

IV. QUALITY ASSESSMENT:

Quality assessment or evaluation is a process to determine effective quality of the fused image with respect to different quality parameters. The quality metrics used for evaluation of the fusion technique are such as follows:

V. Correlation Coefficient (CC):

The similarity between the fused and reference images can be calculated using correlation coefficient. CC of unity indicates that both images are same. It is one of the reference quality metrics. It is defined as

$$CC(I_r, I_f) = \frac{\sum_{i,j} (I_{fij} - \bar{I}_f)(I_{rij} - \bar{I}_r)}{\sqrt{\sum_{i,j} (I_{fij} - \bar{I}_f)^2 (I_{rij} - \bar{I}_r)^2}}$$

here I_f and I_r are the fused image and reference image. The mean values of I_f and I_r are \bar{I}_f and \bar{I}_r respectively. If $\epsilon; j$ and $i; j$ are the pixel values corresponding to the $\delta; i; j$ th pixel of the images I_f and I_r respectively.

2. Bias Of Mean (BM):

BM is the difference between the means of original MS image and fused image (Stanislas de Bethune, 1998). The value taken is related to original image mean value and zero is the ideal value of Bias of Mean.

$$BM = \frac{MS_{mean} - F_{mean}}{MS_{mean}} = 1 - \frac{F_{mean}}{MS_{mean}}$$

where BM is Bias of Mean, MS is multispectral image or data and F is fused image.

3. Peak Signal to Noise Ratio (PSNR):

The mathematical expression for PSNR is given by

$$PSNR(db) = 20 \log \frac{255}{\sqrt{\frac{1}{MN} \sum_{i=1}^M \sum_{j=1}^N (I_{rij} - I_{fij})^2}}$$

here I_r represents the reference image and I_f is the fused image, ϵ and j are the row index and column index.

4. Structural similarity measure (SSIM):

The structural similarity of the fused image and the reference image is determined using SSIM. It is better than PSNR. A Higher value of SSIM indicates better structural quality and hence better quality.

$$SSIM = \frac{2(\mu_r \mu_f)(2\sigma_{rf})}{(\mu_r^2 + \mu_f^2)(\sigma_r^2 + \sigma_f^2)}$$

here mean values of the reference image I_r and fused image I_f are denoted by μ_r and μ_f respectively, its variance is given by σ_r^2 and σ_f^2 and the covariance of the images is represented by σ_{rf} .

5. Entropy E :

It gives the information content in the image. A Higher value of entropy indicates a higher amount of information present in the image.

$$E = \sum_{i=0}^{G-1} P_i \log_2 P_i$$

here G is the total number of grey levels and the probability distribution of each level is given by P_i .

6. Universal image quality index (UIQI):

It is used to calculate the amount of transformation of relevant data from reference image into fused image. The range of this metric is -1 to 1. The value 1 indicates that the reference and fused images are similar

$$UIQI = \frac{4\sigma_{I_r I_f}(\mu_{I_r} + \mu_{I_f})}{(\sigma^2_{I_r} + \sigma^2_{I_f})(\mu^2_{I_r} + \mu^2_{I_f})}$$

V. EXPERIMENTAL RESULTS AND PARAMETER ASSESSMENT:

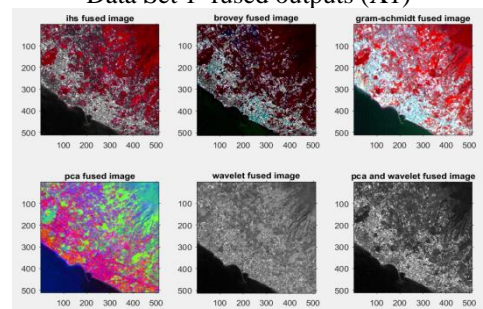
The fusion results are showed in figure, hence the corresponding obtained results and quality assessment are tabulated below.

Fusion methods	TEST IMAGES	IHS	BROVEY (BT)	GRAM-SCHMIDT (GSO)	PRINCIPAL COMPONENT ANALYSIS (PCA)	WAVELET	WAVELET AND PCA FUSED METHOD
CORRELATION COEFFICIENT (CC)	X1	0.292174	0.46070	0.662145	0.73005	0.857271	0.86475
	X2	0.52777	0.551249	0.63700	0.69970	0.729938	0.7814
	X3	0.23306	0.2792980	0.299777	0.492396	0.512496	0.583778
	X4	0.359388	0.3978480	0.471261	0.488316	0.493583	0.624778
MEAN BIAS	X1	47.8837	47.4979	49.1175	56.0178	63.22718	67.8237
	X2	20.7190	21.0717	26.2183	27.6249	41.5981	52.7036
	X3	5.0518	10.6634	24.3320	36.9965	43.5072	54.8587
	X4	10.8534	19.4067	23.3390	25.2571	48.9082	76.8002
PEAK SIGNAL TO NOISE RATIO (PSNR)	X1	11.8067	9.441705	12.032770	12.7406	14.629313	16.0242
	X2	20.784660	23.890294	25.118714	28.349454	30.123243	33.145227
	X3	13.306930	15.909147	17.191942	18.542310	20.030651	20.394016
	X4	6.189453	7.655683	9.089749	11.815711	15.55415	16.725125
Structural similarity measure (SSIM)	X1	0.375738	0.292524	0.400945	0.403003	0.445249	0.508075
	X2	0.249749	0.254358	0.295821	0.344403	0.391930	0.494081
	X3	0.349688	0.484702	0.567373	0.629183	0.652621	0.756754
	X4	0.446656	0.498432	0.532170	0.581020	0.675847	0.774867
ENTROPY	X1	0.48152	0.4213	0.5238	0.55491	0.82585	0.88639
	X2	0.23413	0.351180	0.59798	0.79497	0.83918	0.95495
	X3	0.18856	0.23002	0.39126	0.47252	0.587905	0.67358
	X4	0.10154	0.14823	0.17052	0.213618	0.35414	0.899903
UNIVERSAL IMAGE QUALITY INDEX (UIQI)	X1	0.23890	0.272754	0.286942	0.298473	0.317288	0.38586
	X2	0.27495	0.324078	0.358324	0.375480	0.436020	0.594411
	X3	0.430232	0.454032	0.458836	0.523319	0.59450	0.646595
	X4	0.122976	0.167813	0.252293	0.346313	0.470094	0.642871

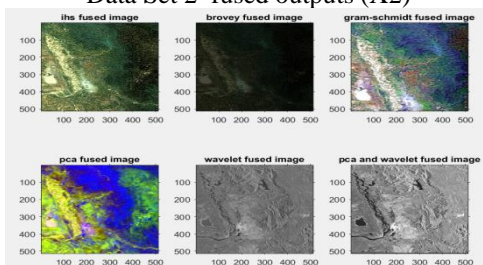
Table 1: Values Of Different Parameters Of Fusion Methods Analyzed To Estimate The Quality Of Fused Images.

The Fig 5 illustrates the corresponding data sets to which the fusion methods are analyzed and quality measures or parameters are assessed and tabulated in Table 1 and the following results are shown in figures given below:

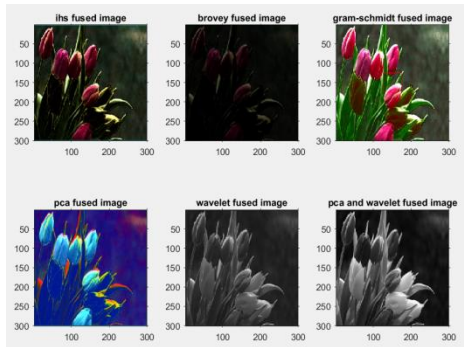
Data Set 1 fused outputs (X1)



Data Set 2 fused outputs (X2)



Data Set 3 fused outputs (X3)



Data Set 4 fused outputs (X4)

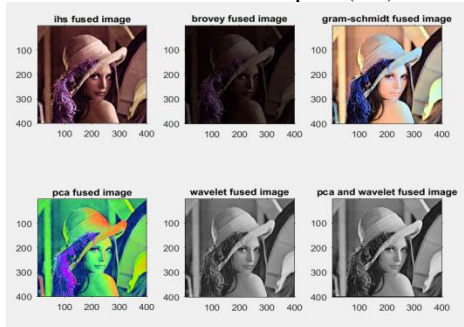


Fig 5: Fused Data Sets(X1,X2,X3,X4).

The results are obtained by using Remote Sensing data (LANDSAT, SPOT and IKONOS) that collects high spatial resolution panchromatic (PAN) image and multiple multispectral (MS) images with low spatial resolution images [2]. The IHS transform separates the spatial information of the multispectral image as the intensity (I) component. By observing the results, IHS method enhances the detail information of image and Brovey transform normalizes the three bands used for RGB and multiplies the result by desired data to add the intensity or brightness component to the image. In Gram-Schmidt image fusion method the low resolution image is panned where small details in the image are observed. PCA separates the spatial information of the image into the first principal component PC1. PCA method introduces less color distortion, but affects spectral responses of the multispectral data. This spectral distortion is caused due to the mismatch of overlap between the spectral responses of the multispectral image, and the bandwidth of the pan image. As compared to other fusion methods wavelets perform better results.

VI. CONCLUSION:

In this paper, we observed different fusion techniques which are applied to the Remote Sensing or satellite data. Many research papers have reported the limitations of existing fusion techniques. Most significant problems observed in the methods are color distortion. To reduce the color distortion and improve fusion quality various fusion techniques have been developed, compared and analyzed. Some of the fusion techniques are utilized in this paper for increasing quality of images or data sets. Various Quality measures are applied to the fused outputs such as PSNR, SSIM, correlation coefficient (CC), Entropy (E), Universal image quality index (UIQI), etc., are analyzed and studied. The quality of fusion is assessed for different images at

different levels. Compared to existing fusion methods proposed fusion techniques show better results.

VII. REFERENCES:

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