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# Channel Usage Classification Using Histogram- Based Algorithms for Fast Wideband Scanners

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# Background

- This study is for spectrum surveillance applications (e.g. **CRC's Spectrum Explorer**).
- A **wideband** scanning device is needed since various signals may occupy a wide frequency band.
- Some signals can last long without major fluctuations (e.g. TV signals); some signals are sporadically on and off with fluctuations (e.g. cellular signals).
- To catch short signals, the time between consecutive scans has to be short (i.e. a **fast scanner** is needed), and the scanning duration has to be long.



- To catch narrow-band signals, the number of scanned channels has to be large enough.
- Basic **preliminary channel usage info** usually includes multiple **(channel#, SNR, AOA, AOA ISD)** for each scan. Thus, **a pre-processing (first-step) procedure (signal detection, type identification, direction finding)** is needed.
- The size of preliminary channel usage info is usually huge.
- After completing scans, **the overall channel usage report (active channel#, EST\_SNR, EST\_AOA, EST\_SD)** should be obtained ASAP.



## Goal

- Develop a set of simple algorithms (**second-step procedure**) to process the preliminary channel usage info set efficiently to get the overall channel usage report.

## Approach

- Use the **histogram-based algorithms** to process the preliminary channel usage info set to get the overall channel usage report.



# Concept

- Statistically, **each lobe of a variable histogram from various scans is linearly related to the distribution density of that variable**, given that the number of scans is large.
- The related information is embedded in the histograms. No prior knowledge of variable distribution is needed.
- In this study, **SNR, AOA and AOA ISD** are the interested variables.



# Active Channel

- If there are  $N$  scans, and among them, there are  $M$  detected counts of channel# $k$ , then **channel# $k$  is active if  $(M/N) > \text{ch\_threshold}$ .**
- For long signals without major fluctuations (e.g. TV signals),  $\text{ch\_threshold} \sim 1$ .
- For signals that are sporadically on and off with fluctuations (e.g. cellular signals),  $\text{ch\_threshold} \sim 0$ .
- In this study,  $\text{ch\_threshold} = 0.5$ .



## SNR, AOA, AOA ISD Histograms

- For each active channel, a SNR histogram (*HistSNR*) from its preliminary channel usage info is generated.
- $CS(k,1$  to  $3)$  are the leftmost, peak and rightmost sample indices of the  $k$ th pre-lobe. For each  $k$ , the pre-lobes are grouped as follows:

```

if (CS(k,3)-CS(k,2))<=2
if CS(k+1,2)-CS(k,2)<3
    if HistSNR(CS(k,2))>=HistSNR(CS(k+1,2))
        CS(k,3)=CS(k+1,3);
    else
        CS(k,2)=CS(k+1,2);
        CS(k,3)=CS(k+1,3);
    end
end
end
end

```

- For a *HistSNR*, its isolated cluster lobes  $CS(I,3)$  were found where **I is the final grouped lobe number.**

- Valid *HistSNR* lobe is defined when  $\text{lobe\_peak}/\text{HistSNR\_max} > 0.8$ .
- For each valid *HistSNR* lobe, the corresponding AOA and histograms (*HistAOA*, *HistISD*) from their preliminary channel usage info are generated.
- The averaged ISD (AISD) was obtained by weight averaging *HistISD*. The weight average of a histogram is:

$$WA = \frac{\sum_{m=m_s}^{m_e} [m \times \text{Hist}(m)]}{\sum_{m=m_s}^{m_e} \text{Hist}(m)}$$

, where  $m_s, m_e$  are the start/end sample indices within a histogram lobe.



- $CA(k,1$  to  $3)$  are the leftmost, peak and rightmost sample indices of the  $k$ th pre-lobe. For each  $k$ , the pre-lobes are grouped as follows:

```

if ( $CA(k,3)-CA(k,2)$ )< $AISD$ 
  if  $HistAOA(CA(k,2))>HistAOA(CA(k+1,2))$ ;  $CA\_C(k,1)=CA(k,1)$ ;
     $CA\_C(k,2)=CA(k,2)$ ;  $CA\_C(k,3)=CA(k+1,3)$ ;
  else  $CA\_C(k,1)=CA(k,1)$ ;  $CA\_C(k,2)=CA(k+1,2)$ ;
     $CA\_C(k,3)=CA(k+1,3)$ ; end;  $n\_cc=2$ ;  $n\_rc=N'-n\_cc$ ;
  while ( $CA\_C(k,3)-CA\_C(k,2)$ )<= $2*AISD$ )& $n\_rc>0$ 
    if  $HistAOA(CA(n\_cc+1,2))<=HistAOA(CA\_C(k,2))$ 
       $CA\_C(k,3)=CA(n\_cc+1,3)$ ;
    else  $CA\_C(k,2)=CA(n\_cc+1,2)$ ;  $CA\_C(k,3)=CA(n\_cc+1,3)$ ;
      end;  $n\_cc=n\_cc+1$ ;  $n\_rc=N'-n\_cc$ ; end;
elseif  $CA(k+1,2)-CA(k+1,1)$ <= $AISD$ 
  if  $HistAOA(CA(k+1,2))>=HistAOA(CA(k,2))$ 
     $CA\_C(k,1)=CA(k,1)$ ;  $CA\_C(k,2)=CA(k+1,2)$ ;  $CA\_C(k,3)=CA(k+1,3)$ ;
  elseif  $HistAOA(CA(k+1,2))<HistAOA(CA(k,2))$ 
     $CA\_C(k,1)=CA(k,1)$ ;  $CA\_C(k,2)=CA(k,2)$ ;  $CA\_C(k,3)=CA(k+1,3)$ ;
  end; end;
 $CA(k,1)=CA\_C(k,1)$ ;  $CA(k,2)=CA\_C(k,2)$ ;  $CA(k,3)=CA\_C(k,3)$ ; end;

```

where  $N'$  is the grouped lobe number computed on the fly.

- For a  $HistAOA$ , its isolated cluster lobes  $CA(J,3)$  were found where  $J$  is the final grouped lobe number.

- The AOA SDs were calculated from the isolated *HistAOA* lobes.
- **Valid *HistAOA* lobe** is defined when  $\text{lobe\_peak}/\text{HistAOA\_max} > 0.5$ .
- The **weight average** of each valid *HistSNR* lobe = EST\_SNR.
- The **angularly weighted average** of each valid *HistAOA* lobe = EST\_AOA.
- **The angularly weighted average (in degrees)** of a histogram is:

$$AWA = \frac{180}{\pi} \times \text{Ang} \left[ \sum_{m=m_s}^{m_e} e^{j \frac{\pi}{180} [m \times \text{Hist}(m)]} \right]$$

, where  $\text{Ang}[\bullet]$  represents the phase angle of  $\bullet$  in radians.

- **(EST\_SNR, EST\_AOA)** represents an estimated signal from a transmitter (user) within an active channel.

# Simulated and CRC-measured Data

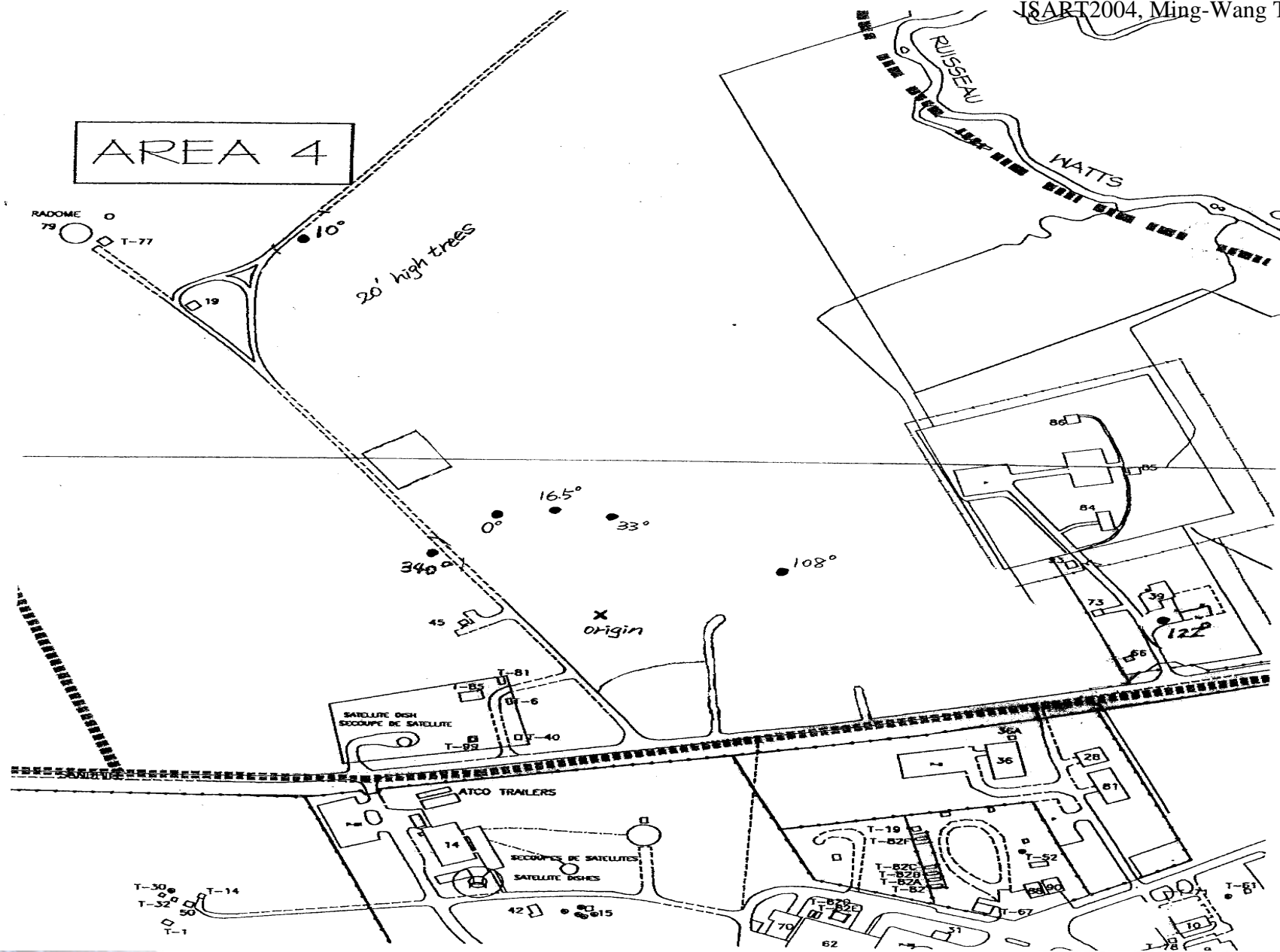
- Simulated part:  
**1000-sample-per-signal** normal distribution was used for the SNRs, the SNRs, AOAs and AOA ISDs in preliminary channel usage info set.
- CRC-measured part:



- For each scenario in CRC-measured data, around 5000 data scans were collected with **300 ms** between consecutive scans with **one 25 KHz channel** using the same frequency center as the TX signal. The scanned data were preprocessed using a 2.5 kHz FFT resolution (**400 us** time span for each scan) to determine the SNRs, AOA and AOA ISDs.

TABLE I. CRC-MEASURED SCENARIOS

Scenario	TX Location (degree, meter)	Description
1	(0, 110)	Clear LOS
2	(108, 100)	Clear LOS
3	(340, 110)	Clear LOS
4	(16.5, 110)	Clear LOS
5	(33, 110)	Clear LOS
6	(122, 300)	Beside a building
	RX Location (degree, meter)	
7	(10, 350)	Behind 20' high trees



- Simulated Scenario: 3 signals with AOA  $\sim |N(20/40/60\text{-dg}, 2/3/4\text{-dg SD})|$ , AOA ISD  $\sim |N(0, 2/3/4\text{-dg SD})|$  for signal 1/2/3, SNR  $\sim |N(5 \text{ to } 40\text{-dB}, 2\text{-dB SD})|$  for each signal.
- The AOA ISDs/SDs were set purposely to be independent of the SNRs. **In practice, as the SNR increases, the AOA SD decreases.**

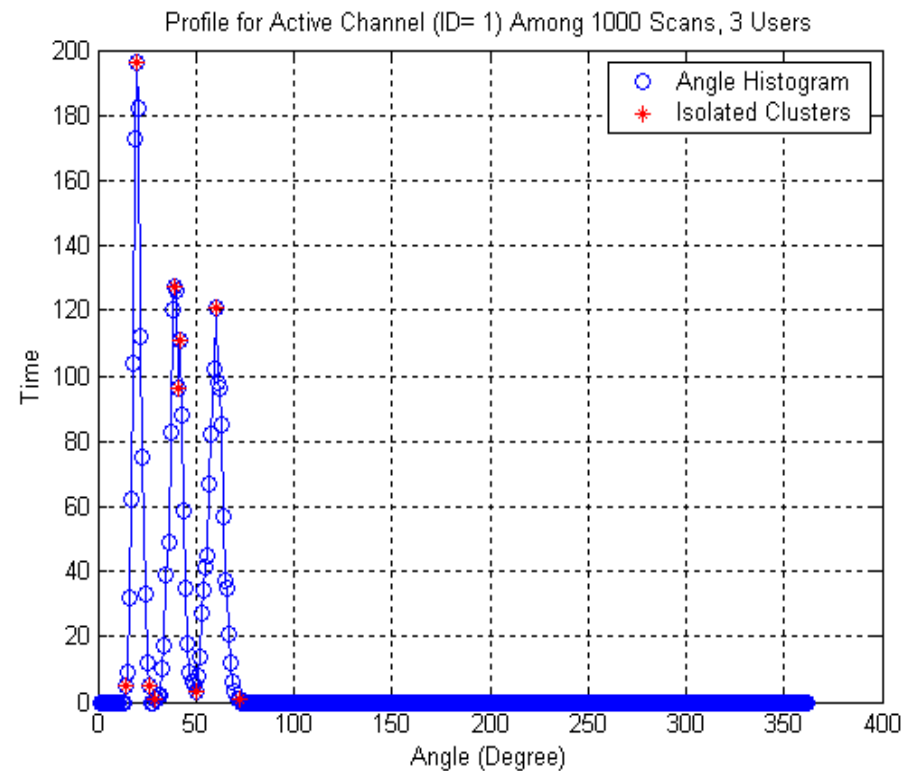
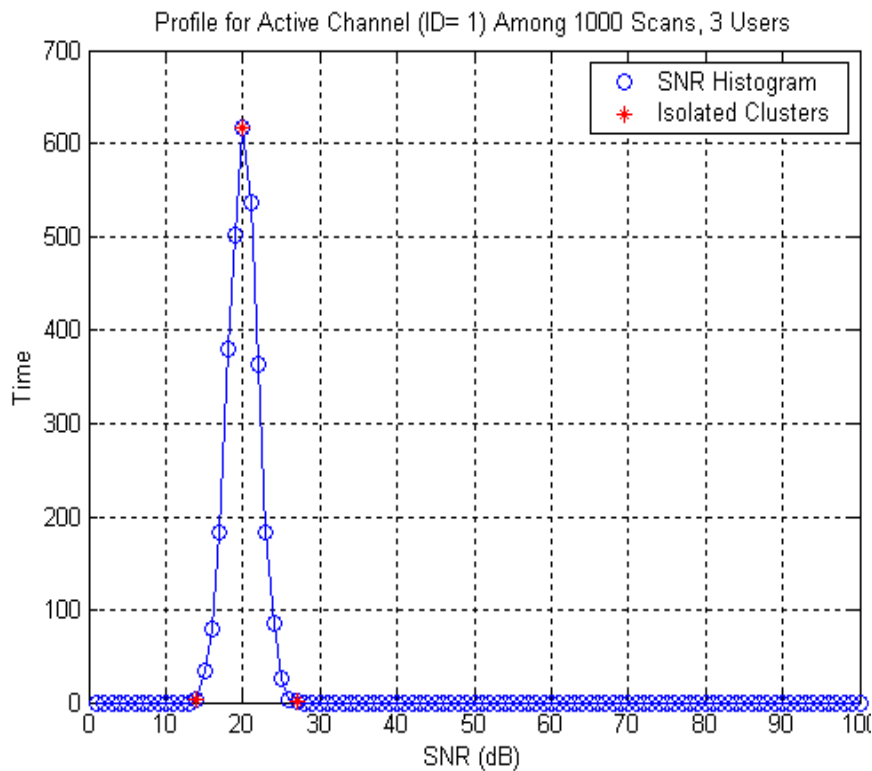
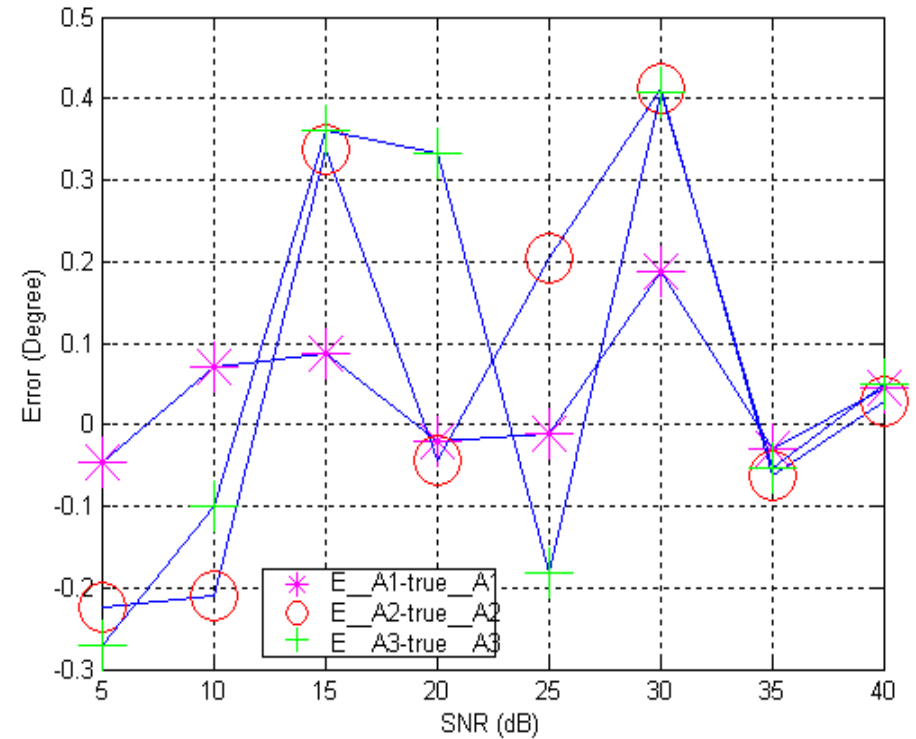
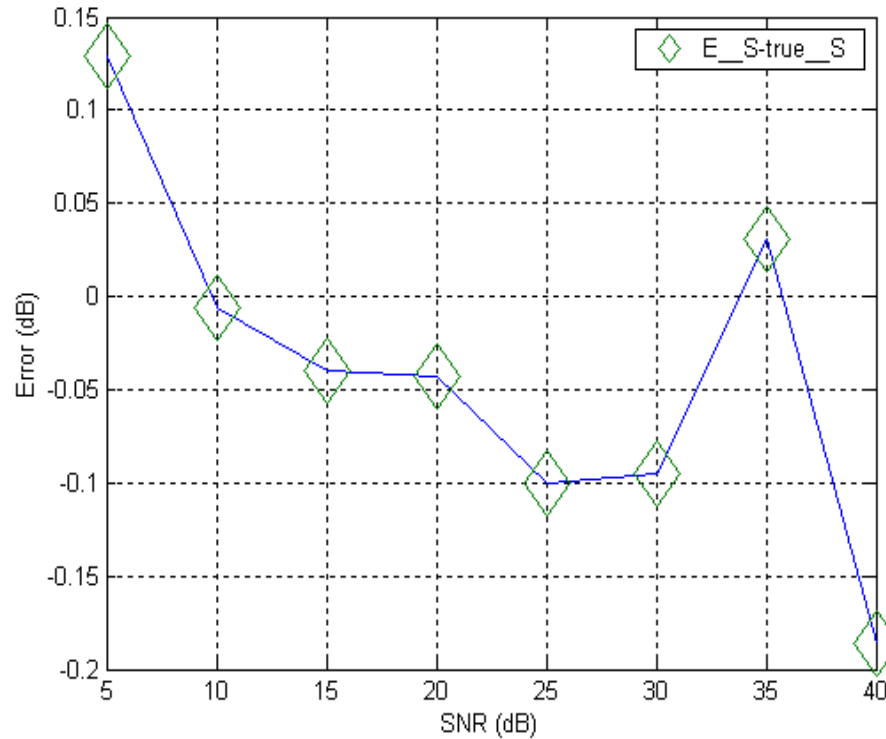


TABLE II. SIMULATED TEST RESULT

SNR	5	10	15	20	25	30	35	40
E_S	5.129	9.9943	14.96	19.957	24.9	29.9	35.0	39.814
E_A1	19.954	20.071	20.086	19.980	19.990	20.2	20.0	20.044
E_A2	39.777	39.790	40.337	39.957	40.205	40.4	39.9	40.028
E_A3	59.730	59.901	60.360	60.333	59.818	60.4	59.9	60.050
SD_A1	2.0001	2.0013	2.0001	2.0033	2.0032	2.00	2.00	2.0016
SD_A2	2.8839	2.8868	2.5853	2.5821	2.5823	3.16	2.58	2.8957
SD_A3	3.4577	2.9001	3.1633	3.1634	3.1938	3.16	3.16	2.8725





- CRC Test18 Scenario: Location **scenario 6** (TX at (122 dgs, 300 meters) beside a building) with a 905 MHz FM signal and high RX. **AOA static error** (~8 dgs) comes from inaccurate angle alignment between the TX and RX.
- **AI\_A~SD\_A** for various SNRs, especially from 20 to 35 dB.

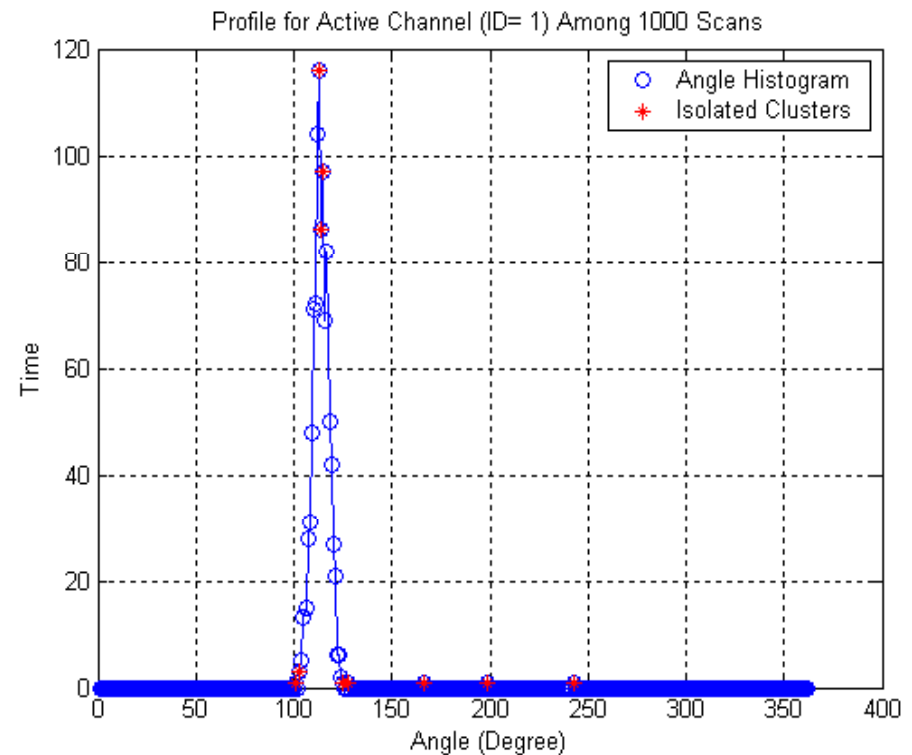
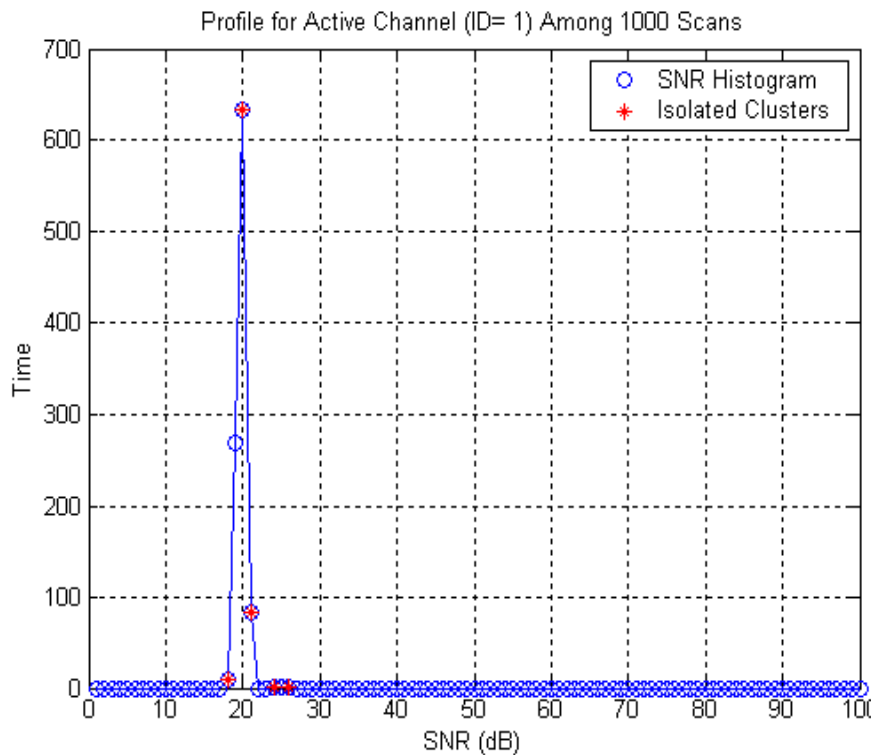
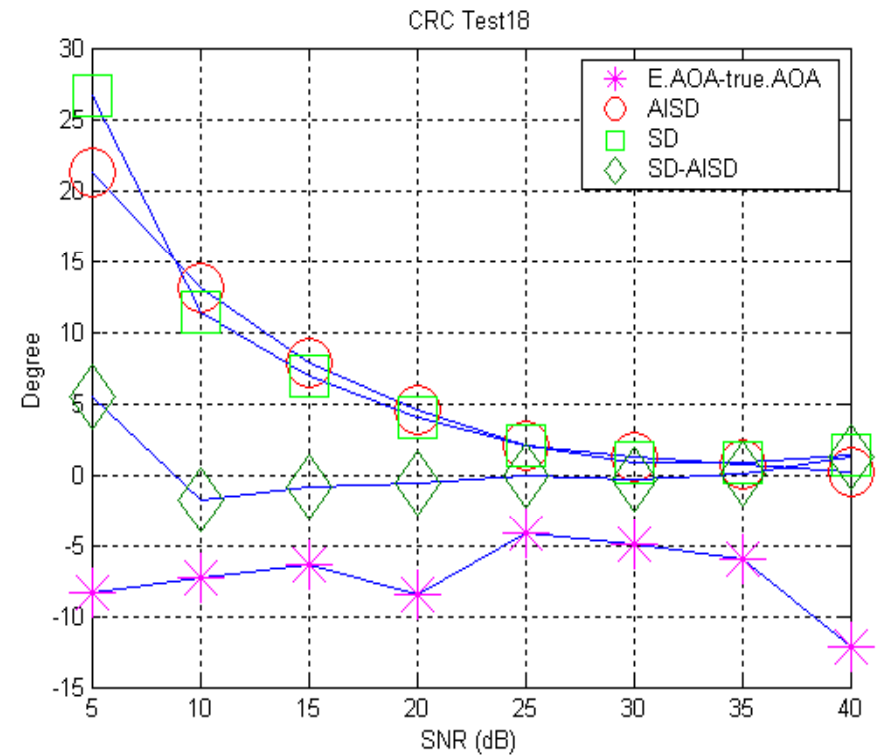
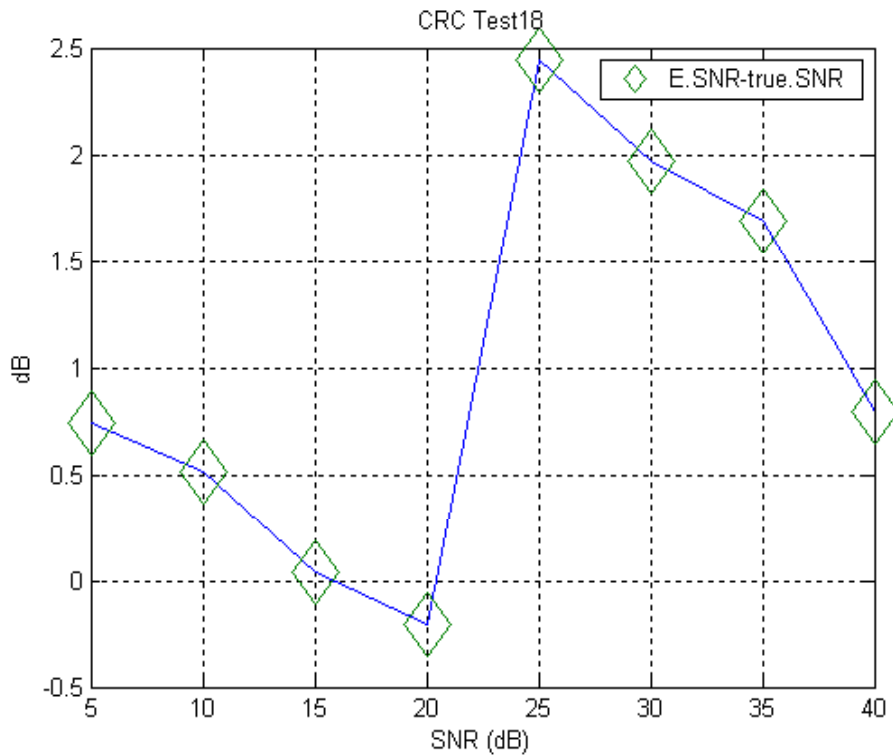




TABLE III. CRC TEST18 RESULT

SNR	5	10	15	20	25	30	35	40
E_S	5.7	10.5	15.0	19.8	27.4	32.0	36.7	40.8
E_A	113.58	114.73	115.59	113.57	117.89	117	116	109.87
AI_A	21.248	13.152	7.7716	4.5715	2.0420	1.21	0.74	0.1770
SD_A	26.664	11.326	6.9228	4.0318	2.0029	0.82	0.82	1.4204



- CRC Test23 Scenario: Location **scenario 7** (TX at (10 dgs, 350 meters) behind 20' high trees) with a 39 MHz FM signal and high RX.
- **AI\_A~SD\_A for various SNRs, especially from 20 to 35 dB.**

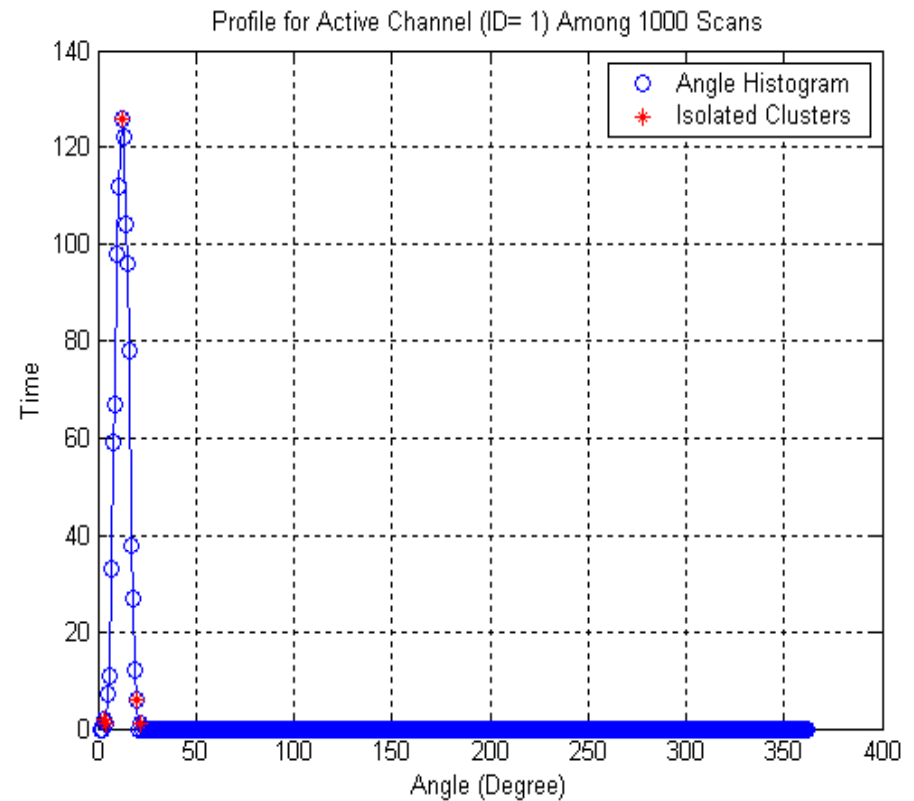
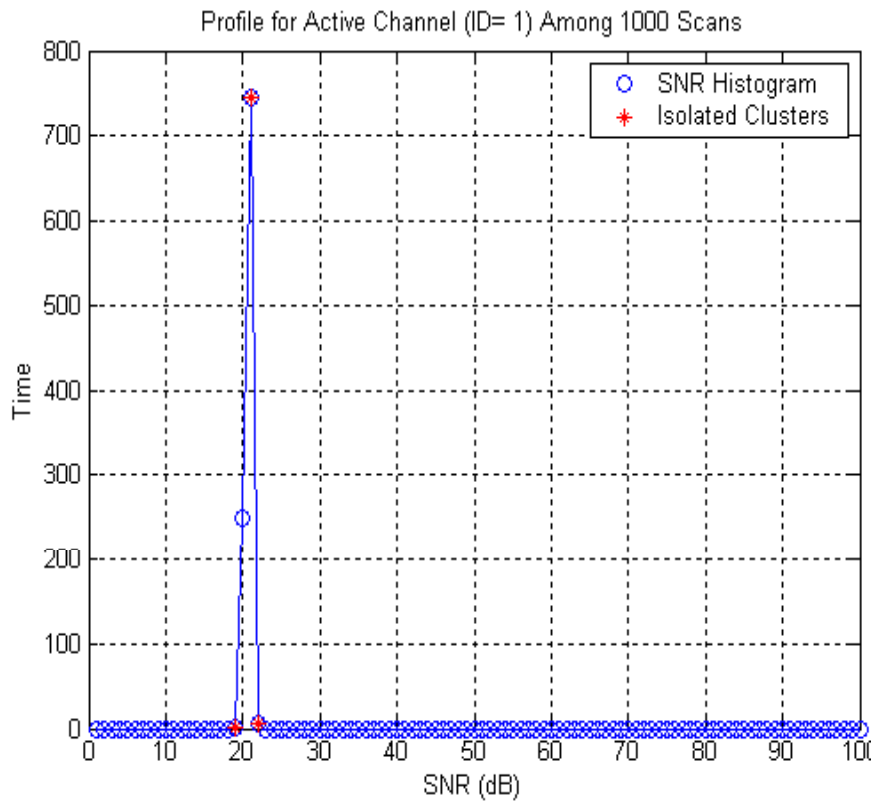
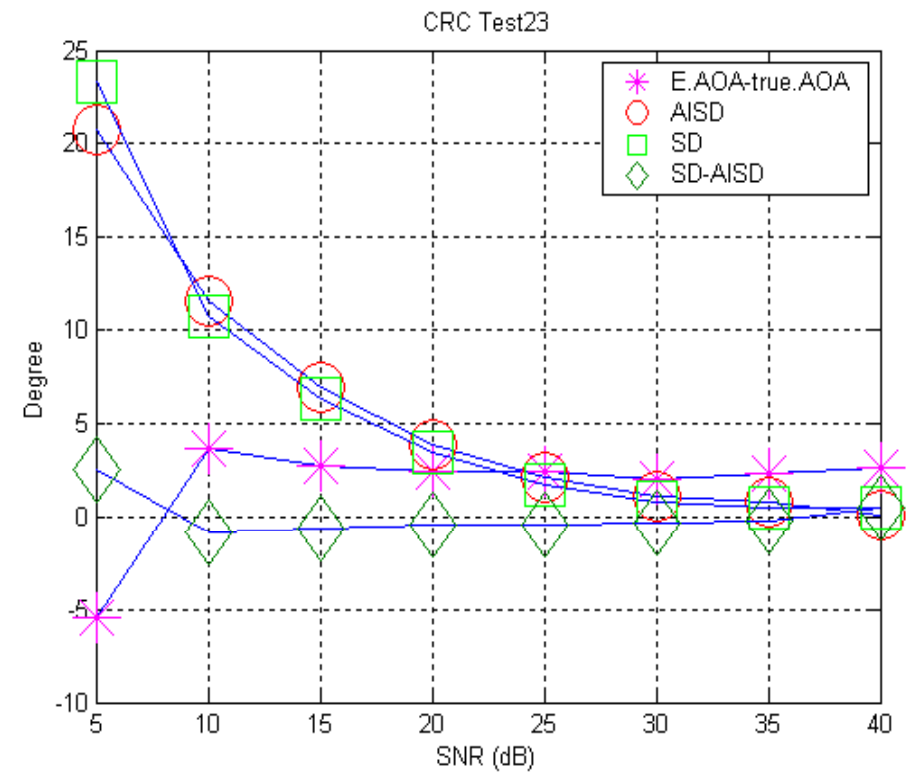
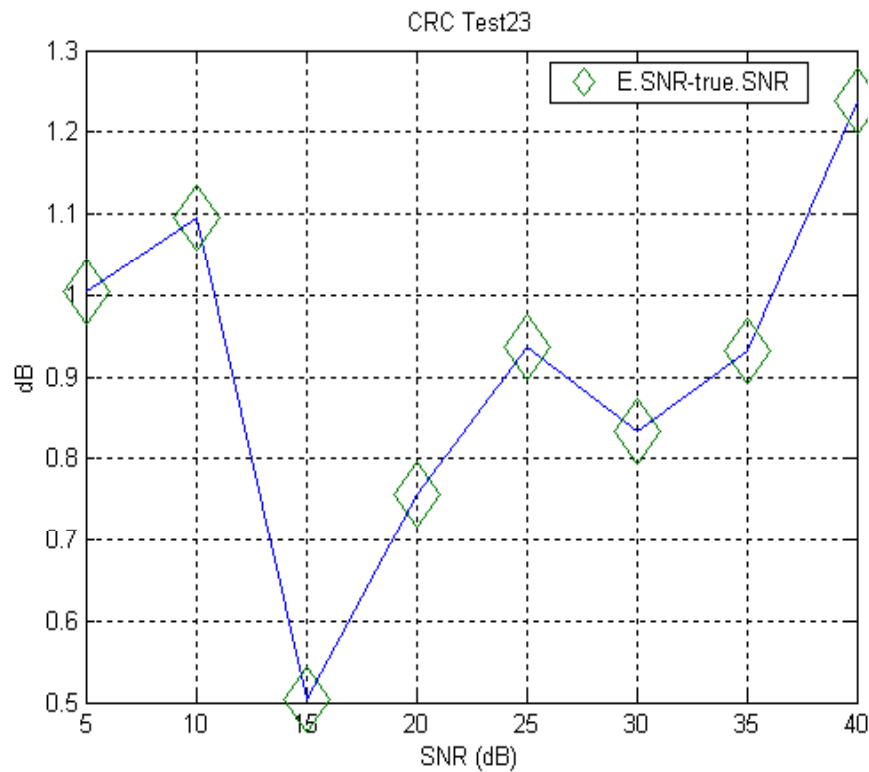


TABLE IV. CRC TEST23 RESULT

SNR	5	10	15	20	25	30	35	40
E_S	6.0043	11.095	15.504	20.756	25.936	30.8	35.9	41.237
E_A	4.5275	13.709	12.703	12.388	12.422	12.0	12.4	12.657
AI_A	20.759	11.531	6.9510	3.8350	2.1150	1.15	0.79	0.0750
SD_A	23.299	10.686	6.3475	3.4539	1.7096	0.82	0.52	0.5241



- CRC Test17 Scenario: Location **scenario 6** (TX at (122 dgs, 300 meters) beside a building) with a 905 MHz AM signal and high RX. Again, **the AOA static error (~8 dgs) exists**.

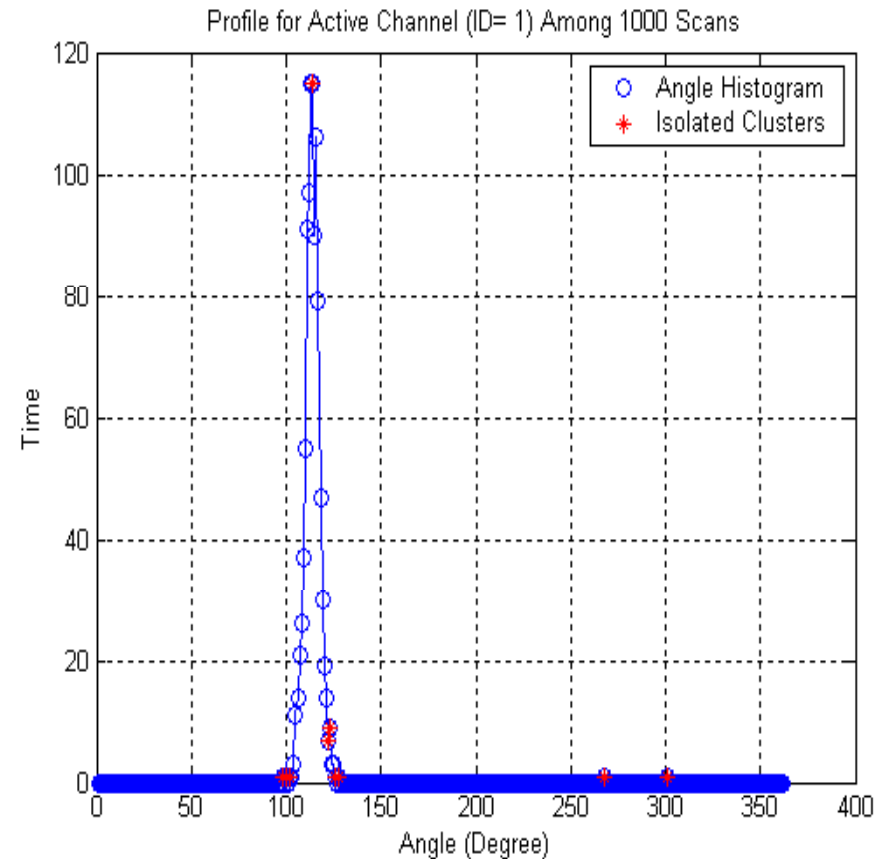
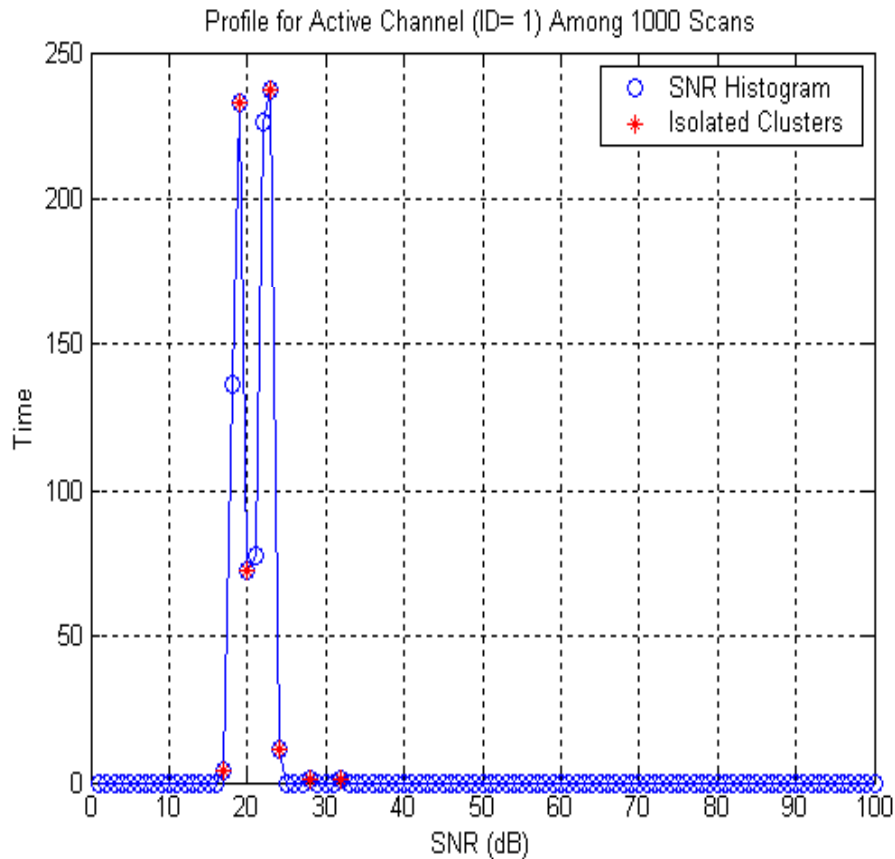
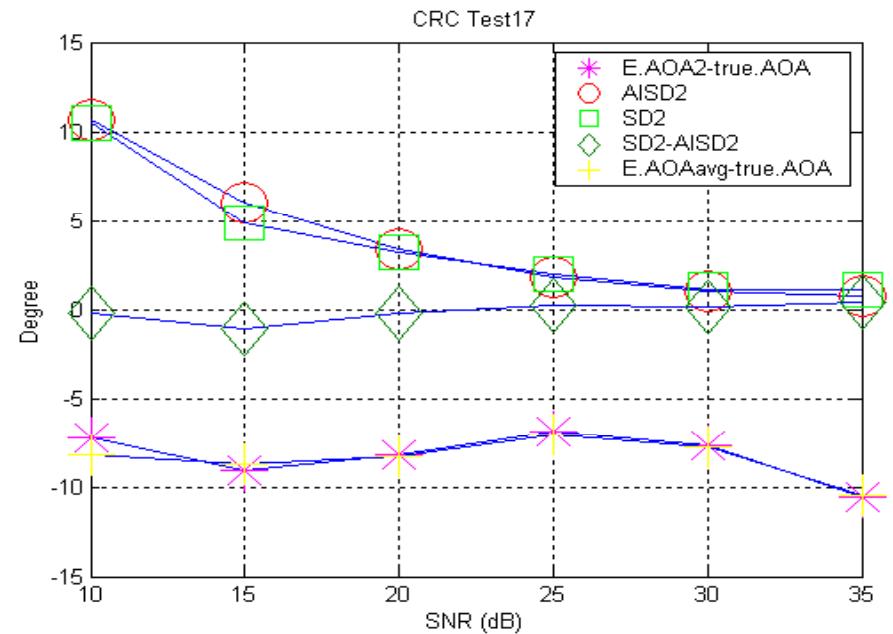
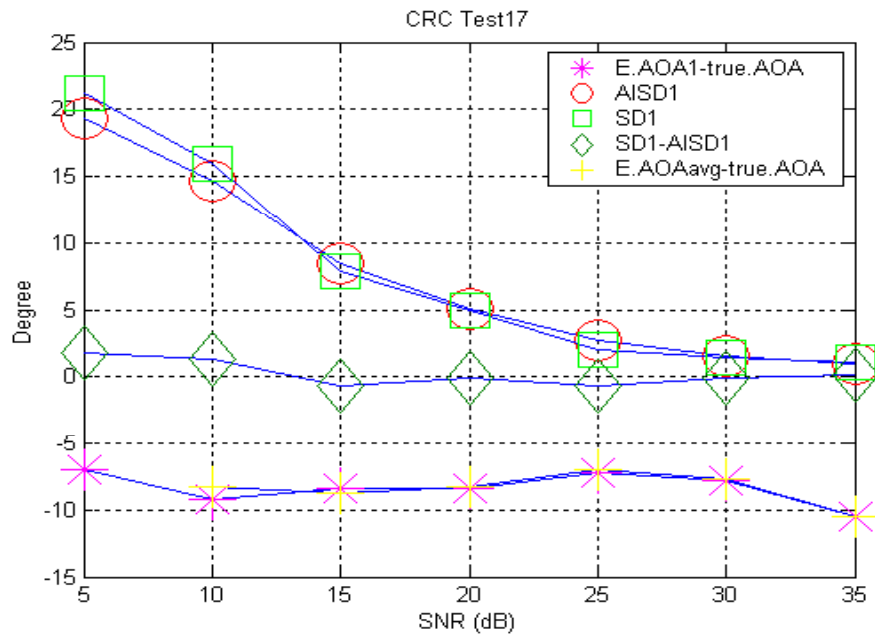
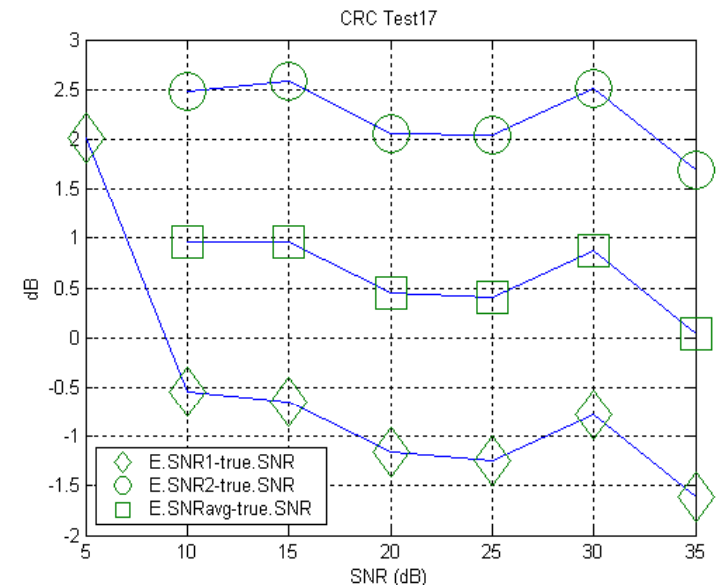


TABLE V. CRC TEST17 RESULT

SNR	5	10	15	20	25	30	35
E_S1	7.0068	9.4573	14.349	18.841	23.754	29.224	33.384
E_S2	-	12.476	17.585	22.056	27.042	32.513	36.690
E_A1	114.96	112.75	113.55	113.58	114.81	114.19	111.54
E_A2	-	114.78	112.95	113.81	115.10	114.32	111.42
AI_A1	19.368	14.653	8.4600	5.0516	2.6765	1.4971	0.9963
AI_A2	-	10.676	5.9791	3.3824	1.8153	1.0352	0.7481
SD_A1	21.162	15.924	7.8082	4.9334	2.0090	1.4271	1.1189
SD_A2	-	10.466	4.8993	3.1677	2.0024	1.1326	1.1211
ESavg	-	10.967	15.967	20.449	25.398	30.869	35.037
EAavg	-	113.77	113.25	113.70	114.96	114.26	111.48



Study of Limitation: Various SNR and AOA fluctuations between 2 (Signal\_1/2) angularly close signals were simulated.

- **Signal\_1**: SNR1  $\sim |N(5:5:40\text{-dB}, 1:5\text{-dB SD})|$ ,  
 AOA1  $\sim |N(21\text{-dg}, 1:5\text{-dg SD})|$ ,  
 AOA1 ISD  $\sim |N(0, 1:5\text{-dg SD})|$ .
- **Signal\_2**: SNR2  $\sim |N(40\text{-dB}, 1:5\text{-dB SD})|$ ,  
 AOA2  $\sim |N(20\text{-dg}, 1:5\text{-dg SD})|$ ,  
 AOA2 ISD  $\sim |N(0, 1:5\text{-dg SD})|$ .
- AOA ISDs/SDs were set purposely to be independent of the SNRs.
- 1000 and 25 samples (scans) were used.

TABLE VI. RESULT FOR SIGNAL\_1 (1000 SCANS)

SNR1	5	10	15	20	25	30	35	40
E_S1	5.5007	9.958	14.958	19.958	24.958	30.0	35.1	39.990
E_A1	21.002	21.020	21.020	21.020	21.020	21.0	21.0	-
E_S2	4.9085	9.921	14.921	19.921	24.921	30.0	34.7	39.968
E_A2	21.076	21.071	21.071	21.071	21.071	21.1	21.0	-
E_S3	5.8986	9.9716	14.876	19.876	24.814	30.3	37.3	39.723
E_A3	21.005	21.117	21.117	21.117	21.118	21.1	-	-
E_S4	-	9.5632	14.750	19.720	25.041	29.7	34.3	39.237
E_A4	-	21.157	21.152	21.139	21.11	21.1	21.0	-
E_S5	-	-	17.137	22.397	25.539	30.1	35.2	38.677
E_A5	-	-	21.021	21.017	20.115	21.2	20.1	-

TABLE VII. RESULT FOR SIGNAL\_2(1000 SCANS)

SNR1	5	10	15	20	25	30	35	40
E_S1	40.021	40.021	40.021	40.021	40.021	40.0	40.0	39.990
E_A1	20.007	20.007	20.007	20.007	20.007	20.0	20.0	-
E_S2	40.031	40.031	40.031	40.031	40.031	40.0	39.8	39.968
E_A2	20.014	20.014	20.014	20.014	20.014	20.0	20.1	-
E_S3	38.644	38.644	38.644	38.644	38.619	40.1	37.3	39.723
E_A3	19.941	19.941	19.941	19.941	19.942	19.9	-	-
E_S4	-	38.302	38.302	38.554	38.548	38.6	40.6	39.237
E_A4	-	20.139	20.139	20.130	20.111	20.2	20.1	-
E_S5	-	37.878	37.878	37.853	37.580	40.9	40.2	38.677
E_A5	-	20.034	20.034	20.034	19.947	19.8	20.2	-

- The smaller AOA/SNR SDs and the bigger SNR1 lead to the more accurate the E\_S and E\_A.
- As the SNR1 increases to 40 (35 in one case) dB, both signals tend to be merged.
- The estimations fail when AOA/SNR SDs are big (4, 5-dg/dB) and SNR1 is low (5, 10-dB).
- In general, when the AOA/SNR SDs are not significant, the histogram-based algorithms can estimate close signals with great accuracy.



TABLE VIII. RESULT FOR SIGNAL\_1 (25 SCANS)

SNR1	5	10	15	20	25	30	35	40
E_S1	5.08	10.08	15.08	20.08	25.08	30.1	35.1	40.04
E_A1	21	21	21	21	21	21	21	-
E_S2	5.2	10.2	15.2	20.2	25.2	30.2	34.9	40.16
E_A2	20.960	20.960	20.960	20.960	20.960	21.0	21.1	22.191
E_S3	5.6	9.5714	14.571	19.571	24.571	29.6	-	41.167
E_A3	21.268	-	-	-	-	-	-	23.385

TABLE IX. RESULT FOR SIGNAL\_2 (25 SCANS)

SNR1	5	10	15	20	25	30	35	40
E_S1	40	40	40	40	40	40	40	40.04
E_A1	19.75	19.75	19.75	19.75	19.75	19.8	19.8	-
E_S2	40.12	40.12	40.12	40.12	40.12	40.1	39.7	40.16
E_A2	19.240	19.240	19.240	19.240	19.240	19.2	19.4	19.088
E_S3	41.533	41.533	41.533	41.533	41.533	41.5	41.5	41.167
E_A3	-	-	-	-	-	-	-	18.120

- For 25 scans, the estimations are not as accurate as the 1000-scan case. However, when the AOA/SNR SDs are not significant ( $<3$ -dg/dB), the histogram-based algorithms can estimate close signals with great accuracy, even when the number of scans is low.
- By CRC-measured results, when SNR is larger than 25 dB, its AOA SD is less than 3 dgs. Thus, for actual signals with large SNR, the histogram-based algorithms may estimate with great accuracy using small number of scanned samples.



# Conclusions

- It is effective to use the histogram-based algorithms to process the preliminary channel usage info set to get the overall channel usage report.
- When the SNR is significant, only a small number of scanned samples may be needed for the histogram-based algorithms.

