
A Review on Watermarking Techniques Based on Deep Learning Neural Networks

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Abstract.

A mechanized watermark is a kind of marking that is concealed in a noisy tolerant communication, such as video, sound, even picture. It's common to see imagined authorship for the patent of such transmissions. The process of concealing automated bits in a transport signal is known as "watermarking." There is no need that the protected information to be linked to the carrier signal. Automated watermarks can be used to verify the transport signal's legitimacy or soundness, as well as to demonstrate the proprietors' individuality. Another set of alterations affected by Deep Learning frameworks is examined in this research. Let's take a total examination of the different significant learning methods to introduce the watermark that can be processed to obtain a significant level of security for information communicated and power more than some aggression, especially when sending noisy media.

Keywords. Digital Watermarking, Robust, Deep learning, RNN, FCNN

1. INTRODUCTION

Advanced pictures are made by making a carefully encoded portrayal of an article's visual characteristics. They are used in demonstrating, computer games, engineering configuration, satellite photos, maps, and other things. The client may easily create, adjust, and communicate computerized photographs on account of present-day innovation. It is expected to get photographs during transmission against illegal use by an unapproved client. An unapproved client can hack and tempered the picture [1]. Therefore, the analysts should check their authenticity. Computerized Image Watermarking is the best method for guaranteeing the realness of advanced photographs. This is the innovation that safeguards computerized photographs, sound documents, and recordings. The most common way of watermarking advanced photographs is to hide data in them. pictures, films, and sound in computerized design. This approach was first established in 1992 by Andrew Tirkel and Charles Osborne.

There are two types of apparent and undetectable computerized picture watermarking. Watermarks on logos, bank notes, and advanced photographs are instances of distinguishable watermarks that should be visible with ordinary eyes. In any case, it might become easy to eliminate these watermarks. Then again, imperceptible watermarks are encoded in a mystery design that must be gotten to by supported people. The recovery of these watermarks required numerical computations. Typical eyes can't see these sorts of watermarks. Imperceptible watermarks are tougher than those that are noticeable.

As of late, the headway of profound learning-based strategies has been found in picture watermarking procedures. The utilization of profound neural organizations in watermarking strategies has shown noteworthy outcomes.

In the field of computerized photo watermarking, this work examines fundamental neural organization-based watermarking calculations from top to bottom. The following are the major commitments of our work: - This research will aid experts in the disciplines of watermarking and deep progressing by providing a detailed examination of methods centered on "Digital image watermarking technique in deep learning." Because this study gives a complete survey of the accessible methods, different scientists may effortlessly dissect the numerous parts of the issue.

2. WATERMARKED STRATEGIES IMPLANTED IN DEEP NEURAL NETWORKS

Watermarking using a neural organization produces a good outcome, and this solution is more resistant to various assaults than other methods.

2.1 Watermarked methods inserted in Artificial Neural Networks (ANN)

Watermarking strategies considering neural organizations were effective. This is because of the way that the NN-based procedure beats a specific arrangement of theoretical assaults and functions admirably with the Human Visual System (HVS). Artificial neural networks (ANNs) are structures equipped to get the hang of, recall, and sum up explicit conditions and issues. ANNs are equal frameworks comprised of essential neurons of the unit that register explicit numerical capacities that are regularly non-straight and whose activity is roused by the capacity of the natural neuron. (Haykin ss 2009) [5].

Examination: In this method, the neural organization is prepared considering a subset of info pictures, inferring that this model just functions admirably with a subset of pictures and can't install or extricate the watermark from different pictures. Their prepared model is picture subordinate; the model recoveries picture-related data at the hour of watermark extraction. Thus, this approach is named semi-blind.

2.2 Watermarked procedure implanted in Convolutional Neural Networks (CNN)

The Convolutional Neural Network (CNN or ConvNet) is an exceptional discriminative profound gaining engineering that advances straightforwardly from statistics without the requirement for human mediation extraction of highlights. A Convolutional Neural Network (CNN), a sort of counterfeit neural organization, is extensively applied for photo coping with, division, and characterization. Picture denoising and super-intention are the 2

maximum sizeable regions of photo coping for similarly growing photo quality. Profound neural companies assemble making plans amongst spotless and loud pics to perform denoising precision. CNN's fruitful photo denoising accomplishments are credited to its excessive demonstrating restrict in-community making ready and plan. CNN with a profound layout offers greater noteworthy adaptability to attending to photo properties. Hemdan et al. [6] made a COVIDX-Net version that takes X-beam pics. The COVIDX-Net version became organized to make use of seven unmistakable CNN models, and it became checked to make use of 50 X-beam pics (25 every day and 25 COVID-19 cases).

Examination: Ahmad et al proposed [7] CNN's are constructed from 3 sizeable forms of layers: convolutional, pooling, and related. The convolution layers use channels/elements whose coefficients are altered throughout the coaching level to research large highlights that could occur withinside the statistics. Each channel is convolved autonomously over the contribution to create a factor map, with better enactment values demonstrating the region of factors.

2.3 Watermarked procedure utilized in Fully Convolutional Neural Networks (FCNN)

The instar-out big-name version is a convolutional neural enterprise with 3 layers: facts, result, and grouping. This version is used to devise the input-yield data. Bansal et al. [8] used a neural agency version with one facts layer, one mystery layer, and one results layer of their setup technique. The cowl photo is first inserted withinside the backpropagation neural agency, and the version's masses have then adjusted the use of the backpropagation technique and the goal watermark. The writer then used spatial methods [9] to combine the altered masses into the duvet photo. The very last watermark image is hooked up with the expected results watermark to decide the PSNR of the acquired watermark image.

Investigation: Instead of the use of the duvet image, a fully convolutional neural network (FCNN) changed into used to contain the watermark inner FCNN relationships. This aided in extending electricity and decreasing minor problems to a potential degree. As a result, the watermarked photo is like the original. Furthermore, most assaults didn't degrade the great of the recovered watermark photo, notwithstanding the truth that connected layers are computationally expensive. Because best the watermarked image is needed to split the watermark now of extraction, this the watermarking technique is visually degraded.

2.4 Watermarked strategy installed in Deep neural Networks (DNN)

Deep neural networks (DNNs) have arisen as a huge device for carrying insight to portable and installed gadgets. As DNN models become even more broadly conveyed, shared, and possibly marketed, there is an expanding interest in licensed innovation security (IP) assurance. As of late, DNN watermarking has arisen as a feasible choice. Technique for licensed innovation security. To empower DNN watermarking on implanted gadgets in a sensible situation, a discovery method is required. Existing DNN watermarking systems either don't fulfill or don't meet the necessities. black-box prerequisite or are helpless against a few sorts of attacks. Jia Guo et.al [10] propose a watermarking system that incorporates the creator's mark during the preparation of DNNs in run-of-the-mill conditions, the resultant watermarked DNN works typically. Whenever given any marked item, it acts in a different, preset design input, hence, showing creation.

Examination: By examining the ability of profound neural organizations in the work of combining the appropriated image and the watermark's dormant areas, it has been discovered that the suggested structure has built a picture combination application on picture watermarking. The impediment of picture combination frameworks is that this strategy could bring about huge information misfortune. Besides, when an image is melded, data planning is fairly directed.

Table 1. Comparison of Deep Learning Techniques

Ref No.	Embedded Technique	Features	Visual Imperceptibility	Robustness Attacks considered	Research Gaps
[2]	The YCbCr color space, IWT (integer wavelet transform), and DCT (discrete cosine transform) are used to create a blind and resilient system.)	used in robust applications (i.e., copyright protection) for efficient results and less computational time.	PSNR = 40.25 Db, SSIM = 0.9976	NC = 1.000 Attack Considered Signal processing attacks like cropping, JPEG Compression, resizing	The embedding strategy is not efficient in neural networks architecture to achieve optimal performance
[3]	The lightweight convolution neural network (LW-CNN) technique is used	Reduced the calculation time and made the system more robust to current attacks.	SSIM = 0.98	NCC = 0.998 BER = 0.31 Attack Considered Noisy Domain like average, Gaussian, median	Less robustness on translation and rotational type attacks
[4]	Used Spread Transform Dither Modulation (STDm) and Spread Spectrum (SS)	Denoising with a Fully Convolutional Neural Network (FCNN) maintains picture quality while compromising resilience.	SSIM = 0.987	BER=0.342 Attack Considered Salt And Pepper, Gaussian filtering, median filtering, Weiner filtering, average filtering	Used in other types of attacks

Table 1. shows, an audit of past work in advanced watermarking methods are given. A few well-known approaches that have been examined in the past incorporate spatial area and recurrence space procedures. Besides, the spatial area computerized watermarking innovation is less powerful and subsequently less suggested. Power, indistinctness, security, and limit are utilized to assess the watermarked picture's exhibition. The visual subtlety of the watermarked picture and the strength of the watermarking were two of the main elements. Moreover, future work could profit from joining techniques and applying them in a half and half structure to work on the vigor of the watermarked picture, yet in addition to diminishing the inconveniences of every strategy separately.

3. CONCLUSION

We have characterized a thorough conversation on a few profound learning-based advanced picture watermarking frameworks in this work, which remembers flow improvement and development for this area. All the current profound learning-based advanced picture watermarking calculations enjoy benefits and impediments. Our examination investigates different neural organization-based philosophies and analyses them as far as vigor and indistinctness. Many issues stay annoying and perplexing for deciding the strength of the watermarked picture against attacks, for example, equivocal assaults, conspiracy assaults, crossbreed assaults, and managing more than one assault simultaneously, as expressed in the above areas. To fortify watermarking frameworks for advanced pictures, it is basic to resolve these issues.

4. REFERENCES

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Biographies



Shikha Yadav received a bachelor's degree in computer applications from Delhi University in 2014, a master's degree in computer applications from Maharshi Dayanand University in 2018, and pursuing the philosophy of doctorate degree in Computer applications from Lovely Professional University. Her research areas include digital watermarking, deep learning, and social network analysis.



Jeevan Bala, assistant professor, completed her doctorate degree in Computer Science and Engineering with a specialization in machine learning. She is a dedicated researcher and an experienced academician with research papers in prominent journals, including publications in SCI/SCIE indexed journals. Her research interest includes digital image processing, machine learning, and meta-heuristic techniques.