

# Evaluation and Optimization of Virtual Rigid Body

## Project I4

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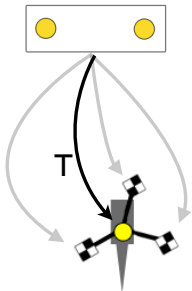
Seminar Presentation  
April 17th, 2014

## Recapitulation of the project

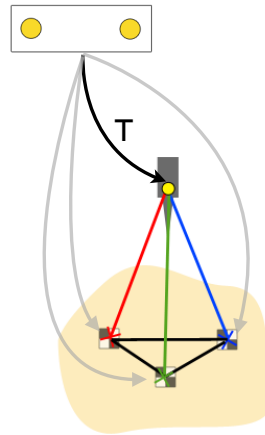
- Pose ( $T = [R, t]$ ) of the surgical tool in optical tracker coordinates?

Conventional physical rigid body (PRB)

Optical Tracker  
(MicronTracker)



Virtual rigid body (VRB)



How do the two types of rigid body compare?

# Designing Optically Tracked Instruments for Image-Guided Surgery

J.B. West, C.R. Maurer,  
*IEEE Transactions in Med. Imaging, 2004, 23(5)*

## Goal of the paper

- Overview of registration errors in optical tracking system
- Theoretical prediction, simulation and experimental evaluation

## Key points & significance

### Key points

- Theoretical model predicts that:
  1. Tracking error of a tooltip ↑ with
    - ↑ measurement error of fiducial positions — internal to hardware/software
    - ↑ distance of the fiducials from the tooltip
    - ↓ distance of the fiducials from each other
    - ↓ number of fiducials
 } fiducial design
  2. Error accumulates in quadrature with multiple registration
- Model prediction matches well with experimental results

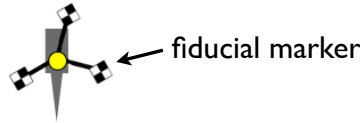
### Significance

- Convenient means to estimate the accuracy from the given fiducial design
- General guideline for fiducial marker design

# Background

## Optical tracking

- Purpose: Identifies a surgical tool in the pre/intraoperative image or other frames.
- Composition:
  - Optical position sensor (OPS): measures the fiducial position
  - Fiducial marker
    - Active: emits light
    - Passive: reflective / non-reflective (MicronTracker)



## Registration

Transformation between two coordinate frames

- Point-to-point registration
  - Find  $T=[R,t]$  between corresponding  $N$  points  $\{x_i\}$  and  $\{y_i\}$  that minimizes :

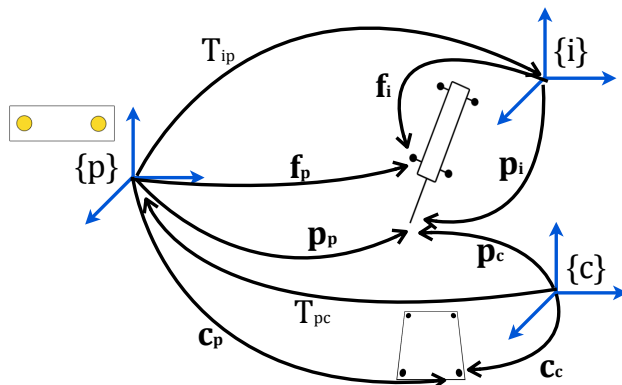
$$d^2 = \frac{1}{N} \sum_{i=1}^N |y_i - (Rx_i + t)|^2$$

- Quaternion implementation for CIS I

# Background

## Circumstances in optical tracking

- Single registration
  - between the optical position sensor (OPS) and the surgical instrument
- Two (or more) registrations
  - Introduction of coordinate reference frame (CRF)
  - Fiducials attached to the patient to track the tool with respect to the patient
  - Allows repositioning the OPS and the patient to maintain line of sight



$f$  : instrument fiducial position  
 $p$  : instrument tip position  
 $c$  : CRF fiducial position  
 $\{p\}$  : OPS coordinate  
 $\{i\}$  : instrument coordinate  
 $\{c\}$  : CRF coordinate

## I. Theory

- 1) Types of error in optical tracking system
- 2) Statistical prediction of the registration errors
- 3) Statistical prediction of composite error with multiple registration

## 2. Numerical simulation

## 3. Experimental evaluation

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7 / 23



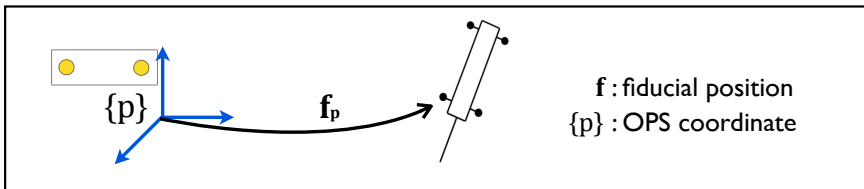
# Theory - I. Types of errors in optical tracking

## 1) Fiducial Localization Error (FLE)

- Distance between the actual and measured fiducial positions in optical position sensor (OPS) coordinate
- Value reported by the manufacturers (~0.4mm Polaris)

### I. Theory

- 1) Types of error
  - 2) Statistical prediction
  - 3) Composite error
2. Simulation
  3. Experiment



For the  $j$ th out of  $N$  fiducials

$$FLE_j \equiv \| \mathbf{f}_{pj}^* - \mathbf{f}_{pj} \|$$

$$FLE \equiv rms[FLE_1, \dots, FLE_N] = \sqrt{\frac{1}{N} \sum_{j=1}^N FLE_j^2}$$

$\square^*$  : actual

$\square$  : measured

$rms$  : root-mean-squared

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8 / 23

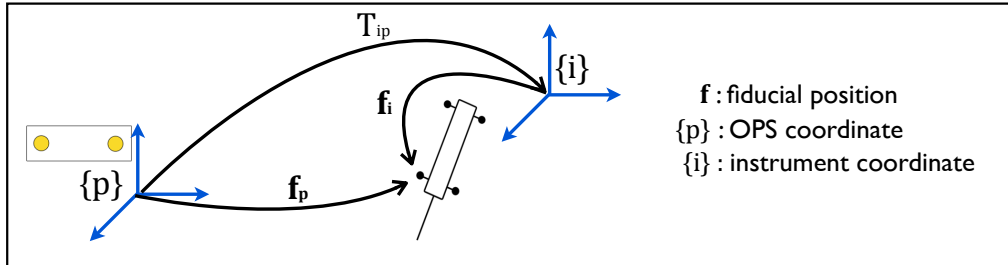


# Theory - I. Types of errors in optical tracking

## 2) Fiducial Registration Error (FRE)

- Distance between the actual and registered fiducial positions in OPS coordinate
- Assumption: actual fiducial positions are known in the instrument coordinate ( $f_i^*$ )

- Theory
  - Types of error
  - Statistical prediction
  - Composite error
- Simulation
- Experiment



$f$  : fiducial position  
 $\{p\}$  : OPS coordinate  
 $\{i\}$  : instrument coordinate

For the  $j$ th out of  $N$  fiducials

$$FRE_j \equiv \|T_{ip}^* \cdot f_{ij}^* - T_{ip} \cdot f_{ij}\| = \|T_{ip}^* \cdot f_{ij}^* - f_{pj}\|$$

$$FRE \equiv rms[FRE_1, \dots, FRE_N]$$

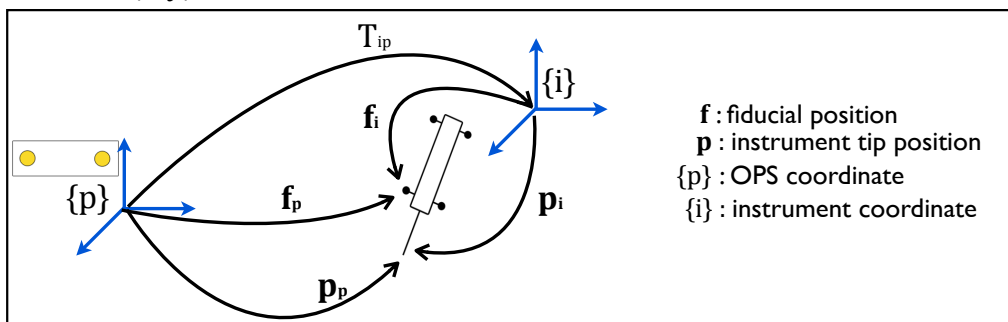
$\square^*$  : actual  
 $\square$  : measured  
*rms* : root-mean-squared

# Theory - I. Types of errors in optical tracking

## 3) Target Registration Error (TRE)

- Distance between the actual and registered target or tooltip position in OPS coordinate
- Assumption: actual tooltip position is known in the instrument coordinate ( $p_i^*$ )

- Theory
  - Types of error
  - Statistical prediction
  - Composite error
- Simulation
- Experiment



$f$  : fiducial position  
 $p$  : instrument tip position  
 $\{p\}$  : OPS coordinate  
 $\{i\}$  : instrument coordinate

$$TRE \equiv \|p_p^* - p_p\| = \|T_{ip}^* \cdot p_i^* - T_{ip} \cdot p_i\| = \|T_{ip}^* \cdot p_i^* - p_p\|$$

$\square^*$  : actual  
 $\square$  : measured

# Theory - 2. Statistical prediction of registration errors

$\langle \cdot \rangle$  : expected value

$$\langle FLE^2 \rangle = 3\sigma^2 \quad \sigma^2: \text{variance of random noise}$$

$$\langle FRE^2 \rangle = \frac{N-2}{N} \langle FLE^2 \rangle \quad (\text{Sibson, R., 1979})$$

•Remark: FRE does *not* depend on spatial distribution of fiducials

$$\langle TRE^2(\mathbf{r}) \rangle = \frac{\langle FLE^2 \rangle}{N} \left( \underset{\substack{\downarrow \\ \text{translational}}}{1} + \frac{1}{3} \sum_{k=1}^3 \frac{d_k^2}{\underset{\substack{\longleftarrow \\ \text{rotational}}}{f_k^2}} \right) \quad (\text{Fitzpatrick, J., 2001})$$

$d_k$  : distance of tooltip from each principal axis of the instrument

$f_k$  : rms distance of the fiducials from each principal axis of the instrument

•Remark: TRE depends on number and spatial distribution of fiducial markers

- 1. Theory
  - 1) Types of error
  - 2) Statistical prediction
  - 3) Composite error
- 2. Simulation
- 3. Experiment

# Theory - 2. Statistical prediction of registration errors

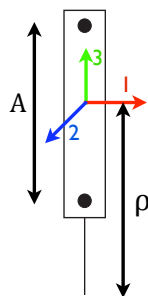
$$\langle TRE^2(\mathbf{r}) \rangle = \frac{\langle FLE^2 \rangle}{N} \left( 1 + \frac{1}{3} \sum_{k=1}^3 \frac{d_k^2}{f_k^2} \right) \quad (\text{Fitzpatrick, J., 2001})$$

$d_k$  : distance of tooltip from each principal axis of the instrument

$f_k$  : rms distance of the fiducials from each principal axis of the instrument

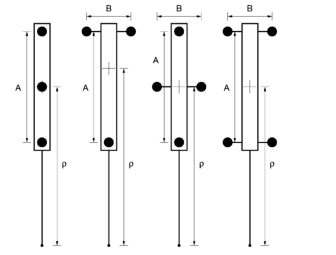
•Example:

	k=1	2	3
$d_k$	$\rho$	$\rho$	0
$f_k$	$A/2$	$A/2$	0



$$\langle TRE^2(\mathbf{r}) \rangle = \frac{\langle FLE^2 \rangle}{2} \left( 1 + \frac{1}{3} \cdot \frac{4\rho^2}{A^2} \right)$$

Smaller TRE ← Larger A : distance between fiducials  
 Smaller rho : distance from tooltip



Case	Configuration	N	Rotational Component
a	Line	2	$\frac{1}{3} \frac{\rho^2}{A^2} (FLE^2)$
b	Line	3	$\frac{1}{3} \frac{\rho^2}{A^2} (FLE^2)$
c	Triangle	3	$\frac{8+3\xi^2}{2(4+3\xi^2)} \frac{\rho^2}{A^2} (FLE^2)$
d	Cross	4	$\frac{2(2+\xi^2)}{3(1+\xi^2)} \frac{\rho^2}{A^2} (FLE^2)$
e	Rectangle	4	$\frac{2+\xi^2}{3(1+\xi^2)} \frac{\rho^2}{A^2} (FLE^2)$

Figure and table from (West, 2004)

- 1. Theory
  - 1) Types of error
  - 2) Statistical prediction
  - 3) Composite error
- 2. Simulation
- 3. Experiment

# Theory - 3. Composite error with multiple registration

- Tracking the tooltip in the patient (coordinate reference) frame

$$\mathbf{p}_c = \mathbf{T}_{pc} \cdot \mathbf{T}_{ip} \cdot \mathbf{p}_i$$

: Two registration transformations

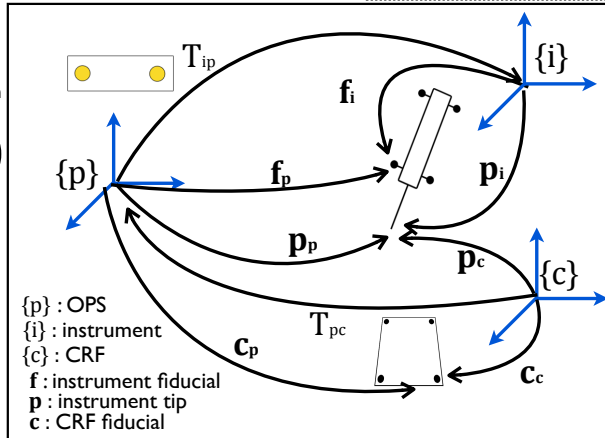
- What is the composite error?

$$\begin{aligned} TRE_{ip,pc}(\mathbf{p}_c) &= \mathbf{p}_c - \mathbf{p}_c^* \\ &= \mathbf{T}_{pc} \cdot \mathbf{p}_p - \mathbf{T}_{pc}^* \cdot \mathbf{p}_p^* \\ &= \mathbf{T}_{pc} \cdot \mathbf{p}_p - \mathbf{T}_{pc} \cdot (\mathbf{p}_p - TRE_{ip}(\mathbf{p}_p)) \\ &= TRE_{pc}(\mathbf{p}_c) + \mathbf{T}_{pc} \cdot TRE_{ip}(\mathbf{p}_p) \end{aligned}$$

vector form

$$\begin{aligned} \langle TRE_{ip,pc}^2(\mathbf{p}_c) \rangle &= \langle TRE_{pc}^2(\mathbf{p}_c) \rangle + \langle TRE_{ip}^2(\mathbf{p}_p) \rangle \\ &\quad + 2 \langle TRE_{pc}^2(\mathbf{p}_c) \cdot TRE_{ip}^2(\mathbf{p}_p) \rangle \end{aligned}$$

Orthogonal, zero-mean



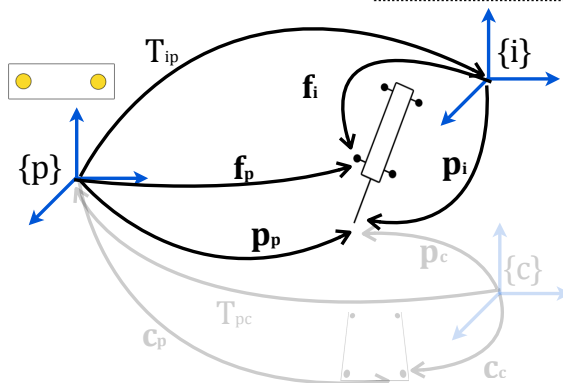
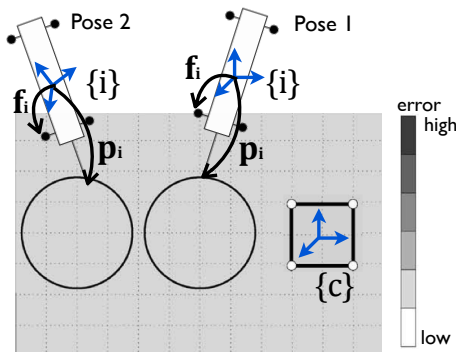
- Theory
  - Types of error
  - Statistical prediction
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- Experiment

$$\langle TRE_{ip,pc}^2(\mathbf{p}_c) \rangle = \langle TRE_{ip}^2(\mathbf{p}_p) \rangle + \langle TRE_{pc}^2(\mathbf{p}_c) \rangle$$

: Quadrature sum of each TRE

# Theory - 3. Composite error with multiple registration

- Spatial map of  $\langle TRE_{ip}^2(\mathbf{p}_p) \rangle$



- Theory
  - Types of error
  - Statistical prediction
  - Composite error
- Simulation
- Experiment

- Moving the tool does not change the instrument fiducial configuration with respect to tooltip
- Independent of spatial location of tooltip.

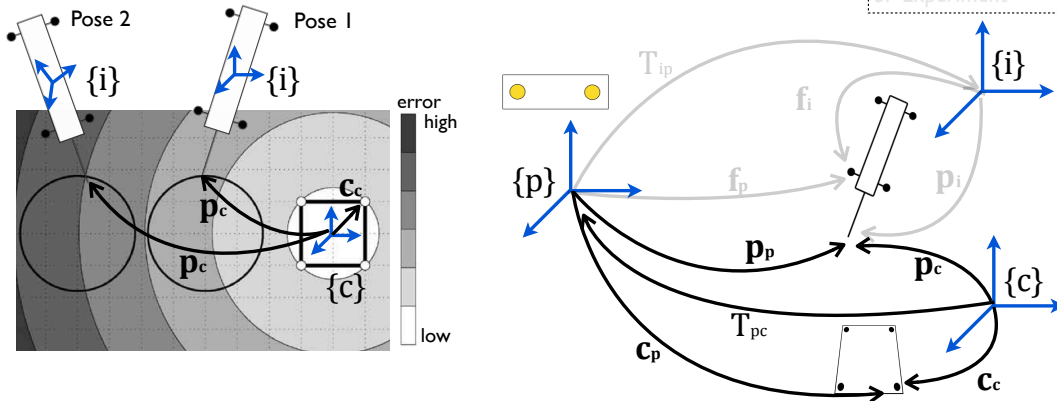
- Legend:  
 {p}: OPS  
 {i}: instrument  
 {c}: CRF  
 f: instrument fiducial  
 p: instrument tip  
 c: CRF fiducial

Figure modified from (West, 2004)

# Theory - 3. Composite error with multiple registration

• Spatial map of  $\langle TRE_{pc}^2(\mathbf{p}_c) \rangle$

1. Theory
  - 1) Types of error
  - 2) Statistical prediction
  - 3) Composite error
2. Simulation
3. Experiment



- Moving the tool does change the CRF fiducial configuration with respect to the tooltip.
- Dependent of spatial location of tooltip!

{p} : OPS  
 {i} : instrument  
 {c} : CRF  
 f : instrument fiducial  
 p : instrument tip  
 c : CRF fiducial

Figure modified from (West, 2004)

# Theory - 3. Composite error with multiple registration

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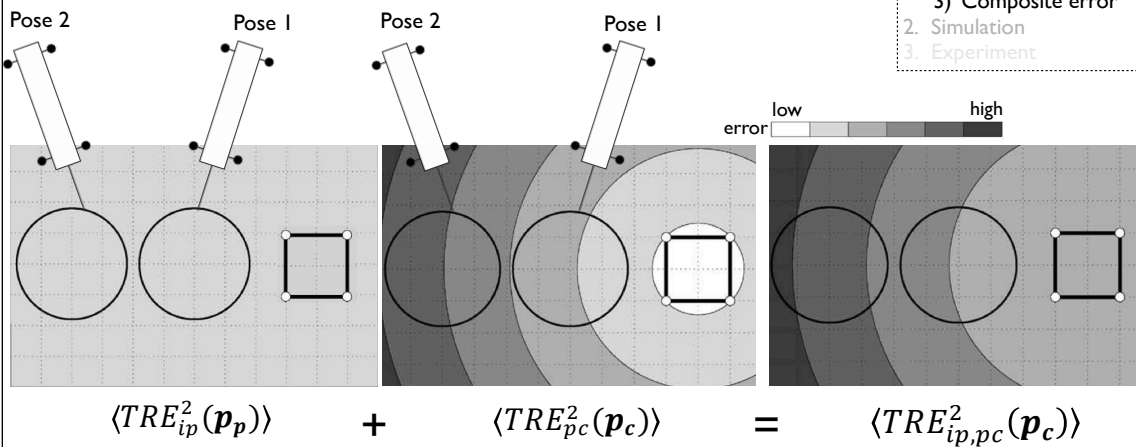


Figure modified from (West, 2004)

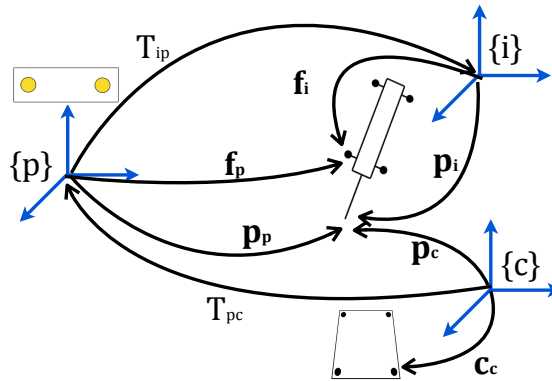


# Simulation

1. Choose arbitrary actual values  $\mathbf{c}^*, \mathbf{f}_i^*, T_{ic}^*, T_{cp}^*$
2. Compute actual values  $\mathbf{p}_c^*, \mathbf{f}_c^*, \mathbf{c}_p^*, \mathbf{p}_p^*, \mathbf{f}_p^*$
3. Simulate OPS measurements  $\mathbf{c}_p, \mathbf{p}_p$  by adding noise with 
$$\sigma = \frac{FLE}{\sqrt{3}}$$
 where FLE values are provided by the manufacturers of OPS.
4. Compute transformations  $T_{pc}, T_{ip}$  from "measured" values
5. The actual and measured values pointer tool in CRF are given by 
$$\mathbf{p}_c^* = T_{ic}^*(\mathbf{p}_i^*), \mathbf{p}_c = T_{pc} \cdot T_{ip}(\mathbf{p}_i^*)$$
6.  $\langle TRE_{ip,pc}^2(\mathbf{p}_c) \rangle = \|\mathbf{p}_c - \mathbf{p}_c^*\|^2$
7. Loop 1-6 100000 times, and calculate rms value of the acquired TREs.
8. Perform simulation at various locations with respective to CRF

$\mathbf{f}$  : instrument fiducial position  
 $\mathbf{p}$  : instrument tip position  
 $\mathbf{c}$  : CRF fiducial position  
 $\{\mathbf{p}\}$  : OPS coordinate  
 $\{\mathbf{i}\}$  : instrument coordinate  
 $\{\mathbf{c}\}$  : CRF coordinate

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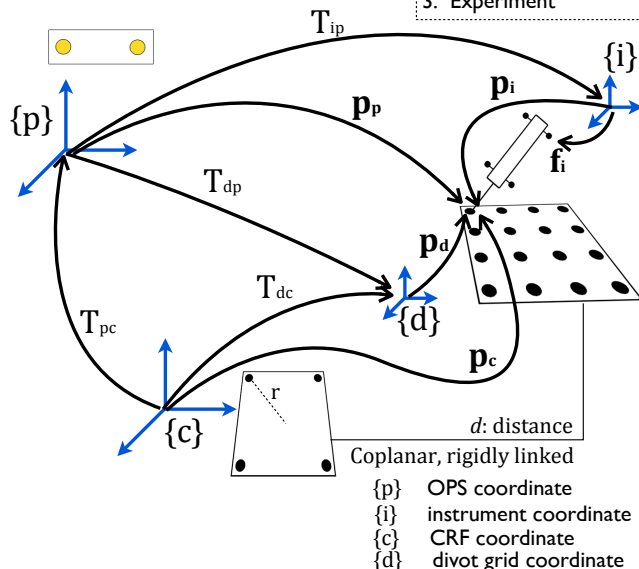
# Experiment

- Goal
  - Experimentally measure  $\langle TRE_{ip,pc}^2(\mathbf{p}_c) \rangle$  for a set of instrument and CRF fiducial configurations
- Setup
  1. OPS, CRF, surgical instrument
  2. Drilled 4x4 grid of divots (0.025 mm accuracy)
  3. Divot grid coplanar, rigidly attached to CRF
  4. Pivot calibration of tooltip
- Process
 

For given fiducial configuration,

  1. Tooltip is placed at each divot
  2. Registration between OPS and divot grid ( $T_{dp}$ ), and its FRE is calculated

3. Evaluate  $TRE_m = \sqrt{\frac{N}{N-2} FRE}$

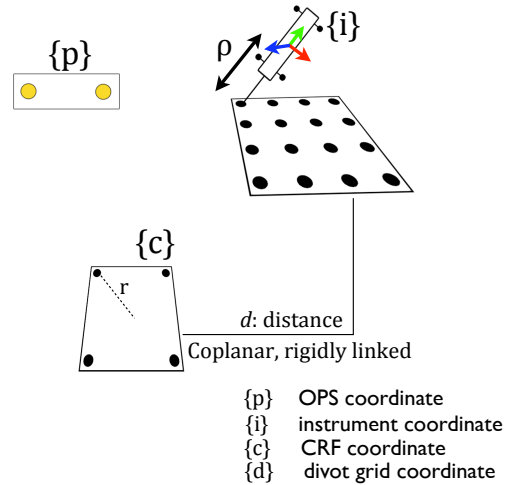


1. Theory
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# Experiment

- Experimental combinations
  1. Two values of  $\rho$  (tool fiducial configuration)
  2. Two values of  $r$  (CRF fiducial configuration)
  3. Four values of  $d$  (CRF fiducial configuration)
  4. Three types of experiments
    - At each divot,
      - A. Tool orientation, divots grid and CRF positions are constant.
      - B. Tool orientation is random, divots grid and CRF positions are constant.
      - C. Tool orientation, divots grid and CRF positions are constant.
  5. Three types of OPS/fiducial marker
    1. Optotrack 3020 / Active (infrared)
    2. Polaris / Active (infrared)
    3. Polaris / Passive (retroreflective)

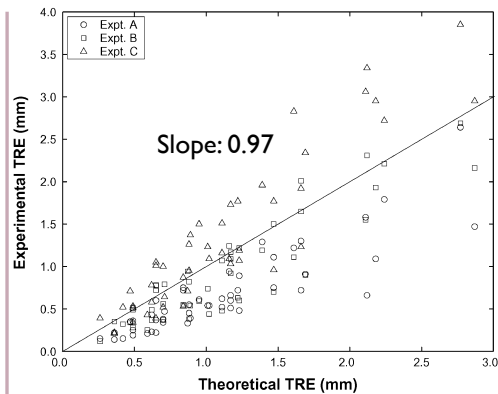
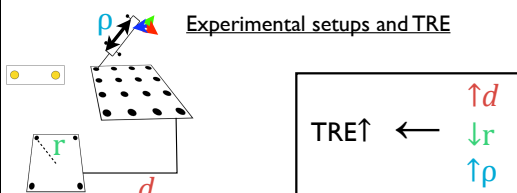
1. Theory
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# Result

- Simulation
  - difference with prediction < 0.6%
- Experiment

Instrument	CRF	$d$ (mm)	rms[TRE] (mm)			
			Theory	Expt. A	Expt. B	Expt. C
$A = 50$ mm	$r = 28$ mm	100	0.36	0.22 (-38%)	0.35 (-3%)	0.22 (-39%)
		200	0.62	0.23 (-63%)	0.37 (-40%)	0.58 (-6%)
		300	0.89	0.39 (-56%)	0.54 (-40%)	1.37 (54%)
		400	1.17	0.60 (-49%)	1.09 (-7%)	1.03 (-13%)
$A = 50$ mm	$r = 28$ mm	100	0.49	0.25 (-48%)	0.28 (-42%)	0.51 (5%)
		200	0.70	0.34 (-51%)	0.56 (-19%)	1.00 (43%)
		300	0.95	0.61 (-36%)	0.59 (-38%)	1.50 (58%)
		400	1.22	0.72 (-41%)	0.63 (-48%)	1.77 (45%)
$A = 50$ mm	$r = 57$ mm	100	0.26	0.15 (-45%)	0.12 (-56%)	0.39 (47%)
		200	0.36	0.14 (-62%)	0.35 (-5%)	0.21 (-42%)
		300	0.49	0.19 (-60%)	0.51 (6%)	0.53 (10%)
		400	0.62	0.43 (-30%)	0.49 (-21%)	0.78 (27%)
$A = 50$ mm	$r = 57$ mm	100	0.42	0.15 (-65%)	0.32 (-23%)	0.52 (23%)
		200	0.49	0.36 (-26%)	0.49 (0%)	0.34 (-31%)
		300	0.59	0.21 (-64%)	0.25 (-58%)	0.43 (-27%)
		400	0.70	0.38 (-46%)	0.37 (-47%)	0.52 (-26%)

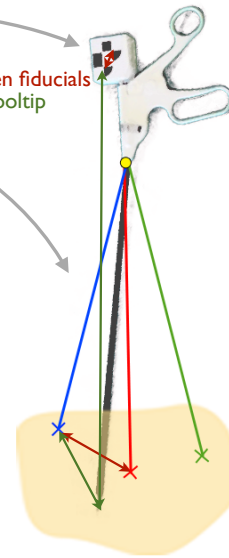


Considerable variability, but overall matches well

Table and figure taken from (West, 2004)

# Relevance

- Theoretical support for virtual rigid body (VRB)'s usefulness
  - Compared to conventional rigid bodies,
    - VRB can be projected farther from each other
    - VRB are projected closer to the tooltip
- Analysis and design considerations
  - Originally, primary interest was in FRE.
  - FLE and TRE should be kept in mind.
    - FLE : Detection of physical vs. projected light checkerboard
    - TRE : TRE, but not FRE, depends on fiducial configuration



$$\langle FLE^2 \rangle = 3\sigma^2$$

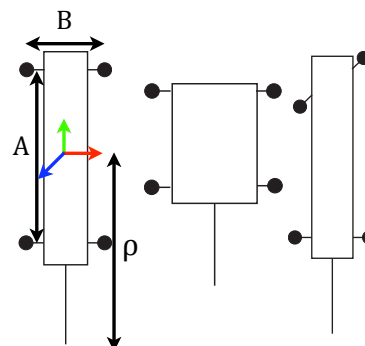
$$\langle FRE^2 \rangle = \frac{N-2}{N} \langle FLE^2 \rangle \quad (\text{Sibson, R., 1979})$$

$$\langle TRE^2(\mathbf{r}) \rangle = \frac{\langle FLE^2 \rangle}{N} \left( 1 + \frac{1}{3} \sum_{k=1}^3 \frac{d_k^2}{f_k^2} \right) \quad (\text{Fitzpatrick, J., 2001})$$

Picture of laparoscope taken from (Sánchez-Margallo, 2013)

# Assessment

- Great summary of error in optical tracking
  - Classification
  - High-level theory, example applications, experimental evaluations
- Difficulty in following the experiment
- Qualitative analysis of experimental data regarding TRE and fiducial configurations
- Suggestions for further works
  - More test cases of instrument fiducial configurations
    - Combinations of A and B
    - Slanted distribution
  - Details and verification of rotational tooltip error
 
$$\Delta\theta_k = \frac{FLE}{\sqrt{3N}f_k}$$
  - Fully passive fiducial markers (MicronTracker)



## Further readings

- Statistical details
  - R.Sibson, "Studies in the robustness of multidimensional scaling : Perturbational analysis of classical scaling", J. Roy. Statist. Soc. B, vol. 41, pp. 217–229, 1979.
  - J. M. Fitzpatrick and J. B. West, "Distribution of target registration error in rigid-body point-based registration", IEEE Trans. Med. Imag., vol. 20, pp. 917–927, Sept. 2001
- Experimental evaluations
  - J.Hummel et. al., "Design and application of an assessment protocol for electromagnetic tracking systems", Med. Phys. vol. 32(7), pp. 2371-2379, July 2005
  - J.A.Sánchez-Margallo, "Technical Evaluation of a Third Generation Optical Pose Tracker for Motion Analysis and Image-Guided Surgery", CLIP 2012, pp.75-82, 2013

Questions?