

# Virtual View Rendering using Super-resolution with Multiview Images

---

Bumsub Ham  
Digital Image Media Lab.  
Yonsei University, Republic of Korea

# Contents

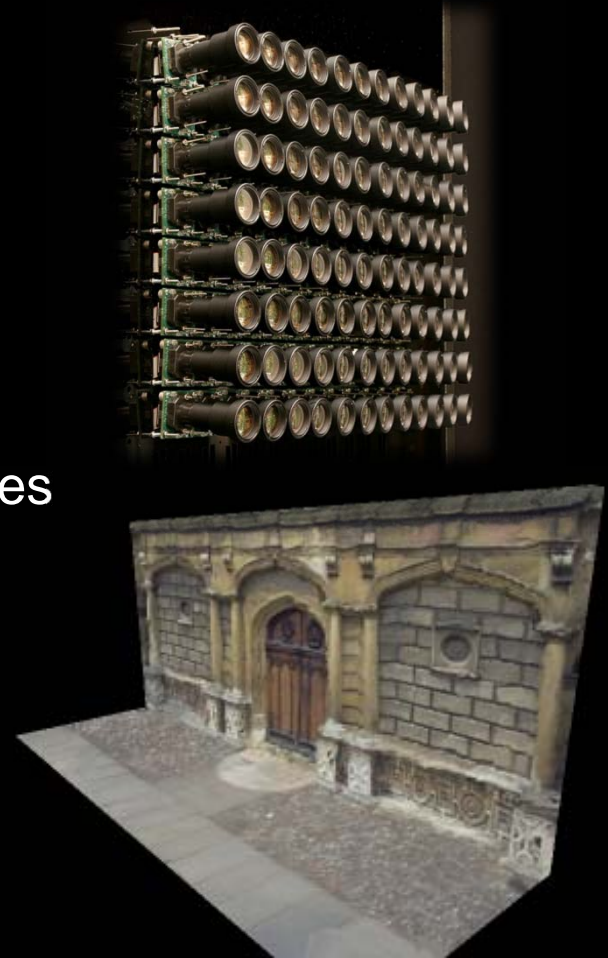
---

- Introduction
- Virtual view rendering
- Motivation and overview
- Proposed method
  - Stereo matching
  - Geometric based forward warping
  - Hole filling using backward warping
- Experimental results
- Conclusion

# Introduction

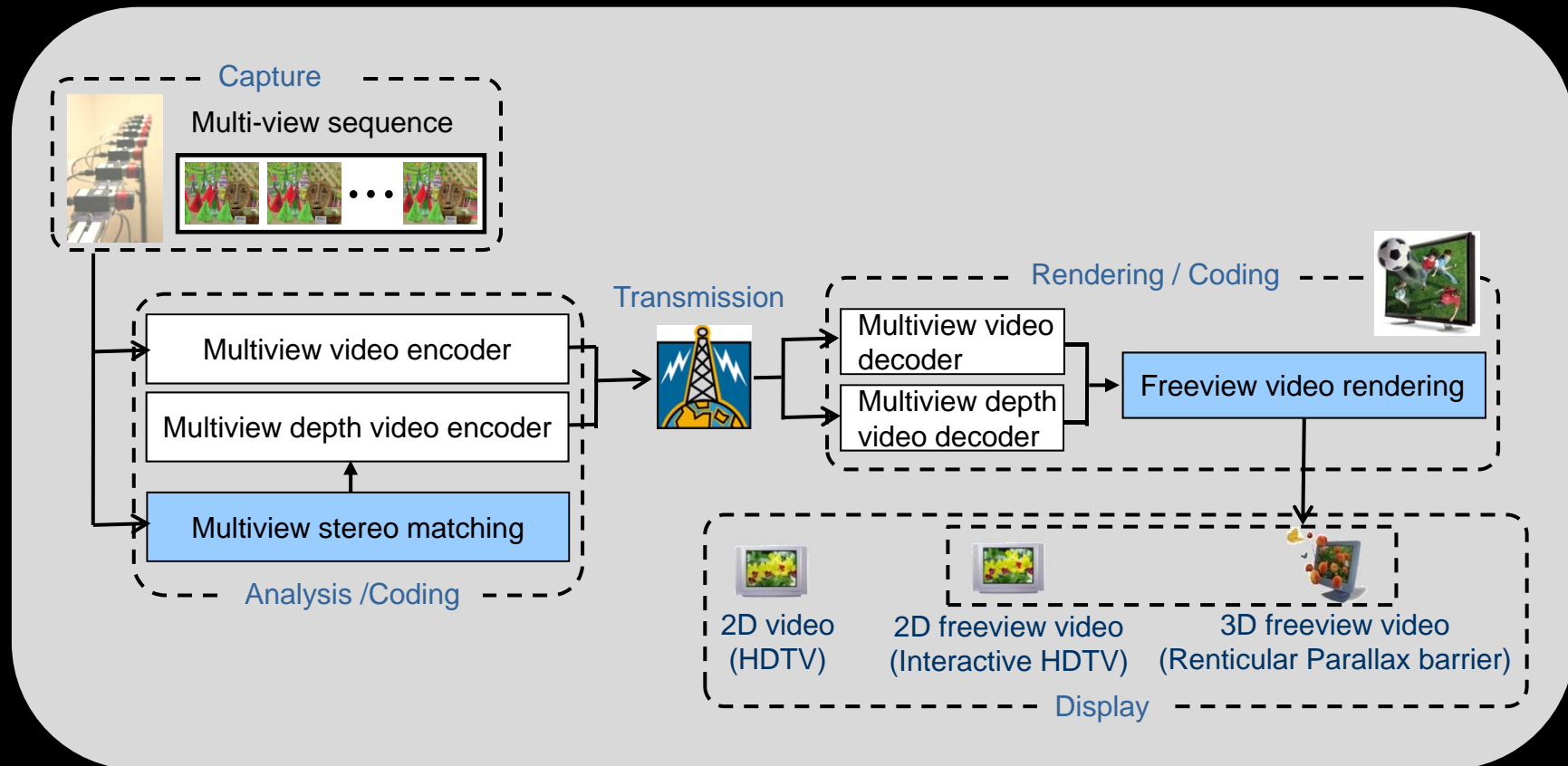
---

- Feature of 3DTV system
  - User interactivity
  - 3D depth feeling
- Components of 3DTV system
  - Ability of capturing 3D video
  - Analysis & compression of multiview images
  - Transmission of huge amount of data
  - Display 3D video

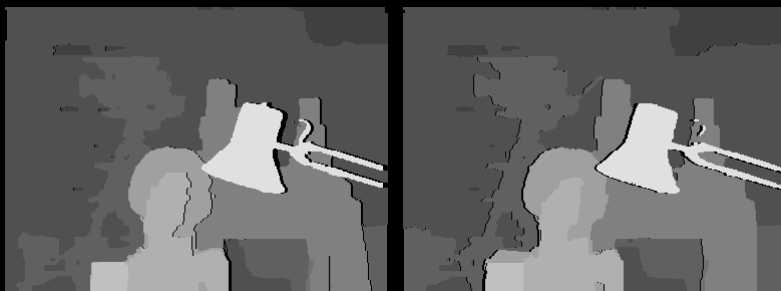


# Introduction

- An example of 3DTV system



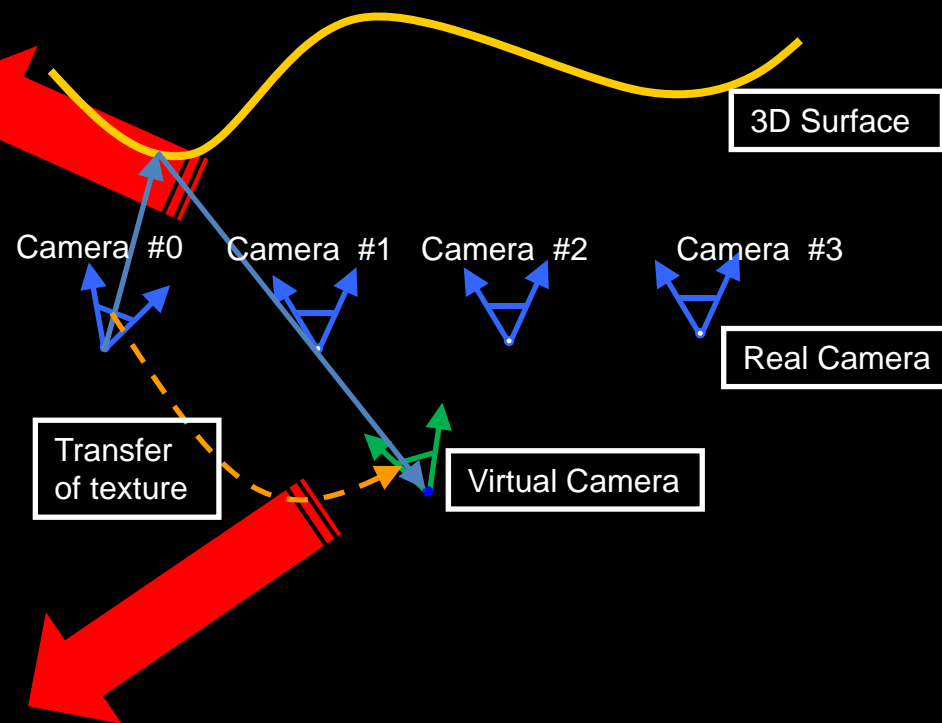
# Virtual View Rendering



$$x^v - x_c = f \frac{(x_i - x_c)B/d_i + T_x}{fB/d_i + T_z} = \frac{(x_i - x_c) + d_i \alpha_x}{1 + d_i \alpha_z / f}$$

$$y^v - y_c = f \frac{(y_i - y_c)B/d_i + T_y}{fB/d_i + T_z} = \frac{(y_i - y_c) + d_i \alpha_y}{1 + d_i \alpha_z / f}$$

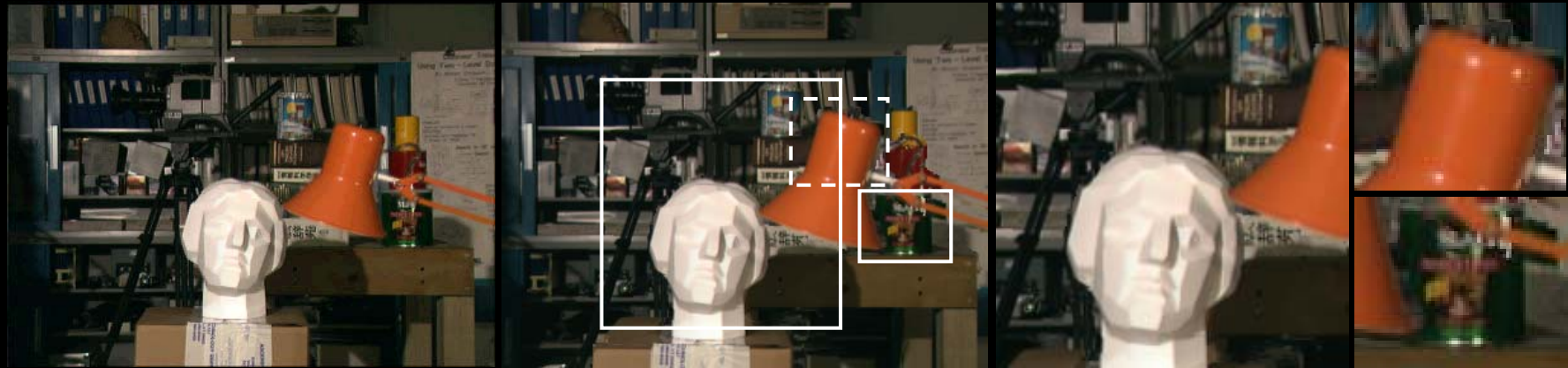
$$(T_x/B, T_y/B, T_z/B) = (\alpha_x, \alpha_y, \alpha_z)$$



$$I_v(x, y) = Vis^L(x, y)(1 - \alpha)I_v^L(x, y) + Vis^R(x, y)\alpha I_v^R(x, y)$$

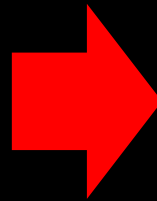
# Motivation and overview

- Motivation



## Observation

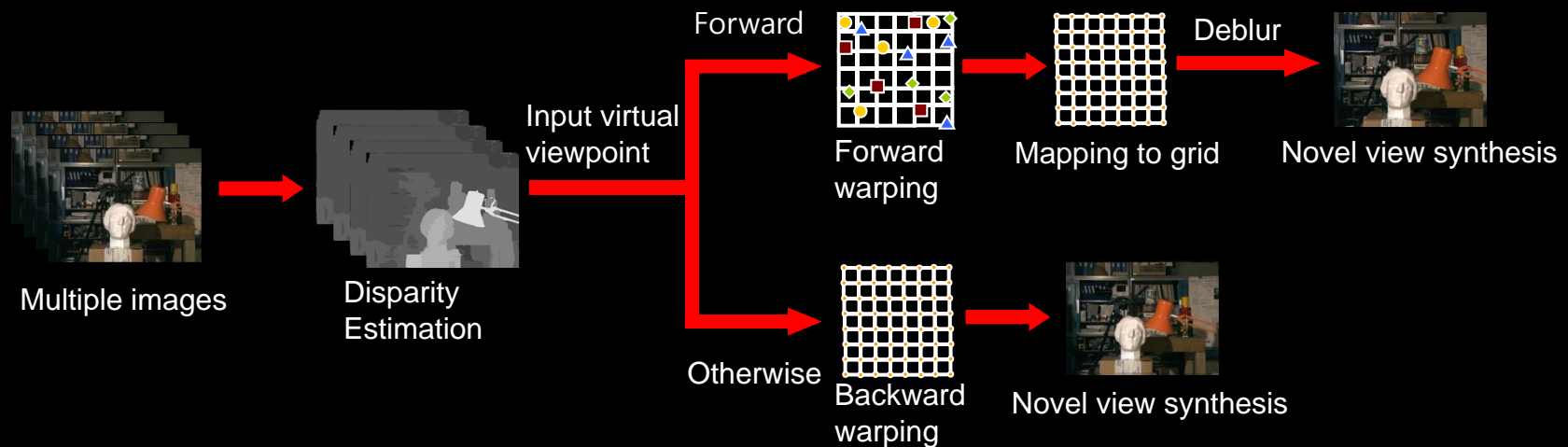
When the virtual camera moves forward, the synthesized view is **degraded**.



In **multiview configuration**, We prevent the quality of a virtual view from being degraded using **super-resolution** concept.

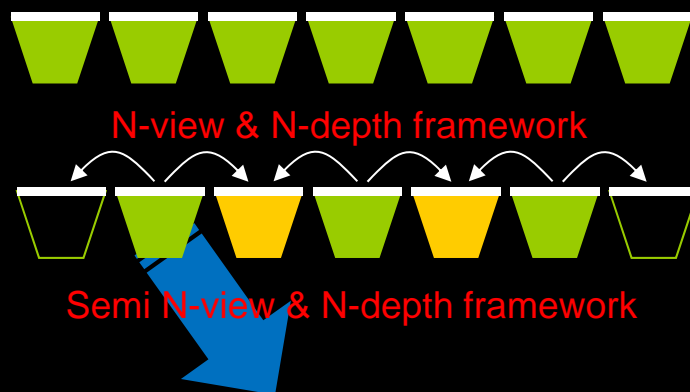
# Motivation and overview

- Overview
  - Stereo matching
  - Geometric based forward warping
  - Hole filling using backward warping
  - Deblur



# Proposed Method

- Stereo matching
  - Min's algorithm



→ Forward warping of cost function  
 ← Backward warping of cost function

■ Reference views  
 ■ Target views with symmetric warping  
 □ Semi-target views with asymmetric warping

Cost  
aggregation

$$e(p, d) = E(p, d) + n$$

$$E^{k+1}(p) = \bar{e}(p) + \bar{E}^k(p)$$

$$= \frac{e(p) + \lambda \sum_{m \in N(p)} w(p, m) E^k(m)}{1 + \lambda \sum_{m \in N(p)} w(p, m)}$$

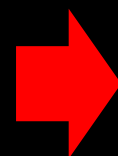
D. Min and D. Kim and K. Sohn, "2D/3D Freeview Video Generation for 3DTV System," ICIP 2008.



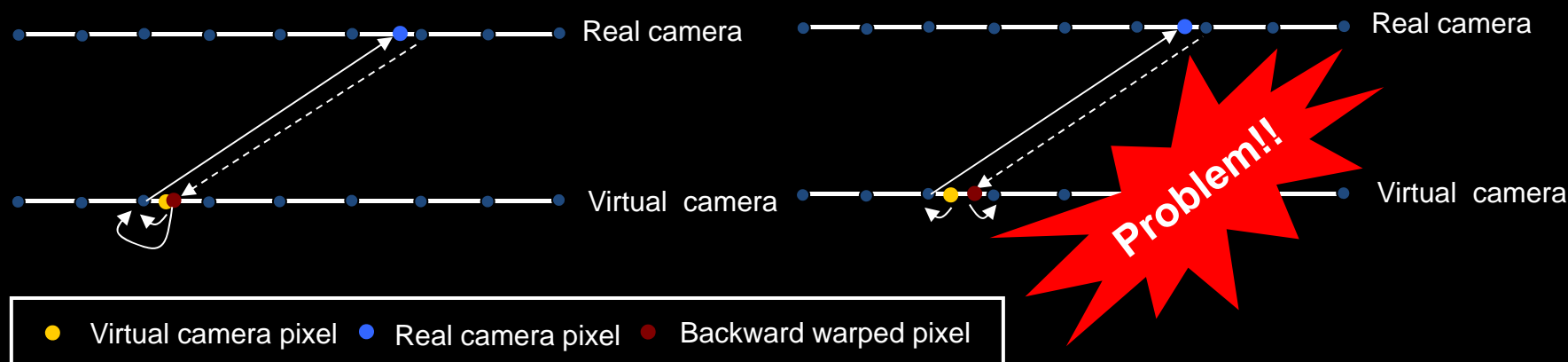
# Proposed Method

- Geometric based forward warping
  - Forward warping : Multiple matching  $\rightarrow$  hole problem
  - Backward warping

However, we do not use interpolation!

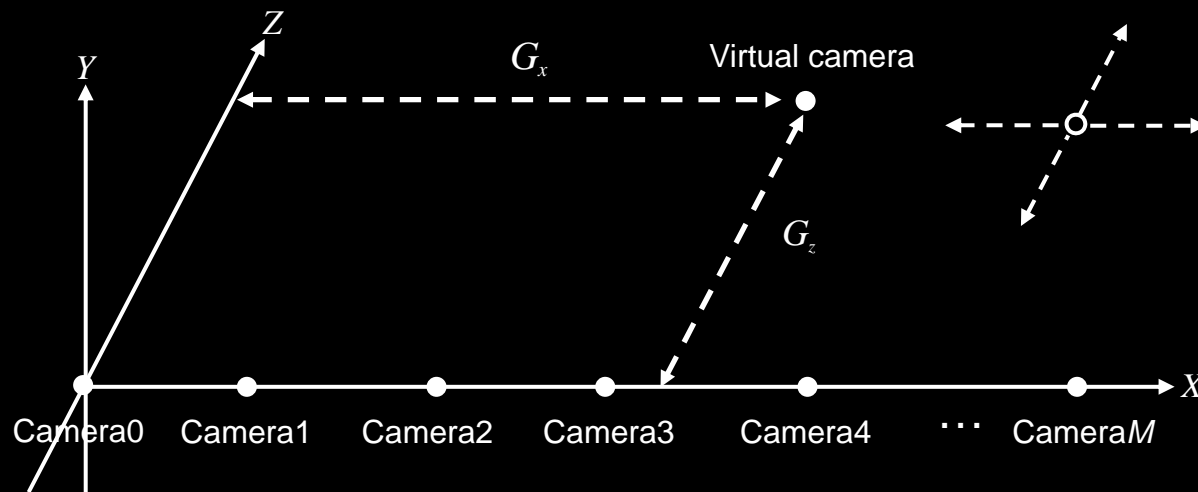


Forward is more suitable than backward warping

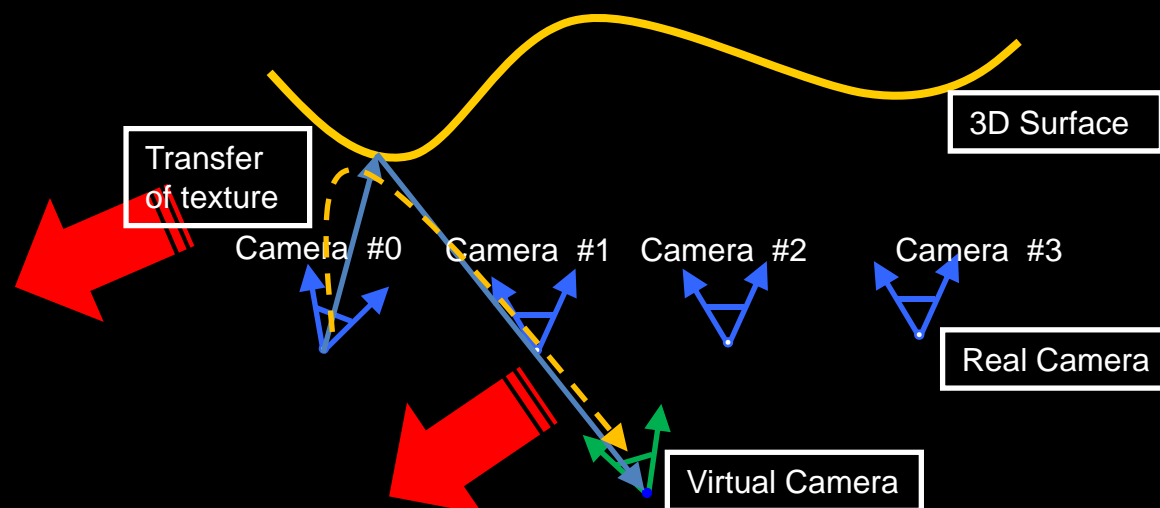


# Proposed Method

- Geometric based forward warping



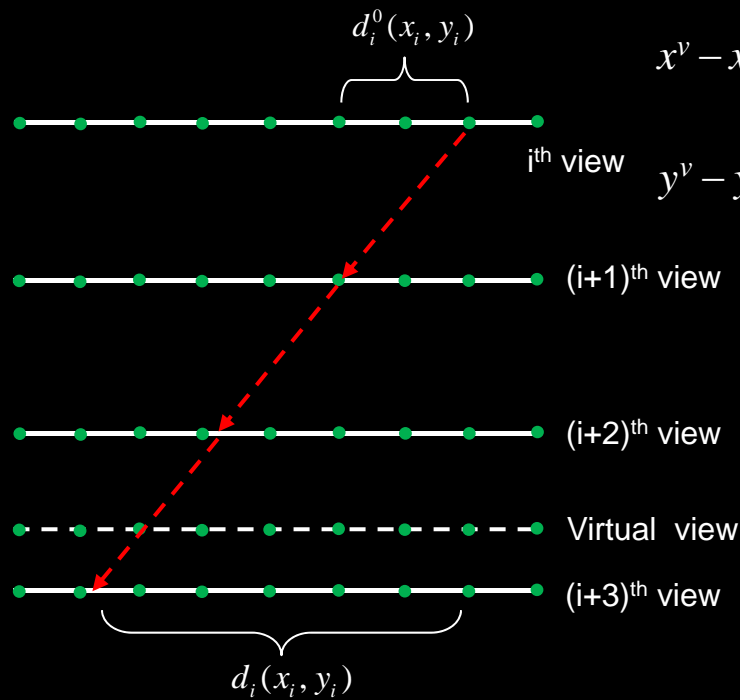
- Geometric based forward warping

$$I^v(x^v, y^v) = I_i(x_i, y_i)$$


$$\begin{aligned} x^v - x_c &= f \frac{(x_i - x_c)B_i/d_i(x_i, y_i) + T_{i,x}}{fB_i/d_i(x_i, y_i) + T_{i,z}} = \frac{(x_i - x_c) + d_i(x_i, y_i)\alpha_{i,x}}{1 + d_i(x_i, y_i)\alpha_{i,z}/f} \\ y^v - y_c &= f \frac{(y_i - y_c)B_i/d_i(x_i, y_i) + T_{i,y}}{fB_i/d_i(x_i, y_i) + T_{i,z}} = \frac{(y_i - y_c) + d_i(x_i, y_i)\alpha_{i,y}}{1 + d_i(x_i, y_i)\alpha_{i,z}/f} \end{aligned}$$

# Proposed Method

- Geometric based forward warping
  - Disparity refinement
    - Disparity influences the quality of synthesized view.



$$x^v - x_c = f \frac{(x_i - x_c)B_i / d_i(x_i, y_i) + T_{i,x}}{fB_i / d_i(x_i, y_i) + T_{i,z}} = \frac{(x_i - x_c) + d_i(x_i, y_i)\alpha_{i,x}}{1 + d_i(x_i, y_i)\alpha_{i,z} / f}$$

$$y^v - y_c = f \frac{(y_i - y_c)B_i / d_i(x_i, y_i) + T_{i,y}}{fB_i / d_i(x_i, y_i) + T_{i,z}} = \frac{(y_i - y_c) + d_i(x_i, y_i)\alpha_{i,y}}{1 + d_i(x_i, y_i)\alpha_{i,z} / f}$$

$$d_i(x_i, y_i) = \begin{cases} d_i^0(x_i, y_i) + \sum_{k=i+1}^{\lfloor G_z \rfloor} d_k(x_k, y_k) \\ x_k = x_{k-1} - d_{k-1}^0(x_{k-1}, y_{k-1}) \\ d_i^0(x_i, y_i) + \sum_{k=\lceil G_x \rceil}^{i-1} d_k(x_k, y_k) \\ x_k = x_{k+1} + d_{k+1}^0(x_{k+1}, y_{k+1}) \end{cases}$$

# Proposed Method

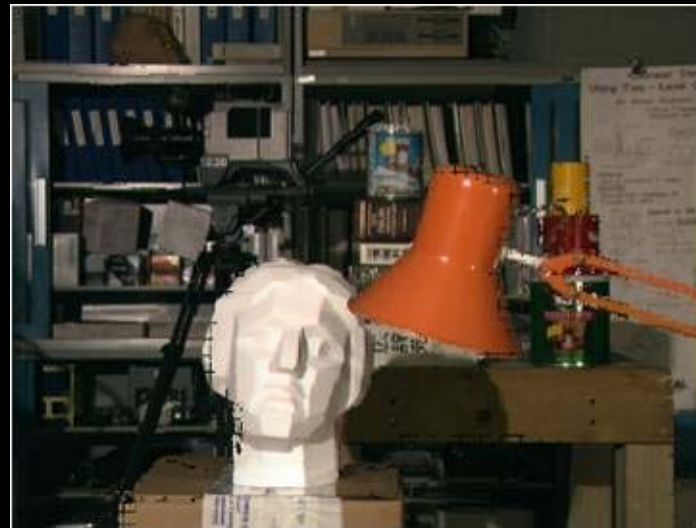
---

- Geometric based forward warping
  - Two problem
    - Background disparity penetrates the foreground regions.
    - NOT one-to-one correspondence → Hole

# Proposed Method

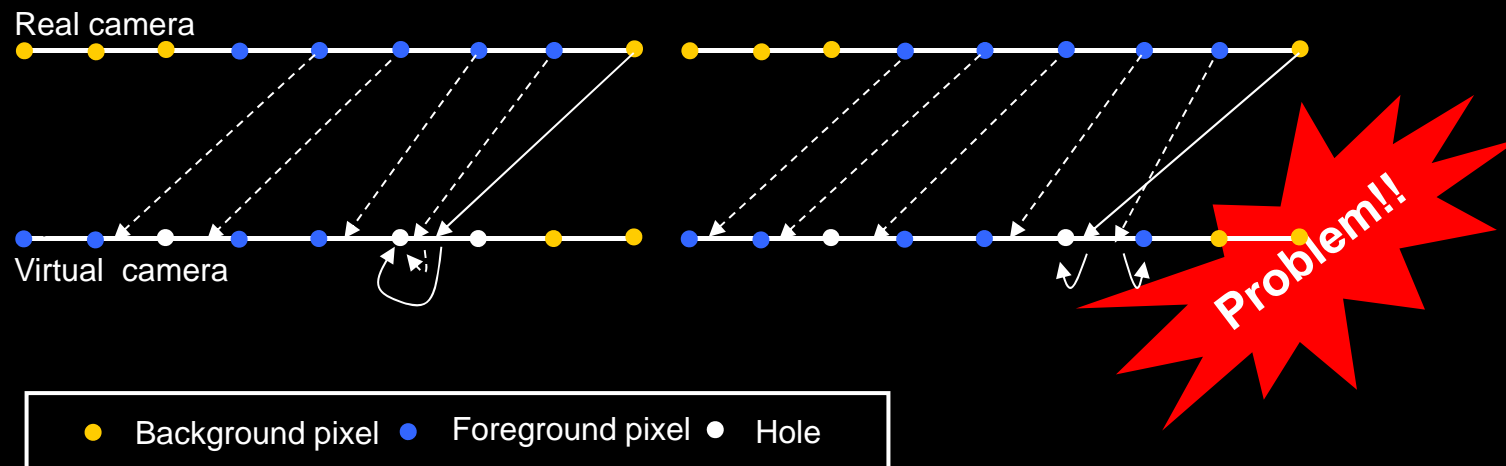
- Geometric based forward warping
  - Background disparity penetrates the foreground regions.
    - Depth ordering : pixels with largest disparity are visible.

However, this problem still occurs!



# Proposed Method

- Geometric based forward warping
  - The reason why this problem occurs.



- Similarity comparison : using neighboring disparity

# Proposed Method

- Hole filling using backward warping
  - NOT one-to-one correspondence → Hole
    - Backward warping with interpolated disparity map.
    - Geometric resampling : only used to change coordinate



Interpolated disparity map

$$x_i = (x^v - x_c)(1 - f \alpha_{i,z} Dis_i(x^v, y^v)) + x_c + \alpha_{i,x} Dis_i(x^v, y^v)$$
$$y_i = (y^v - y_c)(1 - f \alpha_{i,z} Dis_i(x^v, y^v)) + y_c + \alpha_{i,y} Dis_i(x^v, y^v)$$

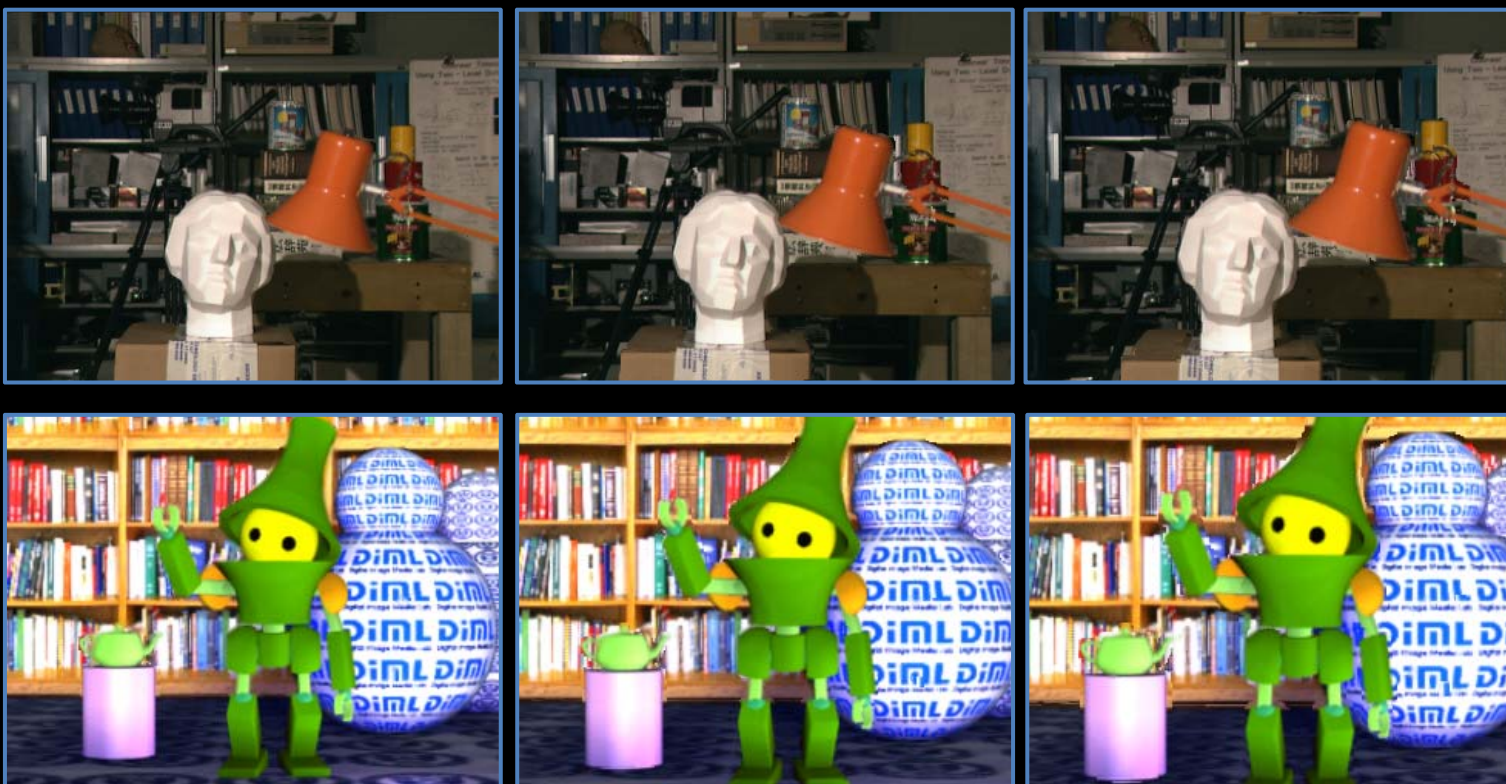
- Visibility function is needed.

$$I^v(x^v, y^v) = I_i(x_i, y_i) V_i(x^v, y^v)$$



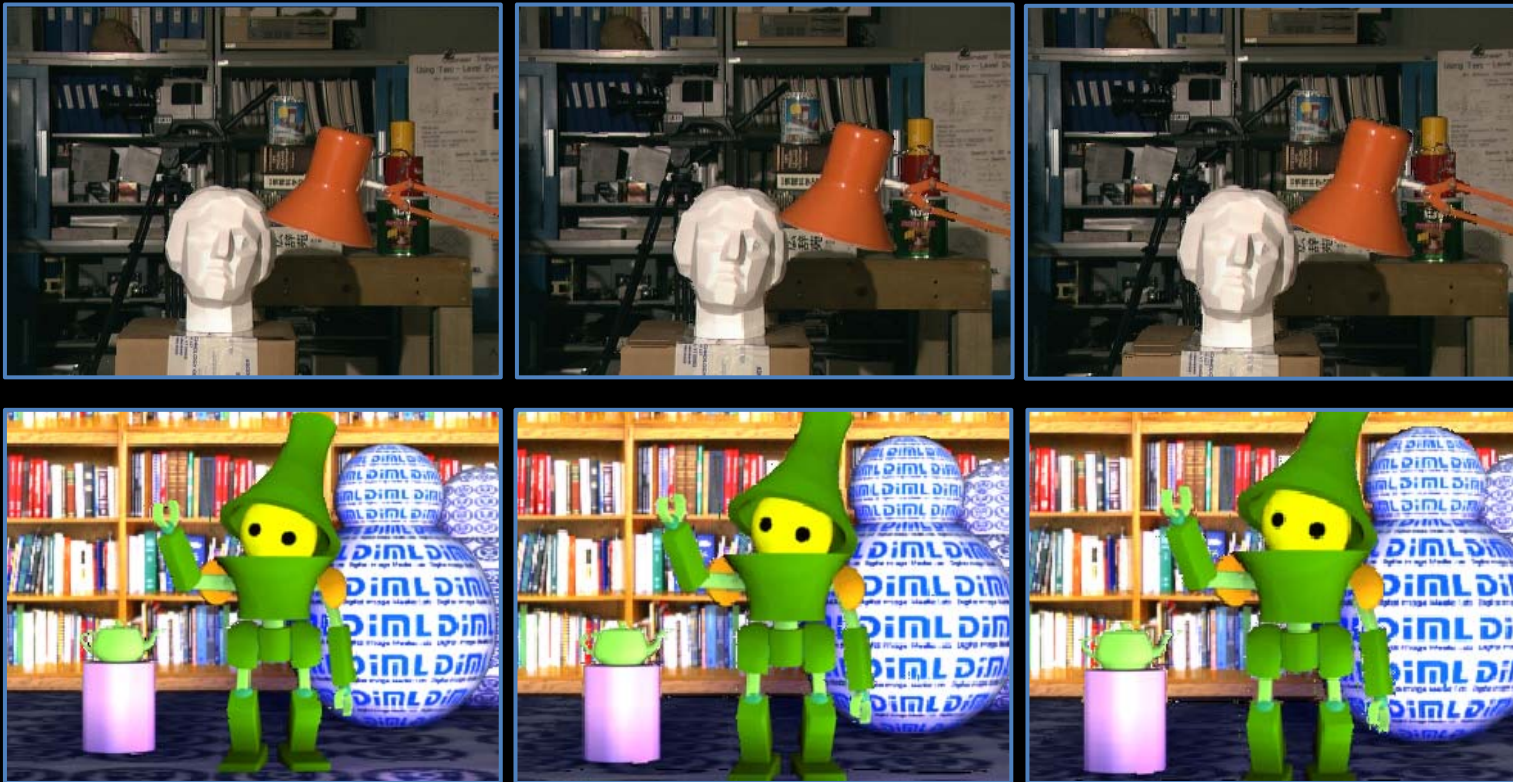
# Experimental Results : Exp1

- Conventional method
  - (from left to right) the virtual camera moves forward more.



# Experimental Results : Exp1

- Proposed method
  - (from left to right) the virtual camera moves forward more.





# Experimental Results : Exp1

- Conventional method



# Experimental Results : Exp1

- Proposed method



# Experimental results : EXP2

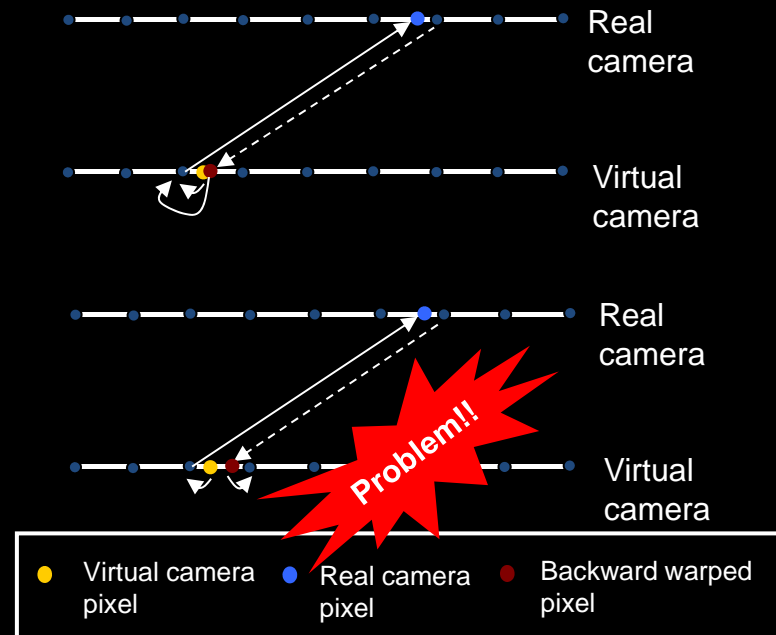
- A scene is synthesized by only applying backward warping.
- Not use interpolation



Backward warping  
based method



Proposed method



# Experimental Results

- Complexity
  - Assume it takes **N operation** when one view is warped to the virtual camera coordinate
  - Conventional method :  $11N$ 
    - Disparity warping ( $2N$ )
    - Texture mapping ( $6N$ )
    - Blending ( $3N$ )
  - Proposed method :  $12N$  (if we use 4 reference images)
  - Hole filling is ignored

Sequence	<i>Tsukuba (ms)</i>	<i>Venus (ms)</i>	<i>Teddy (ms)</i>	<i>Cone (ms)</i>	<i>Robot (ms)</i>
Conventional method	111.52	177.87	180.56	180.09	79.81
Proposed method	126.81	194.83	194.04	195.02	88.80

# Experimental Results

---

- Objective evaluation : 'Robot' sequence
  - PSNR gain is mild (0.9dB) in comparison with visual quality.
    - Enhanced regions, that is, the foreground, occupy small portion.
    - Outliers - Disparity error.

# Conclusion

---

- Summary
  - Quality enhancement scheme
    - Prevent synthesized view from being degraded when the virtual camera moves forward
    - Apply SR concept to IBR
    - Forward and backward warping are used, properly
- Further work
  - Investigate more elaborate data fusion
    - Robust to disparity error
  - Overall PSNR gain is mild
    - Explore this in order to show good results both PSNR and visual quality



# Thank You!

## Any Questions?

<http://diml.yonsei.ac.kr>

[mimo@yonsei.ac.kr](mailto:mimo@yonsei.ac.kr)

[khsohn@yonsei.ac.kr](mailto:khsohn@yonsei.ac.kr)