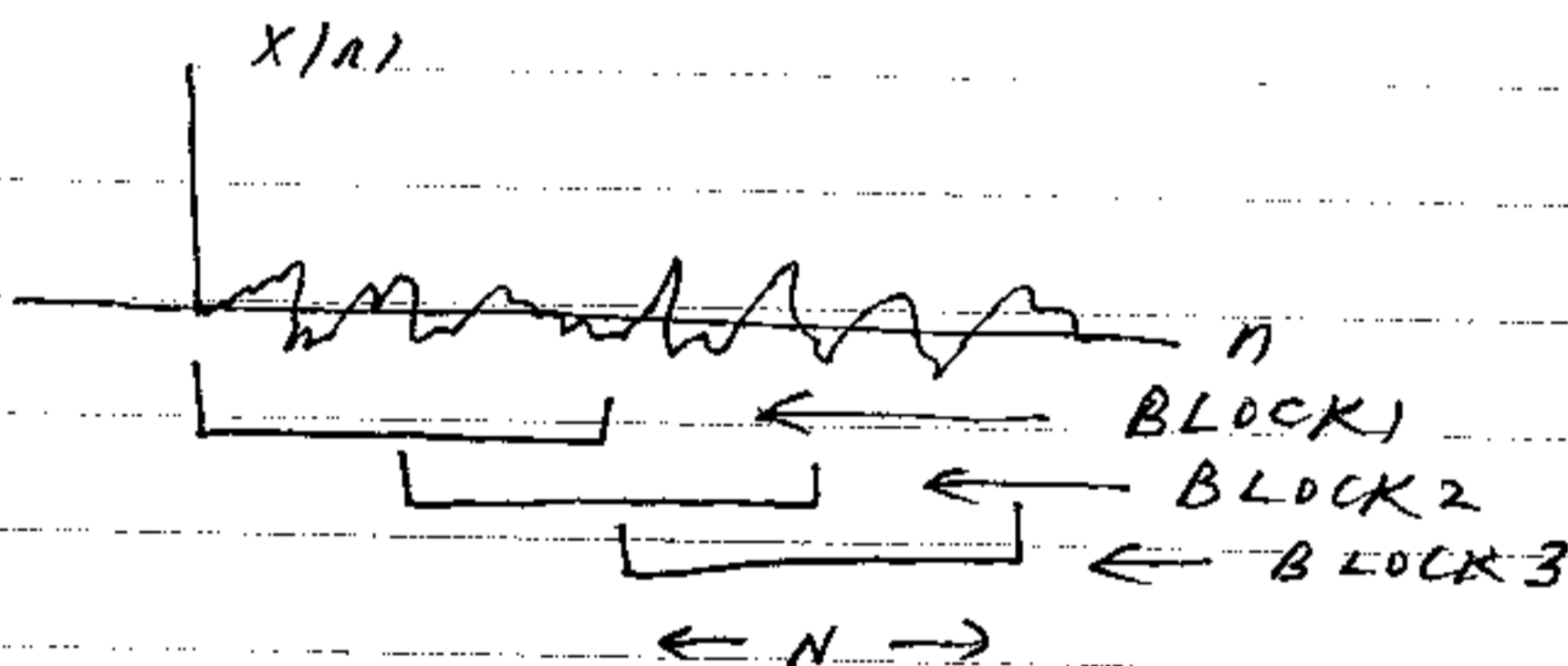


ASSUME f_0 IS MULTIPLE OF $1/N$
 FOR ANALYSIS. ALSO, IN PRACTICE
 CANNOT COMPUTE FFT FOR EACH
 ASSUMED n_0 . USUALLY USE
 50% OVERLAP OR

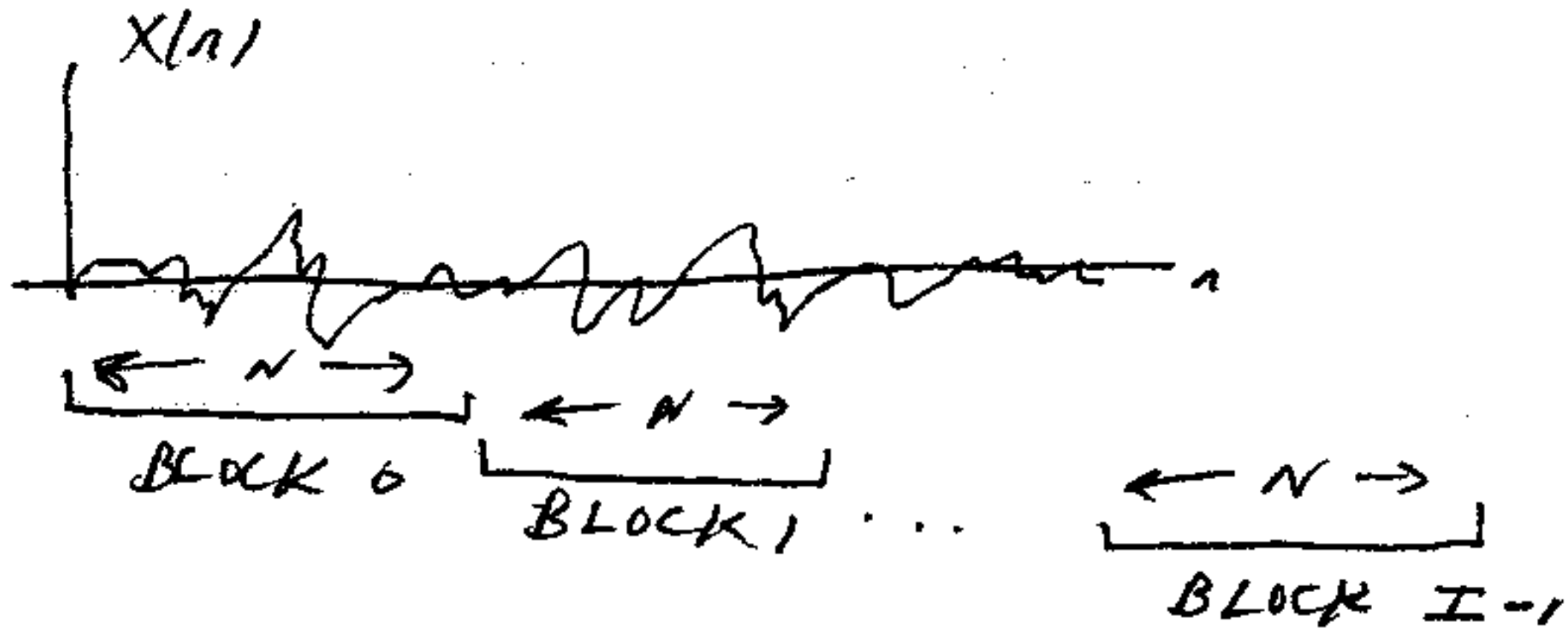


SOME LOSS RELATIVE TO SHIFTING
 BLOCK FOR EACH SAMPLE. WORST
 CASE LOSS IS ABOUT 1.5 dB DUE TO
 LOSS IN SIGNAL ENERGY BY $1/4$.

ASSUME FOR PURPOSES OF ANALYSIS
 WE USE NONOVERLAPPING BLOCKS
 AND SIGNAL LIES ENTIRELY IN
 ONE BLOCK \Rightarrow BLOCKS ARE INDE-

PENDING. CAN SHOW THIS IS
REASONABLE APPROXIMATION TO
50% OVERLAP CASE.

PROBLEM:



$$H_0: x_i(n) = w_i(n) \quad n = 0, 1, \dots, N-1$$

$$i = 0, 1, \dots, I-1$$

$$H_1: x_i(n) = \begin{cases} w_i(n) & n = 0, 1, \dots, N-1 \\ A \cos(2\pi f_0 n + \phi) + w_i(n) & n = 0, 1, \dots, N-1 \\ w_i(n) & n = 0, 1, \dots, N-1 \end{cases}$$

$$i = 0, 1, \dots, i_0 - 1$$

$$i = i_0$$

$$i = i_0 + 1, \dots, I-1$$

$\uparrow k_0/N$

$x_i(n)$ IS i^{th} BLOCK

ALL $w_i(n)$ 'S ARE INDEPENDENT
(NONOVERLAPPING)

GLRT DECIDES H_1 IF

$$T(\alpha) = \max_{i,k} \frac{1}{N} \left| \sum_{n=0}^{N-1} x_i(n) e^{-j \frac{2\pi}{N} kn} \right|^2 > \delta$$

$$= \max_{i,k} \frac{1}{N} |x_i(k)|^2 > \delta'$$

UNDER H_1 , SIGNAL HAS FREQUENCY
 $f_0 = k_0/N$ ($k_0 \equiv$ DFT BIN) AND
 CONTAINED IN BLOCK i_0 .

k_0 = DOPPLER BIN OF SIGNAL

i_0 = RANGE BIN OF SIGNAL

$\Rightarrow \frac{1}{N} |x_{i_0}(k)|^2 = \underline{\text{RANGE-DOPPLER MAP}}$

DETECTION PERFORMANCE

NEED PDF OF $x(k)$ $k=1, 2, \dots, \frac{N}{2}-1$
 FOR WGN OR

$$x(k) = \sum_{n=0}^{N-1} w(n) e^{-j \frac{2\pi}{N} kn}$$

$$= \sum_{n=0}^{N-1} w(n) \cos \frac{2\pi}{N} kn - j \sum_{n=0}^{N-1} w(n) \sin \frac{2\pi}{N} kn$$

$$= u(k) + j v(k)$$

BUT $\{ u(1), u(2), \dots, u(\frac{N}{2}-1),$
 $v(1), v(2), \dots, v(\frac{N}{2}-1) \}$

ARE ALL GAUSSIAN AND IID WITH MEAN ZERO AND VARIANCE $N\sigma^2/2$.

$$\begin{pmatrix} \underline{U} \\ \underline{V} \end{pmatrix} = \underbrace{\begin{bmatrix} \underline{c}_1^T \\ \vdots \\ \underline{c}_{N/2-1}^T \\ \underline{s}_1^T \\ \vdots \\ \underline{s}_{N/2-1}^T \end{bmatrix}}_{\underline{H} \quad 2(N/2-1) \times N} \underline{W}$$

$$\underline{c}_i = [1 \quad \dots \quad \cos \frac{2\pi}{N} i \quad \dots \quad \cos \frac{2\pi}{N} i(N-1)]^T$$

$$\underline{s}_i = [0 \quad -\sin \frac{2\pi}{N} i \quad \dots \quad -\sin \frac{2\pi}{N} i(N-1)]^T$$

$$\begin{aligned} \underline{c}_i^T \underline{c}_j &= N/2 \delta_{ij} \\ \underline{s}_i^T \underline{s}_j &= N/2 \delta_{ij} \\ \underline{c}_i^T \underline{s}_j &= 0 \quad \text{ALL } i, j \end{aligned}$$

$\Rightarrow \underline{H}$ IS SCALED "ORTHOGONAL" MATRIX AND $\underline{H} \underline{H}^T = \frac{N}{2} \underline{I}$.

$$\begin{pmatrix} \underline{U} \\ \underline{V} \end{pmatrix} = \underline{H} \underline{W}$$

$$\begin{aligned} E \left[\begin{pmatrix} \underline{U} \\ \underline{V} \end{pmatrix} \begin{pmatrix} \underline{U} \\ \underline{V} \end{pmatrix}^T \right] &= \underline{H} E(\underline{W} \underline{W}^T) \underline{H}^T = \underline{H} \sigma^2 \underline{I} \underline{H}^T \\ &= \frac{N\sigma^2}{2} \underline{I} \end{aligned}$$

$$\text{LET } T_{i,k}(z) = \frac{|X_i(k)|^2}{N\sigma^2/2} = \frac{U_i^2(k) + V_i^2(k)}{N\sigma^2/2}$$

BUT FOR A GIVEN i ALL
 $U_i(k), V_i(k)$ ARE INDEPENDENT
 ($\text{COV}(U_i(k), V_i(l)) = 0$ ALL k, l
 $\text{COV}(U_i(k), U_i(l)) = 0$ $k \neq l$
 $\text{COV}(V_i(k), V_i(l)) = 0$ $k \neq l$)

AND THEY ARE INDEPENDENT FROM BLOCK
 TO BLOCK. WHY?

$\Rightarrow T_{i,k}(x) \sim \chi^2$ UNDER H_0
 ALL i, k AND INDEPENDENT

$$P_{FA} = P_r \left\{ \max_{i,k} \frac{\sigma^2}{2} T_{i,k}(x) > \gamma'; H_0 \right\}$$

$$= P_r \left\{ \max_{i,k} T_{i,k}(x) > \frac{2\gamma'}{\sigma^2}; H_0 \right\}$$

$$= 1 - P_r \left\{ \max_{i,k} T_{i,k}(x) < \frac{2\gamma'}{\sigma^2}; H_0 \right\}$$

$$= 1 - P_r \left\{ T_{i,k}(x) < \frac{2\gamma'}{\sigma^2} \text{ FOR ALL } i, k; H_0 \right\}$$

\uparrow IID

$$= 1 - \prod_{i,k} P_r \left\{ T_{i,k}(x) < \frac{2\gamma'}{\sigma^2}; H_0 \right\} \quad \text{INDEPENDENCE}$$

$$= 1 - P_r \left\{ T_{i,k}(x) < \frac{2\gamma'}{\sigma^2}; H_0 \right\}^L \quad \text{IDENTICALLY DISTRIBUTED}$$

WHERE $L = I(N/2 - 1) = \text{NUMBER OF}$

RANGE AND DOPPLER BINS SEARCHED
OVER FOR MAXIMUM.

$$\text{BUT } P_r \left\{ \underbrace{T_{i,k}(x)}_{\chi^2_2} < \frac{2\gamma'}{\sigma^2}; H_0 \right\}$$

$$= \int_0^{2\gamma'/\sigma^2} \frac{1}{2} e^{-\frac{1}{2}u} du$$

$$= 1 - e^{-\gamma'/\sigma^2}$$

$$\Rightarrow P_{FA} = 1 - (1 - e^{-\gamma'/\sigma^2})^L$$

USUALLY WANT PFA SMALL \Rightarrow

$$e^{-\gamma'/\sigma^2} \ll 1 \quad \text{BUT}$$

$$(1-x)^L \approx 1-Lx \quad \text{FOR } x \ll 1$$

$$\begin{aligned} \Rightarrow P_{FA} &\approx 1 - (1 - L e^{-\gamma'/\sigma^2}) \\ &= L e^{-\gamma'/\sigma^2} \end{aligned}$$

$$\text{BUT } e^{-\gamma'/\sigma^2} = P_r \left\{ T_{i,k}(x) > \frac{2\gamma'}{\sigma^2}; H_0 \right\}$$

= PROBABILITY THAT

$$\frac{1}{N} |x_i(k)|^2 > \gamma'$$

= PROBABILITY OF FALSE ALARM

IN A SINGLE BIN . = PFA(BIN)

$\therefore PFA = L PFA(\text{BIN})$
 \propto NUMBER OF BINS
 SEARCHED.

TO FIND P_D MUST DEFINE A
 DETECTION. DETECTION OCCURS
 WHEN $\max_{i,h} \frac{1}{N} |x_i(h)|^2 > \gamma'$ AND

MAXIMUM OCCURS FOR CORRECT
 RANGE-DOPPLER BIN. (NO DETECTION
 IF NOISE CAUSES THRESHOLD
 EXCEEDANCE AND IS LARGER THAN
 SIGNAL BIN OUTPUT)

$$P_D = P_r \left\{ \frac{\sigma^2}{2} T_{i_0, k_0}(z) > \gamma'; H_1 \right\}$$

\uparrow SIGNAL BIN

$$= P_r \left\{ T_{i_0, k_0}(z) > \frac{2\gamma'}{\sigma^2}; H_1 \right\}$$

$\frac{\sigma^2}{2} T_{i_0, k_0}(z) = I(f)$ IS JUST PERIODOGRAM.
 ALREADY SHOWED THAT

$$P_D = P_r \left\{ I(f_0) > \gamma'; H_1 \right\}$$

(UNKNOWN A, ϕ AND KNOWN f_0)

$$= P_s \left\{ \frac{I(f_0)}{\sigma^2/2} > \frac{\delta'}{\sigma^2/2}; H_1 \right\} \quad \lambda = NA^2/c$$

$$= Q_{\chi^2_2(\lambda)} \left(2\delta'/\sigma^2 \right) \quad \text{SEE PG 17 IN BOOK}$$

SINCE $P_{FA} = L e^{-\delta'/\sigma^2}$ (CHAPTER 7)

$$\delta'/\sigma^2 = L N L / P_{FA}$$

$$\therefore P_D = Q_{\chi^2_2(\lambda)} \left(2 L N \frac{L}{P_{FA}} \right)$$

$$\text{WHERE } \lambda = \frac{NA^2}{2\sigma^2}$$

EXAMPLE : SPECS: $P_{FA} = 10^{-4}$

$$P_D = 0.5$$

WISH TO DETECT TARGET OUT TO $R =$

5000 YDS. USING 1 PING PER 10

SECONDS. INPUT SNR = $\frac{A^2}{2\sigma^2} \geq 0.1$ (-10 dB).

OBSERVATION INTERVAL MUST BE

TWICE MAX. ROUND TRIP DELAY

$$T = 2R/c = \frac{2(5000)(3)}{5000} = 6 \text{ SEC.}$$

IF SIGNAL HAS FREQUENCY OF

$F_T = 30,000 \text{ Hz}$ AND DOPPLER CAUSES

A ± 500 HZ SHIFT, THEN BANDWIDTH
 IS 1000 HZ \Rightarrow SAMPLE AT 2000 HZ.

$$\text{BUT } I(N/2 - 1) = L$$

$$\text{AND } NI = \text{NUMBER OF SAMPLES} \\ = 12000$$

$$L \approx \frac{1}{2} NI = 6000$$

$$P_D = Q_{\chi^2_2}(\lambda) \left(2LN \frac{L}{PFA} \right)$$

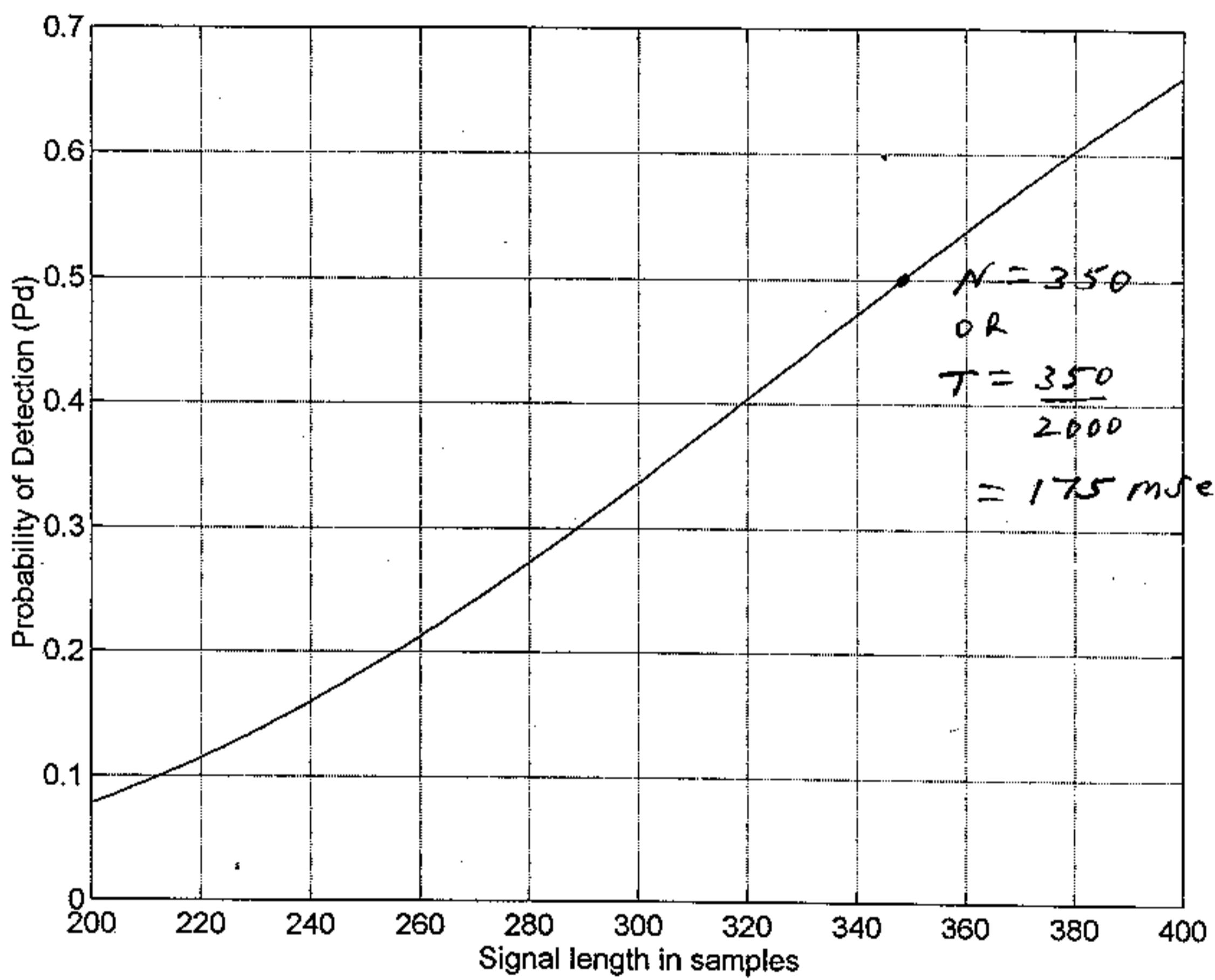
$$= Q_{\chi^2_2}(\lambda) \left(2LN \frac{6000}{10^{-4}} \right)$$

$$\text{WHERE } \lambda = \frac{NA^2}{2\sigma^2} = 0.1N$$

$$P_D = Q_{\chi^2_2}(0.1N) (35.82) = 0.5$$

USE CHI2.M WITH

$$P_D = \text{CHI2.M} \left(\underset{\substack{\uparrow \\ \nu}}{2}, \underset{\substack{\uparrow \\ \lambda}}{0.1N}, \underset{\substack{\uparrow \\ X}}{35.82}, \underset{\substack{\uparrow \\ \text{ERROR}}}{0.001} \right)$$



SKIP CHAPTER 8.

CHAPTER 9 - UNKNOWN NOISE PARAMETERS

NOW CONSIDER CASE WHERE PDF UNDER H_0 IS NOT COMPLETELY KNOWN.

RECALL THAT TO FIND THRESHOLD:

$$\begin{aligned} PFA &= P_c \{ T(\underline{x}) > \gamma'; H_0 \} \\ &= \int_{\gamma'}^{\infty} p(T; H_0) dT = \alpha \end{aligned}$$

IF $p(\underline{x}; H_0)$ NOT COMPLETELY KNOWN,
THEN $p(T; H_0)$ NOT " " " \Rightarrow
CAN'T FIND γ' .

EXAMPLE: DC LEVEL IN WGN, $A > 0$ KNOWN
DECODE H_1 IF

$$T(\underline{x}) = \bar{x} > \frac{\sigma^2}{NA} \ln \gamma + \frac{A}{2} = \gamma'$$

$T(\underline{x}) \sim N(0, \sigma^2/N)$ UNDER H_0

$$\Rightarrow PFA = Q\left(\frac{\gamma'}{\sqrt{\sigma^2/N}}\right)$$

$$\gamma' = \sqrt{\sigma^2/N} \Phi^{-1}(\text{PFA})$$

IF σ^2 IS UNKNOWN, CAN'T SET THRESHOLD,

POSSIBLE APPROACH IS

$$\hat{\gamma}' = \sqrt{\frac{\hat{\sigma}^2}{N}} \Phi^{-1}(\text{PFA})$$

$$\hat{\sigma}^2 = \frac{1}{N} \sum_{n=0}^{N-1} x^2(n) \quad \text{"ESTIMATE AND PLUG"}$$

PROBLEMS:

1) $\hat{\sigma}^2$ WILL BE BIASED UNDER H_1

$$E(\hat{\sigma}^2) = \sigma^2 + A^2$$

2) PDF NO LONGER CORRECT

SINCE

$$\bar{x} > \sqrt{\frac{\hat{\sigma}^2}{N}} \Phi^{-1}(\text{PFA})$$

$$\frac{\bar{x}}{\sqrt{\hat{\sigma}^2/N}} > \Phi^{-1}(\text{PFA})$$

↑ NOT $N(0,1)$

ANOTHER APPROACH USES EXTRA
 NOISE SAMPLES $w_r(n)$ $n = 0, 1, \dots, N-1$
 (IF AVAILABLE)

DECIDE H_1 IF

$$\frac{\frac{1}{N} \sum_0^N x(n)}{\sqrt{\hat{\sigma}^2/N}} > \gamma^0$$

WHERE $\hat{\sigma}^2 = \frac{1}{N} \sum_{n=0}^{N-1} w_r(n)^2$

\Rightarrow NO BIAS, PDF UNDER H_0
 CAN BE FOUND (STUDENT t PDF) AND
 DOES NOT DEPEND ON σ^2

$\sqrt{\hat{\sigma}^2/N}$ CALLED NORMALIZATION FACTOR

IF THRESHOLD MAY BE SET INDEPENDENT
 OF UNKNOWN PARAMETER \Rightarrow

CONSTANT FALSE ALARM RATE
 (CFAR) DETECTOR (MEETS
 NP CONDITIONS)

NOW CONSIDER GLRT APPROACH.

EXAMPLE : KNOWN DC LEVEL IN WGN
 σ^2 IS UNKNOWN

GLRT DECIDES \mathcal{H}_1 IF

$$L_G(x) = \frac{p(x; \hat{\sigma}_1^2, \mathcal{H}_1)}{p(x; \hat{\sigma}_0^2, \mathcal{H}_0)} > \gamma$$

NOTE DIFFERENT MLES UNDER $\mathcal{H}_0, \mathcal{H}_1$.
 (DIFFERENT THAN "ESTIMATE AND PLUG")
 EASILY SHOWN THAT

$$\hat{\sigma}_0^2 = \frac{1}{N} \sum_n x^2(n)$$

$$\hat{\sigma}_1^2 = \frac{1}{N} \sum_n (x(n) - A)^2$$

$$L_G(x) = \left(\frac{\hat{\sigma}_0^2}{\hat{\sigma}_1^2} \right)^{N/2}$$

TO SHOW THAT IT IS NOT CFAR :

UNDER \mathcal{H}_0 $x(n) = \sigma u(n)$ $u(n) \sim N(0, 1)$

$$L_G(x)^{2/N} = \frac{\frac{1}{N} \sum_n \sigma^2 u^2(n)}{\frac{1}{N} \sum_n (\sigma u(n) - A)^2}$$

$$= \frac{\frac{1}{N} \sum u^2(n)}{\frac{1}{N} \sum (u(n) - A/\sigma)^2}$$

DEPENDS ON σ^2 . A SUFFICIENT
CONDITION FOR STATISTIC TO BE
CFAR IS SCALE INVARIANCE OR

$$T(\sigma x) = T(x) \quad \text{ALL } \sigma > 0.$$

GLRT MAY NOT RESULT IN CFAR
DETECTOR.

EXAMPLE: UNKNOWN DC LEVEL IN
WGN WITH UNKNOWN σ^2

SEE EXAMPLE 6.5. GLRT DECIDES
 \mathcal{H}_1 IF

$$T(x) = 2 \ln L_G(x) = N \ln \frac{1}{1 - \frac{\bar{x}^2}{\hat{\sigma}_0^2}} > \gamma$$

SHOWN TO BE CFAR SINCE IT IS
SCALE INVARIANT. ALSO,

$$T(x) \approx \chi_1^2 \quad \text{UNDER } \mathcal{H}_0$$

ASYMPTOTICALLY CAN EASILY
FIND THRESHOLD FROM PDF.

IN GENERAL, IF WE HAVE

$$H_0: \underline{\theta}_r = \underline{\theta}_{r_0}, \underline{\theta}_s$$

$$H_1: \underline{\theta}_r \neq \underline{\theta}_{r_0}, \underline{\theta}_s$$

WHERE $\underline{\theta}_s$ ARE NUISANCE

PARAMETERS OR NOISE PARAMETERS

$$\Rightarrow 2LN L_G(x) \approx \chi_r^2$$

\Rightarrow ASYMPTOTICALLY CFAR

IN PREVIOUS EXAMPLE

$$\underline{\theta}_r = A, \underline{\theta}_s = \sigma^2$$

GLRT FOR WGN - σ^2 UNKNOWN

CASE 1: KNOWN DETERMINISTIC SIGNAL

CASE 2: DETERMINISTIC SIGNAL WITH
UNKNOWN PARAMETERS

CASE 1: $H_0: x(n) = w(n) \quad n=0, 1, \dots, N-1$
 $H_1: x(n) = s(n) + w(n) \quad "$

$w(n)$ IS WGN WITH UNKNOWN σ^2 ,
 $s(n)$ IS KNOWN

GLRT DECIDES H_1 IF

$$L(x) = \frac{p(x; \hat{\sigma}_1^2)}{p(x; \hat{\sigma}_0^2)} > \gamma$$

$$\hat{\sigma}_0^2 = \text{MLE UNDER } H_0 = \frac{1}{N} \sum_{n=0}^{N-1} x^2(n)$$

$$\hat{\sigma}_1^2 = \text{MLE UNDER } H_1 = \frac{1}{N} \sum_{n=0}^{N-1} (x(n) - s(n))^2$$

$$\Rightarrow L(x) = \left(\frac{\hat{\sigma}_0^2}{\hat{\sigma}_1^2} \right)^{N/2}$$

ALTERNATIVELY, CONSIDER

$$T(x) = \frac{1}{2} \left(L(x)^{2/N-1} \right)$$

$$= \frac{N}{2} \left(\frac{\hat{\sigma}_0^2 - \hat{\sigma}_1^2}{\hat{\sigma}_1^2} \right)$$

$$= \frac{\sum_{n=0}^{N-1} x^2(n) - \sum_{n=0}^{N-1} (x(n) - s(n))^2}{2 \hat{\sigma}_1^2}$$

$$= \frac{\sum_{n=0}^{N-1} x(n) \hat{y}(n) - \frac{1}{2} \sum_{n=0}^{N-1} \hat{y}^2(n)}{\hat{\sigma}_1^2}$$

WHEN σ^2 IS KNOWN, AN NP TEST IS

$$\frac{\sum_{n=0}^{N-1} x(n) \hat{y}(n) - \frac{1}{2} \sum_{n=0}^{N-1} \hat{y}^2(n)}{\sigma^2} > \ln \delta$$

NORMALIZING FACTOR IS AN ESTIMATE.

GLRT NOT CFAR (CAN BE SHOWN)

CASE 2 : ASSUME LINEAR MODEL FOR SIGNAL

$$\underline{x} = \underline{H} \underline{d} + \underline{w} \leftarrow N(0, \sigma^2 \underline{I})$$

\uparrow UNKNOWN SIGNAL PARAMETERS
 \uparrow UNKNOWN

GLRT FOR LINEAR MODEL WITH
 σ^2 UNKNOWN

EXAMPLE: UNKNOWN DC LEVEL IN
WGN WITH UNKNOWN σ^2

IN SECTION 7.7 ASSUMED σ^2 KNOWN.

THEOREM 9.1 - $\underline{x} = \underline{H}\underline{\theta} + \underline{w}$, \underline{H} IS
 $N \times p$ AND KNOWN, $\underline{\theta}$ IS $p \times 1$ AND
UNKNOWN, $\underline{w} \sim N(\underline{0}, \sigma^2 \underline{I})$ WITH
 σ^2 UNKNOWN. CONSIDER

$$H_0: \underline{A}\underline{\theta} = \underline{b}, \sigma^2 > 0$$

$$H_1: \underline{A}\underline{\theta} \neq \underline{b}, \sigma^2 > 0$$

$$\uparrow$$

$$r \times p \quad r \leq p$$

GLRT DECIDES H_1 IF

$$T(\underline{x}) = \frac{N-p}{r} \left(L_G(\underline{x}) \right)^{\frac{2}{N-p} - 1}$$

$$= \frac{N-p}{r} \frac{(\underline{A}\hat{\underline{\theta}}_1 - \underline{b})^T [\underline{A}(\underline{H}^T \underline{H})^{-1} \underline{A}^T]^{-1} (\underline{A}\hat{\underline{\theta}}_1 - \underline{b})}{\underline{x}^T (\underline{I} - \underline{H}(\underline{H}^T \underline{H})^{-1} \underline{H}^T) \underline{x}} \quad \text{9.1}$$

WHERE $\hat{\underline{\theta}}_1 = (\underline{H}^T \underline{H})^{-1} \underline{H}^T \underline{x}$ = MLE OF $\underline{\theta}$

UNDER H_1 (UNRESTRICTED MLE)
 DETECTION PERFORMANCE IS
 (EXACTLY - FINITE DATA RECORDS)

$$P_{FA} = Q_{F_{r, N-p}}(\delta)$$

$$P_D = Q_{F'_{r, N-p}(\lambda)}(\delta)$$

$F_{r, N-p}$ = CENTRAL F PDF WITH r
 NUMERATOR DEGREES OF FREEDOM AND
 $N-p$ DENOMINATOR DEGREES OF FREEDOM

$F'_{r, N-p}(\lambda)$ = NONCENTRAL F WITH
 NONCENTRALITY PARAMETER λ .

$$\lambda = \frac{(\underline{A}\underline{\theta}_1 - \underline{b})^T [A(H_1^T A)^{-1} A]^T (\underline{A}\underline{\theta}_1 - \underline{b})}{\sigma^2}$$

WHERE $\underline{\theta}_1$ IS VALUE OF $\underline{\theta}$ UNDER H_1 .

GLRT IS SAME AS WHEN σ^2 KNOWN
 EXCEPT DENOMINATOR, WHICH WAS
 σ^2 , REPLACED BY ESTIMATE OF σ^2 OR