









# PA198 **Augmented Reality Interfaces**

Lecture 7 Augmented Reality Registration and Calibration

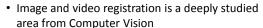
> Fotis Liarokapis liarokap@fi.muni.cz

06th November 2017

# Image and Video Registration



# Image and Video Registration

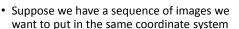


- · It is concerned with the alignment of image sequences with respect to each other
  - i.e. in a common 3D coordinate system
- Many applications ranging from ubiquitous panorama creations to sophisticated interfaces for interaction with media



 $\forall$ 

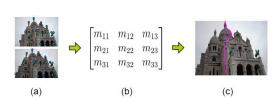
## Image Registration Common Pipeline



- First, we need to identify features in the images and find correspondences between pairs of images
- Then, we can estimate the transformation relating the image planes
- This estimation must be robust to outliers due to mismatched features
- Finally, we optimize the position of the images taking the whole set into account, for better results



# Image Registration Common Pipeline .



- (a) Feature detection and matching
- (b) Transformation estimation between two images (c) Image stitching with seam optimization (illustrative only)



# Feature Detection and Matching



- · Consider two frames of a video and the task of creating a panorama from them
- While there is much coherence in the two images, the information about how they would fit together is not explicit
- The similarity of a part of the first image with a part of the second image needs to be formalized in a way that a computer can understand it
- This lecture will focus on the detection and matching of two types of features:
  - Regions
  - Lines



### **Points and Patches**





### Points and Patches.



- · Points and patches are the most common features used when trying to find correspondences between images
  - They provide the easiest algorithms
- Two approaches can be used in point matching:
  - Finding features that can be tracked in a set of images
    - Recommended when the scene does not change much
  - Finds the most prominent features of each image and then tries to match the sets

- · Four main steps:
  - Feature detection
  - Feature description
  - Feature matching
  - Feature tracking



### **Feature Detection**







### Feature Detection.



- · Detect which parts of the image make the best features
  - To avoid ambiguities
- · The question that comes up when confronted with the task of selecting a set of features from an image is what makes a good feature?
- The most distinct patches should be selected



- (a), (c) bad features







### Feature Detection ..



- The simplest way to match two features form different images is to take the sum of squared
- Can be described as:

differences between them

$$Error(u) = \sum [I_1(x_i + u) - I_0(x_i)]^2$$

- where
  - $-I_0$  and  $I_1$  are the images being compared
  - u is a displacement vector



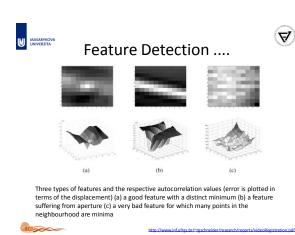
### Feature Detection ...



• Next, evaluate how different a patch is from the patches around it using an autocorrelation function

 $AutoCorrelation(u) = \sum [I_0(x_i + u) - I_0(x_i)]^2$ 

 Note that the displacement vector u here would represent how the second patch is displaced from the original one





### Feature Detection .....



· We can approximate the function by using the first terms of a Taylor Series expansion to generate an autocorrelation matrix that will then be used to define how distinctable a feature is

After simplifications:

$$AutoCorrelation(u) = \sum [I_0(x_i + u) - I_0(x_i)]^2$$

$$\approx \sum [I_0(x_i) + \nabla I_0(x_i)u - I_0(x_i)]^2$$

$$= \sum |\nabla I_0(x_i)u|^2$$

$$= \sum n^T Au$$



## Feature Detection ......



### Feature Detection ......



• The matrix A is called the autocorrelation matrix and its properties can be used to decide whether a feature is distinct or not

$$A = \begin{bmatrix} I_{xx} & I_{xy} \\ I_{yx} & I_{yy} \end{bmatrix}$$

• How the properties of the autocorrelation matrix are used to determine whether a feature should be used or not depends on the type of detection



we do



· Some examples: - Shi and Tomasi

- Förstner-Harris
- Adaptive non-maximal suppression
- SIFT











# Shi-Tomasi Example 1





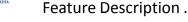
# Shi-Tomasi Example 2





# **Feature Description**







- Once we have decided which parts of the image would generate good features, we need to match them
- A simple approach would be minimizing the sum of squared differences
- · Unfortunately, this would only work if the transformation applied to the patch was a simple translation
- · In most cases, the patch will undergo arbitrary affine transformations that will require more sophisticated methods for comparison
  - See next slide

- MOPS (Multi-Scale Oriented Patches )
  - Used in applications that do not require invariance for transformations
  - It consists of sampling a lower frequency version of the image around the feature
  - Patch intensities are re-scaled such that their mean is zero and the variance is 1
- GLOH (Gradient Location-Orientation Histogram)
  - Extension of SIFT that uses polar bins instead of square
  - Divides the space into 3 radial bins and 6 angular bins with one additional bin for radius = 0



### Feature Description ..







### Feature Matching



- SIFT (Scale-invariant feature transform )
- Descriptors are formed by computing the gradient in a 16x16 window around the pixel
  - The contribution of each gradient is weighted by a Gaussian centered at the pixel
  - The 16x16 window is divided into sixteen 4x4 regions, and represents the gradient in these regions by adding them to 8 bins
  - The 128 resulting values (the values in each of the 8 bins, in each of the 16 regions, 16x8 = 128) are the SIFT descriptor



### · There are two important steps when matching features

- Define a matching strategy
- Combine data structures and algorithms to efficiently perform the matching evaluations



## Feature Matching.



- A simple approach is to immediately reject matches that are further away from each other than a threshold value (using Euclidean distance)
  - In this case, we must of course observe that the threshold is consistent with our expected camera motion, to avoid false positives and false negatives
  - The problem with this strategy is that the threshold depends on each case and is difficult to optimize







- A different approach is to use nearest neighbors in feature space
  - Since some features would not have matches, a threshold approach is still used to avoid extreme false positives

4



### **Feature Tracking**





# Feature Tracking.

· To solve this problem, features are matched in

affine motion model

different images along the sequence using an



- · An alternative approach to detecting candidate features in each image and then matching them is to find features in the first image and track them throughout the image sequence
- · This approach is most commonly used in videos
  - Because the scene is not expected to change much from one frame to the next
  - The definition of a good feature to track is the same as before
- · If features are being tracked in long image sequences, it is important to consider the problem of big changes in the patches, as well as the loss of patches by occlusion
- Since affine matching is more expensive than translational, a first estimation is performed
- using simpler models The resulting tracker is called Kanade-Lucas-

- Instead of a simple translational one

Tomasi, or KLT



### KLT AR Example







# **AR Registration**

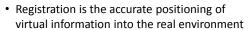


### AR Registration









- · Mis-registration:
  - Breaks the illusion that the two coexist
  - Prevents acceptance of many serious applications







## Video Key Method



- · Video Keying is a process that is widely used in television, film production and CG. (weather report)
- · When using video keying to design AR scenes, one signal contains the foreground image and the other one contains the background image
- The 'keyer' combines the two signal to produce a combined video which is then sent to the display device



## Video Key Method.





### Video Key Method ..



- · Keying can be done using composite or component video signals
  - A composite video signal contains information about color, luminance, and synchronization, thus combining three piece of information into one signal
  - With component video, luminance synchronization are combined, but chroma information is delivered separately
- · Chroma keying involves specifying a desired foreground key color
- Foreground areas containing the keying color are then electronically replaced with the background image
- · This results in the background image being replaced with the fore ground image in areas where the background image contains chroma color
- · Blue is typically used for chroma keying (Chromakey blue) rarely shows up in human skin tones



## Video Key Method ...









- · If a video image of the real world is chosen as the foreground image, parts of the scene that should show the computer-generated world are rendered blue
- In contrast, if video of the real world is chosen as the background image, the computer generated environment will be located in the foreground







# **Z-key Method**

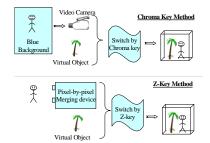


- The z-key method requires images with both depth information (depth map) as inputs
- The z-key switch compares depth information of two images for each pixel, and connects output to the image which is the nearer one to the camera
- The result of this is that real and virtual objects can occlude each other correctly
- This kind of merging is impossible by the chroma-key method, even if it is accompanied with some other positioning devices such as magnetic or acoustic sensor, since these devices provide only a gross measurement of position



# Chroma Key vs Z-Key







# **Spatial Registration**



MANAGERYCON Sources of Registration Errors



Defining Relative Position of Each Elements of a Scene



- · Elements are: User, User's eye, Environment (Table, Room, Building), Objects, etc.
- Coordinate Systems (Euclidian System)
- Initially: Calibration
- Temporally: 3D/6D Tracking



- · Static errors
  - Optical distortions
  - Mechanical misalignments
  - Tracker errors
  - Incorrect viewing parameters
- · Dynamic errors
  - System delays (largest source of error)
    - 1 ms delay = 1/3 mm registration error



Billinghurst, M. COSC 426: Augmented Reality, July 26th 2013.



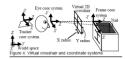
## **Reducing Static Errors**



- · Distortion compensation
- Manual adjustments
- · View-based or direct measurements
- · Camera calibration



# View Based Calibration (Azuma 94)

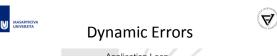


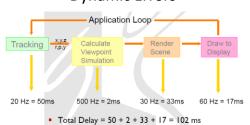




Billinghurst, M. COSC 426: Augmented Reality, July 26th 2013.







■ I ms delay = 1/3 mm = 33mm error

Billinghurst, M. COSC 426: Augmented Reality, July 26th 2013.

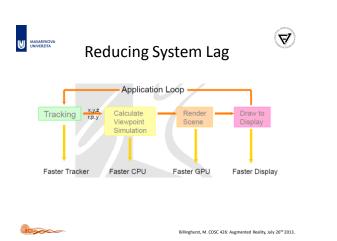


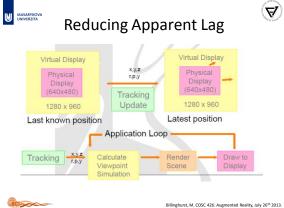
# **Reducing Dynamic Errors**



- · Reduce system lag
  - Faster components/system modules
- · Reduce apparent lag
  - Image deflection
  - Image warping

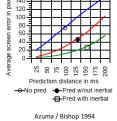
Billinghurst, M. COSC 426: Augmented Reality, July 26th 2013.



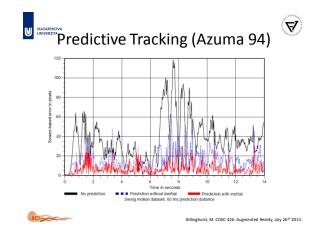


# More on Reducing Dynamic Errors · Match input streams - Delay video of real world

- to match system lag
- Predictive Tracking
  - Inertial sensors helpful



rst. M. COSC 426: Augmented Reality, July 26th 2013.









# **Calibration Requirements**



- "Ideally, the calibration methods should be statistically robust, there should be a variety of approaches for different circumstances, and metrology equipment should be sufficiently accurate, convenient to use, and not too expensive"
  - (Hollerbach and Wampler, 1996)

# **AR Calibration**



# Additional Calibration Requirements



# Typical Calibration Components



- Additional Requirements of Experimental Subsystems:
  - Independent
    - · Not rely on each other
  - Subject-specific
    - · Account for individual differences
  - Avoid residual cues
    - · To prevent subjects using them in unanticipated ways

- Workspace
- · Point of view
- Physical objects



# **Workspace Calibration**



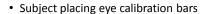


# Point of View Calibration



- Markers are aligned with virtual crosses
- Exactly one position in 3space eliminates "swim"
- · do NOT need stereo to calibrate









# Physical Object Calibration



- · Markers placed anywhere on object
- · Place object in frame so XYZ orientations match



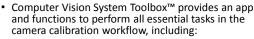


# Measuring ARToolKit's Tracking Error



- · In wide area applications, the positioning accuracy of ARToolKit is not very robust
- In distances between 1m and 2.5m the error in the x and y values increases proportionally with the distance from the marker
- · Calculate error in distances ranging between 20 cm and 80 cm under normal lighting conditions

# Camera Calibration with MATLAB



- Fully automatic detection and location of checkerboard calibration pattern including corner detection with subpixel accuracy
- Estimation of all intrinsic and extrinsic parameters including axis skew
- Calculation of radial and tangential lens distortion coefficients
- Correction of optical distortion
- Support for single camera and stereo calibration



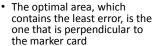
# Camera Calibrator App



· Used to select and filter calibration images, choose the number and type of radial distortion coefficients, view reprojection errors, visualize extrinsic parameters, and export camera calibration parameters



# Measuring ARToolKit's Tracking Error.



· A rigid path is set so that the camera can not loose its direction while moving backwards

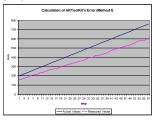
· Numerous measurements of the location of the web camera in a local co-ordinate

system



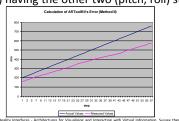
# Measuring ARToolKit's Tracking Error.

· Error is proportional to the distance



# Measuring ARToolKit's Tracking Error ...

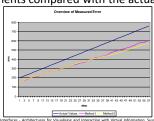
· Camera facing the marker at variable angle (yaw) having the other two (pitch, roll) stable



## Manager Stracking ARToolKit's Tracking Error



• Differences in the error produced from the experiments compared with the actual values











- · ARToolKit provides two software tools called calib\_dist and calib\_param that can be used to calculate these camera properties
  - calib\_dist is used to measure the lens distortion and the image centre point
  - calib\_param is used to compute the focal length of the camera

# ARToolKit's Calibration Method

Calculating Camera

**Parameters** 

 In calib\_dist program, an image of a pattern 6x4 dots spaced equally apart is used

Camera calibration for lens distortion

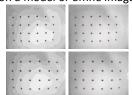
Camera calibration for focal length



## **KLT Tracking Method**

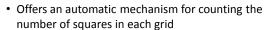


· A feature-based vision method is known as the KLT (Kanade-Lucas-Tomasi) algorithm based on a model or affine image changes





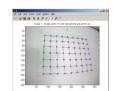
# Camera Calibration Toolbox for Matlab

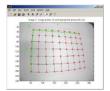


· All calibration images are searched and focal and distortion factor are automatically estimated

	Estimated focal (pixels)	Estimated distortion factor (kc)
Image 1	201.2503	-0.2
Image 2	224.1415	-0.2
Image 3	231.7859	-0.2
Image 4	114.2254	-0.055
Image 5	265.8596	-0.28
Image 6	211.5925	-0.2

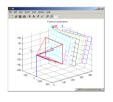
# Calibration Without Lens Distortion

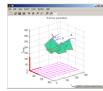


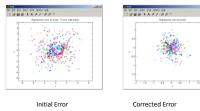




# M MError Calculation of Extrinsic Camera **Parameters**















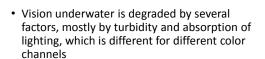
# **Underwater** Dehazing



### **Underwater Vision**





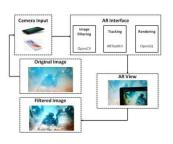


- Concerning the turbidity in the underwater images, the problem is very similar to dehazing
  - i.e. to correct the effects of fog and haze in images taken above water



# AR Dehazing Architecture







# Implementation



- In the first step, the input image from tablet camera is filtered and improved to reduce defects and other imperfections caused by turbidity or poor lighting conditions
- This pre-processed image serves in the second step as an input for detection of objects in real world for augmented reality
- In the third step, objects of augmented reality are composed together with improved pre-processed input image and rendered into output image
- This image is then displayed on the screen of the tablet

Brono, F., Lapstif, A., Ritacco, G., Apralletts, P., Serlattos, D., Cojia, J., Kouffl, P., Lisonbagh, F., Philpin-Brisco, Q., Poullis, C., Mudur, S., Simon, B. Development and integration of digital technologies addressed to inser awareness and access to furgoness underwater cultural heritage. An overview of the HQDD1-MARECULTURE project, OCEANS 2017, IEEE Computer Society, Aberdeen, Scotland, 19-22 June 2017.



### Implementation.



- This prototype was implemented in Java and is focused for Android platforms
- The input from the camera feed is in NV21 format. NV21 is a variant of the YUV420 format
- The image is kept in this format, and in the pre-processing step, Contrast Limited Adaptive Histogram Equalization (CLAHE) (Pizer et al, 1987) is applied to its Y channel
- This process leaves the U and V channels unchanged
- The implementation of the CLAHE algorithm was based on the OpenCV library (OpenCV)
- The augmented reality part is handled by ARToolKit library (ARToolKit)

Bruno, F., Lagudi, A., Ritazco, G., Agraffotis, P., Sanfatos, D., Cejlaa, J., Koulil, P., Larokajos, F., Philipin-Britone, O., Poullis, C., Mudur, S., Simon, B. Development and integration of digital technologies addressed to raise awareness and access to Curpose underwater cultural heritage. An overview of the H2020-MARECULTURE project, OCEANS 2017, IEEE Computer Society, Aberdeen, Scotland, 19-22 June 2017.



### Results



Bruno, F., Lagudi, A., Ritacco, G., Agrafiotis, P., Skarlatos, D., Čejka, J., Kouřil, P., Liarokapis, F., Philpin-Briscoe, O., Poullis, C., Mudur, S., Simon, B. Development and integration of digital technologies addressed to raise awareness and sceness to European underwater cultural heritage. An overview of the H2020 HAMEQUIE Project, CEARS 2017, IEEE Computer Society, Aberdeen, Scotland, 19-22 June 2017.



### Results.



- The AR application was tested on several videos taken in underwater environment
- The videos were played on a monitor of a PC, and a tablet was used to record, process and display the images
- The resolution of input camera was 1280 x 720
- We performed our tests on two devices, NVIDIA Shield K1 tablet and Samsung Galaxy S6 phone
- The pre-processing step took 7.8 milliseconds on the tablet and 9.0 milliseconds on the phone, which in both cases allowed the application to present improved images in real-time (Bruno et al., 2017)

Brunn, F., Lageds, A., Bitacca, G., Agrafichis, P., Saledaro, D., Cylla, J., Korill, P., Lienkajes, F., Philpin-Briscon, O., Poullis, C., Mudor, S., Simon, B. Development and integration of light introducing saddress for to true awareness sad access to European undervolter cultural heritage. An overview of the H2D20-IMARECULTURE project, OCEANS 2017, IEEE Computer Society, Aberdeen, Scotland, 19-22 June 2017.



## Dehazing for Marker-based Tracking



 $\forall$ 





 Testing scenarios for evaluation of impact of methods for dehazing images to marker-based tracking



D6.3. iMARECULTURE Underwater AR Platform. Public Document. Oct 2017

# Tracking

Underwater





### **Data Collection**

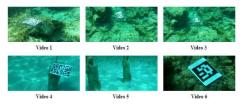




# **Implementation**



· Obtained a set of videos from underwater sites in Cyprus at 10m depth



D6.2, iMARECULTURE hybrid tracking techniques, Public Document, Oct 2017

· For improving images, we used CLAHE, [87CLAHE], which is a simple and fast method that runs real-time, and a method based on a fusion of results of several algorithms described in [12Enhancing] (further referenced as Fusion)

· Implementation of another method based on bright channel prior described in [16Restoration] (further referenced as BCP) is in development

D6.2, iMARECULTURE hybrid tracking techniques, Public Document, Oct 2017



### Implementation.





### Results



- For marker detection, we used three real-time open source libraries
  - ARToolKit [ARToolKit] is one of the best known open source library, which can be used to detect markers with generic patterns
  - ARUco [ARUco] is a library based on OpenCV and its functions, and is used to robustly detect markers with binary matrix codes
  - AprilTags [AprilTags] is a library developed at the University of Michigan, and is focused on robust detection of markers in different lighting conditions and angles of view

D6.2, iMARECULTURE hybrid tracking techniques, Public Document, Oct 2017



4/3/42 CLAHE 6/150/



algorithms (ARToolKit, ARUco, AprilTags) and image enhancing methods (CLAHE, Fusion) The result of each measurement The result of each measurement are three numbers
The first number is the number of markers detected in the original video, but not in the enhanced video

video
The second number is the number of markers detected in the enhanced video, but not in the original video
The third number is the number of The third number is the number of markers detected in both videos In the rightmost column, we can see the time needed to detect markers in the whole video

D6.2, iMARECULTURE hybrid tracking techniques, Public Document, Oct 2017



### Results.





### Results ..



- · The results show us that in some videos tracking is improved by enhancing the image, while in other videos, tracking is worsen by enhancing the image
- This differs with different marker detectors and different image enhancement methods
- · However, in most videos, most non-damaged markers were found in the original and processed images, significant differences were in damaged and occluded markers
- For this reason, such markers must be discarded

- · We can also see that processing times of individual marker detectors
- Videos were processed on a desktop computer with Intel Core i5 760 processor and 8 GB operating
- We can clearly see that ARToolKit finds the markers in the lowest amount of time, while AprilTags needs the
- · We assume the results to be comparable when running on mobile devices, although the processing times presented in the table is measured on a desktop computer

D6.2. iMARECULTURE hybrid tracking techniques. Public Document. Oct 2017

D6.2, iMARECULTURE hybrid tracking techniques, Public Document, Oct 2017







### AR Interface



# Underwater Registration

 We designed the first interface for an application that recorded input video in original quality without performing any lossy compression, performed a simple image enhancing, calibrated the camera, and detected markers







## 1<sup>st</sup> Prototype





### Implementation





\_ .....,pc

- This design allowed setting of various parameters from the user interface
  - i.e. It allowed to set which color channel is enhanced, the parameters of image enhancing algorithm, turning marker detection on and off etc
- The interface also included a button which hid the interface when everything was set, and shown it again when parameters needed to be changed







### Implementation.





### **Testing**



- All parameters are saved into a text file onto the internal disk and reloaded when the application is started next time
- Several parameters (for example a path where the recorded videos are saved) cannot be set from the application though; they can be set only in this text file
- · This allowed us to simplify the GUI

- This user interface was tested in April 2017 by CUT in Cyprus
- This testing showed that it is very hard to manipulate the application with this interface, due to very small buttons
- Also, we found that most of the parameters of this application were set once and did not need to be changed when the application run.

D63. IMARECULTURE Underwater AR Platform. Public Document. Oct 2017



## 2<sup>nd</sup> Prototype







 Results from the tests of the first application helped us with the design of the next applications

- · The main changes are:
  - We create many specialized applications rather than one application containing every feature to reduce the complexity of the user interface.
  - We use only a very few buttons places through the whole screen to ease the manipulation with the interface in underwater conditions.
  - We place parameters of the application into a text file, leaving only a few parameters to be changed directly in the application

· This application improves the image presented to the user, tracks markers, and displays virtual objects



D6.3, iMARECULTURE Underwater AR Platform, Public Document, Oct 2017

D6.3, iMARECULTURE Underwater AR Platform, Public Document, Oct 2017



### **Implementation**







# Implementation.



- · The user interface contains only two buttons, which allows the user to turn on/off dehazing (an algorithm for enhancing the input image), and to turn on/off tracking of markers
- The buttons span the whole left and right part of the screen, though their visual representation is smaller
- This makes the manipulation with the interface much easier
- The user interface also hides itself automatically after a few seconds of user's inactivity, reappearing again when the user touches the screen
- All other parameters (parameters of the image improving algorithm, parameters of tracking and others) can be set only from a text file that contains application parameters





- The application is capable of rendering 3D objects and text descriptions at places of these markers
- Currently it demonstrates the capabilities of the application
- In future, it will be used to augment the vision of the user by adding virtual aids into the scene, show artefacts similar to those seen on the screen, or show the appearance of the objects in the past
- It will also be used to provide the user with a description of seen objects or places

D6.3, iMARECULTURE Underwater AR Platform, Public Document, Oct 2017



### Results





AR presentation underwater
(a) the underwater environment

D6.3, iMARECULTURE Underwater AR Platform, Public Document, Oct 2017

textual augmentation textual description and 3D information



### Results.



- · A second application for recording video and storing its raw data without using and lossy compression is created
  - This application does not do any image enhancements and does not track markers





### Results ..





# Questions



- This interface contains two indicators
  - One indicator is place in the top part of the screen, and represents the state of the recording
  - The other indicator is in the bottom part of the screen, and informs the user about the speed of recording
- Additionally, the whole screen behaves as a single button, controlling the state of recording
- The interface is always visible; it cannot be hidden in any way
  - Similarly to the previous interface, all other parameters are set from a text file



D6.3, IMARECULTURE Underwater AR Platform, Public Document, Oct 2017