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## Higher Order Singular Value Decomposition for Image Fusion

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**Abstract:** *The Important points are as follows:1) Since fusion of image mainly depends on local information of source images, the proposed algorithm picks out informative image patches of source images to constitute the fused image by processing the divided sub tensors rather than the whole tensor; 2)To evaluate the quality of the related image patch the sum of absolute values of the coefficients (SAVC) from HOSVD of sub tensors is employed for activity-level measurement; and 3)a novel sigmoid-function-like coefficient-combining scheme is applied to construct the fused result. Hence, a novel higher order singular value decomposition (HOSVD) based image fusion algorithm is proposed.*

**Keywords:** *Tensor, Higher Order Singular Value Decomposition, sigmoid*

### I. INTRODUCTION

The process of combining information from two or more images of the same scene in order to obtain the resulting image more suitable for human and machine perception or further image processing tasks like segmentation, feature extraction, and target recognition is known as Image Fusion [1].It is widely applied in various fields like medical, remote sensing, computer vision.

The recent availability of multi-sensor system in key image application areas, such as remote and air bone sensing, motivated researchers to work on image fusion in general and pixel level image fusion in particular. thus a plethora of pixel level fusion algorithms have been developed with different performance and complexity characteristics.

Fusion performance is mainly assessed using informal subjective preference tests and ,so far, little if any effort has been directed towards the development of objective image fusion performance metrics. In this work we associate important visual information with the “edge” information that is present in each pixel of an image. Notice that this visual to edge information association is supported by Human Visual System studies and is extensively used in image analysis and compression systems. Furthermore, by evaluating the amount of edge information that is transferred from input images to the fused image, a measure of fusion performance can be obtained.

Multway arrays like tensors are the generalizations of scalars, vectors and matrices to an arbitrary number of indices. As tensor based information processing methods are more suitable for representing high-dimensional data and extracting relevant information than vector and matrix based methods they receive lots of attention [5]-[7].

### II. LITERATURE SURVEY

A number of previous researchers have proposed techniques for image fusion one of them is Discrete Wavelet Transform(DWT),In the case of wavelet transform fusion, all respective wavelet coefficients from the input images are combined using the fusion rule. Since wavelet coefficients having large absolute values contain the information about the salient features of the images such as edge and lines, a good fusion rule plays an important role in fusion process.DWT uses method

named Principal Component analysis(PCA).This fusion method has the effect of blurring textures as well image information loss occurs in edge.

**a) Objective Image Fusion Performance Measure by C.S.Xydeas and V.Petrovic**

A measure for objectively assessing pixel level fusion performance is defined. The proposed metric reflects the quality information obtained from the fusion of input images and can be used to compare the performance of different image fusion algorithms. Experimental results clearly indicate that this metric is perceptually meaningful.

**b) Adaptive Multi-way Analysis Of Images by Damien Letexier and Salah Bourenane**

This paper presents a new multiway filtering method for multidimensional images corrupted by white Gaussian noise. Images are considered as multi-way arrays instead of matrices or vectors, which enable to keep relations between each index. The presented filtering method is based on multilinear algebra principles and it improves the multi-way Wiener filtering. The originality of the method relies on the flattening of images. Experiments on color images and hyper spectral images have been computed to illustrate the improvement of MWF by the analysis of image characteristics.

**c) A Method for Compact Image Representation using Sparse Matrix and Tensor projections onto Exemplar Orthonormal bases by K. S. Gurumoorthy, A. Rajwade, A. Banerjee, and A. Rangaraian**

This paper presents a new method for compact representation of large image datasets. This method is based on treating small patches from a 2D image as matrices as opposed to the conventional vectorial representation, and encoding these patches as sparse projections onto a set of exemplar orthonormal bases, which are learned a priori from a training set. The end result is a low-error, highly compact image/patch representation that has significant theoretical merits and compares favorably with existing techniques (including JPEG) on experiments involving the compression of ORL and Yale face databases, as well as two databases of miscellaneous natural images. In the context of learning multiple orthonormal bases, this paper show the easy tunability of our method to efficiently represent patches of different complexities.

**d) Multi-Sensor Image Fusion using the Wavelet Transformation by H. Li, S. Manjunath, and S. Mitra**

In the image fusion scheme presented in this paper, wavelet transformation of the input images are appropriately combined, and the image is obtained by taking the inverse wavelet transform of the fused wavelet coefficients. An area-based maximum selection rule and a consistency verification step are used for feature selection. A performance using specially generated is also suggested.

**e) A Contrast based image fusion technique in the DCT domain by Jinshan Tang**

This paper studies image fusion technique in the discrete cosine transform domain. A new image fusion technique based on a contrast measure defined in the DCT domain is presented. The performance of our contrast measure based technique is analyzed and compared with image fusion techniques. Experimental results show that there is no difference in visual quality between the fused image obtained by our algorithm and that obtained by a wavelet transform based image fusion technique.

**f) The Higher-Order Singular Value Decomposition: Theory and an Application by G. Bergqvist and E. G. Larsson**

Tensor modeling and algorithms for computing various tensor decompositions constitute a very active research area in mathematics. Most of this research has been driven by applications. There is also much software available, including MATLAB toolboxes [4].

**g) Higher Order SVD Analysis for Dynamic Texture Synthesis by R. Costantini, L. Sbaiz and S. Susstrunk**

Videos representing flames, water, smoke, etc., are often defined as dynamic textures: "textures" because they are characterized by the redundant repetition of a pattern and "dynamic" because this repetition is also in time and not only in

space. Dynamic textures have been modeled as linear dynamic systems by unfolding the video frames into column vectors and describing their trajectory as time evolves. After the projection of the vectors onto a lower dimensional space by singular value decomposition (SVD), the trajectory is modeled using system identification techniques. Synthesis is obtained by driving the system with random noise. In this paper, we show that the standard SVD can be replaced by a higher order SVD (HOSVD), originally known as Tucker decomposition. HOSVD decomposes the dynamic texture as a multidimensional signal (tensor) without unfolding the video frames on column vectors. This is a more natural and flexible decomposition, since it permits us to perform dimension reduction in the spatial, temporal, and chromatic domain, while standard SVD allows for temporal reduction only. We show that for a comparable synthesis quality, the HOSVD approach requires, on average, five times less parameters than the standard SVD approach.

#### *h) A Universal image quality index by Z.Wang and A.Bovik*

In this paper a new universal objective image quality index is proposed, which is easy to calculate and applicable to various image processing applications. Instead of using traditional error summation methods, the proposed index is designed by modeling any image distortion as a combination of three factors: loss of correlation, luminance distortion and contrast distortion. Although the new index is mathematically defined and no human visual system model is explicitly employed.

#### *i) Adaptive Flattening for Multidimensional Image Restoration by D. Letexier and S. Bourennane*

Whereas most previous works treating color or hyper-spectral image restoration use hybrid filters or data splitting, some new approaches consider multidimensional or tensor signal processing techniques. Tensor processing methods are based on multilinear algebra and are more efficient than 2-D filtering. This paper proposes a method to adapt the flattening depending on the data set. Proposed method is based on the estimation of main directions in multidimensional data. For this purpose, they extend the straight line detection algorithm. Multidimensional filtering method HOSVD - ( $K_1, \dots, K_N$ ) is applied along the estimated directions. They also adapt a quad tree partitioning in order to split tensors into homogeneous sub-tensors to keep local characteristics. Considering some examples of color and hyper spectral images, they present some promising results  
Fig 7.D2AMA

### III. PROPOSED SYSTEM

A novel Higher Order Single Value Decomposition based image fusion algorithm is proposed

1. HOSVD, a fully data-driven technique, is an efficient tool for high-dimensional data decomposition and feature extraction.
2. The SAVC is a feasible activity-level measurement for evaluating the quality of image patches.
3. The sigmoid-function-based coefficient-combining strategy incorporates the conventional choose-max strategy and the weighted average strategy and thus adapts to different activity levels flexibly.

This technique evaluates six quality parameters. It doesn't produce the blurring effect.

### IV. CONCLUSION

A novel HOSVD-based image fusion algorithm has been proposed. It constructed multiple input images as a tensor and can evaluate the quality of image patches using HOSVD of sub tensors. Then, it employed a novel sigmoid-function-like coefficient-combining scheme to obtain the fused result. Finally experimental result show that the proposed transform domain algorithm is an alternative image fusion approach.

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