# Measuring Ball Spin by Image Registration 

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## Background

Many factors in sports : score, time, weight, etc.


- considering condition
- measuring speed
- analysing player's motion
- understanding ball spin
usefull for training, improving skill 任ll



## Spin of table tennis

- Football (free kick) 300-600rpm
- Baseball (curve) -1800rpm
- Golf 4000-10000rpm
- Tabel tennis -10000 rpm



## Spin of table tennis

- Football (free kick) 300-600rpm
- Baseball (curve) -1800rpm
- Golf 4000-10000rpm
- Tabel tennis -10000 rpm up to 8094 rpm for Chinese national team (Qun, 92)

- In 2000, ball diameter was changed from 38 mm to 40 mm to reduce spin and ball speel for making a game more entertaining


## Registration of known shape object

3D motion estimation with two successive images of a close-up marked ball


Estimating spin (motion parameters) that minimize the difference between two images by IMAGE REGISTRATION


Assumption : the ball is a sphere (known shape)

## Modeling transformations


$Q, S$ : unknown parameters
$R, \boldsymbol{T}$ : given parameters

$$
\begin{aligned}
\boldsymbol{P}_{2} & =Q \boldsymbol{P}_{0}+\boldsymbol{S} \\
& =Q R^{-1}\left(\boldsymbol{P}_{1}-\boldsymbol{T}\right)+\boldsymbol{S}
\end{aligned}
$$

## Estimating parameters

 minimize the sum of square of residuals:$$
\min _{\theta} \sum_{i} r_{i}\left(\boldsymbol{p}_{1 \mathrm{i}}\right)^{2} \quad r_{i}\left(\boldsymbol{p}_{1 \mathrm{i}}\right)=I_{1}\left(\boldsymbol{p}_{1 \mathrm{i}}\right)-I_{2}\left(\boldsymbol{p}_{2 \mathrm{i}}\right)
$$


solved by the Gauss-Newton method: to find the parameter $\quad \theta=(Q, \boldsymbol{S})$

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$$



## Using depth buffer

Transformation from $\boldsymbol{p}_{1 i}$ to $\boldsymbol{p}_{2 i}$ requires depth $Z_{1} Z_{2}$ :

3D CG sphere

real image
manaul fitting


## Visible test

Find the area for sum of residuals: where visible in both $I_{1}$ and $I_{2}$.
invisible area

first frame $I_{1}$

second frame $I_{2}$
surface normal at $\boldsymbol{p}_{2 i}$ at $I_{2}$ :

$$
\boldsymbol{N}_{i}=\frac{\partial \boldsymbol{P}_{2 \mathrm{i}}}{\partial x} \times \frac{\partial \boldsymbol{P}_{2 \mathrm{i}}}{\partial y}
$$

angle between $\boldsymbol{N}_{i}$ and
viewing direction :

$$
\phi_{i}=\cos ^{-1}\left(\frac{\left|\boldsymbol{N}_{i} \cdot \boldsymbol{P}_{2 \mathrm{i}}\right|}{\left|\boldsymbol{N}_{i}\right|\left|\boldsymbol{P}_{2 \mathrm{i}}\right|}\right)
$$

least square summation:

$$
\sum_{i} r_{i}\left(\boldsymbol{p}_{1 \mathrm{i}}\right)^{2} \text { where }\left|\phi_{i}\right|>\frac{\pi}{2}
$$

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## Overview of registration



## Experiments


environment :

- table tennis ball ( $\mathrm{R}=40 \mathrm{~mm}$ ) with ramdom marks at about 1.0 m distane away from the camera
- slightly rotated, moved away from the camera


## Convergence of estimation

$$
\boldsymbol{P}_{2}=Q(\boldsymbol{P}-\boldsymbol{T})+\boldsymbol{S}
$$



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$$
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$$



## inital



## Convergence of estimation

$$
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$$



## More improved estimation



## Experimental result



5 iterations

$w_{y}=20.7$

61 iterations


|  | $Q \quad[\mathrm{deg}]$ |  |  | $\boldsymbol{T}$ [mm] |  |  | $\boldsymbol{S}$ [mm] |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | $\omega_{x}$ | $\omega_{y}$ | $\omega_{Z}$ | $T_{x}$ | $T_{y}$ | $T_{z}$ | $S_{x}$ | $S_{y}$ | $S_{z}$ |
| initial | 0.0 | 0.0 | 0.0 | -9.0 | 30.0 | 399.0 | -9.0 | 30.0 | 399.0 |
| estimated | 0.3 | -20.7 | -8.1 | -9.6 | 29.9 | 398.2 | -10.1 | 29.5 | 401.2 |
| (mntinn) |  |  |  |  |  |  | - 40 |  | $\begin{gathered} 2 \cap 7 \\ =I \end{gathered}$ |

## Real Rally of table tennis



# Rally images <br> <br> of player A 

 <br> <br> of player A}

image sequence of table tennis rally taken by a high speed camera (MotionMeter 500) frame rate: $1 / 500$ [s] shutter speed: 1/10000 [s] resolution : $292 \times 110$ [pixel]

## Rally images of player B


FRAME -001687 TIME -003374

image sequence of table tennis rally taken by a high speed camera (MotionMeter 500) frame rate: $1 / 500$ [s] shutter speed: 1/10000 [s] resolution : 292x110 [pixel]

## Rally images

## of player B


image sequence of table tennis rally taken by a high speed camera (MotionMeter 500) frame rate: $1 / 500$ [s] shutter speed: 1/10000 [s] resolution : $292 \times 110$ [pixel]

## Spins of two players

sipn of player A

sipn of player $B$


## Conclusions

- Proposed a method for measuring spin of table tennis ball by image registration with a known shape CG model
- Experimental results : two real images and real rally sequences. Not yet quantitative evaluation.
- DISADVANTAGE :

1. focal lenghth should be known in advance
2. simple shape for modeling object shape
