

DENOISING OF VOLUMETRIC DEPTH CONFIDENCE FOR VIEW RENDERING

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Tree-Viewpoint Television Virtual Camera Digital Camera Depth Map Estimation depth map \$2 Stereo Matching Matching

Inconsistency of Multiview Depth Imagery

view $\sharp 2$

(a) Dancer.

view #3

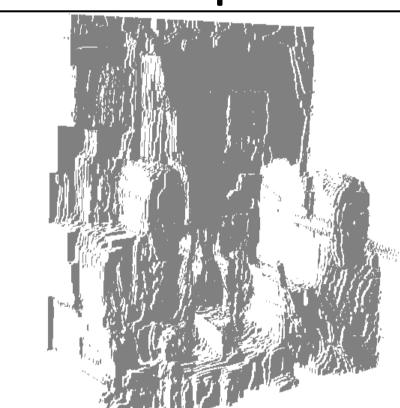
view #1

(b) Newspaper.

2 APPROACH

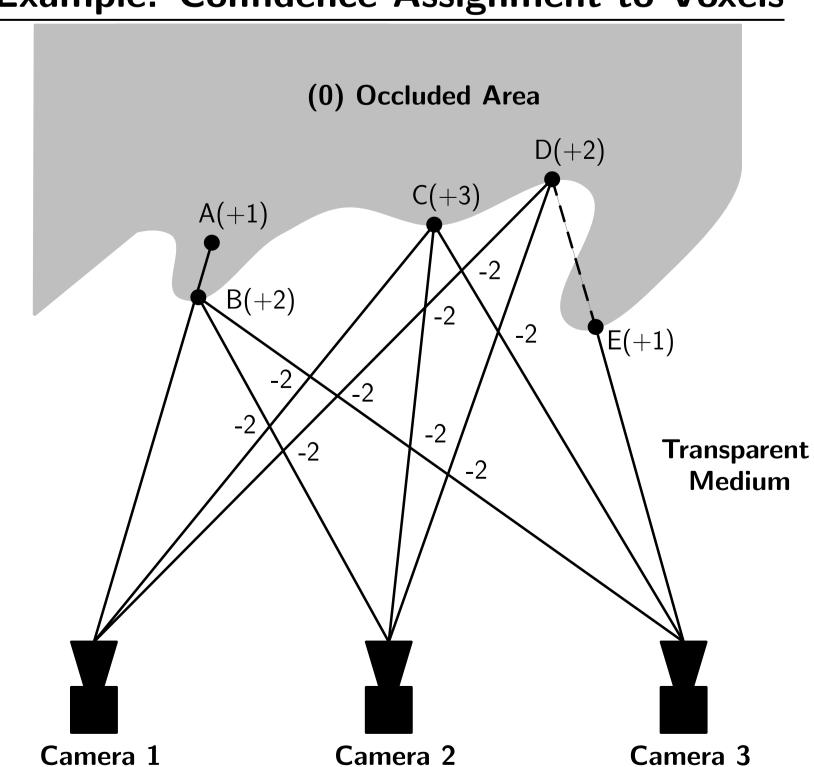
depth map $\sharp 1$ depth map $\sharp 2$ depth map $\sharp n$

Volumetric Depth Confidence



Perspective Projection

Example: Confidence Assignment to Voxels



- Each mapped depth pixel from a viewpoint contributes +1 as confidence for a voxel
- Each occluded pixel from a viewpoint does not change the confidence for a voxel
- Each ray traversing in a transparent voxel contributes -1 as confidence for a voxel

3 3D WAVELET DENOISING

Why wavelet denoising?

- It can create sparse coefficients and spreads out i.i.d. noise equally among all the coefficients
- It can distinguish between signal and noise efficiently

Wavelet Denoising Process

Noisy Volume Discrete Wavelet Volume **Transform** Decomposition (DWT) **Wavelet Coefficients** Denoising **Thresholding** Methods **Modified Coefficients** Volume Inverse **DWT** Reconstruction **Denoised Volume**

Adaptive Thresholding Using SURE Shrink

Goal: Determine thresholds that remove noise efficiently

- SURE (Stein's Unbiased Risk Estimator) is used to estimate sub-band adaptive thresholds
- For multivariate normal observations, SURE offers an unbiased estimate of the expected squared error of the mean
- Let $\{c_i: i=1,\ldots,l\}$ be the noisy wavelet coefficients in the j-th sub-band.

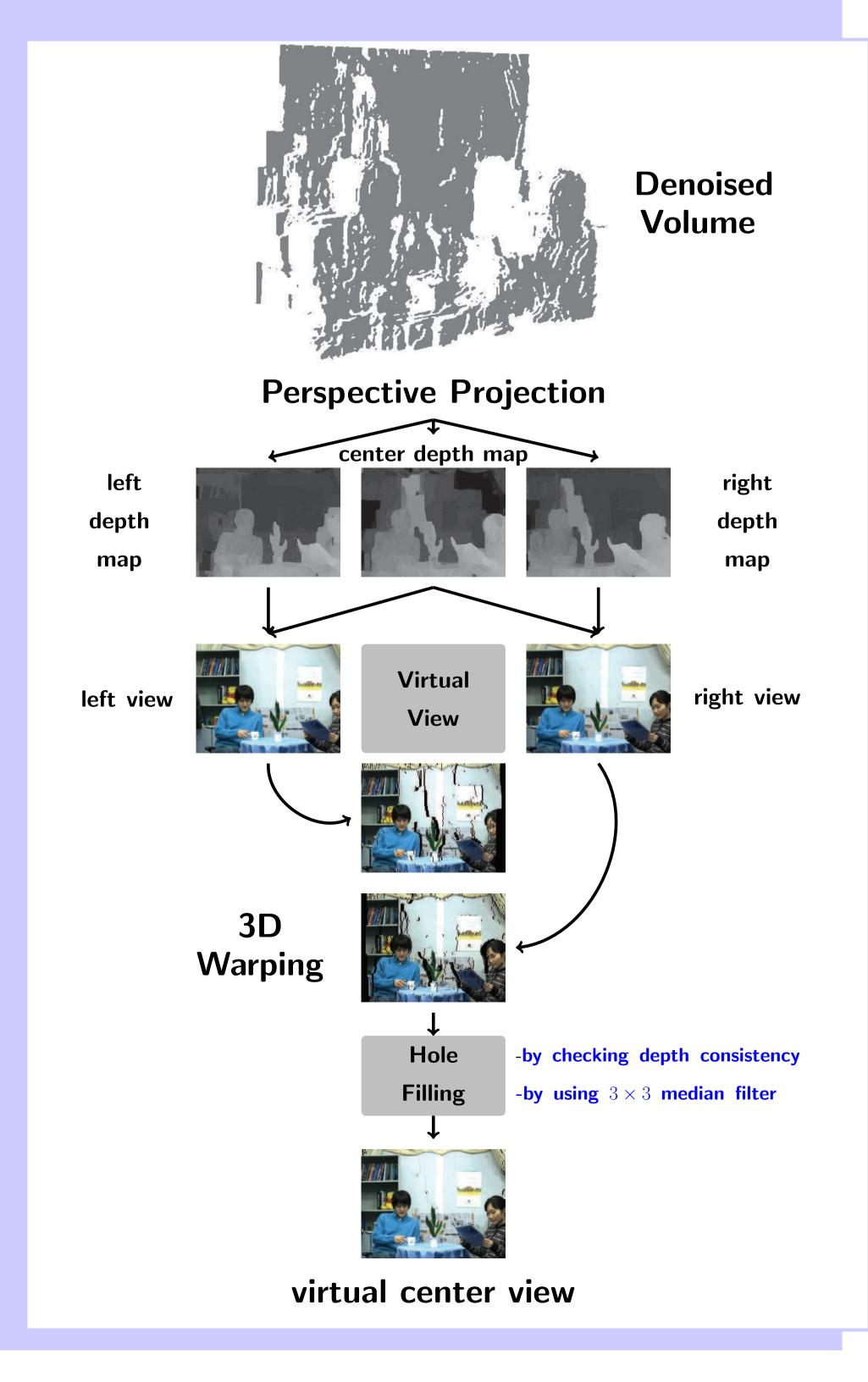
SURE $(\theta; \underline{c}) = l - 2|\{i : |c_i| < \theta\}| + \sum_{i=1}^{n} \min(|c_i|, \theta)^2,$

where θ is a given threshold and $|\cdot|$ denotes the cardinality of a set

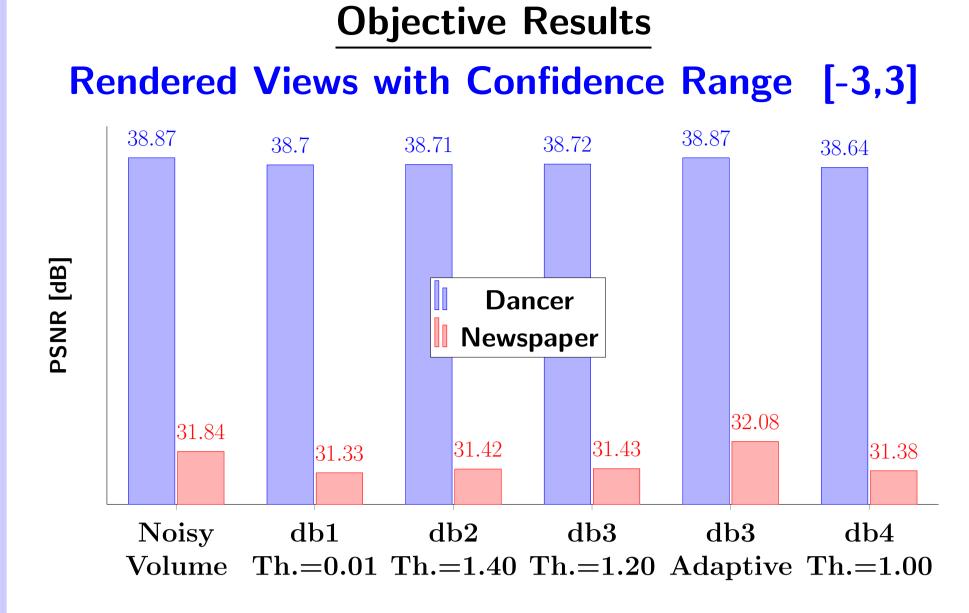
ullet Set the SURE threshold $heta^S$ by

 $\theta^S = \arg\min_{\underline{c}} \mathbf{SURE}(\theta;\underline{c})$

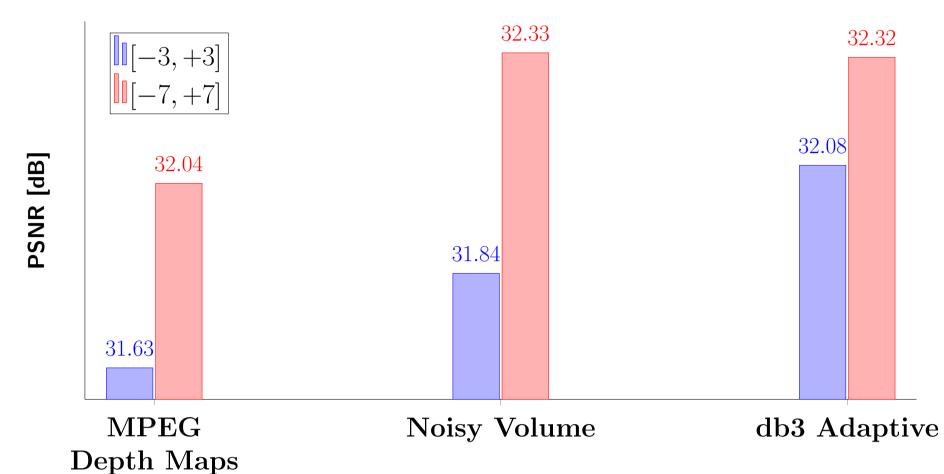
4 VIEW RENDERING



5 EXPERIMENTAL RESULTS



Effect of Confidence Range on Newspaper Rendered Views



Subjective Results

Rendered views of Newspaper with Confidence Range [-7,+7]





(a) Original view.

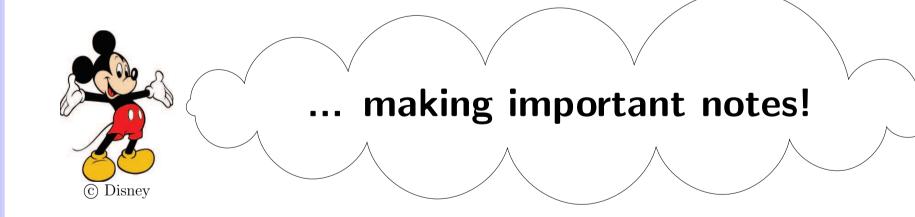
(b) With MPEG depth maps.





(c) With noisy depth volume.

(d) With denoised volume.



- Adaptive thresholding in the 3D wavelet domain improves the quality compared to rendering with MPEG depth maps and noisy volumetric data, respectively
- For synthetic scenes, the improvement is insignificant due to consistent description of the geometry
- Volumetric depth confidence improves rendering results even without wavelet denoising when projecting highest confidence voxels into the camera plane

6 CONCLUSIONS

- Define volumetric depth confidence to handle inconsistent depth estimates
- Use superposition principle to incorporate confidence information from multiple camera views
- Denoise volumetric depth confidence by using adaptive 3D wavelet thresholding
- Improve the visual quality of rendered views by using the denoised volumetric depth confidence