

Subjective Assessment Method for Multiple Displays with and without Super Resolution

Chinatsu Mori and Seiichi Gohshi

*Department of Informatics, Kogakuin University, 1-24-2 Nishi-Shinjuku Shinjuku-ku, 163-8677, Tokyo, Japan
ed15002@ns.kogakuin.ac.jp, gohshi@cc.kogakuin.ac.jp*

Keywords: Display, Image Quality, Subjective Assessment, Paired Comparison, 4K TV, Super Resolution.

Abstract: At present, although 4K TV sets are available in the market, the provision of 4K TV content is still not sufficient. Almost all TV content is in high-definition television (HDTV) broadcasting, and images/videos with insufficient resolution are up-converted to the resolution of the display. Thus, almost all 4K TV sets are equipped with super-resolution (SR) technology to improve the resolution of the content. However, the performance of SR on TV sets has not been guaranteed. Although the capability of SR needs to be assessed, there has been no standard method for such an assessment. In this paper, a subjective assessment method for multiple displays is proposed. Subjective assessment experiments of displays with and without SR are conducted to confirm the ability of an SR method. As the results of statistical analysis, the superiority of the SR in resolution quality is proved by the significant differences indicating the reproducible results. As the reproducible results are obtainable, the proposed method is useful to assess multiple displays. In this paper, the methodology of the proposed assessment method is described and the experimental results are presented.

1 INTRODUCTION

Digital high-definition television (HDTV) broadcasting has begun, and home-use television (TV) displays have evolved from cathode-ray tubes to liquid crystal displays. In 2011, 4K TV sets, which have four times the resolution ($3,840 \times 2,160$) of HDTV ($1,920 \times 1,080$), were introduced in the market, and in 2014, 4K satellite broadcasting started in Japan. However, 4K video content is still not widespread, resulting in the release of 4K TV sets ahead of the 4K broadcasting. Almost all TV content available currently is in HDTV, and thus, format conversion is necessary to play conventional HDTV content on 4K TV sets. However, enlarging an image causes blurring.

To improve image/video quality, almost all TV sets are equipped with signal processing technologies such as an enhancer. However, the enhancer only enhances the edges of an image and cannot actually improve resolution. Super-resolution (SR) technology is one way to increase resolution. 4K TV sets equipped with SR have been released by some manufacturers (Toshiba, 2013; Sony, 2015).

A popular SR method is super-resolution image reconstruction (SRR), which uses multiple low-resolution images to reconstruct a high-resolution

image (Farsiu, 2004). Although 4K TV sets equipped with SRR are available (Toshiba, 2013), the inability of SRR to improve the resolution of the TV content has been discussed (Mori, 2016). Note that SR is a catchphrase used in TV marketing, and the performance of SR on TV sets is not guaranteed.

Although the assessment of SR performance on TV sets is required, there is no method for such an assessment at present. The simplest evaluation of SR is signal analysis, which is a comparison of the signals with and without SR in the frequency domain. However, there is no way to measure the signals after the SR processing on the TV sets. As signal analysis cannot be used, a subjective assessment is the only way to evaluate the performance of SR embedded in video devices.

There are various TV sets equipped with signal processing technologies including SR by different manufacturers. Consumers compare these products when they purchase a TV set. Although image quality is frequently considered in the decision, there is no way for consumers to evaluate the relative merits of image quality between the products. A standardized assessment methodology for television video quality is described in BT.500 (ITU-R, 2002). However, BT.500 is not adaptable for assessing multiple displays leading to a product comparison.

In other method, a paired comparison (Scheffe, 1952), was applied to image quality assessments (Nakamae, 1996), and also applied to assess different display panels (Kubota, 2008); however, these assessments are for still-images. The typical use for TV sets is video appreciation. The usefulness of the method for video assessments on multiple displays has not been verified. The purpose of this study is to propose an assessment method for multiple displays enabling to obtain consumers' subjective impressions. Another purpose is to assess TV sets equipped with different SR methods. In authors' previous work, a novel SR method using non-linear signal processing (NLSP) was proposed (Gohshi, 2014). The effect of NLSP is assessed by the proposed method (Sugie, 2014; Mori, 2015). The methodology of the assessment and the experimental results are presented. The proposed method is applicable to product comparisons.

2 SUBJECTIVE ASSESSMENT

Subjective image quality is a psychophysical quantification of how a viewer perceives images and videos. Human perceptions vary individually. Thus, statistical analysis is essential to validate the reproducibility of assessments. The reproducibility is evaluated with the significant difference. Thus, significant differences must be detectable because the result without them makes no sense. Note that psychophysical quantities are susceptible to various factors, and we must carefully select the assessment method and experimental conditions to obtain reproducible measurements.

One of the most common subjective assessment tools is BT.500 (ITU-R, 2002). BT.500 is useful in evaluating the relationship between subjective image quality and bitrate of the image coding. However, BT.500 assessments must use a single display to present assessment videos, and it is not directly adaptable for multiple display assessments. A paired comparison method and ranking method are commonly used for sensory evaluation and it is adaptable to multiple display assessments involving simultaneous comparisons. The ranking method is a comparison of all samples, whereas the paired comparison is that of every pair of samples. The ranking method is inferior to the paired comparison method with respect to the sensitivity of the assessment (Nakamae, 2000). In this paper, the paired comparison method is combined with some of the BT.500 experimental conditions, such as the eligibilities of test sequences and observers. The

proposed method copes with the inadaptability of BT.500 assessments to multiple display assessments.

3 PROPOSED METHOD

3.1 Scheffe's Paired Comparison

A paired comparison method is a round-robin paired comparison that helps in obtaining a statistical order for image quality. The process of Scheffe's paired comparison method is as follows. Using a pair of target and reference samples, observers score their quality on a five-grade scale from -2 to +2 (+2: Excellent, +1: Good, 0: Even, -1: Poor, -2: Bad). The same assessments are repeated for all pairs of samples. Figure 1 shows the actual experiment using the paired comparison method. The observer compares the quality of multiple displays placed together. This situation reproduces an environment in which shoppers compare multiple items at a store.

3.2 Observers and Test Sequences

BT.500 specifies that observers must be non-experts who do not work in the video industry and have normal visual acuity and color vision. Moreover, the number of observers must be at least 15. The proposed method adopts these conditions.

BT.500 specifies that each test sequence used in the assessment must last for 10-15 s and at least four test sequences must be used. The proposed method also adopts these specifications. Although BT.500 does not specify assessment areas, it is not easy for non-expert observers to recognize the difference in quality. To stabilize the observers' decisions, the proposed method specifies assessment areas that make it easier to assess image quality in each of the test sequences. Examples of the test sequences and the assessment areas are shown in Figures 2 and 3. The ovals indicate the assessment areas, and the observers judge the image qualities in these areas.

3.3 Experimental Environments

A training session is conducted in advance to explain the meaning of high- and low-quality images



Figure 1: Experimental setup.

and the experimental method to observers. The experimental process and evaluation points are effectively explained to observers using a dummy test sequence. The test sequence is repeated for each display during the assessment. There is no time limit for the assessment. The observers can freely move to the front of each display and view the test sequences to decide on their opinion. BT.500 specifies an observation angle of $\pm 30^\circ$ from the front of the screen. The proposed method maintains this angle, and the observers are asked to view the videos from the front of the display. A viewing distance of three times the display height is specified in BT.500; however, the appropriate viewing distances vary for individuals according to their visual acuity. In the proposed method, observers can freely select their viewing distance during the assessment.

4 EXPERIMENTS

4.1 Experiment 1

Subjective assessment experiments were conducted to verify the effect of NLSP. In experiment 1, the effect of NLSP was assessed on multiple TV displays. We used a pair of the same consumer-grade 4K TV sets to present different assessment videos. Figure 4 shows the 4K TV set used in the experiment. NLSP was applied to one of the TV sets by using the additional hardware shown in Figure 6. Figure 7 shows a system diagram of the experiment. The solid arrow indicates the process for presenting the NLSP video signal, and the dashed arrow indicates the process for presenting the original vi-

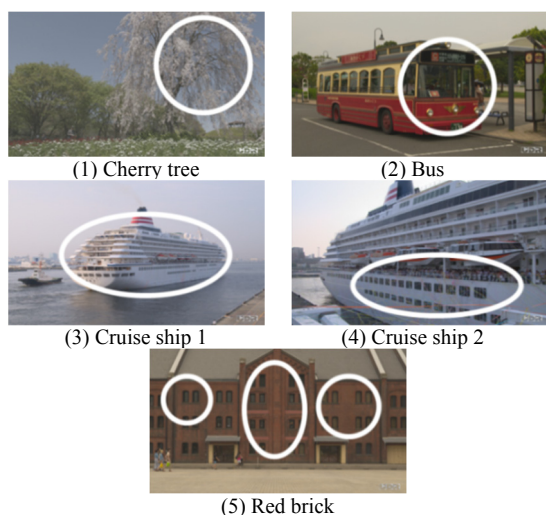


Figure 2: 4K test sequences.

deo signal. The 4K video player outputs a video signal with 4K resolution. For the NLSP process, the signal is input to the NLSP hardware and is processed with NLSP. The processed video signal is then displayed through the 4K TV set. For the original process, the original 4K video signal is directly input and displayed through the 4K TV set.

4.2 Experiment 2

The qualities of NLSP and conventional up-conversion methods were compared. Experiment 2 also considered the effect of different display panels. The same and different display sets were used for the experiments. The stimuli are the 4K signals up-converted from a 2K (1,920 × 1,080) signal by three methods: NLSP, SRR, and the Lanczos filter (Burger, 2010), which is a common interpolation algorithm. Experiment 2-A uses two consumer-grade 4K TV sets, as shown in Figure 4, and experiment 2-B uses the 4K TV set shown in Figure 4 and a professional 4K display, shown in Figure 5. The 4K TV set shown in Figure 4 is equipped with SRR and implements it when the resolution of an input signal is less than that of its display resolution (4K), but it does not work with the same resolution. The system diagrams for two experiments are shown in Figures 8 and 9, respectively. They are the same experiment except for the types of display devices. The solid arrow indicates the process for presenting the NLSP or original video signal. The dashed arrow indicates the process for presenting the SRR video signal. The video player outputs a video signal with 2K resolution. For the NLSP process, the 2K signal is input to the NLSP hardware and is first up-converted to 4K using the Lanczos filter. Then, the

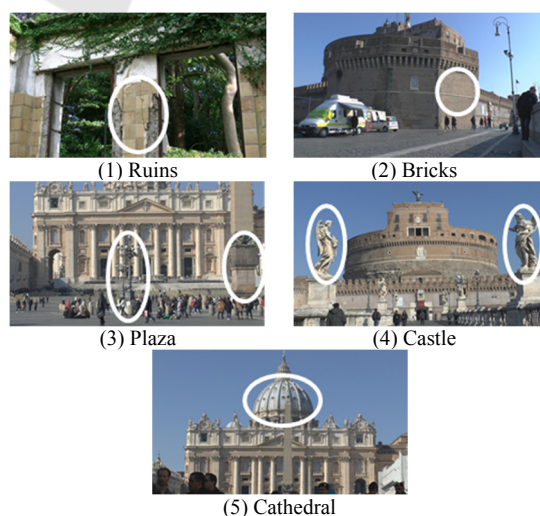


Figure 3: 2K test sequences.

NLSP is implemented with the SR processing on the hardware enabled (ON). If this setting is disabled (OFF), the unprocessed 4K signal is output. The output signal is either displayed through the 4K TV set or the professional 4K display. For the SRR process, the original 2K signal is directly input to the consumer-grade 4K TV set. The signal is then up-converted to 4K by the SRR embedded in the 4K TV set and displayed through the 4K TV set.

4.3 Experimental Conditions

Thirty non-expert observers participated in the experiments. The observers assessed image quality using the five-grade scale from -2 to +2. They were asked to assess resolution only. Other quality factors, such as noise and color, were not considered in the assessment. Five test sequences were used in each experiment: the 4K test sequences shown in Figure 2 were used in experiment 1, and the 2K test sequences shown in Figure 3 were used in experiment 2. These sequences do not include pan and tilt scenes. The assessment areas indicated by ovals in Figures 2 and 3 were specified. These areas have high-resolution elements and are appropriate for recognizing resolution differences.

5 RESULTS AND DISCUSSION

5.1 Results of Experiment 1

The stimuli of experiment 1 are the original 4K video signal (original) and 4K video signal processed by NLSP (NLSP). The assessment results for the “Cherry tree” sequence are shown in Figure 10, which shows the average and standard deviation of the assessment score for each stimulus. The horizontal axis shows an assessment score, and the marks show the average score of original and NLSP (rhombus and square, respectively). The bars extending from the marks show the range of the

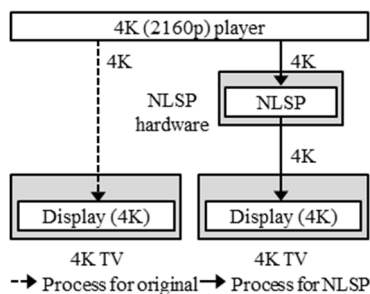


Figure 7: Experiment 1.

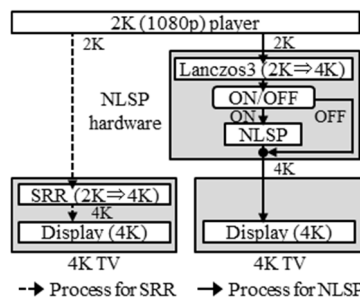


Figure 8: Experiment 2-A.

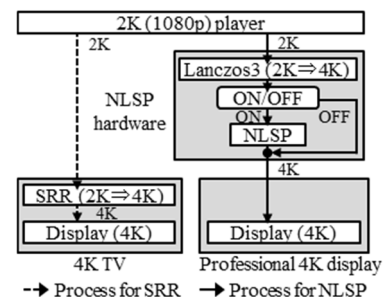


Figure 9: Experiment 2-B.



Figure 4: 4K TV.

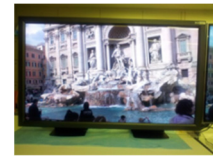


Figure 5: 4K display.



Figure 6: NLSP hardware.

standard deviation, which indicates the dispersion of the score from its average. A higher average indicates a higher assessment. The average of NLSP (1.73) is higher than that of original (-1.27).

A reproducibility test is necessary to guarantee the difference in averages. Reproducibility is evaluated by the average score and range of the standard deviation. The separation of the ranges between the stimuli indicates the reproducibility of the assessments. Comparing the ranges of the NLSP and original values shown in Figure 10, there is a complete separation of the range. Similar results are obtained from the assessments for other test sequences. All results prove the reproducibility and the superiority of NLSP’s scores.

5.2 Results of Experiment 2

The stimuli of experiment 2 are signals up-converted by the Lanczos filter (Lanczos), SRR equipped on the 4K TV set (SRR), and SR with NLSP (NLSP). Table 1 is the cross table for the “Ruins” sequence. Row i indicates the reference stimulus for comparison, and column j indicates the target stimulus. The values in Table 1 are the sums of the assessment scores for all observers. Further, X_i and X_j represent the sums of each row and column, $X_j -$

X_i is the difference of X_j and X_i , and $X_{...}$ represents the total of each row or column.

Here, analysis of variance (ANOVA) was used to assess the significant differences in the assessment scores of the stimuli. The ANOVA results for the “Ruins” sequence are shown in Table 2. The sum of squares, degrees of freedom, and mean squares were calculated for each factor (Fukuda, 2009). The F_0 score is a statistical value for the F-test, and it is obtained by dividing the mean square of a specific factor and that of the residual factor. Further, $F_{1\%}$ is a critical F value for the 1% significance level. If F_0 of the stimuli factor is greater than $F_{1\%}$, there is a significant difference in the assessment scores of stimuli. Here, F_0 of the stimuli factor is $F_0 = 582.96 > F_{1\%} = 4.881$. Thus, a 1% significant difference between the stimuli is observed. Owing to space limitations, the results for the other test sequences cannot be shown, but all the ANOVA results are the same in that there are significant differences for the stimuli factor.

The significant differences in each pair of stimuli were assessed because the ANOVA results guarantee the significant differences of least one of the pairs of stimuli. The yardstick values α for each stimulus are calculated by $(X_j - X_i)/(2Nn)$, where n is the number of observers (30) and N is the number of stimuli (3). The yardstick values for the “Ruins” sequence are shown in Figure 11. In Figure 11, the horizontal axis is the yardstick value, and the marks (rhombus, square, and triangle) show the values of each stimulus. Higher values indicate higher assessment. The values on the arrows show the differences between the stimuli. A critical value of the difference in yardstick values with significance level α is calculated as follows:

$$Y_\alpha = q \sqrt{\frac{V_\epsilon}{2nN}}, \quad (1)$$

where V_ϵ is the mean square of the residual factor (0.26), as shown in Table 2. Further, q is obtained from the Student’s t-distribution with the degrees of freedom for the residual factor (89) and number of stimuli N (3). Let significance level be 0.01. Then $q = 4.282$, and thus, $Y_{0.01} = 0.164$. If the difference in yardstick values is greater than $Y_{0.01}$, there is a significant difference between the yardstick values. In the results of the “Ruins” sequence, the yardstick values in Figure 11 are the highest for NLSP, SRR, and Lanczos, in that order. The differences in the yardstick values of adjacent stimuli, NLSP with SRR ($\alpha_{NLSP} - \alpha_{SRR}$), and SRR with Lanczos ($\alpha_{SRR} - \alpha_{Lanczos}$) are as follows:

$$\alpha_{NLSP} - \alpha_{SRR} = 1.60 > Y_{0.01} \quad (2)$$

$$\alpha_{SRR} - \alpha_{Lanczos} = 0.00 < Y_{0.01} \quad (3)$$

Because $\alpha_{NLSP} - \alpha_{SRR}$ is greater than $Y_{0.01}$, a 1% significant difference between NLSP and SRR is observed. The value of $\alpha_{SRR} - \alpha_{Lanczos}$ is not greater than $Y_{0.01}$, and thus, a significant difference between SRR and Lanczos is not guaranteed. The asterisks (**) in Figure 11 indicate 1% significant differences between the stimuli. The significance level of the difference is the error decision probability. The complement value 99% to “**” is the probability of the difference. Thus, a quality difference practically exists with a 99% probability. All results have similar tendencies; NLSP has the highest evaluation, and there are significant differences between NLSP and SRR as well as NLSP and Lanczos in all cases. Significant differences between SRR and Lanczos are obtained for “Plaza,” “Castle,” and “Cathedral.” The results of experiment 2-B were analyzed in the same way as those of experiment 2-A. As the ANOVA results, the 1% significant difference between the stimuli is observed in all test sequences. Figure 12 show the results of yardstick values for the “Ruins” sequence. All the results are similar to those of experiment 2-A. The yardstick values of NLSP are the highest of all stimuli in all cases. The significant differences are revealed between NLSP and the other two stimuli, SRR and Lanczos. Significant differences between SRR and Lanczos are obtained for “Bricks” and “Castle.”

5.3 Discussion

As a result of experiment 1, a quality difference in resolution with and without NLSP was observed. The reproducibility of the results was proven, and thus, the effect of NLSP on 4K TV sets is guaranteed. In experiment 2, the superiority of NLSP is proven from the results of two experiments with the same and different displays. The same results were obtained regardless of the different displays. The quality differences between SRR and Lanczos are too small to guarantee because they depend on the display and sequence. The essential limits of the ability of SRR to improve the resolution of the TV content were discussed (Mori, 2016), and the results of the experiments are consistent with these discussions. All the results prove its reproducibility, regardless of the different displays.

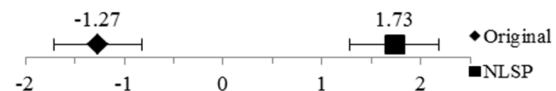


Figure 10: Assessment results (experiment 1 Cherry tree).

The proposed assessment method is useful for assessing multiple displays with SR.

6 CONCLUSIONS

In this paper, a subjective assessment method for multiple displays was proposed, and the subjective assessment experiments of different displays with and without SR were conducted. The results prove the superiority of NLSP in resolution quality. Since the statistical differences were observed from all assessment results, the proposed method is useful to reproducible assessments. The proposed method is adaptable for measuring other quality factors, such as noise or color; the measurement of overall image quality by proposed method is the future work.

Table 1: Cross table (experiment 2-A Ruins).

$i \backslash j$	Lanczos	NLSP	SRR	X_i
Lanczos		55	8	63
NLSP	-42		-39	-81
SRR	9	56		65
X_j	-33	111	-31	$X \dots$
$X_j - X_i$	-96	192	-96	47

Table 2: ANOVA results (experiment 2-A Ruins).

Factor	Sum of Squares	Degree of Freedom	Mean Square	F_0	$F_{1\%}$
Stimuli	307.20	2	153.60	582.96**	4.881
Stimuli \times Observers	39.47	58	0.68	2.58**	1.746
Combination	0.05	1	0.05	0.19	6.963
Position	12.27	1	12.27	46.58**	6.963
Position \times Observers	8.56	29	0.30	1.12	1.944
Residual	23.45	89	0.26	-	-
Overall result	391.00	180	2.17	-	-

** : 1% significant difference

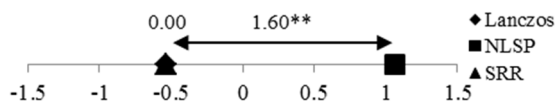


Figure 11: Assessment results (experiment 2-A Ruins).

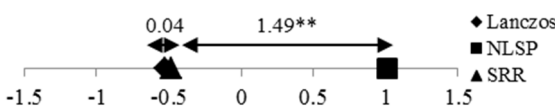


Figure 12: Assessment results (experiment 2-B Ruins).

** : 1% significant difference

REFERENCES

Toshiba, 2013, <http://us.toshiba.com/tv/research-center/technology-guides/what-is-4k>

Sony, 2015, <http://www.sony.com/electronics/bravia/extra>

S. Farsiu, M. Dirk Robinson, "Fast and Robust Multi-Frame Super-Resolution", IEEE Trans Image Process. 2004, Vol.13, no.10, pp.1327-1344, Oct.2004.

Rec. ITU-R BT.500-11, "Methodology for the subjective assessment of the quality of television pictures", ITU-R, 2002.

H. Scheffe, "An analysis of variance for paired comparisons," J. Am. Stat. Assoc. 47(259), pp.381-400, 1952.

M. Nakamae, Y. Tabata, Y. Ohga, M. Kakuta, F. Uto, T. Okunishi, T. Ochi, K. Maeda, "Method of Subjective Evaluation by Scheffe's Method of Paired Comparisons", Japanese Journal of Radiological Technology, Vol.52, No.11, pp.1561-1565, 1996. (in Japanese)

M. Nakamae, "Study of the Reliability of Visual Evaluation by the Ranking Method: Analysis of Ordinal Scale and Psychological Scaling Using the Normalized-rank Approach", Japanese Journal of Radiological Technology 56.5, pp.725-730, 2000. (in Japanese)

S. Kubota, "Evaluation of Image Quality of Organic Light-emitting Diode Displays", The Journal of The Institute of Image Information and Television Engineers Vol. 62, No.1, pp.122-125, 2008. (in Japanese)

W. Burger, M. J. Burge, "Principles of Digital Image Processing: Core Algorithms", Springer Science & Business Media, 2010. pp.223-225

T. Fukuda, R. Fukuda, "Ergonomics handbook", Scientist press co.ltd, Tokyo, 2009. (in Japanese)

C. Mori, K. Tanioka, S. Gohshi, "Relationship between Super Resolution Image Reconstruction and Image Device", IIEEJ Transactions on Image Electronics and Visual Computing, Vol.4, No.1, pp.12-19, 2016.

M. Sugie, S. Gohshi, H. Takeshita C. Mori, "Subjective assessment of super-resolution 4K video using paired comparison", Intelligent Signal Processing and Communication Systems (ISPACS) 2014, pp.17-22, 2014.

C. Mori, M. Sugie, H. Takeshita, S. Gohshi, "Subjective Assessment of Super-Resolution: High-Resolution Effect of Nonlinear Signal Processing", Asia-Pacific Symposium on Information and Telecommunication Technologies (APSITT) 2015, pp.46-48, 2015.

S. Gohshi, "Real Time Super Resolution for 4K/8K with Non-linear Signal Processing", Journal of SMPTE, 124/7, pp. 51-56, 2014.