and Delp, E., Spatial synchronization using watermark key structure, in *Proc. SPIE Conf. Security, Steganography, and Watermarking of Multimedia Contents*, San Jose, CA, 2004, 536.

Mukherjee, D., Maitra, S., and Acton, S., Spatial domain digital watermarking of multimedia objects for buyer authentication, IEEE Trans. Multimedia, 6, 1, 2004.

Lin, S. and Chen, C., A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.

Huang, J., Shi, Y., and Shi, Y., Embedding image watermarks in DC components, IEEE Trans. Circuits and Systems for Video Technology, 10, 974, 2000.

Cox, J. et al., A secure, robust watermark for multimedia, in *Proc. First Int. Workshop Information Hiding*, Cambridge, UK, 1996, 185.

Gray, R. M., Vector quantization, IEEE ASSP Mag., 1, 4, 1984.

Lu, Z. and Sun, S. , Digital image watermarking technique based on vector quantization, IEEE Electronics Letters, 36, 303, 2000.

Wong, P. W., A public key watermark for image verification and authentication, in *Proc. IEEE Int. Conf. Image Processing*, Chicago, IL, 1998, 425.

Rivest, R., Shamir, A., and Adleman, L., A method for obtaining digital signatures and public-key cryptosystems, Communications of the ACM, 21, 120, 1978.

Rivest, R. L. , The MD5 message digest algorithm, in R FC 1321, MIT Laboratory for Computer Science and RSA Data Security, 1992.

Holliman, M. and Memon, N., Counterfeiting attacks on oblivious block-wise independent invisible watermarking schemes, IEEE Trans. Image Processing, 9, 432, 2000.

Celik, M. et al., Hierarchical watermarking for secure image authentication with localization, IEEE Trans. Image Processing, 11, 585, 2002.

Coetzee, L. and Eksteen, J., Copyright protection for cultureware preservation in digital repositories, in *Proc. 10th Annual Internet Society Conf.*, Yokohama, Japan, 2000.

Epstein, M. and McDermott, R. , Copy protection via redundant watermark encoding, USA Patent no. 7133534, 2006, accessed on January 5,

2017, http://www.patentgenius.com/patent/7133534.html.

Cox, I. J. et al., Secure spread spectrum watermarking for multimedia, IEEE Trans. Image Processing, 6, 1673, 1997.

Cox, I. J. et al., Digital watermarking, J. Electronic Imaging, 11, 414, 2002.

#### Watermarking Attacks and Tools

Cox, J. et al., A secure, robust watermark for multimedia, in *Proc. IEEE Int. Conf. Image Processing*, Lausanne, Switzerland, 1996, 185.

Kundur, D. and Hatzinakos, D., Diversity and attack characterization for improved robust watermarking, IEEE Trans. Signal Processing, 29, 2383, 2001.

Fei, C., Kundur, D., and Kwong, R. H., Analysis and design of secure watermark-based authentication systems, IEEE Trans. Information Forensics and Security, 1, 43, 2006. Langelaar, G. C., Lagendijk, R. L., and Biemond, J., Removing spatial spread spectrum watermarks by non-linear filtering, in *Proc. Europ. Conf. Signal Processing*, Rhodes, Greece, 1998.

Pereira, S. et al., Second generation benchmarking and application oriented evaluation, in *Proc. Information Hiding Workshop III*, Pittsburgh, PA, 2001.

O'Ruanaidh, J. and Pun, T., Rotation, translation and scale invariant digital image Watermarking, in *Proc. Int. Conf. Image Processing*, 1997, 536.

Rosenfeld, A. and Kak, A. C., Digital Picture Processing, Academic Press, New York, 1982. Petitcolas, F., Anderson, R., and Kuhn, M., Attacks on copyright marking systems, in Proc. Int. Workshop on Information Hiding, Portland, OR, 218, 1998.

Holliman, M. and Memon, N., Counterfeiting attacks for block-wise independent watermarking techniques, IEEE Trans. Image Processing, 9, 432, 2000.

Pereira, S. et al., Template based recovery of Fourier-based watermarks using log-polar and log-log maps, in *Proc. IEEE Int. Conf. Multimedia Computing and Systems*, Florence, Italy, 1999.

Linnartz, J. and Dijk, M., Analysis of the sensitivity attack against electronic watermarks in images, in *Proc. Int. Workshop on Information Hiding*, Portland, OR, 258, 1998.

Deguillaume, F. et al., Secure hybrid robust watermarking resistant against tampering and copy attack, Signal Processing, 83, 2133, 2003.

Kutter, M. and Petitcolas, F., A fair benchmark for image watermarking systems, in Proc. SPIE Electronic Imaging 199: Security and Watermarking of Multimedia Content, San Jose, CA, 1999, 25–27.

Petitcolas, F., Watermarking schemes evaluation, IEEE Signal Processing, 17, 58, 2000. Voloshynovskiy, S. et al., Attack modelling: Towards a second generation benchmark, Signal Processing, 81, 1177, 2001.

Solachidis, V. et al., A benchmarking protocol for watermarking methods, in *Proc. IEEE Int. Conf. Image Processing*, Thessaloniki, Greece, 1023, 2001.

Lin, P. L. et al., A fragile watermarking scheme for image authentication with localization and recovery, in Proc. IEEE Sixth Int. Symp. Multimedia Software Engineering, Miami, FL, 146, 2004.

Tanebaum, A. S., Computer Networks, 4th edn., the Netherlands, Pearson Education International, 2003.

Lin, P. L. et al., A hierarchical digital watermarking method for image tamper detection and recovery, Pattern Recognition, 38, 2519, 2005.

Lee, T. Y. and Lin, S. D., Dual watermark for image tamper detection and recovery, Pattern Recognition, 41, 3497, 2008.

#### **Combinational Domain Digital Watermarking**

Wolfgang, R. and Delp, E., A watermarking technique for digital imagery: Further studies, in Proc. Int. Conf. Imaging Science, Systems and Technology, Las Vegas, NV, pp. 279–287, 1997.

Pitas, I. and Kaskalis, T., Applying signatures to digital images, in *Proc. IEEE Workshop Nonlinear Signal and Image Processing*, Halkidiki, Greece, June 1995, 460.

- Caronni, G., Assuring ownership rights for digital images, in *Proc. Reliable IT Systems*, Vieweg, Germany, pp. 251–263, 1995.
- Zhao, K. E., Embedding robust labels into images for copyright protection, Technical Report, Fraunhofer Institute for Computer Graphics, Darmstadt, Germany, 1994.
- Cox, I. et al., Secure spread spectrum watermarking for images audio and video, in Proc. IEEE Int. Conf. Image Processing, vol. 3, Lausanne, Switzerland, 1996, 243.
- Cox, I. et al., Secure spread spectrum watermarking for multimedia, IEEE Trans. Image Processing, 6, 1673, 1997.
- Bas, P., Chassery, J.-M., and Macq, B., Image watermarking: An evolution to content based approaches, Pattern Recognition, 35, 545, 2002.
- Hsu, C.T. and Wu, J.L. , Hidden signature in images, IEEE Trans. Image Processing, 8, 58, 1999.
- Lin, D. and Chen, C.F., A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.
- Shih, F. Y. and Wu, S. Y. T., Combinational image watermarking in the spatial and frequency domains, Pattern Recognition, 36, 969, 2003.
- Tsai, M. J., Yu, K. Y., and Chen, Y. Z., Joint wavelet and spatial transformation for digital watermarking, IEEE Trans. Consumer Electronics, 46, 241, 2000.
- Lancini, R., Mapelli, F., and Tubaro, S., A robust video watermarking technique for compression and transcoding processing, in Proc. IEEE Int. Conf. Multimedia and Expo, Zadar, Croatia, 2002, 549.

#### Watermarking Based on Genetic Algorithms

- Rivest, R. L., The MD5 message digest algorithm, RFC 1321, accessed on January 6, 2017, http://www.fags.org/rfc1321.html, 1992.
- Rivest, R. L., Shamir, A., and Adleman, L., A method for obtaining digital signatures and public-key cryptosystems, Communications of the ACM, 21, 120, 1978.
- Lin, S. D. and Chen, C.F., A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.
- Holland, J. H., Adaptation in Natural and Artificial Systems, University of Michigan Press, Ann Arbor, 1975.
- Herrera, F., Lozano, M., and Verdegay, J. L., Applying genetic algorithms in fuzzy optimization problems, Fuzzy Systems and Artificial Intelligence, 3, 39, 1994.
- Ho, S.Y., Chen, H.M., and Shu, L.S., Solving large knowledge base partitioning problems using the intelligent genetic algorithm, in *Proc. Int. Conf. Genetic and Evolutionary Computation*, Orlando, FL, 1999, 1567.
- Tang, K.S. et al., Minimal fuzzy memberships and rules using hierarchical genetic algorithms, IEEE Trans. Industrial Electronics, 45, 162, 1998.
- Holland, J. H., Adaptation in Natural and Artificial System: An Introductory Analysis with Applications to Biology, Control, and Artificial Intelligence, MIT Press, Cambridge, MA, 1992. Wakatani, A., Digital watermarking for ROI medical images by using compressed signature image, in Proc. Int. Conf. System Sciences, Hawaii, 2002.
- Strom, J. and Cosman, P. C., Medical image compression with lossless regions of interest, Signal Processing, 59, 155, 1997.
- Said, A. and Pearlmana, W. A., A new, fast, and efficient image codec based on set partitioning in hierarchical trees, IEEE Trans. Circuits and System for Video Technology, 6, 243, 1997.
- Shapiro, J., Embedded image coding using zerotrees of wavelet coefficients, IEEE Trans. Signal Processing, 41, 3445, 1993.
- Rajendra Acharya, U. et al., Compact storage of medical image with patient information, IEEE Trans. Information Technology in Biomedicine, 5, 320, 2001.
- Wang, H., Ding, K., and Liao, C., Chaotic watermarking scheme for authentication of JPEG images, in Proc. Int. Symp. Biometric and Security Technologies, Islamabad, Pakistan, 2008. Ho, C. K. and Li, C. T., Semi-fragile watermarking scheme for authentication of JPEG images, in *Proc. Int. Conf. Information Technology: Coding and Computing*, Las Vegas, NV, 2004.

- Lin, C. Y. and Chang, S.F., Semi-fragile watermarking for authenticating JPEG visual content, in Proc. SPIE Security and Watermarking of Multimedia Content II, San Jose, CA, 140, 2000. Li, C. T., Digital fragile watermarking scheme for authentication of JPEG images, in IEE Proceedings: Vision, Image and Signal Processing, 151, 460, 2004.
- Lin, P. L., Huang, P. W., and Peng, A. W., A fragile watermarking scheme for image authentication with localization and recovery, in Proc. IEEE Sixth Int. Symp. Multimedia Software Engineering, Miami, FL, 146, 2004.
- Lee, T. Y. and Lin, S. D., Dual watermark for image tamper detection and recovery, Pattern Recognition, 41, 3497, 2008.
- Holliman, M. and Memon, N., Counterfeiting attacks on oblivious block wise independent invisible watermarking schemes, IEEE Trans. Image Processing, 9, 432, 2000.

#### Adjusted-Purpose Watermarking

- Cox, I. et al., Secure spread spectrum watermarking for multimedia, IEEE Trans. Image Processing, 6, 1673, 1997.
- Wong, P. W., A public key watermark for image verification and authentication, in *Proc. IEEE Int. Conf. Image Processing*, Chicago, IL, 1998, 425.
- Rivest, R. L., Shamir, A., and Adleman, L., A method for obtaining digital signatures and public-key cryptosystems, Comm. ACM, 21, 120, 1978.
- Rivest, R. L., The MD5 message digest algorithm, RFC 1321, accessed on January 6, 2017, http://www.fags.org/rfcs/rfc1321.html, April 1992.
- Celik, M. U. et al., Hierarchical watermarking for secure image authentication with localization, IEEE Trans. Image Processing, 11, 585, 2002.
- Chen, L.H. and Lin, J.J., Mean quantization based image watermarking, Image Vision Computing, 21, 717, 2003.
- Serra, J., Image Analysis and Mathematical Morphology, Academic Press, New York, 1982. Haralick, R. M., Sternberg, S. R., and Zhuang, X., Image analysis using mathematical
- morphology, IEEE Trans. Pattern Analysis and Machine Intelligence, 9, 532, 1988.
- Shih, F. Y. and Mitchell, O. R. , Threshold decomposition of grayscale morphology into binary morphology, IEEE Trans. Pattern Analysis and Machine Intelligence, 11, 31, 1989.
- Dittmann, J. and Nack, F., Copyright-copywrong, IEEE Multimedia, 7, 14, 2000.
- Guo, C., Ma, Q., and Zhang, L., Spatio-temporal saliency detection using phase spectrum of quaternion Fourier transform, in Proc. IEEE Conf. Computer Vision and Pattern Recognition, Anchorage, Alaska, 2008.
- Hou, X. and Zhang, L., Saliency detection: A spectral residual approach, in Proc. IEEE Conf. Computer Vision and Pattern Recognition, Minneapolis, MN, 2007.
- Huang, J., Shi, Y., and Shi, Y., Embedding image watermarks in DC components, IEEE Trans. Circuits and Systems for Video Technology, 10, 974, 2000.
- Itti, L., Koch, C., and Niebur, E., A model of saliency-based visual attention for rapid scene analysis, IEEE Trans. Pattern Analysis and Machine Intelligence, 11, 1254, 1998.
- Alattar, A. M., Reversible watermark using the difference expansion of a generalized integer transform, IEEE Trans. Image Processing, 13, 1147, 2004.
- Al-Qershi, O. M. and Khoo, B. E., Two-dimensional difference expansion (2D-DE) scheme with a characteristics-based threshold, Signal Processing, 93, 154, 2013.
- Tian, J., Reversible data embedding using a difference expansion, IEEE Trans. and Systems for Video Technology, 13, 890, 2003.
- Chang, C. C., Tsai, P., and Lin, C. C., SVD-based digital image watermarking scheme, Pattern Recognition Letters, 26, 1577, 2005.
- Wang, Y. R., Lin, W. H., and Yang, L., An intelligent watermarking method based on particle swarm optimization. Expert Systems with Applications. 38, 8024, 2011.
- Qin, C., Chang, C. C., and Chiu, Y. P., A novel joint data-hiding and compression scheme based on SMVQ and image inpainting, IEEE Trans. Image Processing, 23, 969, 2014.
- Qin, C. Chang, C. C., and Hsu, T. J., Reversible data hiding scheme based on exploiting modification direction with two steganographic images, Multimedia Tools and Applications, 74, 5861, 2015.

Qin, C. and Zhang, X., Effective reversible data hiding in encrypted image with privacy protection for image content, J. Visual Communication and Image Representation, 31, 154, 2015.

Kennedy, J., Particle swarm optimization, in Encyclopedia of Machine Learning, Springer, New York, 760, 2010.

Shih, F. Y. and Wu, Y. T., Robust watermarking and compression for medical images based on genetic algorithms, Information Sciences, 175, 200, 2005.

Ruderman, D. L. and Bialek, W., Statistics of natural images: Scaling in the woods, Physical Review Letters, 73, 814, 1994.

Srivastava, A., Lee, A. B., Simoncelli, E. P., and Zhu, S. C., On advances in statistical modeling of natural images, J. Mathematical Imaging and Vision, 18, 17, 2003.

Chadha, R. and Allison, D., Decomposing rectilinear figures into rectangles, Technical Report, Department of Computer Science, Virginia Polytechnic Institute and State University, 1988.

Wang, Z. and Bovik, A. C. , A universal image quality index, IEEE Signal Processing Letters, 9, 81, 2002.

#### **High-Capacity Watermarking**

Berghel, H. and O'Gorman, L., Protecting ownership rights through digital watermarking, IEEE Computer Mag., 101, 1996.

Eggers, J. and Girod, B., Informed Watermarking, Kluwer Academic, Norwell, MA, 2002.

Wu, Y. T., Multimedia security, morphological processing, and applications, PhD dissertation, New Jersey Institute of Technology, Newark, 2005.

Nikolaidis, N. and Pitas, I. , Robust image watermarking in the spatial domain, Signal Processing, 66, 385, 1999.

Celik, M. U. et al., Hierarchical watermarking for secure image authentication with localization, IEEE Trans. Image Processing, 11, 585, 2002.

Voyatzis, G. and Pitas, I., Applications of toral automorphisms in image watermarking, in Proc. IEEE Int. Conf. Image Processing, Lausanne, Switzerland, 1996, 237.

Mukherjee, D. P., Maitra, S., and Acton, S. T., Spatial domain digital watermarking of multimedia objects for buyer authentication, IEEE Trans. Multimedia, 6, 1, 2004.

Wong, P. W., A public key watermark for image verification and authentication, in *Proc. IEEE Int. Conf. Image Processing*, Chicago, IL, 1998, 425.

Cox, I. J. et al., Secure spread spectrum watermarking for multimedia, IEEE Trans. Image Processing, 6, 1673, 1997.

Zhao, D., Chen, G., and Liu, W., A chaos-based robust wavelet-domain watermarking algorithm, Chaos, Solitons and Fractals, 22, 47, 2004.

Miller, M. L., Doerr, G. J., and Cox, I. J., Applying informed coding and embedding to design a robust high-capacity watermark, IEEE Trans. Image Processing, 13, 792, 2004.

Wu, Y. T. and Shih, F. Y., An adjusted-purpose digital watermarking technique, Pattern Recognition, 37, 2349, 2004.

Shih, F. Y. and Wu, Y., Enhancement of image watermark retrieval based on genetic algorithm, J. Visual Communication and Image Representation, 16, 115, 2005.

Lin, S. D. and Chen, C.F., A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.

Wu, Y. T. and Shih, F. Y., Genetic algorithm based methodology for breaking the steganalytic systems, IEEE Trans. Systems, Man, and Cybernetics: Part B, 36, 24, 2006.

Shih, F. Y. and Wu, Y. T., Combinational image watermarking in the spatial and frequency domains, Pattern Recognition, 36, 969, 2003.

Wang, H., Chen, H., and Ke, D., Watermark hiding technique based on chaotic map, in *Proc. IEEE Int. Conf. Neural Networks and Signal Processing*, Nanjing, China, 2003, 1505.

Chen, B., Shu, H., Coatrieux, G., Chen, G., Sun, X., and Coatrieux, J. L., Color image analysis by quaternion-type moments, J. Mathematical Imaging and Vision, 51, 124, 2015.

Huang, J., Shi, Y., and Shi, Y., Embedding image watermarks in DC components, IEEE Trans. Circuits and Systems for Video Technology, 10, 974, 2000.

Ruderman, D. L. and Bialek, W., Statistics of natural images: Scaling in the woods, Physical Review Letters, 73, 814, 1994.

Berghel, H. and O'Gorman, L., Protecting ownership rights through digital watermarking, Computer, 29, 101, 1996.

Dittmann, J. and Nack, F., Copyright-copywrong, IEEE Multimedia, 7, 14, 2000.

Eswaraiah, R. and Sreenivasa Reddy, E., Medical image watermarking technique for accurate tamper detection in ROI and exact recovery of ROI, Int. J. Telemedicine and Applications, 2014.

tamper detection in ROI and exact recovery of ROI, Int. J. Telemedicine and Applications, 2014. Guo, P., Wang, J., Li, B., and Lee, S., A variable threshold-value authentication architecture for wireless mesh networks, J. Internet Technology, 15, 929, 2014.

Shih, F. Y. and Wu, Y. T., Robust watermarking and compression for medical images based on genetic algorithms, Information Sciences, 175, 200, 2005.

Wakatani, A., Digital watermarking for ROI medical images by using compressed signature image, in Proc. 35th IEEE Annual Hawaii Int. Conf. System Sciences, 2043, 2002.

Alattar, A. M., Reversible watermark using the difference expansion of a generalized integer transform, IEEE Trans. Image Processing, 13, 1147, 2004.

Al-Qershi, O. M. and Khoo, B. E., Two-dimensional difference expansion (2D-DE) scheme with a characteristics-based threshold, Signal Processing, 93, 154, 2013.

Zain, J. M. and Clarke, M., Reversible region of non-interest (RONI) watermarking for authentication of DICOM images, Int. J. Computer Science and Network Security, 7, 19, 2007.

Bas, P., Chassery, J. M., and Macq, B., Image watermarking: An evolution to content based approaches, Pattern Recognition, 35, 545, 2002.

Lin, S. D. and Chen, C. F. , A robust DCT-based watermarking for copyright protection, IEEE Trans. Consumer Electronics, 46, 415, 2000.

Loganathan, R. and Kumaraswamy, Y. S., Medical image compression with lossless region of interest using adaptive active contour, J. Computer Science, 8, 747, 2012.

Benyoussef, M., Mabtoul, S., Marraki, M., and Aboutajdine, D., Robust ROI watermarking scheme based on visual cryptography: Application on mammograms, J. Information Processing Systems, 11, 495, 2015.

Gao, X., An, L., Yuan, Y., Tao, D., and Li, X., Lossless data embedding using generalized statistical quantity histogram, IEEE Trans. Circuits and Systems for Video Technology, 21, 1061, 2011.

Rajendra Acharya, U., Acharya, D., Subbanna Bhat, P., and Niranjan, U. C. Compact storage of medical images with patient information, IEEE Trans. Information Technology in Biomedicine, 5, 320, 2001.

Srivastava, A., Lee, A. B., Simoncelli, E. P., and Zhu, S. C., On advances in statistical modeling of natural images, J. Mathematical Imaging and Vision, 18, 17, 2003.

Wang, Z. H., Lee, C. F., and Chang, C. Y., Histogram-shifting-imitated reversible data hiding, J. Systems and Software, 86, 315, 2013.

Zhao, Z., Luo, H., Lu, Z. M., and Pan, J. S., Reversible data hiding based on multilevel histogram modification and sequential recovery, AEU Int. J. Electronics and Communications, 65, 814, 2011.

Chadha, R. and Allison, D., Decomposing rectilinear figures into rectangles, Technical Report, Department of Computer Science, Virginia Polytechnic Institute and State University, Blacksburg, 1988.

Shapiro, J. M., Embedded image coding using zerotrees of wavelet coefficients, IEEE Trans. Signal Processing, 41, 3445, 1993.

Shaamala, A., Abdullah, S. M., and Manaf, A. A., Study of the effect DCT and DWT domains on the imperceptibility and robustness of genetic watermarking, *Int. J. Computer Science Issues*, 8, 2011.

Thodi, D. M. and Rodríguez. J. J., Expansion embedding techniques for reversible watermarking, IEEE Trans. Image Processing, 16, 721, 2007.

Tian, J., Reversible data embedding using a difference expansion, IEEE Trans. Circuits and Systems for Video Technology, 13, 890, 2003.

Xia, Z., Wang, X., Sun, X., Liu, Q., and Xiong, N., Steganalysis of LSB matching using differences between nonadjacent pixels, Multimedia Tools and Applications, 2014.

#### **Reversible Watermarking**

- Yeung, M. and Mintzer, F., An invisible watermarking technique for image verification, in *Proc. IEEE Int. Conf. Image Processing*, Santa Barbara, CA, 680, 1997.
- Fridrich, J., Security of fragile authentication watermarks with localization, in *Proc. SPIE Conf. Security and Watermarking of Multimedia Contents*, San Jose, CA, 691, 2002.
- Holliman, M. and Memon, N., Counterfeiting attacks on oblivious block-wise independent invisible watermarking schemes, IEEE Trans. Image Processing, 9, 432, 2000.
- Celik, M. U., Sharma, G., Saber, E., and Tekalp, A. M., Hierarchical watermarking for secure image authentication with localization, IEEE Trans. Image Processing, 11, 585, 2002.
- Chan, C. S. and Chang, C. C., An efficient image authentication method based on Hamming code, Pattern Recognition, 40, 681, 2007.
- $\label{eq:Liu, S. H. , Yao, H. X. , Gao, W. , and Liu, Y. L. , An image fragile watermark scheme based on chaotic image pattern and pixel-pairs, Applied Mathematics and Computation, 185, 869, 2007. \\$
- Zhang, X. P. and Wang, S. Z. , Fragile watermarking scheme using a hierarchical mechanism, Signal Processing, 89, 675, 2009.
- Chen , C.C. and Lin, C. S. , A GA-based nearly optimal image authentication approach, Int. J. Innovative Computing, Information and Control, 3, 631, 2007.
- Luo, X. Y., Liu, F. L., and Liu, P. Z., An LSB steganography approach against pixels sample pairs steganalysis, Int. J. Innovative Computing, Information and Control, 3, 575, 2007.
- Tian, J., Reversible data embedding using a difference expansion, IEEE Trans. Circuits Systems for Video Technology, 13, 890, 2003.
- Alattar, A. M., Reversible watermark using the difference expansion of a generalized integer transform, IEEE Trans. Image Processing, 13, 1147, 2004.
- Kim, H. J., Sachnev, V., Shi, Y. Q., Nam, J., and Choo, H. G., A novel difference expansion transform for reversible data embedding, IEEE Trans. Information Forensics and Security, 3, 456, 2008.
- Weng, S. W., Zhao, Y., and Pan, J. S., A novel reversible data hiding scheme, Int. J. Innovative Computing, Information and Control, 4, 351, 2008.
- Ni, Z., Shi, Y. Q., Ansari, N., and Su, W., Reversible data hiding, IEEE Trans. Circuits and Systems for Video Technology, 16, 354, 2006.
- Lin, C. C., Tai, W. L., and Chang, C. C., Multilevel reversible data hiding based on histogram modification of difference images, Pattern Recognition, 41, 3582, 2008.
- Chen , C. C. and Kao, D. S. , DCT-based zero replacement reversible image watermarking approach, Int. J. Innovative Computing, Information and Control, 4, 3027, 2008.
- Coltuc, D. and Chassery, J. M., Very fast watermarking by reversible contrast mapping, IEEE Signal Processing Letters, 14, 255, 2007.
- Sudhamani, M. V. and Venugopal, C. R., Nonparametric classification of data viz. clustering for extracting color features: An application for image retrieval, ICIC Express Letters, 1, 15, 2007.
- Xiao, D., Liao, X. F., and Deng, S. J., One-way Hash function construction based on the chaotic map with changeable-parameter, Chaos, Solitons and Fractals, 24, 65, 2005.
- Xiao, D., Liao, X. F., and Deng, S. J., Parallel keyed hash function construction based on chaotic maps, Physics Letters A, 372, 4682, 2008.
- Yi, X., Hash function based on the chaotic tent map, IEEE Trans. Circuits and Systems II, 52, 354, 2005.
- Zhang, J. S., Wang, X. M., and Zhang, W. F., Chaotic keyed hash function based on feedforward–feedback nonlinear digital filter, Physics Letters A, 362, 439, 2007.
- Wu, J. H., Zhu, B. B., Li, S. P., and Lin, F. Z., New attacks on sari image authentication system, in *Proc. SPIE*, San Jose, CA, 602, 2004.
- Zhao, Z., Luo, H., Lu, Z., and Pan, J., Reversible data hiding based on multilevel histogram modification and sequential recovery, AEU: Int. J. Electronics and Communications, 65, 814, 2011.

#### Steganography and Steganalysis

- Wrixon, F. B., *Codes, Ciphers and Other Cryptic and Clandestine Communication*, Black Dog & Leventhal, New York, 469–508, 1998.
- Simmons, G. J., Prisoners' problem and the subliminal channel, in *Proc. Int. Conf.* Advances in Cryptology, 1984, 51.
- Fei, C., Kundur, D., and Kwong, R. H., Analysis and design of secure watermark-based authentication systems, IEEE Trans. Information Forensics and Security, 1, 43, 2006.
- Lyu, S. and Farid, H., Steganalysis using higher-order image statistics, IEEE Trans. Information Forensics and Security, 1, 111, 2006.
- Sullivan, K. et al., Steganalysis for Markov cover data with applications to images, IEEE Trans. Information Forensics and Security, 1, 275, 2006.
- Johnson, N. and Jajodia, S., Exploring steganography: Seeing the unseen, IEEE Computer, 31, 26, 1998.
- Johnson, N. F., Durric, Z., and Jajodia, S., Information Hiding: Steganography and Watermarking, Kulwer Academic, Boston, MA, 2001.
- Kharrazi, M., Sencar, H. T., and Memon, N. D., Benchmarking steganographic and steganalysis techniques, in Proc. Int. Conf. Security, Steganography, and Watermarking of Multimedia Contents, San Jose, CA, 2005.
- Wu, Y. and Shih, F. Y., Genetic algorithm based methodology for breaking the steganalytic systems, IEEE Trans. SMC: Part B, 36, 24, 2006.
- Brown, A., S-Tools for Windows, shareware, 1994.
- Wolf, B., StegoDos: Black Wolf's Picture Encoder v0.90B, public domain,
- ftp://ftp.csua.berkeley.edu/pub/cypherpunks/steganography/stegodos.zip. Accessed January 6, 2017.
- Korejwa, J., JSteg shell 2.0., http://www.tiac.net/users/korejwa/steg.htm. Accessed January 6, 2017.
- Westfeld, A. and Pfitzmann, A., Attacks on steganographic systems breaking the steganographic utilities EzStego, Jsteg, Steganos, and S-Tools and some lessons learned, in *Proc. Int. Workshop Information Hiding*, Dresden, Germany, 1999, 61.
- Avcibas, I., Memon, N., and Sankur, B., Steganalysis using image quality metrics, IEEE Trans. Image Processing, 12, 221, 2003.
- Fridrich, J., Goljan, M., and Hogea, D., New methodology for breaking steganographic techniques for JPEGs, in Proc. El SPIE, Santa Clara, CA, 2003, 143.
- Farid, H., Detecting steganographic message in digital images, Technical Report,
- TR2001–412, Department of Computer Science, Dartmouth College, Hanover, NH, 2001. Provos, N. and Honeyman, P., Detecting steganographic content on the Internet, Technical Report 01–11, Center for Information Technology Integration, University of Michigan, Ann Arbor, 2001.
- Fridrich, J. et al., Quantitative steganalysis of digital images: Estimating the secret message length, Multimedia Systems, 9, 288, 2003.
- Wayner, P., Disappearing Cryptography: Information Hiding; Steganography and Watermarking, 2nd edn., Morgan Kaufmann, San Francisco, CA, 2002.
- Jackson, J. T. et al., Blind steganography detection using a computational immune system: A work in progress, Int. J. Digital Evidence, 4, 19, 2003.
- Fridrich, J., Goljan, M., and Du, R., Reliable detection of LSB steganography in color and grayscale images, in *Proc. ACM Workshop Multimedia Security*, Ottawa, ON, Canada, 2001, 27.
- Westfeld, A. and Pfitzmann, A., Attacks on steganographic systems, Lecture Notes in Computer Science, vol. 1768, 61, Springer, Berlin, 2000.
- Fridrich, J., Goljan, M., Soukal, D., Higher-order statistical steganalysis of palette images, in *Proc. SPIE Conf. Security and Watermarking of Multimedia Contents V*, 2003, 178.
- Dumitrescu, S., Wu, X., and Wang, Z., Detection of LSB steganography via sample pair analysis, in *Proc. Information Hiding Workshop*, 2002, 355.
- Fridrich, J. and Du, R., Secure steganographic methods for palette images, in *Proc. Information Hiding Workshop*, Dresden, Germany, 1999, 4760.
- Fridrich, J. and Goljan, M., Practical steganalysis of digital images: State of the art, in *Proc. SPIE Security and Watermarking of Multimedia Contents IV*, San Jose, CA, 2002, 1.

Ozer, H. et al., Steganalysis of audio based on audio quality metrics, in *Proc. SPIE, Security and Watermarking of Multimedia Contents V*, Santa Clara, CA, 2003, 55.

Kessler, G. C., An overview of steganography for the computer forensics examiner, *Forensic Science Communications*, 6, 2004.

Avcibas, I., Memon, N., and Sankur, B., Steganalysis using image quality metrics, IEEE Trans. Image Processing, 12, 221, 2003.

Grgic, S., Grgic, M., and Mrak, M., Reliability of objective picture quality measures, J. Electrical Engineering, 55, 3, 2004.

Nill, N. B., A visual model weighted cosine transform for image compression and quality assessment, IEEE Trans. Communication, 33, 551, 1985.

Cortes, C. and Vapnik, V., Support-vector networks, Machine Learning, 20, 273, 1995.

Vapnik, V., The Nature of Statistical Learning Theory, Springer, New York, 1995.

Burges, C., A tutorial on support vector machines for pattern recognition, IEEE Trans. Data Mining and Knowledge Discovery, 2, 121, 1998.

Vapnik, V., Statistical Learning Theory, Wiley, New York, 1998.

Heisele, B. et al., Hierarchical classification and feature reduction for fast face detection with support vector machines, Pattern Recognition, 36, 2007, 2003.

Shih, F. Y. and Cheng, S., Improved feature reduction in input and feature spaces, Pattern Recognition, 38, 651, 2005.

Schohn, G. and Cohn, D., Less is more: Active learning with support vector machines, in *Proc. Int. Conf. Machine Learning*, Stanford University, CA, 2000, 839.

Syed, N. A., Liu, H., and Sung, K. K., Incremental learning with support vector machines, in

*Proc. Int. Joint Conf. Artificial Intelligence*, Stockholm, Sweden, 1999, 15. Campbell, C., Cristianini, N., and Smola, A., Query learning with large margin classifiers, in

*Proc. Int. Conf. Machine Learning*, Stanford University, CA, 2000, 111. An, J.L., Wang, Z.O., and Ma, Z.P., An incremental learning algorithm for support vector

machine, in *Proc. Int. Conf. Machine Learning and Cybernetics*, Xi'an, China, 2003, 1153.

Nguyen, H. T. and Smeulders, A. , Active learning using pre-clustering, in *Proc. Int. Conf. Machine Learning*, Banff, AB, Canada, 2004.

Mitra, P., Murthy, C. A., and Pal, S. K., A probabilistic active support vector learning algorithm, IEEE Trans. Pattern Analysis and Machine Intelligence, 26, 413, 2004.

Cortes, C. and Vapnik, V., Support-vector network, Machine Learning, 20, 273, 1995.

Platt, J. C. , Cristianini, N. , and Shawe-Taylor, J. , Large margin DAGs for multiclass classification, in  $Advances\ in\ Neural\ Information\ Processing\ Systems,\ MIT\ Press,\ 12,\ 547,\ 2000.$ 

Hsu, C. W. and Lin, C. J., A comparison of methods for multiclass support vector machines, IEEE Trans. Neural Networks, 13, 415, 2002.

Herbrich, R., Learning Kernel Classifiers Theory and Algorithms, MIT Press, Cambridge, MA, 2001.

Martinez, A. M. and Kak, A. C., PCA versus LDA, IEEE Trans. Pattern Analysis and Machine Intelligence, 23, 228, 2001.

Westfeld, A., High capacity despite better steganalysis (F5—a steganographic algorithm), in *Proc. Int. Workshop Information Hiding*, Pittsburgh, PA, 2001, 289.

Provos, N. , Defending against statistical steganalysis, in Proc. USENIX Security Symposium, 2001, 323.

Fridrich, J., Goljan, M., and Hogea, D., Steganalysis of JPEG images: Breaking the F5 algorithm, in *Proc. Int. Workshop Information Hiding*, Noordwijkerhout, The Netherlands, 2002, 210

Alturki, F. and Mersereau, R., A novel approach for increasing security and data embedding capacity in images for data hiding applications, in *Proc. Int. Conf. Information Technology: Coding and Computing*, 2001, 228.

#### Steganography Based on Genetic Algorithms and Differential Evolution

1. Chu, R. et al., A DCT-based image steganographic method resisting statistical attacks, in *Int. Conf. Acoustics, Speech, and Signal Processing*, Montreal, QC, Canada, 2004.

Karboga, D. and Okdem, S., A simple and global optimization algorithm for engineering problems: Differential evolution algorithm, Turkish J. Electrical Engineering and Computer Sciences, 12, 53, 2004.

Price, K., Storn, R., and Lampinen, J., *Differential Evolution: A Practical Approach to Global Optimization*, Springer, New York, 2005.

Beyer, H. and Schwefel, H., Evolution strategies: A comprehensive introduction, Natural Computing, 1, 3, 2004.

Holland, J. H., Adaptation in Natural and Artificial Systems, University of Michigan Press, Ann Arbor, 1975.

6. Shih, F. Y. and Wu, Y.T., Enhancement of image watermark retrieval based on genetic algorithm, J. Visual Communication and Image Representation, 16, 115, 2005.

Westfeld, A. and Pfitzmann, A., Attacks on steganographic systems breaking the steganographic utilities EzStego, Jsteg, Steganos, and S-Tools and some lessons learned, in *Proc. Int. Workshop Information Hiding*, Dresden, Germany, 1999, 61.

Avcibas, I., Memon, N., and Sankur, B., Steganalysis using image quality metrics, IEEE Trans. Image Processing, 12, 221, 2003.

Avcibas, I. and Sankur, B., Statistical analysis of image quality measures, J. Electronic Imaging, 11, 206, 2002.

Rencher, A. C., Methods of Multivariate Analysis, John Wiley, New York, 1995.

Fridrich, J., Goljan, M., and Hogea, D., New methodology for breaking steganographic techniques for JPEGs, in *Proc. El SPIE*, Santa Clara, CA, 2003, 143.

PictureMarc, Embed Watermark, v 1.00.45, Digimarc Corporation.

Cox, J. et al., Secure spread spectrum watermarking for multimedia, IEEE Trans. Image Processing, 6, 1673, 1997.

Brown, A., S-Tools for Windows, shareware, 1994.

ftp://idea.sec.dsi.unimi.it/pub/security/crypt/code/s-tools4.zip. Accessed January 6, 2017. Shih, F. Y. and Wu, Y.T., Combinational image watermarking in the spatial and frequency domains, Pattern Recognition, 36, 969, 2003.

Shih, F. Y. and Edupuganti, V. G., A differential evolution based algorithm for breaking the visual steganalytic system, Soft Computing, 13, 345, 2009.