## **DIY Multiview Camera System:** Panoptic Studio Teardown

Capture Software, Storage, Calibration, and Multiple Kinect Subsystem

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## The Panoptic Studio Modularized Design with 20 Panels

480 VGA Cameras 31 HD Cameras 10 Kinects

#### Projector

#### HD Camera

### VGA Camera



## The Panoptic Studio





## VGA (480)

## The Panoptic Studio



## The Panoptic Studio

## VGA (480)

## HD (31)





## VGA (480)

## The Panoptic Studio

Kinect v2 (10)

## HD(31)



## Synchronized Videos from 521 Views 480 VGAs, 31HDs, and 10 RGB+Ds



## 531GB/min

## $\times 20$

x 31



## Capture Software

## Capture Software Why Is This Not Straightforward?



## Capture Software Why Is This Not Straightforward?





## Capture Software Why Is This Not Straightforward?



































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#### Master Node





#### Master Node







#### Master Node











#### Aligned start time



### Capture Software Take Home Messages



Timestamped frames allow a posteriori time alignment



### Better capture software may provide conveniences (e.g., preview)

Data/Storage



## We would prefer,

 Higher resolution • Higher frame rate More viewpoints

### Data / Storage Why Do We Need To Consider This?

## • Large size Hard to save

## In Panoptic Studio, 8.85 GB/sec = 531 GB/min

Data / Storage Options?





- Do not save images
- Real-time system



### Save compressed data

Save raw data



# Data / Storage Our Solution







![](_page_28_Picture_2.jpeg)

![](_page_28_Picture_4.jpeg)

![](_page_29_Picture_0.jpeg)

![](_page_29_Picture_1.jpeg)

#### VGA (24 cameras): **184 MB/s** × 20 640 x 480 x 1 Byte/pixel x 24 cameras x 25 frame/sec

![](_page_29_Picture_3.jpeg)

### HD: **120 MB/s** X 31 1920x1080 x 2 Byte/pixel x 30 frames/sec

![](_page_29_Picture_5.jpeg)

Kinect: **145 MB/s** × 10 1920 x 1080 x 2 Byte/pixel x 30 fps + depth 512 x 424 x 2 Byte/pixel x 30 fps (12.4 MB/s) + IR 512 x 424 x 2 Byte/pixel x 30 fps (12.4 MB/s) + body keypoints, audio

### Data / Storage How Big Is The Panoptic Studio Data?

Note: average HDD's writing speed: 80-160 MB/s

![](_page_29_Picture_11.jpeg)

![](_page_30_Picture_0.jpeg)

![](_page_30_Picture_1.jpeg)

#### VGA (24 cameras): **184 MB/s** × 20 640 x 480 x 1 Byte/pixel x 24 cameras x 25 frame/sec

![](_page_30_Picture_3.jpeg)

### HD: **120 MB/s** X 31 1920x1080 x 2 Byte/pixel x 30 frames/sec

![](_page_30_Picture_5.jpeg)

Kinect: **145 MB/s** × 10 1920 x 1080 x 2 Byte/pixel x 30 fps + depth 512 x 424 x 2 Byte/pixel x 30 fps (12.4 MB/s) + IR 512 x 424 x 2 Byte/pixel x 30 fps (12.4 MB/s) + body keypoints, audio

![](_page_30_Picture_9.jpeg)

SSD (1TB) can capture 90 minutes

![](_page_30_Picture_12.jpeg)

![](_page_30_Picture_13.jpeg)

Note: average HDD's writing speed: 80-160 MB/s

![](_page_30_Figure_15.jpeg)

![](_page_30_Picture_16.jpeg)

All Files - Not set

![](_page_31_Picture_2.jpeg)

![](_page_31_Picture_3.jpeg)

![](_page_31_Picture_5.jpeg)

4

![](_page_32_Picture_0.jpeg)

# Storage System Long-Term Storage

- NAS 12 x 8TB (Synology)
- 1 NAS: 88 TB (with RAID5) = 166 minutes
  - \$29 / min
  - $$1,700 + $260 \times 12 = $4,820 / 166 \min$
- Currently Panoptic Studio has about 1 PB data

![](_page_32_Picture_7.jpeg)

# Storage System Take Home Messages

![](_page_33_Picture_1.jpeg)

![](_page_33_Picture_2.jpeg)

### Data size vs Writing speed

![](_page_33_Picture_5.jpeg)

### Required capacity

## Capture storage Long-term storage

![](_page_33_Picture_8.jpeg)

## Camera Calibration

## Camera Calibration Why Do We Need This?

![](_page_35_Picture_1.jpeg)

### Intrinsic: **K** Extrinsic: **R** t Lens distortion: $k_1, k_2, p_1, p_2, p_3$
## Camera Calibration Space of Options









### 2D Checker Board Wand (Light, Ball) 3D Pattern Structure from Motion



## Camera Calibration A Single Camera Example





Intrinsic:  $\mathbf{K}$ Extrinsic:  $\mathbf{R} \mathbf{t}$ Lens distortion:  $k_1, k_2, p_1, p_2, p_3$ 



Caltech Camera Calibration Toolbox



## Camera Calibration A Single Camera Example



200

100

0

-100

-200

-200

Intrinsic:  $\mathbf{K}$ Extrinsic:  $\mathbf{R} \mathbf{t}$ Lens distortion:  $k_1, k_2, p_1, p_2, p_3$ 



Caltech Camera Calibration Toolbox



## A Planar Pattern To Calibrate Panoptic Studio?

### Good accuracy

### Need to cover many locations

### Scalability

Accuracy



Diversity

 Problem for sensors with different frame rates (VGA 25fps, HD 30fps, Kinects 30fps)



- - No perfect sync among different types
  - Pattern should be stationary



Our Solution For Camera Calibration How To Calibrate Panoptic Studio Cameras

## Different types of cameras

## • A large working volume

- Pattern should cover as much space as possible

### • 500+ cameras

- Fully automatic method is needed

- Avoid any image selections

## A 3D Calibration Structure using Structure from Motion (SfM)

## No pattern

## No pattern



## Panoptic Studio Camera Calibration We Use A Tent







# Panoptic Studio Camera Calibration



## Panoptic Studio Camera Calibration We Use A Tent by Projecting A Random Pattern



## Panoptic Studio Camera Calibration We Use A Tent by Projecting A Random Pattern





HD

### Kinect Color

## Calibration Pipeline Based on Structure from Motion (SfM)



Capture





## Calibration Pipeline Based on Structure from Motion (SfM)





## Calibration Pipeline Based on Structure from Motion (SfM)





## Panoptic Studio Camera Calibration Discussion





- Less accurate keypoint localization
- Scale factor is missing



5 minutes for capture
Fully automatic process



 Applicable for different types of sensors (except Kinect depth)

## Camera Calibration Take Home Messages

## **Three Basic Steps for Calibration:**

- Identify & match correspondences
- Initialization (camera matrices and 3D points)  $\neg$
- Bundle adjustment

- Keypoint localization
- Coverage of working volume
- Practicality





Miscellaneous

# Audio Capture Timestamped by HD Cameras

### Master Node



Currently 15 wireless + 3 fixed microphones



# Audio Capture Timestamped by HD Cameras



## **Lighting** We originally didn't plan for this

- Want to get brightness with a cheap solution
- Floor lights to reduce shadow issue

Important in high frame rate cameras 



# Multiview RGB-D: Kinect Subsystem

# The Panoptic Studio

-Kinect v2 (10)

## VGA (480)

# HD (31)





# The Kinect Subsystem

# Kinect v2 (10)

## Depth/Infrared



## RGB-D Sensor Input











## Sensor Placement



## Sensor Placement





~2M points

## One



# Set Signals on a Common Timebase



Time (ms)

# Set Signals on a Common Timebase



Time (ms)

## Spatio-Temporal Sampling









## Fast Motion Artifacts






#### LTC Timecode Decoding



	1.235	1.240	1.245	1.250	1.255	1.260
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SMPTE standard, many decoders exist: http://x42.github.io/libltc/



## Set Signals on a Common Timebase



Time (ms)



## **Dome Exterior**/ Dome Interior Kinect





#### LTC Timecode

## **Dome Exterior**/ Dome Interior Kinect v





Kinect for Windows Adapter

#### LTC Timecode

## **Dome Exterior Dome Interior** Capture Node Kinect







— Kinect for Windows Adapter

LTC Timecode

**Dome Exterior** 





Kinect for Windows Adapter

(LTC)

00:00

LTC Timecode

**Dome Exterior** 





- Kinect for Windows Adapter
- Ethernet
- LTC Timecode

**Dome Exterior** 





- Kinect for Windows Adapter
- Ethernet
- LTC Timecode



- Kinect for Windows Adapter
- Ethernet
- LTC Timecode

**Dome Exterior** 





#### RGB+Depth Relative Timing What Does Frame Start Mean?



Time (ms)



Time (ms)



## **Rolling Shutter Effects**



#### Color

IR



## Direction of motion

.





o Corner detection
\* No compensation
+ Compensated
+ From Depth / IR

## Direction of motion



#### Fast Motion Artifacts







## Kinect Synchronization Take Home Messages



• Off-the-shelf RGBD sensors are cheap, but you'll have to deal with synchronization & interference

Modifying hardware is very impractical: PTP as an alternative

#### Quick way to get 3D reconstruction



## Kinect Calibration



#### Color

IR

#### Depth

## .... Back To The Checkerboard









## YOU MISSED A SPOT





#### Kinect Calibration Take Home Messages

- Combining RGB+IR+Depth will require specialized calibration
- Static checkerboard to calibrate intrinsics and extrinsics between color & depth per Kinect, SfM between sensors
- Multiple RGB-D sensors may produce additional noise and interferences

## Break/Questions





#### After the break:









Thabo Beeler



Derek Bradley

## Backup Slides

#### Panoptic Studio Architecture Time Alignment Across Subsystems



Master Node

#### Panoptic Studio Architecture Time Alignment Across Subsystems



Master Node

Audacit File Edit View Transport Tracks Generate Effect Analyze Help



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