## Interactive Subjective Study on Picture-level Just Noticeable Difference of Compressed Stereoscopic Images

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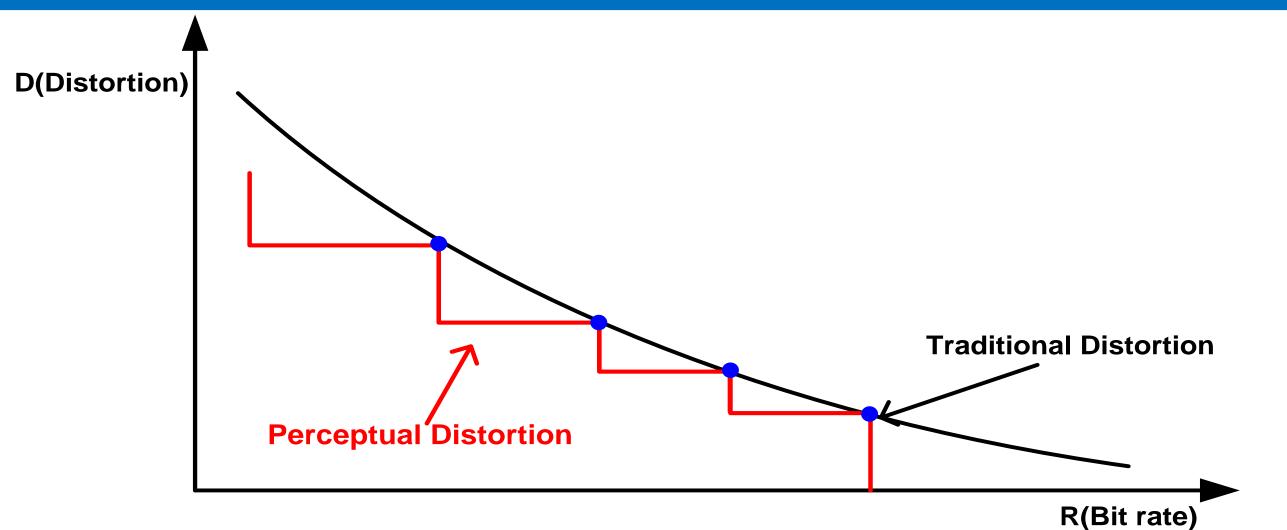


Fig. 1 Perceptual and traditional R-D function.

- Perceptual R-D function is piece-wise constant.
- Just Noticeable Difference (JND) reveals the minimum distortion that human visual system can perceive.
- Traditional JND models focus on pixel and sub-band domain. We study the Picture-level JND (PJND) of stereo images.

# **Subjective Test**

- **✓** Subjective test
- According to ITU-R BT.2022 recommendation.
- Image pairs were shown side by side on a 65' 3D monitor with native resolution  $3840 \times 2160$ .
- Post-processing

The outliers are detected and removed.

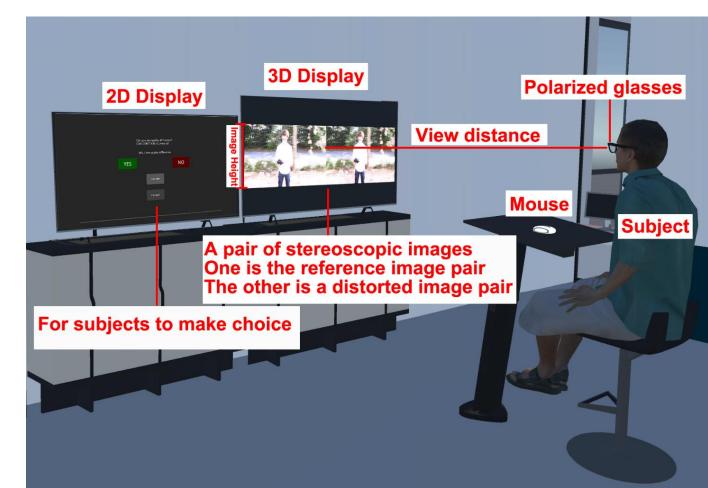


Fig. 3 Subjective test environment.

Fig. 4 Flowchart of the procedure.

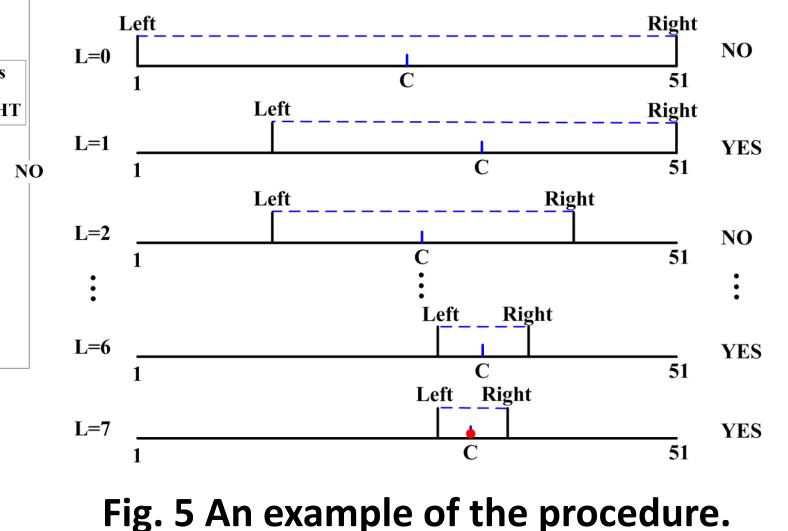


Fig. 5 An example of the procedure.

### **Proposed Dataset**



Fig. 2 Left views of source images in the SIAT-JSSI dataset.

Our dataset includes 10 source stereo images in resolution 1920×1080. The distortion types involved in the test include JPEG2000 and H.265 intra coding.

Table 1 Summarization of the dataset.

Symmetric	Reference Image (L, R)	Comparison Images (L, R)	Number of Distorted Images
1st part	(Source, Source)	H.265:(1, 1),,(51, 51) JPEG2000:(1, 1),,(300, 300)	H.265:51×10 JPEG2000:300×10
2nd part	$(\overline{PJND}_{PRI},\overline{PJND}_{PRI})$	H.265:( $\overline{PJND}_{PRI}$ , $\overline{PJND}_{PRI}$ ),, (51, 51) JPEG2000:( $\overline{PJND}_{PRI}$ , $\overline{PJND}_{PRI}$ ),, (300, 300)	Total:3,510
Asymmetric	Reference Image (L, R)	Comparison Images (L, R)	Number of Distorted Images
1st part	(Source, Source)	H.265:(Source, 1),,(Source, 51) JPEG2000:(Source, 1),,(Source, 300)	H.265:51×10×2 JPEG2000:300×10×2
		31 EG2000.(Source, 1),,(Source, 500)	31 EG2000.300×10×2

#### **Analyses and Discussions**

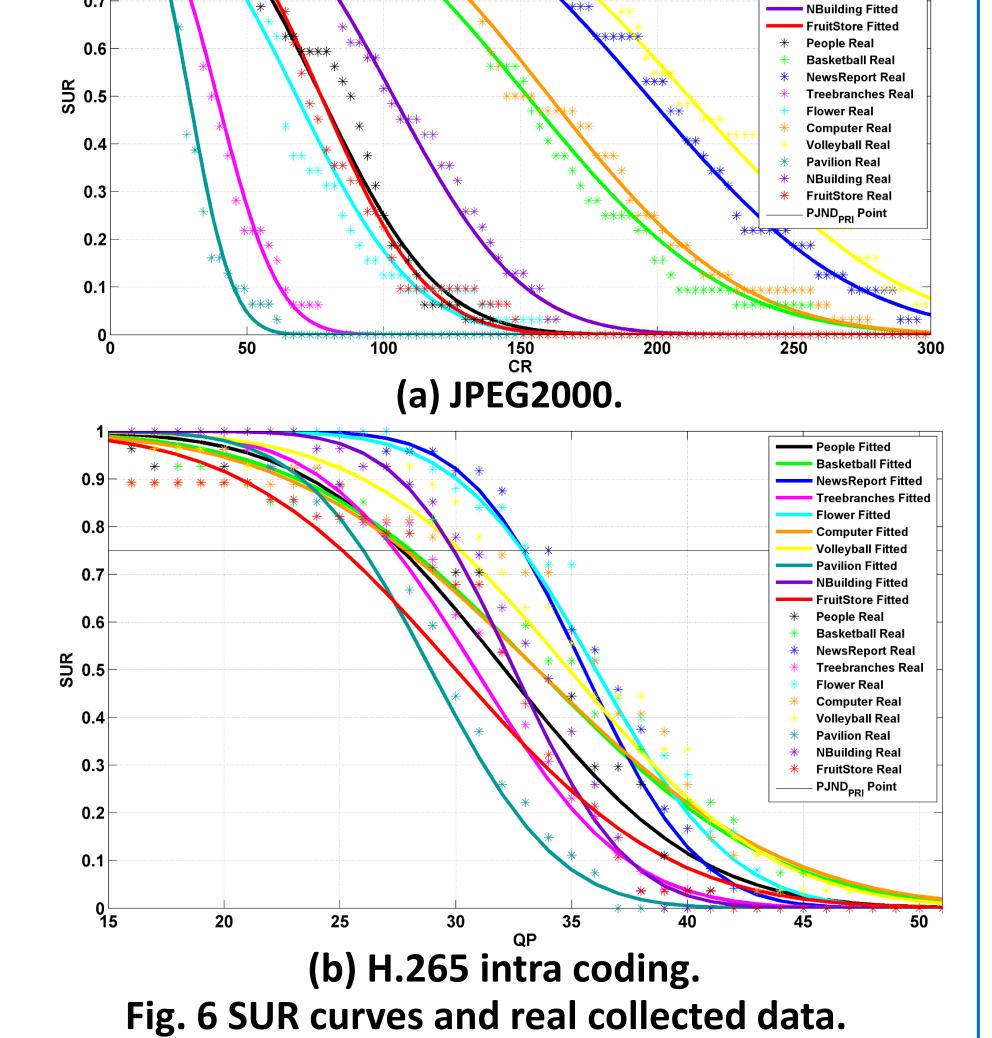
The Satisfied User Ratio (SUR)  $S_n$  for a distorted image  $d_n$  of a source image is  $S_n = 1 - \frac{1}{M} \sum_{m=1}^{M} \Phi_m(d_n)$ 

where M is the number of subjects. if subject m can perceive a quality difference,  $\Phi_m(d_n)=1$ ; otherwise,  $\Phi_m(d_n)=0$ . PJND is defined as the 75% of the SUR.

- The SUR decreases as the distortion increases.
- The real collected data fits well the normal distribution.
- The PJND points vary with the image contents.

Table 2 PJND for H.265 and JPEG2000 compression in SIAT-JSSI.

	H.265				JPEG2000			
Image	$PJND_{PRI}$		$\mathrm{PJND}_{DRI}$		$\mathrm{PJND}_{PRI}$		$PJND_{DRI}$	
	QP	PSNR(L/R)	QP	PSNR(L/R)	CR	PSNR(L/R)	CR	PSNR(L/R)
People	28	35.48/35.46	36	30.86/30.87	54	28.46/28.56	148	27.96/28.10
Basketball	28	40.37/40.28	37	35.34/35.17	114	33.66/33.28	180	31.41/31.17
NewsReport	33	38.78/38.60	35	37.96/37.74	156	38.45/37.96	193	36.78/36.42
Treebranches	27	36.20/36.21	36	30.51/30.50	27	26.25/26.27	137	25.31/25.52
Flower	33	33.84/34.76	37	31.21/31.24	45	26.77/28.62	145	26.11/27.84
Computer	28	39.64/40.80	36	35.72/36.72	123	34.60/36.35	174	33.25/34.86
Volleyball	30	38.93/38.34	36	36.43/35.06	170	37.78/35.83	201	36.89/35.28
Pavilion	26	37.89/38.10	34	31.91/30.09	20	25.64/26.25	143	25.34/25.97
Building	30	38.11/38.69	35	35.14/35.70	78	33.43/34.39	150	32.81/33.80
FruitStore	25	40.32/40.66	35	34.38/34.70	56	32.27/32.89	146	31.30/31.84



People Fitted Basketball Fitted

NewsReport Fitted Treebranches Fitte Flower Fitted

> Computer Fitted Volleyball Fitted

Pavilion Fitted

#### Reference images and their distorted versions

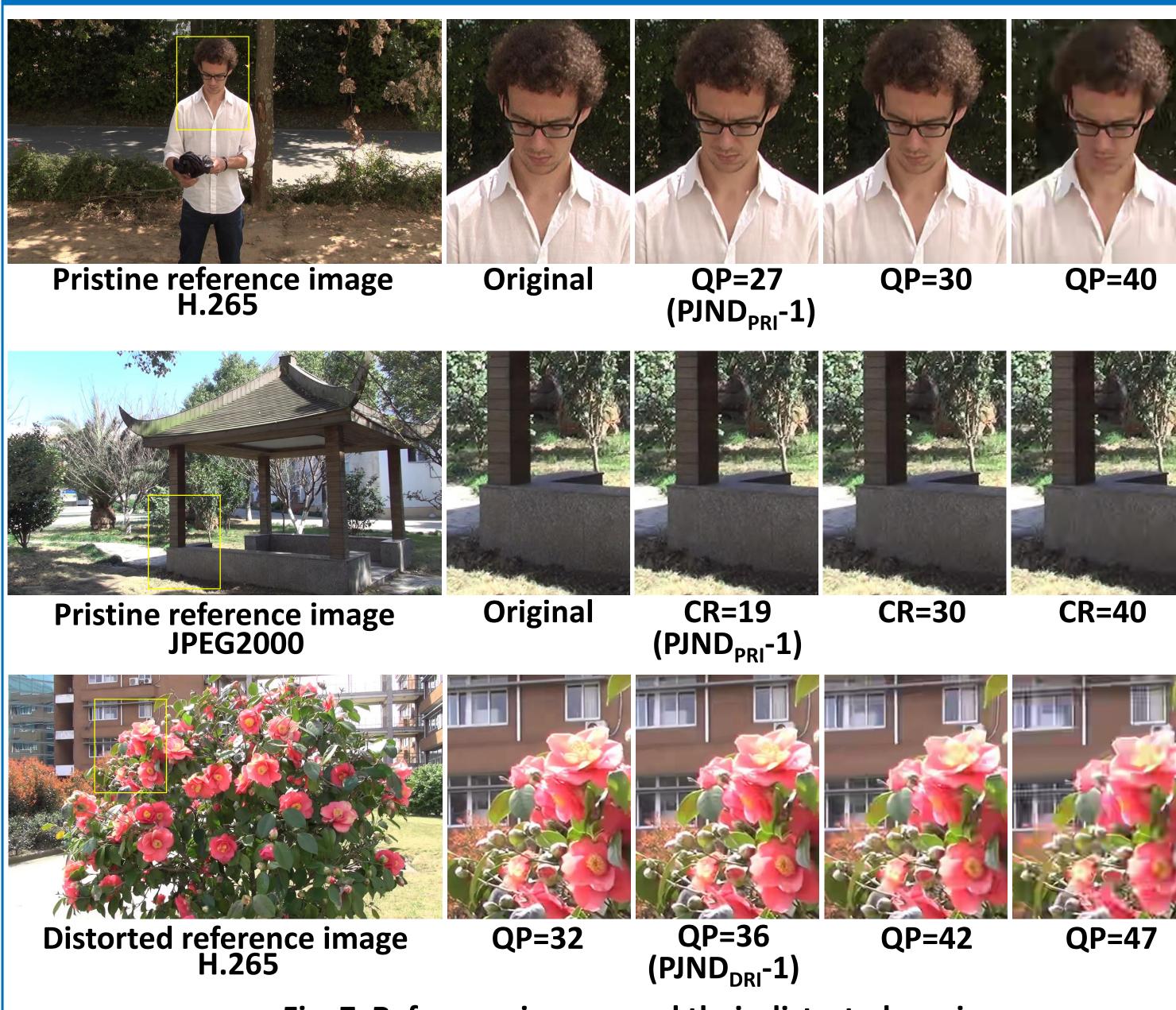


Fig. 7 Reference images and their distorted versions.

#### Conclusions

- **✓** Present subjective test to study the PJND of stereo images.
- **✓** Explore the PJND<sub>PRI</sub> and PJND<sub>DRI</sub>.
- PJND<sub>PRI</sub>: against a pristine reference image (PRI).
- PJND<sub>DRI</sub>: against a distorted reference image (DRI).
- Release PJND-based stereo image datasets, which we made available to the public for further research. Download website: http://codec.siat.ac.cn/SIAT-PJND-index.html

Our findings can be used in perception-based coding and processing.