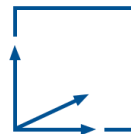


Module IN 2018

# Introduction to Augmented Reality

Prof. Gudrun Klinker  
with contributions from M. Huber, D. Pustka



**Display Calibration**  
**SS 2018**

# Literature

- “Single-point active alignment method (SPAAM) for optical see-through HMD calibration for augmented reality”, M. Tuceryan, Y. Genc and N. Navab. Presence: Teleoperators and Virtual Environments, Vol. 11, Issue 3, pp. 259-276, June 2002.
- “Display-Relative Calibration for Optical See-Through Head-Mounted Displays”, C. Owen, J. Zhou, A. Tang and F. Xiao, in Proceedings of the IEEE and ACM International Symposium on Mixed and Augmented Reality (ISMAR), 2004
- “Practical Solutions for Calibration of Optical See-Through Devices”, Y. Genc, M. Tuceryan and N. Navab, in Proceedings of the IEEE International Symposium on Mixed and Augmented Reality (ISMAR), 2002
- “Real time Versatile Robotics Hand/Eye Calibration using 3D Machine Vision”, R. Tsai and R. Lenz, in IEEE International Conference on Robotics and Automation, 1988



# Agenda

- 1. Introduction
- 2. Video see-through calibration
- 3. Optical see-through calibration
- 4. Summary

# Reminder

Many kinds of display devices for AR

- Portable displays
  - PDAs, Smartphones
  - Laptops, Tablets
- Projectors
- etc.

Today: only head mounted displays (HMDs)

- Video see-through
- Optical see-through

# Motivation



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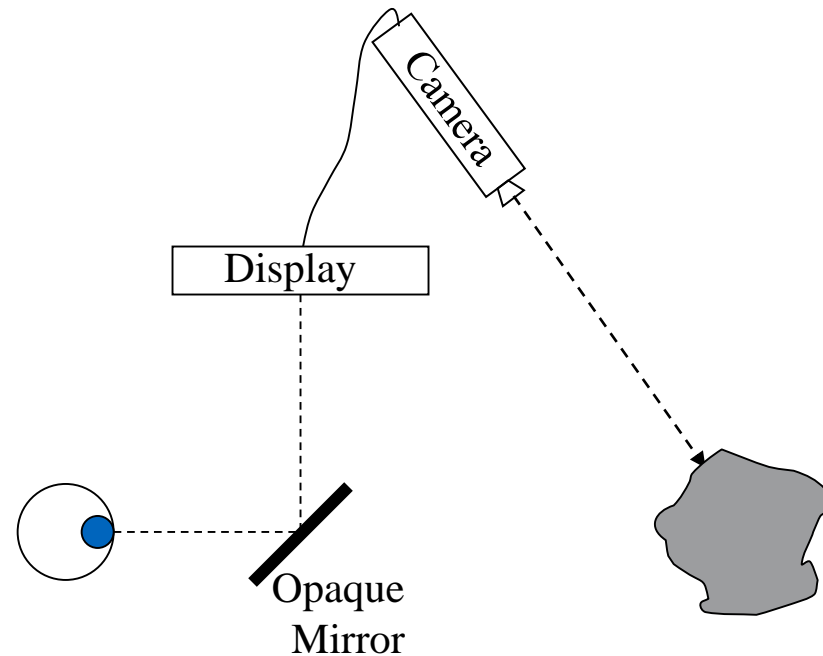




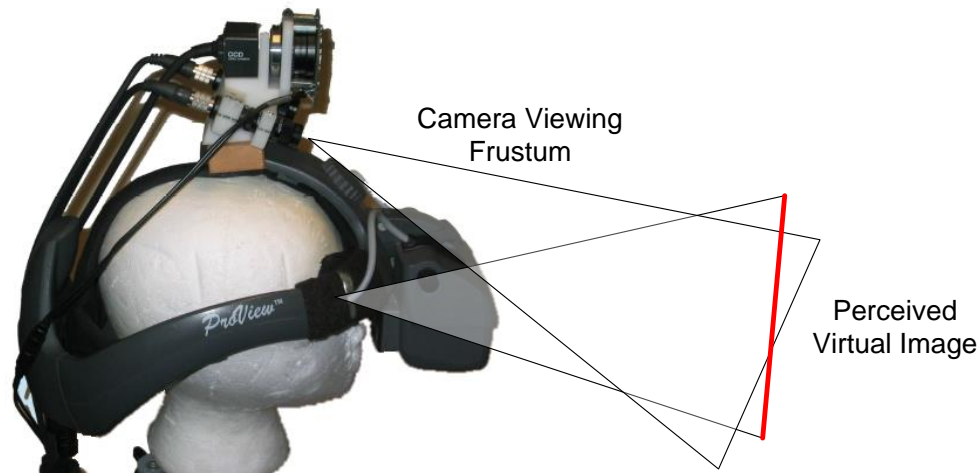
# Agenda

1. Introduction
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# Reminder: Video See-Through HMD



# Video See-Through: Model



- Problem: Perceived viewpoint is always the same as the camera
  - Try to move camera as closely as possible to eyes
  - Choose camera with approx. same viewing angle as display



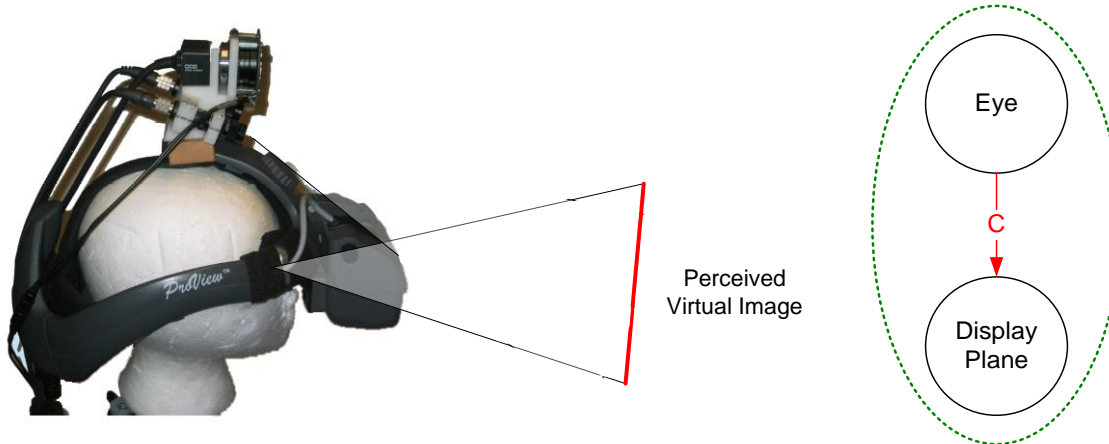


## 2. Video See-Through Calibration

- 2.1 Using inside-out tracking
- 2.2 Using outside-in tracking

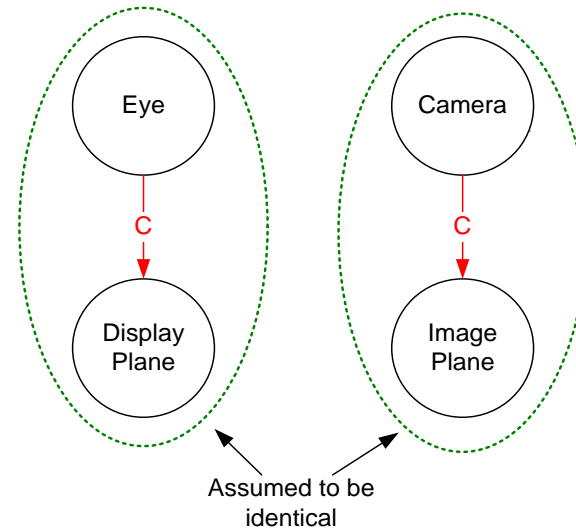
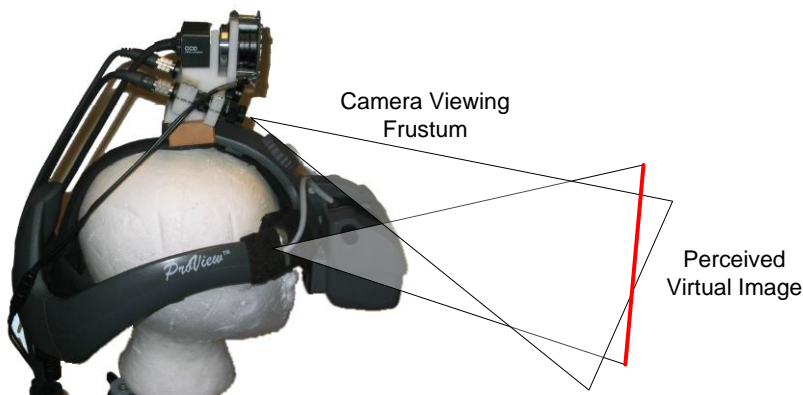
# Based on Video Image

- What projection matrix to load into OpenGL?
- Needed: HMD intrinsics (FOV, etc.) + extrinsics (eye position and orientation)



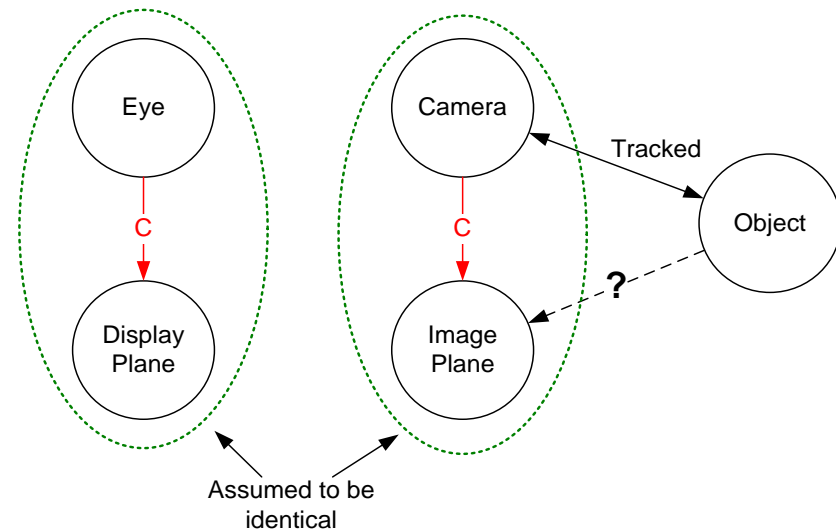
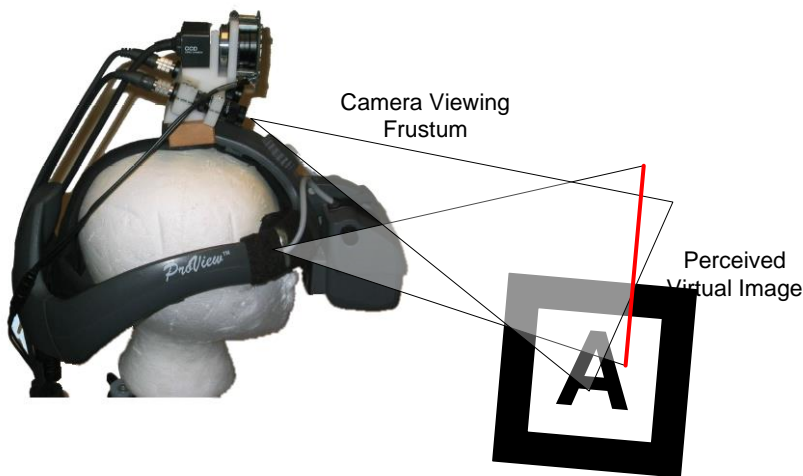
# Based on Video Image

- What projection matrix to load into OpenGL?
- Needed: HMD intrinsics (FOV, etc.) + extrinsics (eye position and orientation)



# Based on Video Image

- What projection matrix to load into OpenGL?
- Needed: HMD intrinsics (FOV, etc.) + extrinsics (eye position and orientation)



- Normal camera calibration (e.g. Tsai, Zhang)
- Unwarp radial distortion before displaying!!



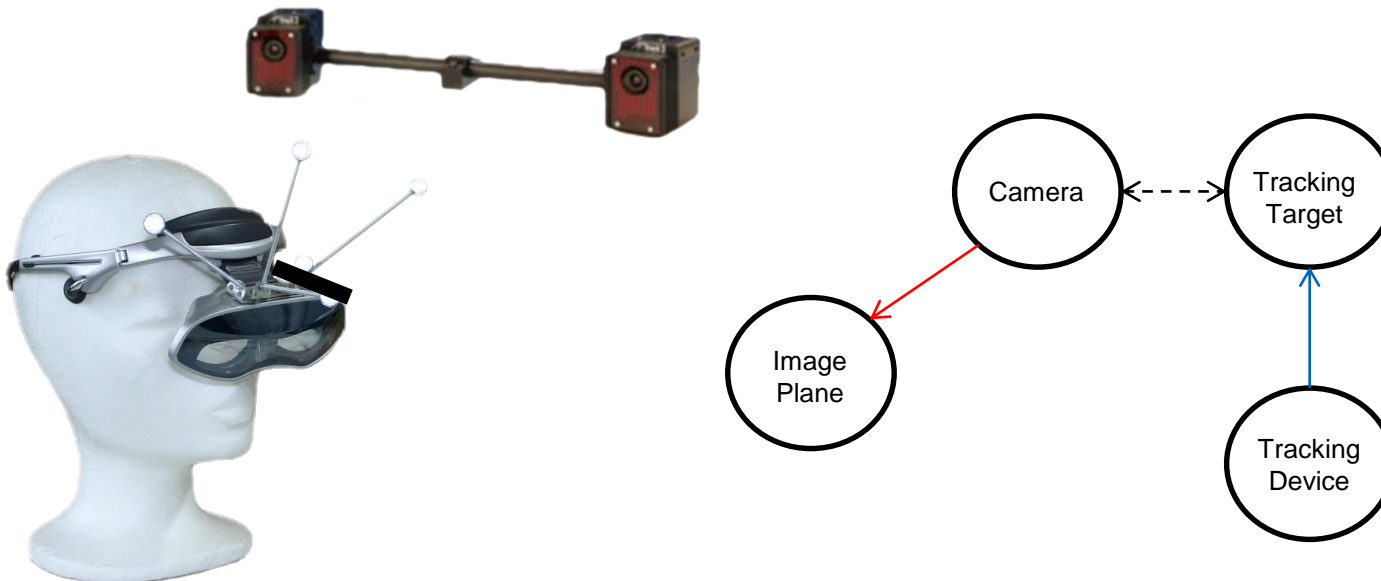
## 2. Video See-Through Calibration

2.1 Using inside-out tracking

→ 2.2 Using outside-in tracking

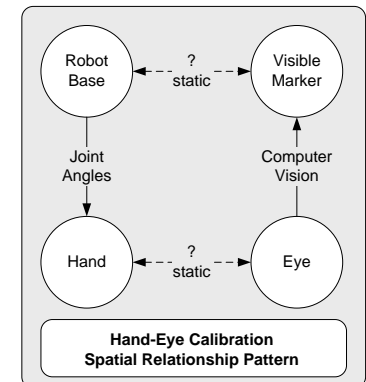
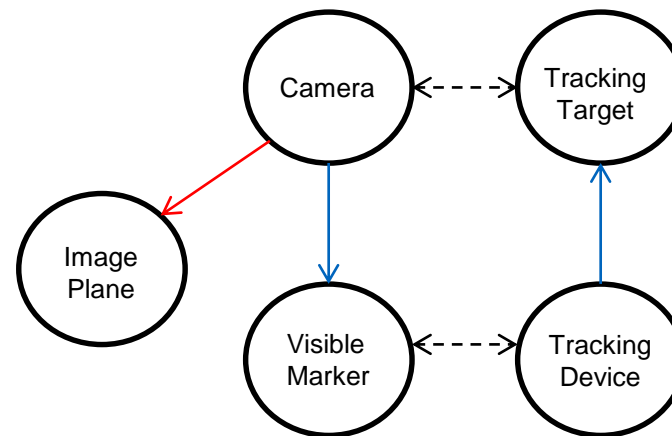
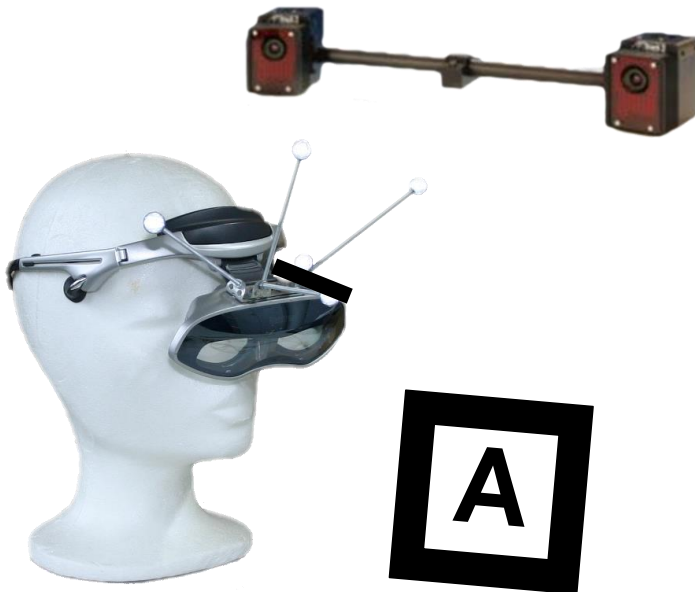
# Based on Hand-Eye Calibration

- Problem: no direct link between camera and tracker coordinate systems



# Based on Hand-Eye Calibration

- Idea: use video camera for tracking – but only during calibration
- Using Hand-Eye calibration, the video camera does not need to track the same object as the tracker
  - but transformations must not change!



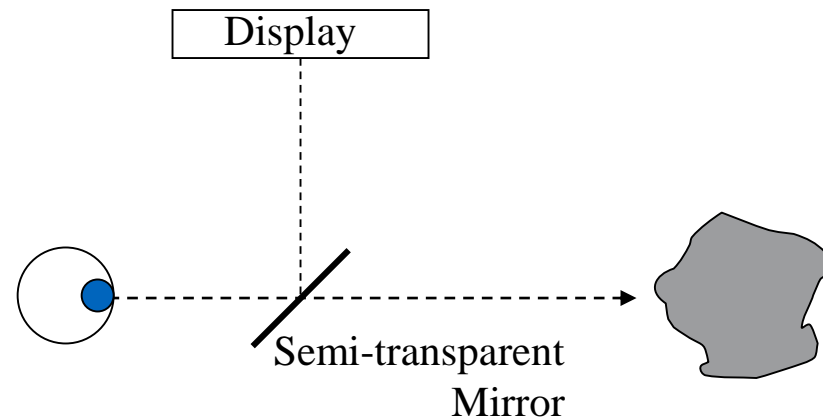


# Agenda

1. Introduction
2. Video see-through calibration
- 3. Optical see-through calibration
4. Summary



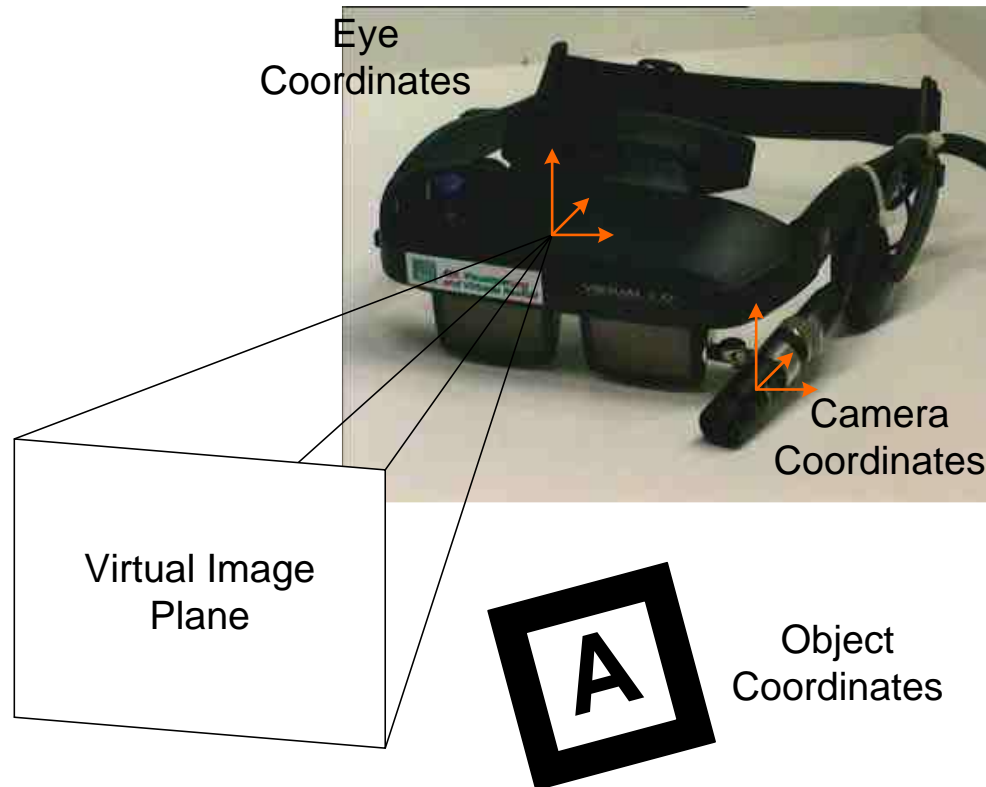
# Reminder: Optical See-Through HMD



# 3. Optical See-Through Calibration

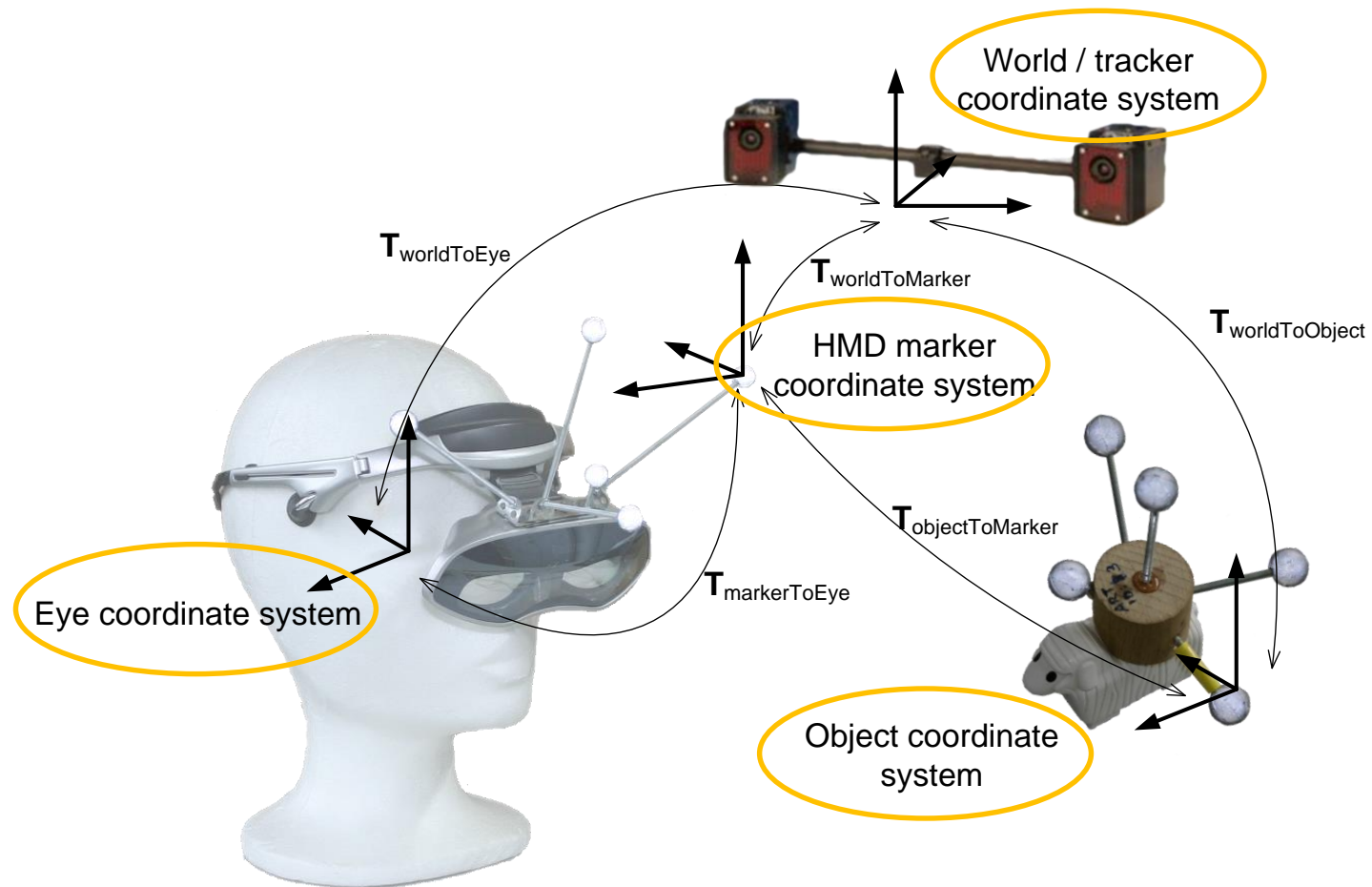
- 3.1 Single Point Active Alignment Method (SPAAM)
- 3.2 Display Relative Calibration (DRC)

# Using Inside-Out Tracking

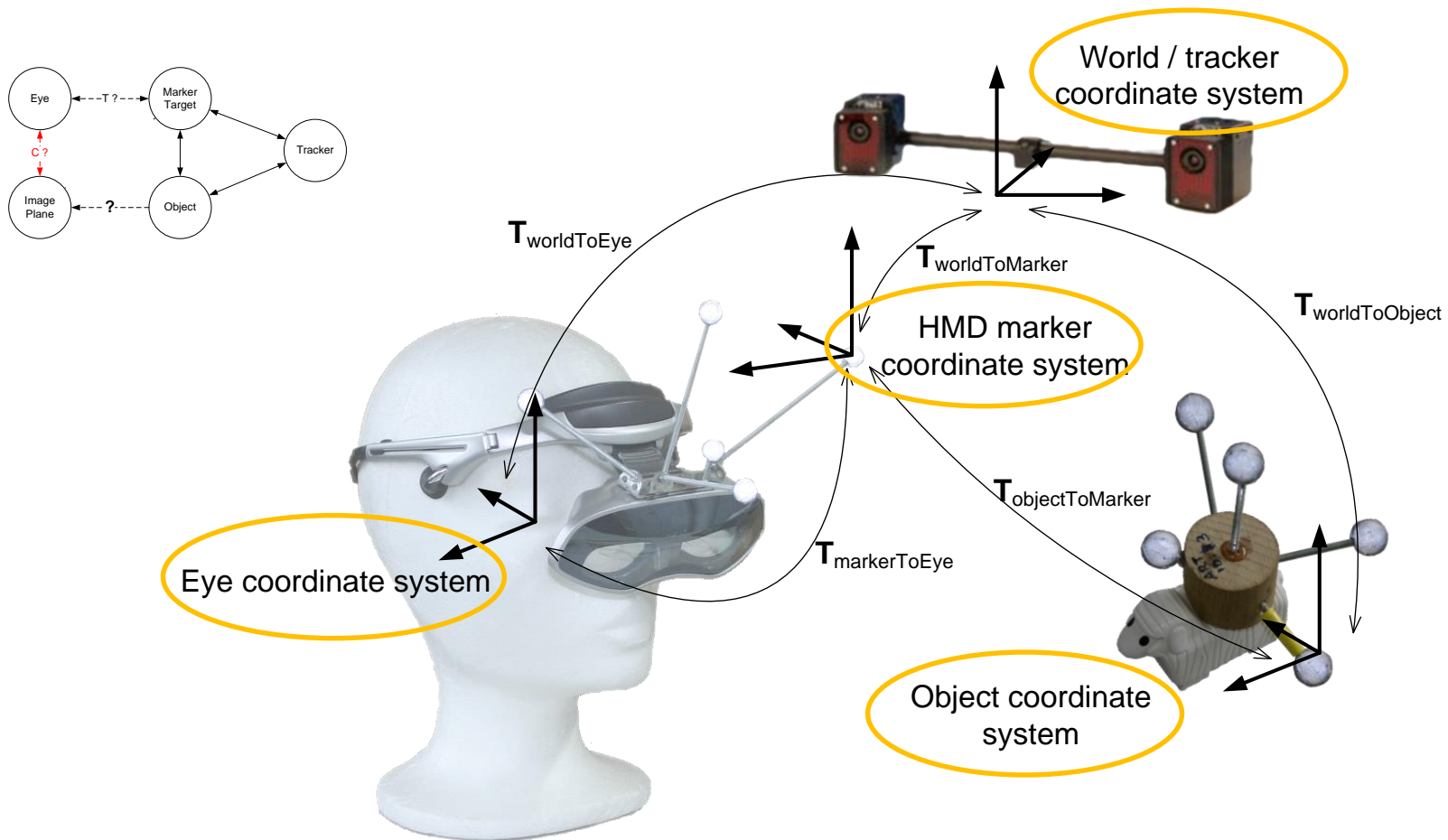


Camera calibration done independently of HMD calibration

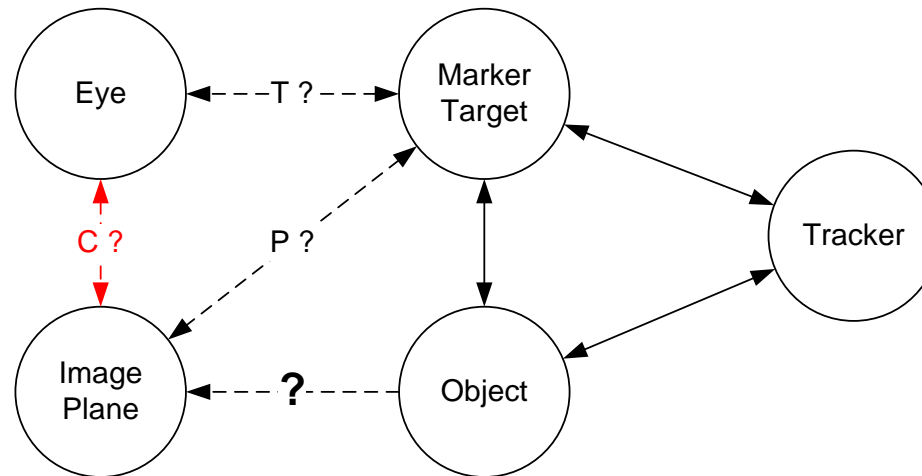
# Using Outside-In Tracking



# Using Outside-In Tracking



# Problem Definition

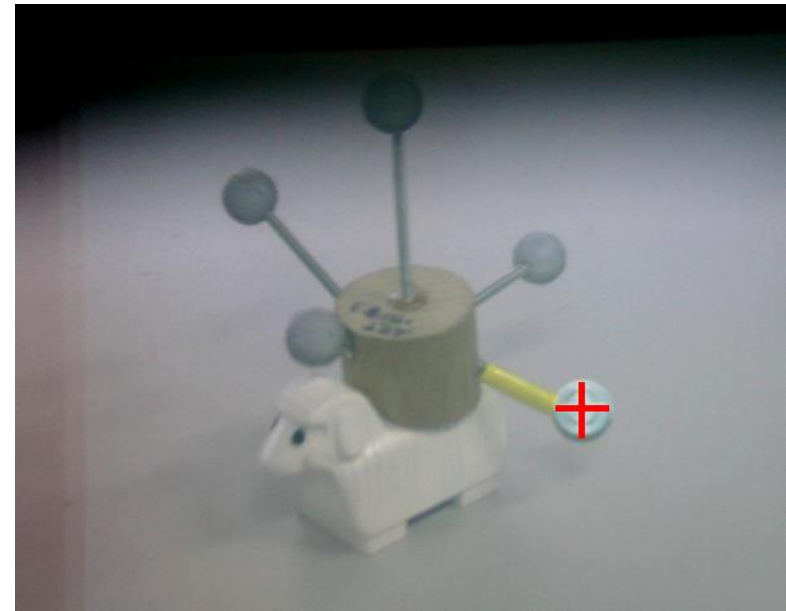
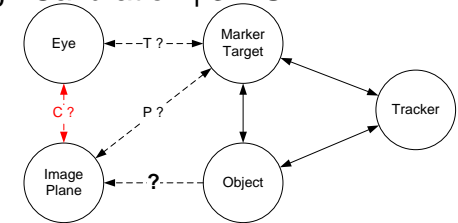


- Unknowns
  - Transformation from marker coordinate frame to viewpoint (translation and orientation): 4x4 matrix  $T$
  - Intrinsic camera parameters: 3x4 matrix  $C$
- If both  $T$  and  $C$  were known:
  - Projection matrix  $P = CT$

# Estimating P Directly

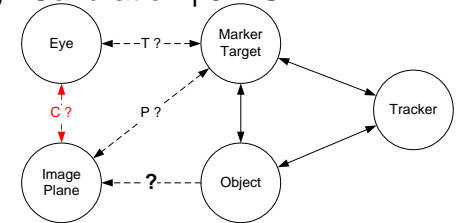
- Single Point Active Alignment Method [Tuceryan 2000]
- Given 3D points in tracker target coordinate frame **and** Given **corresponding** 2D points on the screen  
P can be computed directly

## 3. Optical See-Through Calibration | 3.1 SPAAM



### 3. Optical See-Through Calibration | 3.1 SPAAM

# Computing P



- Given: Homogeneous 3D points  $\mathbf{x}_i = (x_i, y_i, z_i, w_i)^T$  and 2D points  $\mathbf{x}'_i = (x'_i, y'_i, w'_i)^T$  s.t.

$$\mathbf{x}'_i = \mathbf{P}\mathbf{x}_i$$

- Where P is a homogeneous 3x4 matrix
- Directly solving above equation not possible, as homogeneous  $\mathbf{x}'_i$  is defined up to scale
- Idea: Solve  $\mathbf{x}'_i \times \mathbf{P}\mathbf{x}_i = \mathbf{0}$  (parallel vectors)
- Equivalent since  $\mathbf{a} \times \lambda \mathbf{a} = \mathbf{0}$



### 3. Optical See-Through Calibration | 3.1 SPAAM

# Computing P

$$\mathbf{P} = \begin{bmatrix} \mathbf{p}^{1\top} \\ \mathbf{p}^{2\top} \\ \mathbf{p}^{3\top} \end{bmatrix} \quad \mathbf{x}'_i = (x'_i, y'_i, w'_i)^T \quad \text{with} \quad \mathbf{a} \times \mathbf{b} = \begin{pmatrix} a_2 b_3 - a_3 b_2 \\ a_3 b_1 - a_1 b_3 \\ a_1 b_2 - a_2 b_1 \end{pmatrix}$$

$$\mathbf{x}'_i \times \mathbf{P} \mathbf{x}_i = \begin{pmatrix} y'_i \mathbf{p}^{3\top} \mathbf{x}_i - w'_i \mathbf{p}^{2\top} \mathbf{x}_i \\ w'_i \mathbf{p}^{1\top} \mathbf{x}_i - x'_i \mathbf{p}^{3\top} \mathbf{x}_i \\ x'_i \mathbf{p}^{2\top} \mathbf{x}_i - y'_i \mathbf{p}^{1\top} \mathbf{x}_i \end{pmatrix} = 0$$

$$(\mathbf{p}^{1\top}, \mathbf{p}^{2\top}, \mathbf{p}^{3\top})^\top \cdot \quad \text{Factoring for}$$

$$\begin{bmatrix} 0^\top & -w'_i \mathbf{x}_i^\top & y'_i \mathbf{x}_i^\top \\ w'_i \mathbf{x}_i^\top & 0^\top & -x'_i \mathbf{x}_i^\top \\ -y'_i \mathbf{x}_i^\top & x'_i \mathbf{x}_i^\top & 0^\top \end{bmatrix} \begin{pmatrix} \mathbf{p}^1 \\ \mathbf{p}^2 \\ \mathbf{p}^3 \end{pmatrix} = 0$$

# SPAAM Algorithm: Computing P

$$\begin{bmatrix} 0^\top & -w'_i \mathbf{x}_i^\top & y'_i \mathbf{x}_i^\top \\ w'_i \mathbf{x}_i^\top & 0^\top & -x'_i \mathbf{x}_i^\top \\ -y'_i \mathbf{x}_i^\top & x'_i \mathbf{x}_i^\top & 0^\top \end{bmatrix} \begin{pmatrix} \mathbf{p}^1 \\ \mathbf{p}^2 \\ \mathbf{p}^3 \end{pmatrix} = 0$$

- the three rows are not linearly independent  $\rightarrow$  last row is usually dropped (provided  $w'_i \neq 0$ )

$$\begin{bmatrix} 0^\top & -w'_i \mathbf{x}_i^\top & y'_i \mathbf{x}_i^\top \\ w'_i \mathbf{x}_i^\top & 0^\top & -x'_i \mathbf{x}_i^\top \end{bmatrix} \begin{pmatrix} \mathbf{p}^1 \\ \mathbf{p}^2 \\ \mathbf{p}^3 \end{pmatrix} = \mathbf{A}_i \mathbf{p} = 0$$

- Stacking matrices  $\mathbf{A}_i$  for all correspondences  $i$  gives matrix  $\mathbf{A}$
- Homogeneous Linear Equation System

# SPAAM Algorithm: Solving for P

- We now have  $\mathbf{A}\mathbf{p} = \mathbf{0}$ , where  $\mathbf{A}$  is a  $(n \cdot 2) \times 12$  matrix and  $\mathbf{p}$  is a homogeneous 12-vector ( $\rightarrow$  defined up to scale)
- Straightforward solving would result in trivial solution  $\mathbf{p} = \mathbf{0}$
- Solution is the null-space (kernel) of  $\mathbf{A}$
- In this case kernel is 1D subspace
- Null-space: (Right) singular vectors  $\mathbf{x}$  corresponding to singular value 0

$$\mathbf{A}\mathbf{x} = \mathbf{0} \cdot \mathbf{x}$$

- Compute  $\mathbf{p}$  using Singular Value Decomposition

$$\mathbf{A}_{m \times n} = \mathbf{U}_{m \times m} \mathbf{\Sigma}_{m \times n} \mathbf{V}_{n \times n}^T$$

where  $\mathbf{p}$  is the last column of  $\mathbf{V}$

- SVD also enforces constraint  $\|\mathbf{p}\| = 1$

# Creating a Projection Matrix for OpenGL

- $P$  is a 3x4 matrix, OpenGL requires 4x4 projection matrices
- Copy third row and modify to account for depth clipping

$$\mathbf{P}_{\text{OpenGL}} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & -z_{\text{near}} - z_{\text{far}} & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix} \mathbf{P} + \begin{bmatrix} 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & z_{\text{near}} \cdot z_{\text{far}} \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

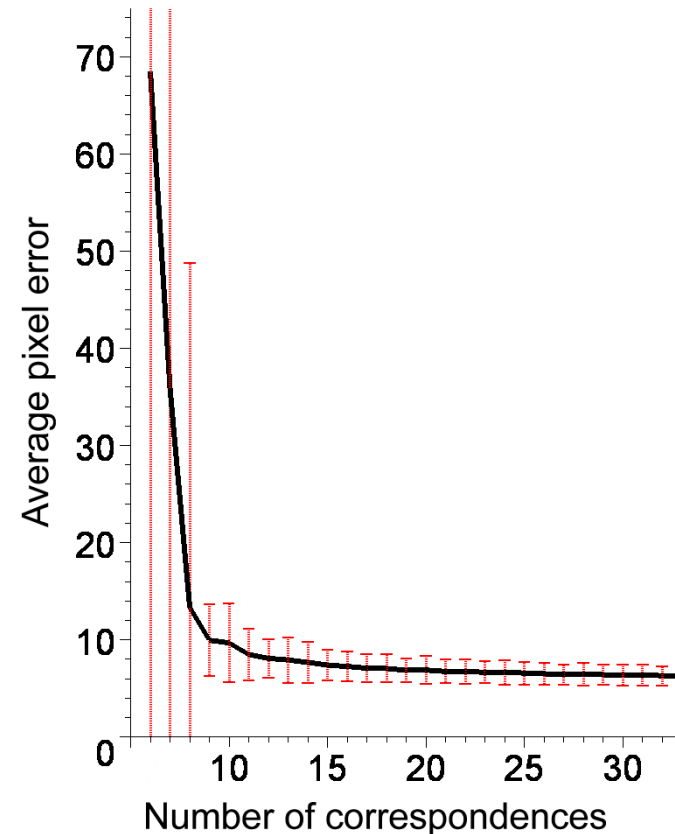
- Requires normalization s.t.  $\|p_{3,1} \ p_{3,2} \ p_{3,3}\| = 1$
- Load into OpenGL:

```
glMatrixMode( GL_PROJECTION );  
glLoadIdentity();  
glOrtho( 0, w, 0, h, z_near, z_far );  
glMultMatrixd( P_OpenGL );
```

# Considerations for Choosing Points (I)

Minimum number of required point correspondences:

- P has 12 entries, but only 11 degrees of freedom
- Each correspondence gives 2 constraints  
→ at least 6 ( $>5.5$ ) corresponding points required
- User input is noisy  
→ good results achieved with  $n \geq 15$



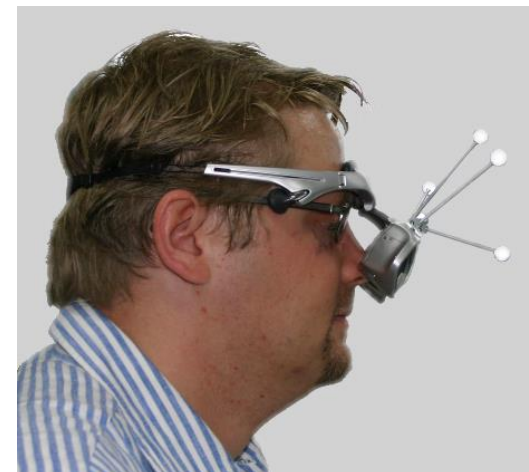
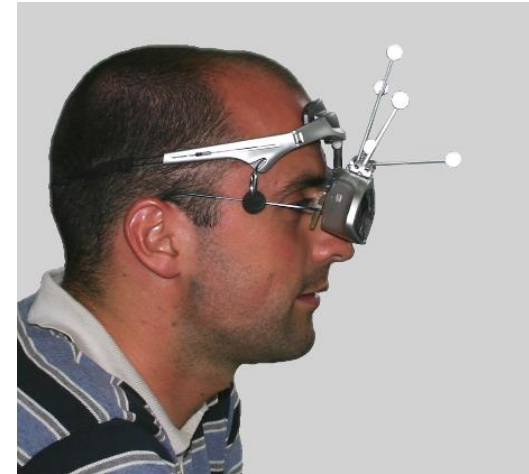
# Considerations for Choosing Points (II)

Perspective projection depends on depth

- 3D points must be at different distances from the user
  - Software should instruct user to change distance
  - Software should reject point sets with insufficient depth
- 3D points must not be co-planar
- Ideal: sampling of the whole working volume of the application

# How Often is Calibration Necessary?

- Arrangement of tracker and HMD is fixed
- Users have different physiology
  - Size of head
  - Position of eye
  - Interpupillary distance
- Different ways of putting on the HMD
- Calibration is necessary
  - for every user
  - when HMD is moved



# Calibrating a Stereo HMD

- Either calibrate the two displays individually
  - Drawback: requires  $>2 \cdot 15$  interactions
- Or use Stereo-SPAAM
  - Show crosshair in both displays simultaneously
    - crosshair also has a 3D position
  - User has to align crosshair with reference point in 3D
    - creates valid correspondences for both displays
  - Then use normal matrix estimation to estimate  $P_L$  and  $P_R$  separately
  - Drawback: correct alignment in 3D is difficult



# Refining Existing Calibrations: EasySPAAM

- Having to provide >15 points every time the user puts on the HMD is tedious
- Idea: Add correction to existing SPAAM calibration
- Correction modeled by warping in 2D on the image plane

$$\mathbf{P}' = \mathbf{S}\mathbf{P}$$

$$\mathbf{S} = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix} \quad \text{or} \quad \mathbf{S} = \begin{bmatrix} s_x & 0 & t_x \\ 0 & s_y & t_y \\ 0 & 0 & 1 \end{bmatrix}$$

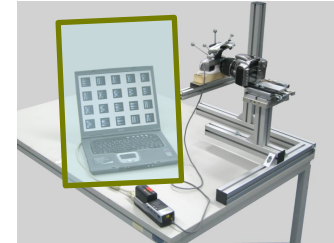
- Simpler model with less parameters → less points required
- [Tuceryan 2002b]

# 3. Optical See-Through Calibration

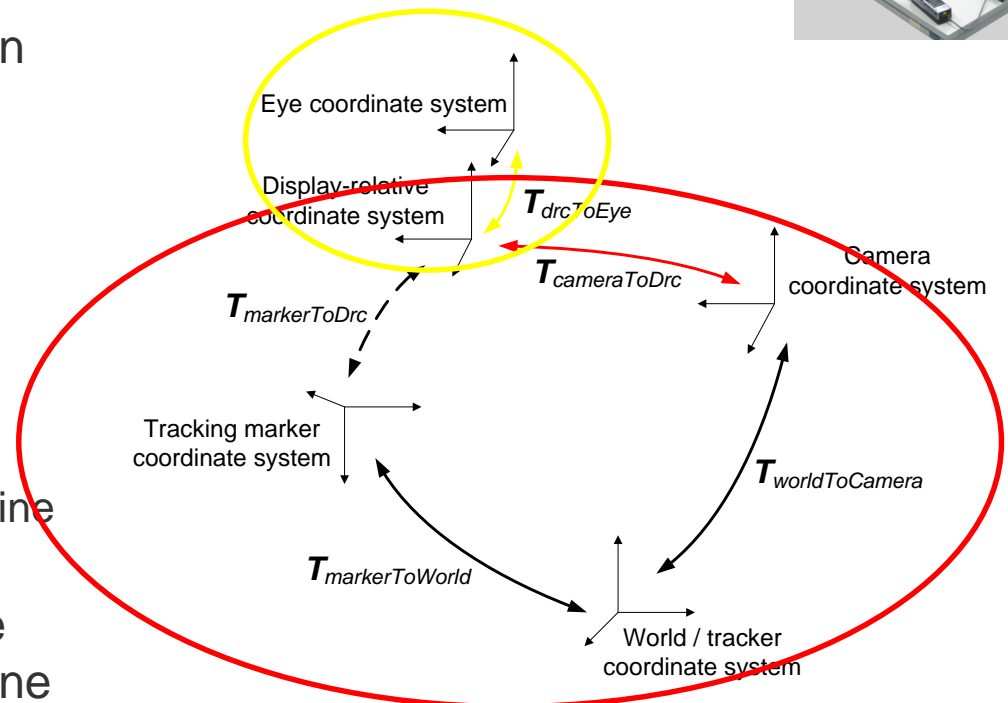
3.1 Single Point Active Alignment Method (SPAAM)

→ 3.2 Display Relative Calibration (DRC)

# Advanced Image Formation Model

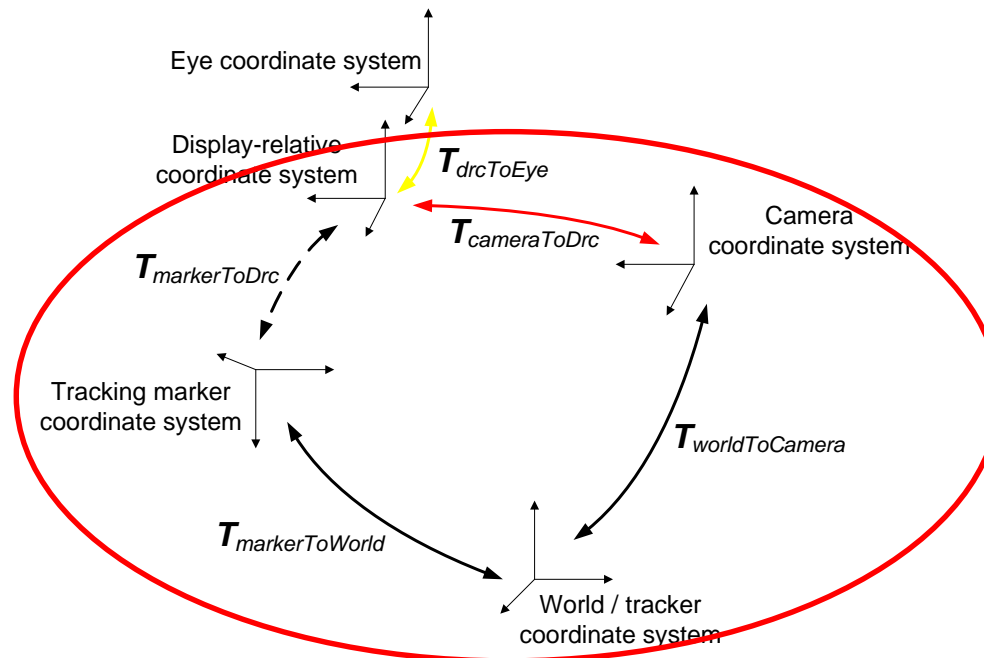
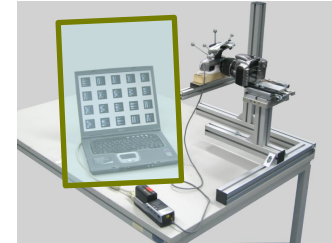


- If HMD and marker are fixed, only the eye position changes
  - less parameters to estimate (3 vs. 11)  
→ less points
  - Two-phase approach
    - Offline: replace eye with camera
    - Online: only determine eye position
- SPAAM does not take the position of the display plane into account
- [Owen 2004]

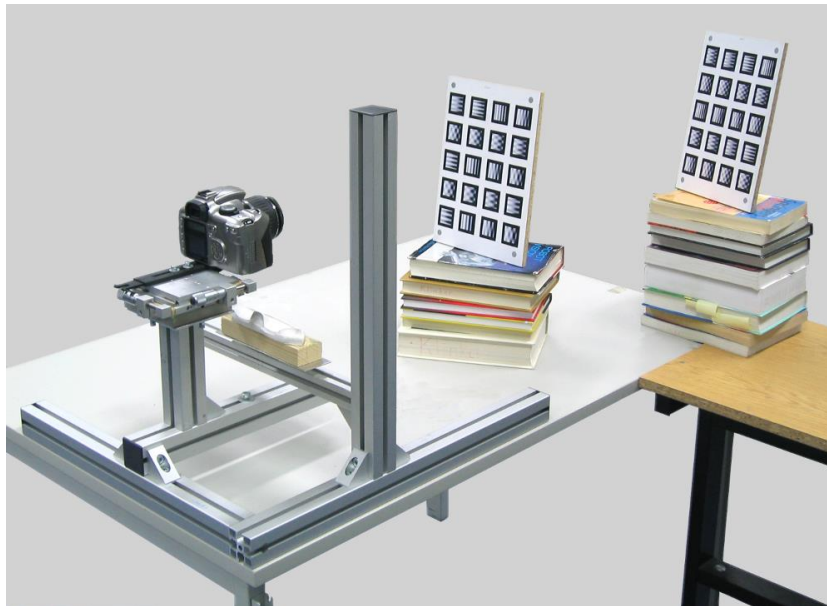


# DRC: Offline-Phase

- Determine HMD extrinsic ( $T_{\text{markerToDrc}}$ ) and intrinsic parameters
- $T_{\text{markerToDrc}} = T_{\text{cameraToDrc}} T_{\text{worldToCamera}} T_{\text{markerToWorld}}$
- Determine position of the display plane

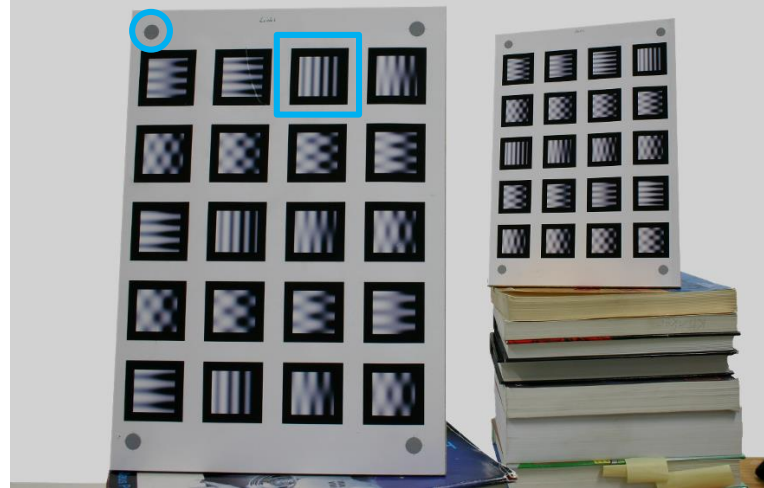


# Offline Step 1: Calibrating the Camera

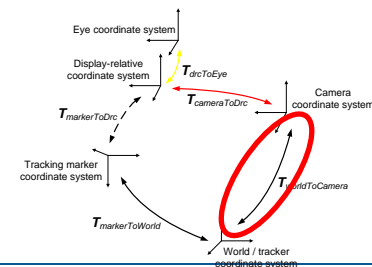


Two sets of optical markers on the same board:

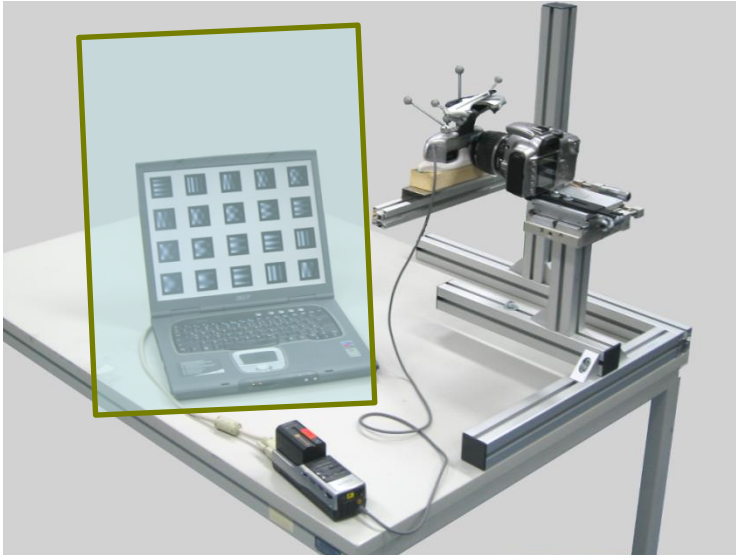
- Squares for Tsai camera calibration
- Circles for ART tracking



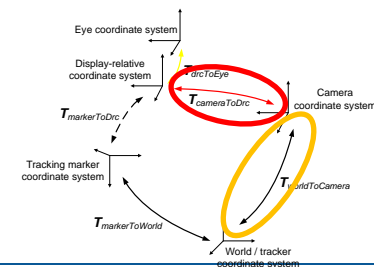
- Calibration patterns are tracked
- Camera calibration (Tsai) computes both  $T_{\text{worldToCamera}}$  and intrinsic parameters from 2D-3D point sets



# Offline Step 2: Calibrating the HMD

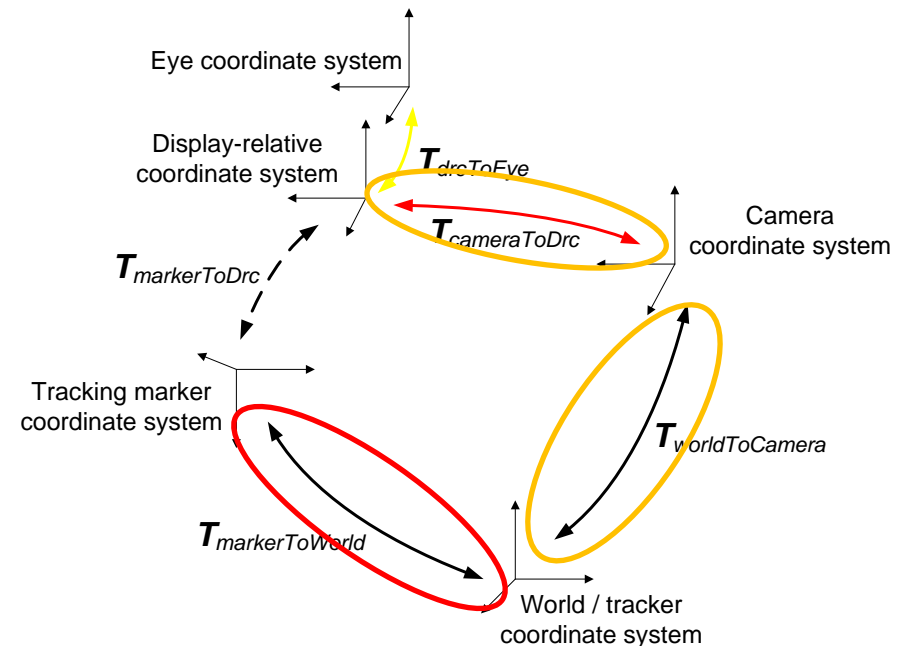
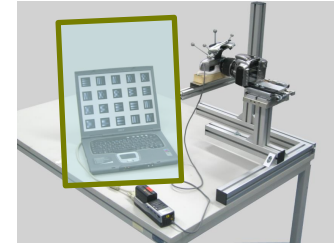


- Find markers projected into the HMD (turned into “opaque” mode)
- Project 2D points into 3D using known camera calibration and arbitrary (but different) depths
- Apply Tsai calibration to compute  $T_{\text{cameraToDrc}}$  and HMD intrinsics



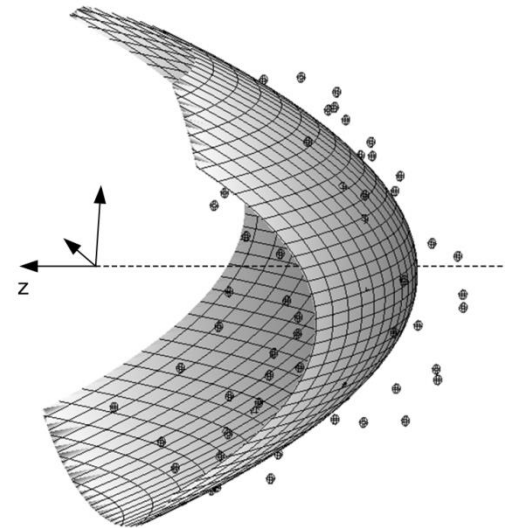
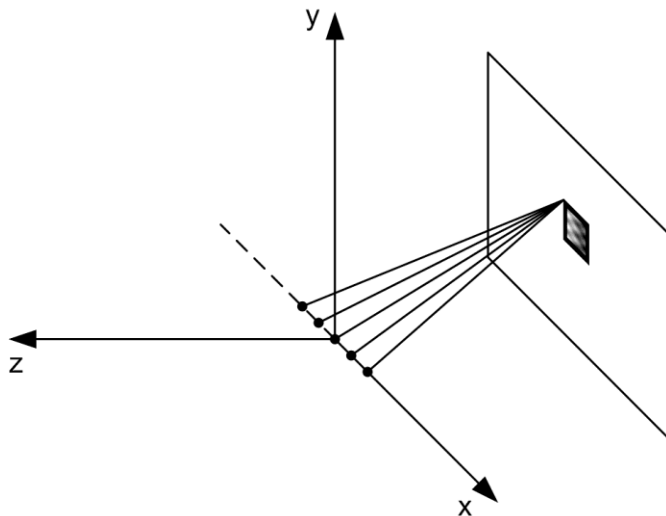
# Offline Step 3: HMD Tracker Pose

- Trivially done by reading tracker data  $T_{\text{markerToWorld}}$
- $T_{\text{markerToDrc}}$  can now be computed as  
 $T_{\text{cameraToDrc}} T_{\text{worldToCamera}} T_{\text{markerToWorld}}$



# Offline Step 4: Compute HMD Image Plane

- Move camera using precision translation stage (several mm)
- Stereo vision to find actual 3D position of points on image plane



Result: Image plane actually is parabolic



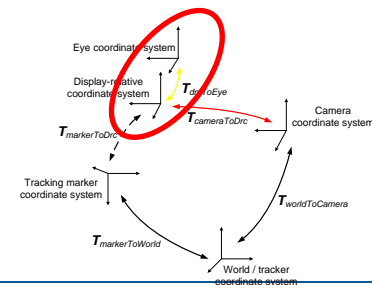
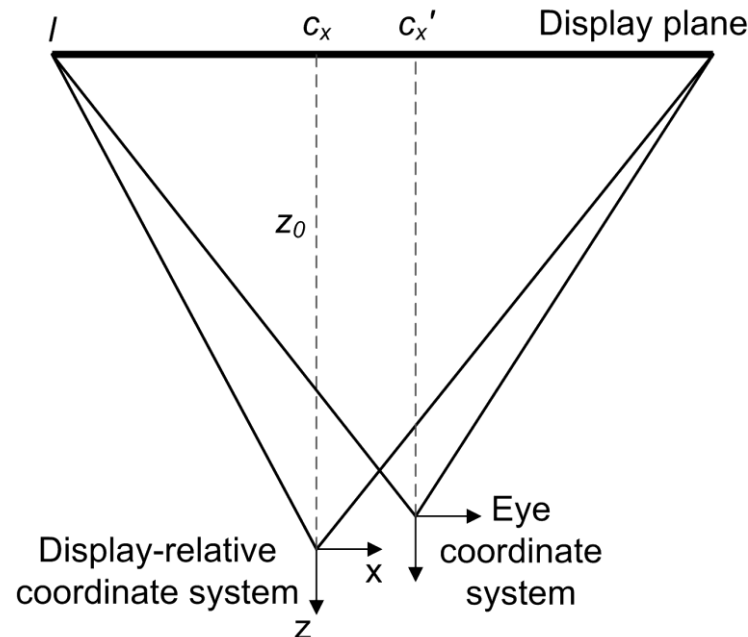
# Online Phase

- Determine user-dependent parameter:  $T_{\text{drcToEye}}$
- Used to compute  $T_{\text{markerToEye}} = T_{\text{drcToEye}} T_{\text{markerToDrc}}$
- Modification of intrinsic parameters necessary

$$c'_x = c_x - \frac{x_{\text{eye}} f s_x}{z_0}$$

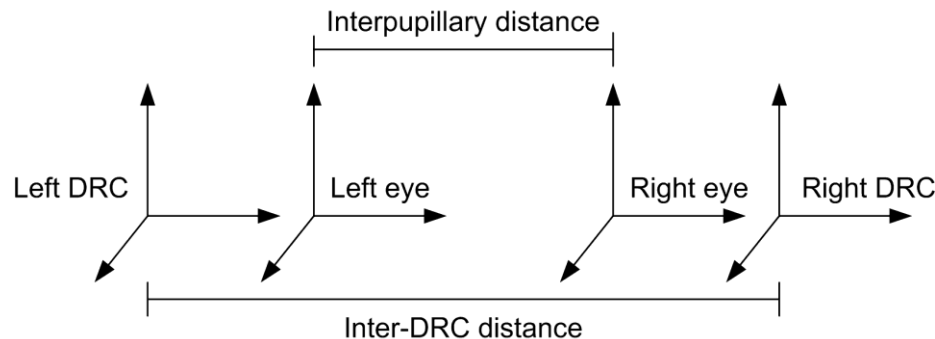
$$c'_y = c_y - \frac{y_{\text{eye}} f}{z_0}$$

$$f' = f \cdot \frac{z_0 - z_{\text{eye}}}{z_0}$$

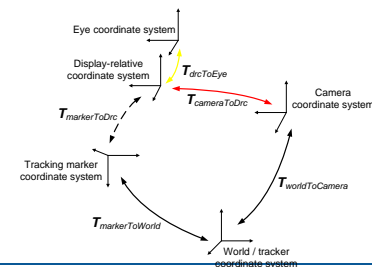


# Getting the Eye Position (I)

- Interpupillary distance (for stereo HMDs)
  - Measured using pupilometer
  - Shift eye position in X

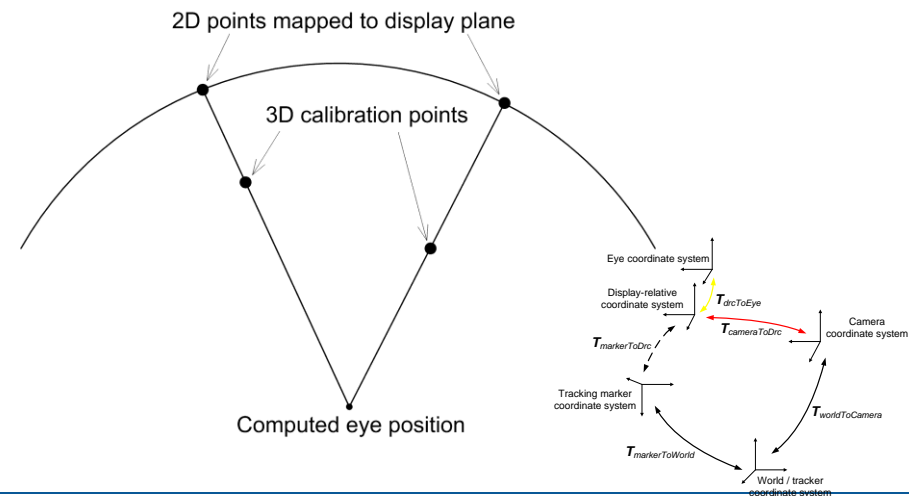
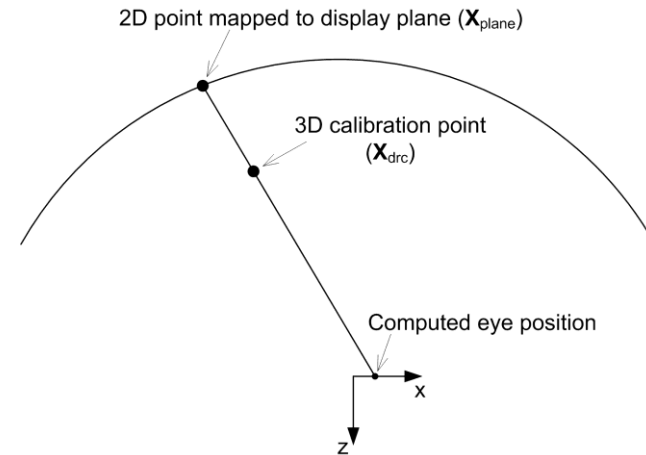


- Manual adjustment
  - using keyboard, joystick, mouse...
  - possible as only three degrees of freedom



# Getting the Eye Position (II)

- Single 2D-3D point correspondence
  - yields eye position in x and y only
- Multiple 2D-3D point correspondences
  - full eye position
  - intersecting rays





# Agenda

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# Summary

- Video see-through displays
  - Inside-Out tracking using see-through camera: Camera calibration (e.g. Tsai or Zhang)
  - Outside-In tracking: Hand-eye calibration
- Optical see-through displays
  - Single Point Active Alignment Method (SPAAM)
    - Collect >15 points by simple user interaction
    - Easy to implement
  - Display Relative Calibration (DRC)
    - Offline-phase requires complicated laboratory setup
    - More advanced model
    - In reality, does not produce better results

# Thank you!

