

Implementation of the Generic Equation (25) on the Journal Paper "*Use of Flip Ambiguity Probabilities in Robust Sensor Network Localization*"

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This note describes the implementation methodology of Equation (25) of the Journal Paper "Use of Flip Ambiguity Probabilities in Robust Sensor Network Localization". Sample values of each of d_{AD} , \bar{d}_{BD} and \bar{d}_{CD} are taken to span the distance range $[0, R]$ at a step size of R/N . Integration is implemented using the MATLAB function *trapz*. In choice of N there is a trade-off between accuracy and computational cost. In our case, N was chosen to be 100.

```
1 function NumericalCalculationOfFlip(xy,R,N,sigma)
2 %xy - true coordinates of A,B,C and D
3 %transmission range R
4 %Number of steps N
5 %Standard deviation of Gaussian noise sigma
6
7 % create distance matrix containing possible values
8 % x axis representing measured distance dAD,
9 % y axis representing measured distance dBd, and
10 % z axis representing measured distance dCD
11 Delta=R/N;
12 d=Delta:Delta:R;
13 for i=1:N,
```

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```

14      dAD(:,:,i)=ones(N,1)*d;
15      dBd(:,:,i)=d'*ones(1,N);
16      dCD(:,:,i)=i*Delta*ones(N,N);
17  end
18
19 %Create Identity Matrices
20 I_zeta_AB=Calculate_I_zeta_XY(dAD,dBD,xy,R);
21
22 xy_changedOrder=[xy(2,:);xy(3,:);xy(1,:);xy(4,:)];
23 I_zeta_BC=Calculate_I_zeta_XY(dBD,dCD,xy_changedOrder,R);
24
25 xy_changedOrder=[xy(3,:);xy(1,:);xy(2,:);xy(4,:)];
26 I_zeta_AC=Calculate_I_zeta_XY(dAD,dCD,xy_changedOrder,R)
27 % Define normalised Gaussian transfer functions
28 measured_dCD=shiftdim((dCD(1,1,:)),2)';
29 CD=norm(xy(3,:)-xy(4,:));
30 TF=1/(sigma*sqrt(2*pi))*exp(-(dCD-CD).^2/(2*sigma^2));
31 NF=cdf('normal',R,CD,sigma)-cdf('normal',0,CD,sigma);
32 YCD=TF/NF; clear TF NF
33
34 measured_dBD=dBD(:,1,1)';
35 BD=norm(xy(2,:)-xy(4,:));
36 TF=1/(sigma*sqrt(2*pi))*exp(-(dBd(:,1)-BD).^2/(2*sigma^2));
37 NF=cdf('normal',R,BD,sigma)-cdf('normal',0,BD,sigma);
38 YBD=TF/NF;
39
40 measured_dAD=dAD(1,:,1);
41 AD=norm(xy(1,:)-xy(4,:));
42 TF=1/(sigma*sqrt(2*pi))*exp(-(measured_dAD-AD).^2/(2*sigma^2));
43 NF=cdf('normal',R,AD,sigma)-cdf('normal',0,AD,sigma);
44 YAD=TF/NF;
45
46 % Calculate the analytical probability P(zeta_AB_BC_AC_AD/ABCD)
47 Y=YCD.*I_AB.*I_BC.*I_AC;
48 for i=1:N,
49     for j=1:N,
50         YC(i,j)=trapz(measured_dCD,shiftdim((Y(i,j,:)),2)');
51     end
52 end
53 Y=YBD.*YC;
54 for i=1:N,
55     YB(1,i)=trapz(measured_dBD,Y(:,i)');
56 end
57 Y=YAD.*YB;
58 P_zeta_AB_BC_AC_ABCD=trapz(measured_dAD,Y);
59 end

```

0.1 Function Calculating $I_{\zeta_{XY}}$

In order to implement Equation (25), it is necessary to calculate the three dimensional indicator function $I_{\zeta_{XY}}$ which is set when there is a flipped realization with respect to line XY .

This function uses two other functions to calculate the corresponding λ_C and to create an indicator function δ_{ZD} which is set to one when $R_{D_1}^{AB} \subset H_{\overline{C}}$ and reset to zero when $R_{D_1}^{AB} \subset H_C$. These functions are explained in Subsections 0.2 and 0.3 respectively.

This function ignores the negligible flips (See Section 6 of Journal Paper) by not calculating λ_C for the cases of non-intersecting circles $\mathcal{C}(p(A), \bar{d}_{AD})$, $\mathcal{C}(p(B), \bar{d}_{BD})$ and setting them to be zero.

The matlab code of this function is as follows.

```

1  function I_zeta_XY=Calculate_I_zeta_XY(dXD,dYD,xy,R)
2      %True distance XY between points X and Y
3      XY=norm(xy(1,:)-xy(2,:));
4      %Create a 3D dimensional condition matrix indicating
5      %whether the circles centered at X and Y intersect.
6      CirclesIntersect=(abs(dXD-XY)<=dYD).*(dYD<=min(dXD+XY,R));
7      %Calculate Lambda_C
8      Lamda_C=CirclesIntersect.*Calculate_lambda_C(dYD,dXD,xy);
9      %create Indicator indicating whether
10     %Z and D are on same side of XY or not
11     sameSide=decide_ZandDonSameSideOfXY(xy);
12     %make it a 3-dimensional matrix
13     Delta_ZD=sameSide.*ones(N,N,N);
14     I_zeta_XY=((Delta_ZD.*Lamda_C)<=dZD).*(dZD<=(min(Delta_ZD*R+Lamda_C,R)));
15 end

```

0.2 Function Calculating λ_C

From Proposition A.1 of the Journal paper, we know that

$$\lambda_C = \frac{\|p(C) - p_C^{AB}(D)\| + \|p(C) - p_{\overline{C}}^{AB}(D)\|}{2} \quad (0.1)$$

In order to calculate, $\|p(C) - p_C^{AB}(D)\|$ and $\|p(C) - p_{\overline{C}}^{AB}(D)\|$, lets extract $\Delta p(A)p(B)p(C)$, $\Delta p(A)p(B)p_C^{AB}(D)$ and $\Delta p(A)p(B)p_{\overline{C}}^{AB}(D)$ as shown in Figure 0.1. Since $p(C)$ is a ver-

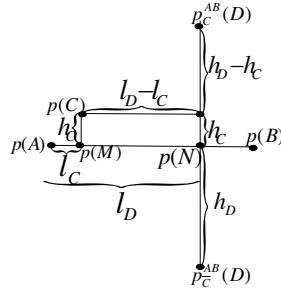


Fig. 0.1 Closer look at $\Delta p(A)p(B)p(C)$, $\Delta p(A)p(B)p_C^{AB}(D)$ and $\Delta p(A)p(B)p_{\overline{C}}^{AB}(D)$ from Figure A.1 of the Journal paper.

tex in both right angled triangles $p(A)p(M)p(C)$ and $p(B)p(M)p(C)$, using pythagoras theorem l_C can be calculated as

$$l_C = \frac{\|p(A) - p(C)\|^2 - \|p(B) - p(C)\|^2 + \|p(A) - p(B)\|^2}{2\|p(A) - p(B)\|} \quad (0.2)$$

Like wise, l_D can be calculated as

$$\begin{aligned} l_D &= \frac{\|p(A) - p_C^{AB}(D)\|^2 - \|p(B) - p_C^{AB}(D)\|^2 + \|p(A) - p(B)\|^2}{2\|p(A) - p(B)\|} \\ &= \frac{\bar{d}_{AD}^2 - \bar{d}_{BD}^2 + \|p(A) - p(B)\|^2}{2\|p(A) - p(B)\|} \end{aligned} \quad (0.3)$$

Since h_C is the height of the $\triangle p(A)p(B)p(C)$ and h_D is the height of the $\triangle p(A)p(B)p_C^{AB}(D)$ (equivalently can consider $\triangle p(A)p(B)p_C^{AB}(D)$ as well), they can be written as

$$h_C = \frac{2K_{\triangle p(A)p(B)p(C)}}{\|p(A) - p(B)\|} \quad (0.4)$$

$$h_D = \frac{2K_{\triangle p(A)p(B)p_C^{AB}(D)}}{\|p(A) - p(B)\|} \quad (0.5)$$

where $K_{\triangle p(A)p(B)p(C)}$ and $K_{\triangle p(A)p(B)p_C^{AB}(D)}$ are the area of $\triangle p(A)p(B)p(C)$ and $\triangle p(A)p(B)p_C^{AB}(D)$ respectively and can be easily calculated using Heron's formula.

Thus $\|p(C) - p_C^{AB}(D)\|$ and $\|p(C) - p_C^{AB}(D)\|$ can be calculated as

$$\begin{aligned} \|p(C) - p_C^{AB}(D)\| &= \sqrt{(l_D - l_C)^2 + (h_D - h_C)^2} \\ \|p(C) - p_C^{AB}(D)\| &= \sqrt{(l_D - l_C)^2 + (h_D + h_C)^2} \end{aligned}$$

and substituted in (0.1) to calculate λ_C .

The matlab code of this function is as follows.

```

1  function lambda_C=Calculate_lambda_C(dBD,dAD,xy)
2      AB=norm(xy(1,:)-xy(2,:));
3      BC=norm(xy(2,:)-xy(3,:));
4      AC=norm(xy(1,:)-xy(3,:));
5
6      %l_C=(AC^2-BC^2+AB^2)/(2*AB);
7      %l_D=(dAD.^2-dBD.^2+AB^2)/(2*AB);
8      l=((AC^2-BC^2)-(dAD.^2-dBD.^2))/(2*AB);
9
10     sABC=(AB+BC+AC)/2;
11     kABC=sqrt(sABC*(sABC-AB)*(sABC-BC)*(sABC-AC));
12
13     sABD=(dAD+dBD+AB)/2;
14     kABD=sqrt(sABD.* (sABD-AB).* (sABD-dBD).* (sABD-dAD));
15
16     %h_C=2*kABC/AB;
17     %h_D=2*kABD./AB;
18     h_D1=2*(kABC-kABD)/AB;
19     h_D2=2*(kABC+kABD)/AB;
20
21     CD1=sqrt(l.^2+h_D1.^2);
22     CD2=sqrt(l.^2+h_D2.^2);
23
24     lambda_C=(x_CD1+x_CD2)/2;
25
26     clear AB BC AC l sABC kABC sABD kABD h_D1 h_D2 CD1 CD2;
27 end

```

0.3 Function Deciding Whether Z and D Are On Same Side Of XY

The is a simple matlab code of this function using cross product and checking the signs to make a decision.

```
1 function sameSide=decide_ZandDOnSameSideOfXY(xy)
2     cZ = cross([xy(2,:)-xy(1,:) 0],[xy(3,:)-xy(1,:) 0]);
3     cD = cross([xy(2,:)-xy(1,:) 0],[xy(4,:)-xy(1,:) 0]);
4     if (sign(cZ(3))*sign(cD(3))==-1)
5         sameSide=0;
6     else %(sign(cZ(3))*sign(cD(3))==1)
7         sameSide=1;
8     end
9 end
```