

# **EECS 499 Project 1**

## **Image Tracking**

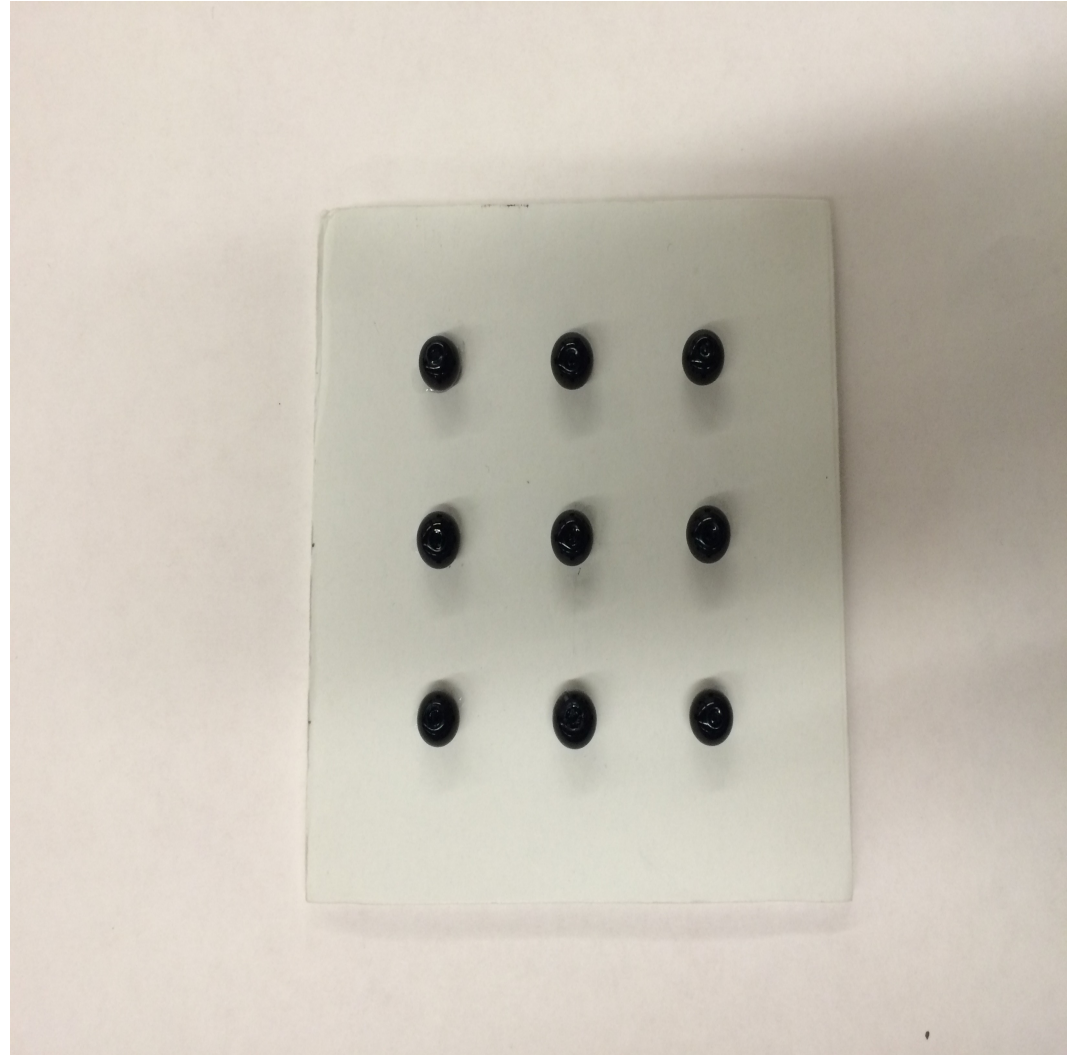
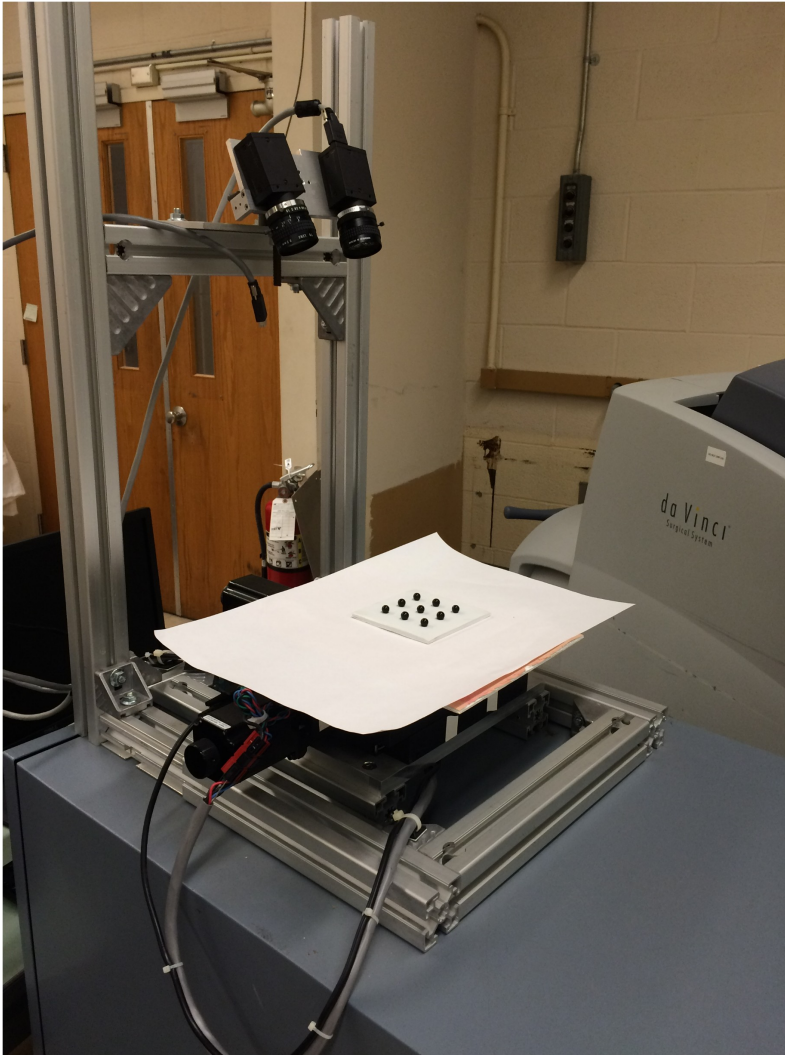
**Su Lu**

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# Experiment setup



# Background

- **Automatic suturing system on daVinci Robot**
- **Estimation of object deformationS**
- **Simplified 6-Dof rigid body motion (plate motion)**
- **Tracking plate motion by capturing beads motion (fiducials)**
- **ROS implementation**

# Particle filter implementation

- State  $X_t$ : 6-Dof ( $x, y, z, \text{rot}_x, \text{rot}_y, \text{rot}_z$ ) expressed by transformation matrix from body to camera frame  $G_{cb}$
- Measurement  $Z_t$ : Camera Image
- Control  $U_t$ : Matrix exponential  $e^{V_{st}}$ .
  - $V_s$  randomly generated spatial velocity
- Each particle represented a hypothesized transformation matrix  $G_{cb}$  or an image with 9 beads

## line 4:

```
Eigen::Affine3d particle_trans_mat_update =  
beadsGenerator.getNewTransformationMatrix(particles_set[i], delta_time);
```

## line 5:

```
cv::matchTemplate(g_frame_in, expected_bead_pos_image, weight,  
CV_TM_CCOEFF_NORMED);
```

## line 8 – 11: Using low variance sampler

```
1:  Algorithm Particle_filter( $\mathcal{X}_{t-1}, u_t, z_t$ ):  
2:       $\bar{\mathcal{X}}_t = \mathcal{X}_t = \emptyset$   
3:      for  $m = 1$  to  $M$  do  
4:          sample  $x_t^{[m]} \sim p(x_t \mid u_t, x_{t-1}^{[m]})$   
5:           $w_t^{[m]} = p(z_t \mid x_t^{[m]})$   
6:           $\bar{\mathcal{X}}_t = \bar{\mathcal{X}}_t + \langle x_t^{[m]}, w_t^{[m]} \rangle$   
7:      endfor  
8:      for  $m = 1$  to  $M$  do  
9:          draw  $i$  with probability  $\propto w_t^{[i]}$   
10:         add  $x_t^{[i]}$  to  $\mathcal{X}_t$   
11:      endfor  
12:      return  $\mathcal{X}_t$ 
```






















```
1:  Algorithm Low_variance_sampler( $\mathcal{X}_t, \mathcal{W}_t$ ):  
2:       $\bar{\mathcal{X}}_t = \emptyset$   
3:       $r = \text{rand}(0; M^{-1})$   
4:       $c = w_t^{[1]}$   
5:       $i = 1$   
6:      for  $m = 1$  to  $M$  do  
7:           $u = r + (m - 1) \cdot M^{-1}$   
8:          while  $u > c$   
9:               $i = i + 1$   
10:              $c = c + w_t^{[i]}$   
11:          endwhile  
12:          add  $x_t^{[i]}$  to  $\bar{\mathcal{X}}_t$   
13:      endfor  
14:      return  $\bar{\mathcal{X}}_t$ 
```

# Results

- **Failed to tracking random rigid body motion**

Possible reasons:

1. Number of particles too less (current 1000), need more?
2. Initial particles guess not correct?
3. Re-sample frequency, currently depend on delta time between loop, better to re-sample at fixed frequency 5s or 10s?

#	Message
#89002	 Paritcle No. 20, normalized weight 0.001023
#89001	 Paritcle No. 19, normalized weight 0.001023
#89000	 Paritcle No. 18, normalized weight 0.001023
#88999	 Paritcle No. 17, normalized weight 0.001023
#88998	 Paritcle No. 16, normalized weight 0.001023
#88997	 Paritcle No. 15, normalized weight 0.001023
#88996	 Paritcle No. 14, normalized weight 0.001023
#88995	 Paritcle No. 13, normalized weight 0.001023
#88994	 Paritcle No. 12, normalized weight 0.001023
#88993	 Paritcle No. 11, normalized weight 0.001023
#88992	 Paritcle No. 10, normalized weight 0.001023
#88991	 Paritcle No. 9, normalized weight 0.001023
#88990	 Paritcle No. 8, normalized weight 0.001023
#88989	 Paritcle No. 7, normalized weight 0.001023
#88988	 Paritcle No. 6, normalized weight 0.001023
#88987	 Paritcle No. 5, normalized weight 0.000002
#88986	 Paritcle No. 4, normalized weight 0.001023
#88985	 Paritcle No. 3, normalized weight 0.001023
#88984	 Paritcle No. 2, normalized weight 0.001023
#88983	 Paritcle No. 1, normalized weight 0.001023
#88982	 Paritcle No. 0, normalized weight 0.001023



# Improvements

- **Tracking tissue deformation by particle filter**
- **Accurate Motion model by robot joint motion**
- **FEM Implementation to estimate soft tissue deformation**