

Statistical Flood Frequency Analysis Using Short Term Data

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Abstract

The most suitable probability distribution for estimating flood risks using short-term data is presented in this paper. A simulation method using autoregressive processes to represent daily flows are used. Several distributions were fitted to the annual peaks of the autoregressive processes. The levels determined using the distributions were compared with the levels from empirical distribution determined using ordered peaks of 1000 autoregressive processes. It was found that the Lognormal III, Pearson Type III and the Weibull gave good risks estimates of flood of high return period.

Keywords

Autoregressive process, return period, empirical distribution.

Abstrak Beberapa taburan kebarangkalian yang sesuai untuk menganggarkan kejadian banjir menggunakan data terhad dijelaskan dalam kertas ini. Kaedah simulasi berdasarkan proses autoregresi digunakan untuk menganbarkan aliran harian. Beberapa taburan dipadankan kepada puncak maksimum bagi proses autoregresi. Paras tertentu ditetapkan menggunakan taburan telah dibandingkan dengan paras menggunakan taburan empirik menggunakan puncak tertib bagi 1000 proses autoregresi. Hasil analisis didapati bahawa taburan Lognormal III, Pearson Jenis III dan Weibull memberikan anggaran terbaik untuk menganggar banjir bagi tempoh ulangan yang tinggi.

Katakunci

Proses Autoregresi, tempoh ulangan, taburan empirik.

1 Introduction

Floods are extreme events, which may cause large amount of damages. Therefore defence mechanism should be designed and built to prevent floods from causing disaster such as

flooding near rivers, which would destroy crops, and causing death to grazing cattle, sheep and other animals.

The relationship between flood magnitude and its return period is of great importance. The design of this defence mechanism greatly relies on the high floods exceeding certain levels. In developing countries like Malaysia, data are scarce. Therefore, a simple probability distribution that can give good estimates of flood of high return period need to be estimated from these data.

In order to find the best-fitted distribution several distributions that are widely used for frequency analysis were studied. They are Extreme Value Type I (EV1), Lognormal III (LNIII), Pearson Type III (PIII), Log Pearson Type III (LPIII), General Extreme Value (GEV) and the Weibull distribution.

2 Extreme Value Type I Distribution

The Gumbel or the Extreme Value Type I (EV1) distribution was introduced by Gumbel in 1941 [2]. It is widely used for frequency analysis in hydrology, meteorology, storms and droughts [6].

The probability density function p.d.f. of an EV1 distribution can be expressed as

$$f(x) = \frac{1}{\alpha} \exp\left\{-\frac{x-\mu}{\alpha} - \exp\left(-\frac{x-\mu}{\alpha}\right)\right\}, \text{ for } \alpha > 0, -\infty < \mu < \infty, \quad (1)$$

where α is the location parameter and μ is the scale parameter.

The relationship between the event x_p and its quartile value p is given by

$$x_p = \mu - \alpha \ln(-\ln(p)). \quad (2)$$

The parameters of this distribution was estimated using the method of probability weighted moments [9].

3 Lognormal III Distribution

The Lognormal III distribution was first introduced by Hazen in 1914. It was used by Hoshi [3] for flood frequency analysis.

The p.d.f. of the Lognormal III distribution is given by

$$f(x) = \frac{1}{\sigma(2\pi)^{1/2}(x-\gamma)} \exp\left(-\frac{(\ln(x-\gamma)-\mu)^2}{2\sigma^2}\right) \quad (3)$$

where μ and σ is the mean and standard deviation respectively and γ is the location parameter.

The quartile of the Lognormal III distribution is given by

$$x_p = \gamma + \exp(\mu + \sigma z_p). \quad (4)$$

where z_p is from the standard normal distribution. The parameters of these distributions were estimated using the method of ordinary moments [3].

4 Pearson Type III Distribution

The Pearson Type III distribution was first introduced by Karl-Pearson in 1924. This distribution is also known as the three-parameter Gamma distribution. Lall and Beard [5] found that this distribution could be used for annual peak distribution.

The p.d.f. of this distribution is given by

$$f(x) = |\beta|[\beta(x - \xi)]^{\alpha-1} \frac{\exp[-\beta(x - \xi)]}{\Gamma(\alpha)}, \text{ for } \xi < x < \infty, \alpha > 0, \quad (5)$$

where α, β and γ are the scale, shape and the location parameters respectively.

The quartile of the Pearson Type III distribution is given by

$$x_p = \mu + \sigma K_p[g(o)], \quad (6)$$

where μ and σ are the mean and standard deviation. K_p and $g(o)$ is the frequency factor and skewness parameter respectively. The parameters of this distribution were estimated using the method of ordinary moments [5].

5 Log-Pearson Type III Distribution

The Log-Pearson Type III distribution was suggested by Water Resources Council USA (W.R.C) in 1967. This distribution was used for flood frequency analysis in USA and Australia [7].

The p.d.f. of this distribution is given by

$$f(x) = |\beta|[\beta(\ln|x| - \xi)]^{\alpha-1} \frac{\exp[-\beta(\ln|x| - \xi)]}{x\Gamma(\alpha)} \quad (7)$$

where α, β and γ are the scale, shape and the location parameters respectively.

The quartile of the Log-Pearson Type III distribution is given by

$$x_p = \exp(\mu + \sigma K_p g(o)). \quad (8)$$

where μ and σ are the mean and standard deviation. K_p and $g(o)$ is the frequency factor and skewness parameter. The parameters of this distribution were estimated using the method of mixed moments [7].

6 Generalized Extreme Value Distribution

The Generalized Extreme Value Distribution was introduced by Jenkinson in 1955. This distribution is the combination of three distributions namely

- i. Extreme Value Type I;
- ii. Extreme Value Type II ;
- iii. Extreme Value Type III or the Weibull distribution.

This distribution is widely used for flood frequency analysis and analysis of peaks of sea level.

The p.d.f. of this distribution is given by [4]

$$f(x) = \frac{\exp(-y - \exp(-y))}{\alpha(1-t)}, \quad (9)$$

where

$$y = \frac{-\ln(1-t)}{\delta},$$

and

$$t = \frac{\delta(x-\xi)}{\alpha},$$

where α , δ and ξ are the scale, shape and the location parameters respectively.

The quartile of the Generalized Extreme Value distribution is given by

$$x_p = \xi + \frac{\alpha}{\delta} (1 - (-\ln(p))^\delta). \quad (10)$$

The parameters of this distribution were estimated using the method of L-moments [4].

7 The Weibull Distribution

The Weibull distribution is widely used in life expectancy of industrial components in industry. It is also widely used in hydrology for drought analysis and rainfall [1].

The p.d.f. of the Weibull distribution is given by

$$f(x) = \frac{\delta}{\alpha^\delta} (x - \xi)^{\delta-1} \exp \left\{ - \left(\frac{x - \mu}{\sigma} \right)^\delta \right\}, \text{ for } \xi < x < \infty, \delta > 0, \alpha > 0, \quad (11)$$

where α , δ and ξ are the scale, shape and the location parameters respectively.

The quartile of the Weibull distribution is given by

$$x_p = \xi - \alpha (\ln(1-p))^{1/\delta}. \quad (12)$$

The parameters of this distribution were estimated using the method of probability ordinary moments [1].

8 Simulation Procedure

A simulation procedure using NAG routine at UTM was adopted. 1000 Autoregressive AR (1) processes with white noises and $\alpha = 0.3$ of the length 61 to represent the flood season during November and December was simulated. The highest peak of each of the 1000 series was noted. Then peaks were fitted with EV1, LNIII, PIII, LPIII, GEV and Weibull distributions. The process was repeated for $\alpha = 0.5, 0.7$ and 0.9 respectively. NAG routine G05FDF were used to generate the white noise and G05CCF were used so that different set of varieties is generated at different times. The fitted distributions are given in Figure 1, Figure 2, Figure 3 and Figure 4.

The 1000 AR(1) processes with $\alpha = 0.3$ of length 61 were again simulated. Their highest peaks were noted and arranged in ascending order of magnitudes. Their 90th quartile was calculated. The EV1, LNIII, PIII, LPIII, GEV and Weibull distributions were fitted to the peaks of the 6 AR(1) processes. The 90th to the 99th quartiles were estimated. These estimates were compared with those of the empirical distribution. The processes were repeated using 8, 10, 12, 14, 16, 20, 25, 30, 35 and 40 AR(1) processes with $\alpha = 0.5, 0.7$ and 0.9 respectively. The plot of the sample quartile estimated using the respective distributions and the Empirical Quartile are given in Figure 5a to Figure 8b.

9 Analysis of Real data

Riverflow data from 5 stations in Johore were analyzed. In the analysis all the six distributions were fitted to the annual peaks of each river. The 10th to the 100th years flood were estimated for each river. The results are given in Table 2a and 2b.

10 Conclusion

From the figure 5a to figure 8b it is shown that as the sample sizes increases the sample quartiles approach the empirical quartiles. Here it was found that the LNIII, PIII and the Weibull distributions gave reasonable quartile estimates of the 90th to 99th quartiles, while the EV1, LPIII and GEV were seen to underestimate.

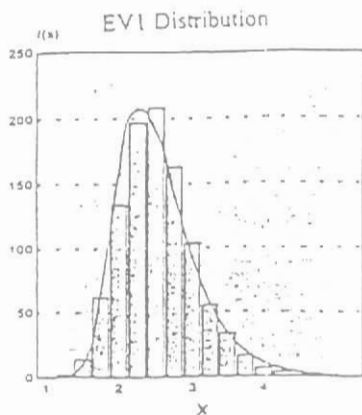
From the results it was found that the LNIII, PIII and the Weibull distributions could be used to estimate floods of high return period using limited data.

In the flood frequency analysis of the rivers in Johor it is shown that there is no significant difference between floods of high return period using each of the suggested distribution. Generally other distributions would give higher frequency estimates.

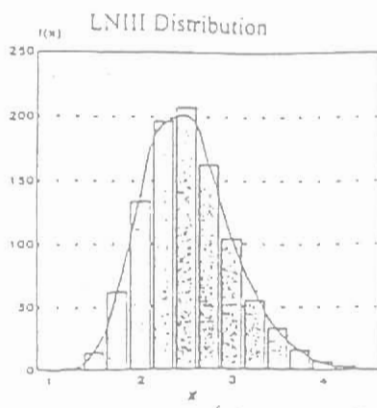
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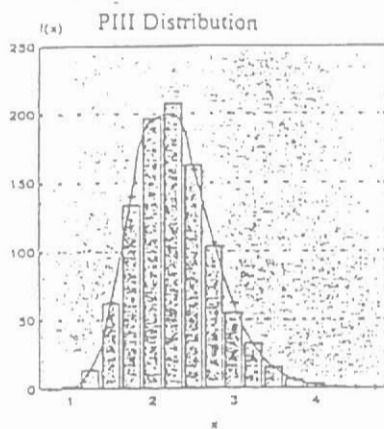
- [6] J. M. Landwehr, N. C. Matalas & J. R. Wallis, *Probability Weighted Moments Compared With Some Traditional Techniques in Estimating Gumbel Parameters and Quantiles*, Water Resources Research. **Vol. 15** (1979), 1055-1064.
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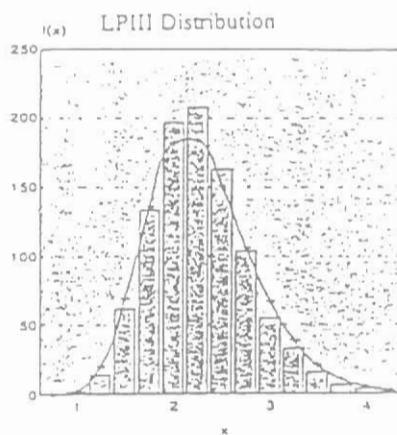
$$f(x) = \frac{1}{\alpha} \exp\left[-\frac{x-\xi}{\alpha} - \exp\left(-\frac{x-\xi}{\alpha}\right)\right]$$



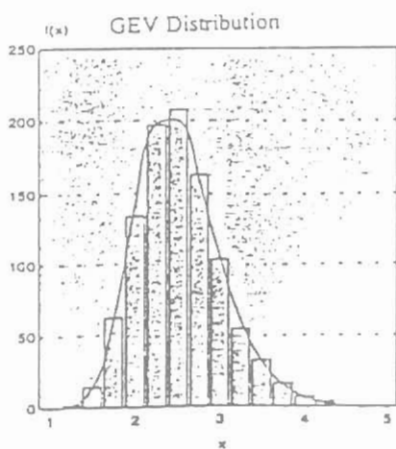
$$f(x) = \frac{1}{\sigma(2\pi)^{1/2}} \exp\left(-\frac{[\ln(x-\gamma) - \mu]^2}{2\sigma^2}\right)$$



$$f(x) = \left| \beta \left[\beta (x - \xi) \right] \right|^{\alpha-1} \frac{\exp[-\beta (x - \xi)]}{\Gamma(\alpha)}$$

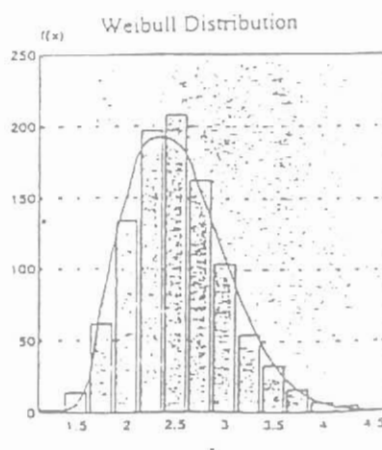


$$f(x) = \left| \beta \left[\beta (\ln(x) - \xi) \right] \right|^{\alpha-1} \frac{\exp[-\beta (\ln(x) - \xi)]}{x \Gamma(\alpha)}$$



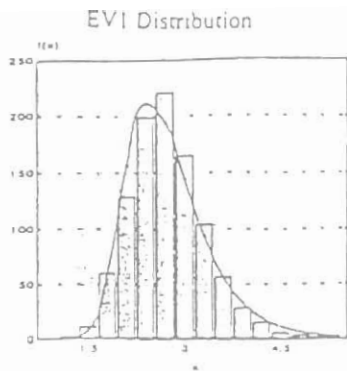
$$f(x) = \frac{\exp[-y - \exp(-y)]}{\alpha(1-t)}$$

where $y = \frac{-\ln(1-t)}{\delta}$ and $t = \frac{\delta(x-\xi)}{\alpha}$

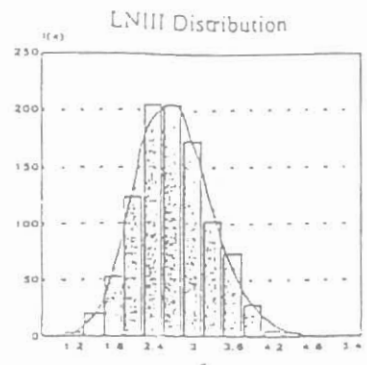


$$f(x) = \frac{5}{\alpha} (x-\xi)^{4-1} \exp\left[-\left(\frac{x-\xi}{\alpha}\right)^5\right]$$

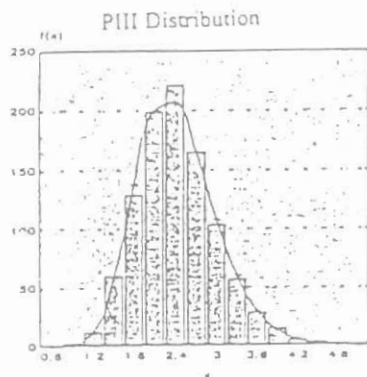
Figure 1 : Histogram And The EVI, LNIII, PIII, LPIII, GEV and Weibull Distributions of Maxima Peaks of AR(1) Process, $\alpha = 0.3$



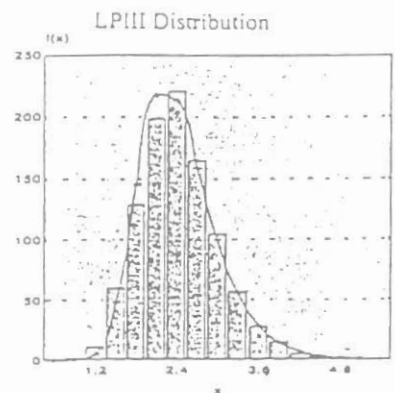
$$f(x) = \frac{1}{\alpha} \exp\left[-\frac{x-\xi}{\alpha}\right] \exp\left(-\frac{x-\xi}{\alpha}\right)$$



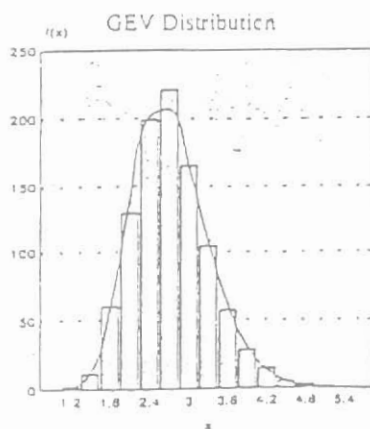
$$f(x) = \frac{1}{\sigma(2\pi)^{1/2}(x-\gamma)} \exp\left(-\frac{(\ln(x-\gamma)-\mu)^2}{2\sigma^2}\right)$$



$$f(x) = \beta [\beta(x-\xi)]^{\alpha-1} \frac{\exp[-\beta(x-\xi)]}{\Gamma(\alpha)}$$

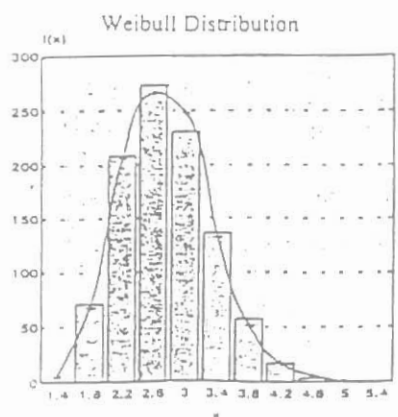


$$f(x) = \beta [\beta(\ln(x)-\xi)]^{\alpha-1} \frac{\exp[-\beta(\ln(x)-\xi)]}{x\Gamma(\alpha)}$$



$$f(x) = \frac{\exp[-y - \exp(-y)]}{\alpha(1-t)}$$

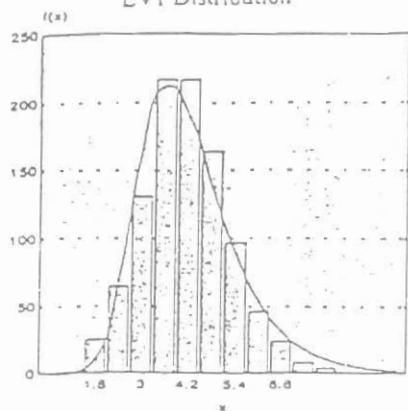
where $y = \frac{-\ln(1-t)}{\delta}$ and $t = \frac{\delta(x-\xi)}{\alpha}$



$$f(x) = \frac{\delta}{\alpha^{\delta}} (x-\xi)^{\delta-1} \exp\left[-\left(\frac{x-\xi}{\alpha}\right)^{\delta}\right]$$

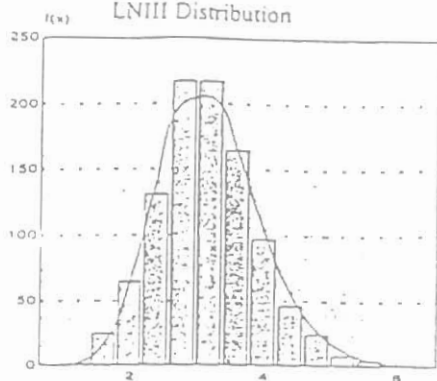
Figure 2 : Histogram And The EV1, LNIII, PIII, LPIII, GEV and Weibull Distributions of Maxima Peaks of AR(1) Process, $\alpha = 0.5$

EV1 Distribution



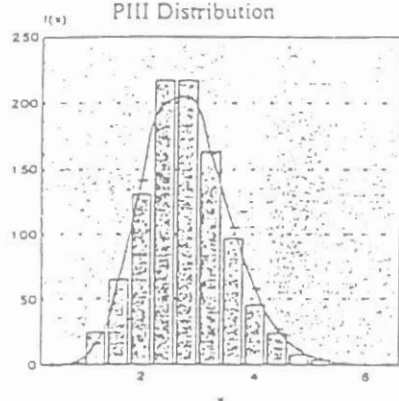
$$f(x) = \frac{1}{\alpha} \exp\left[-\frac{x-\xi}{\alpha}\right] - \exp\left[-\frac{x-\xi}{\alpha}\right]$$

LNIII Distribution



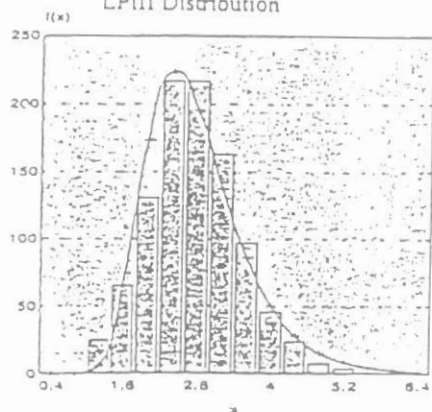
$$f(x) = \frac{1}{\sigma(2\pi)^{1/2}} \exp\left[-\frac{(\ln(x-\gamma)-\mu)^2}{2\sigma^2}\right]$$

PIII Distribution



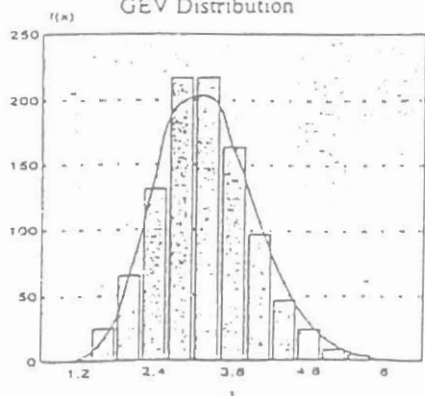
$$f(x) = \beta \left[\beta (x-\xi) \right]^{\beta-1} \frac{\exp\left[-\beta (x-\xi)\right]}{\Gamma(\alpha)}$$

LPIII Distribution



$$f(x) = \beta \left[\beta (\ln(x)-\xi) \right]^{\beta-1} \frac{\exp\left[-\beta (\ln(x)-\xi)\right]}{x\Gamma(\alpha)}$$

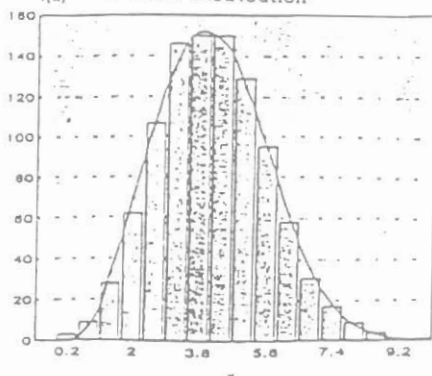
GEV Distribution



$$f(x) = \frac{\exp[-y - \exp(-y)]}{\alpha(1-t)}$$

where $y = \frac{-\ln(1-t)}{\delta}$ and $t = \frac{\delta(x-\xi)}{\alpha}$

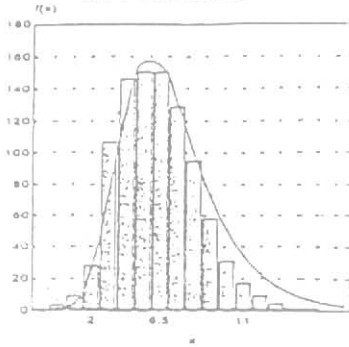
Weibull Distribution



$$f(x) = \frac{\delta}{\alpha} (x-\xi)^{\delta-1} \exp\left[-\left(\frac{x-\xi}{\alpha}\right)^\delta\right]$$

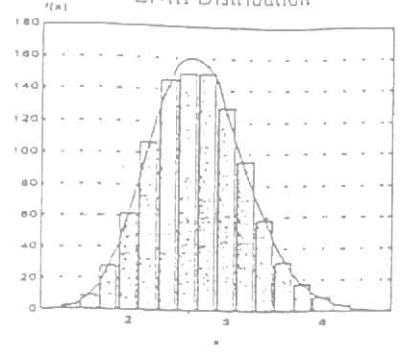
Figure 3 : Histogram And The EV1, LNIII, PIII, LPIII, GEV and Weibull Distributions of Maxima Peaks of AR(1) Process, $\alpha = 0.7$

EV1 Distribution



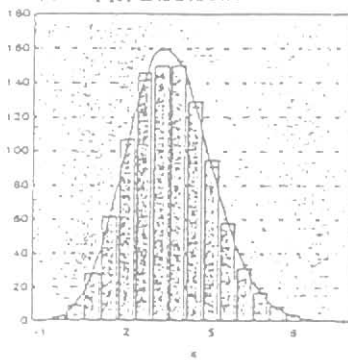
$$f(x) = \frac{1}{\alpha} \exp\left[-\frac{x-\xi}{\alpha}\right] \exp\left[-\frac{x-\xi}{\alpha}\right]$$

LNIII Distribution



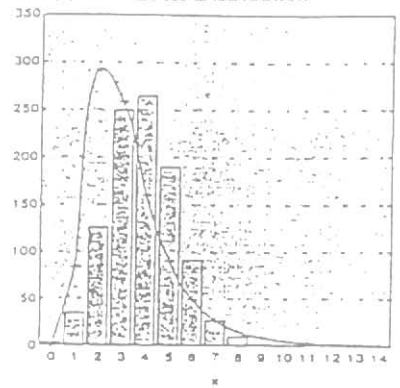
$$f(x) = \frac{1}{\sigma(2\pi)^{1/2}} \exp\left[-\frac{(\ln(x-\gamma)-\mu)^2}{2\sigma^2}\right]$$

PIII Distribution



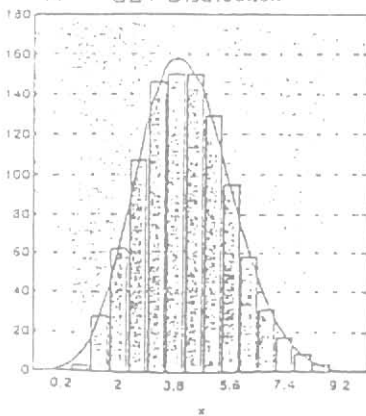
$$f(x) = \left| \beta \left[\beta (x-\xi) \right]^{\alpha-1} \frac{\exp\left[-\beta (x-\xi)\right]}{\Gamma(\alpha)} \right|$$

LPIII Distribution



$$f(x) = \left| \beta \left[\beta (\ln(x)-\xi) \right]^{\alpha-1} \frac{\exp\left[-\beta (\ln(x)-\xi)\right]}{x \Gamma(\alpha)} \right|$$

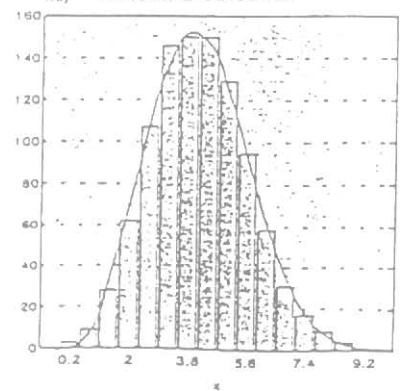
GEV Distribution



$$f(x) = \frac{\exp(-y - \exp(-y))}{\alpha(1-t)}$$

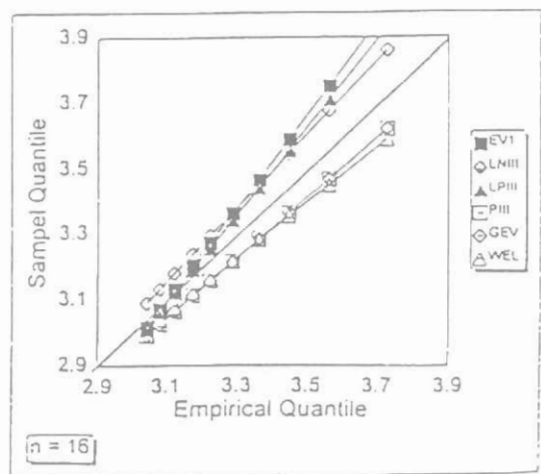
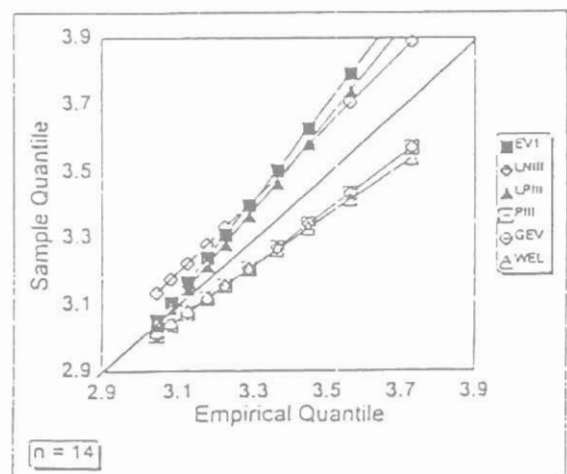
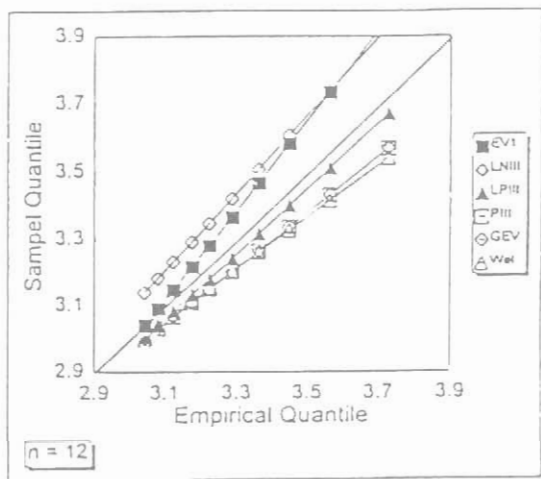
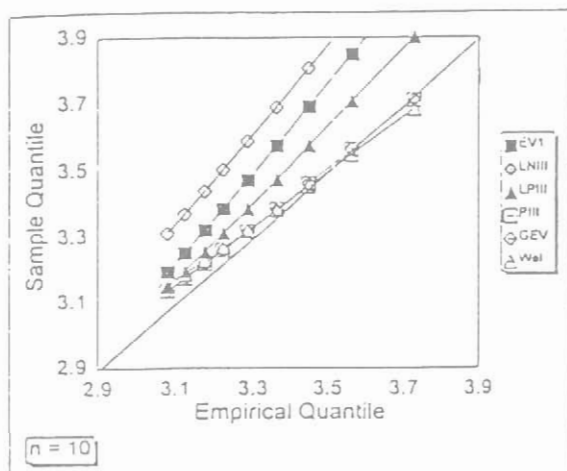
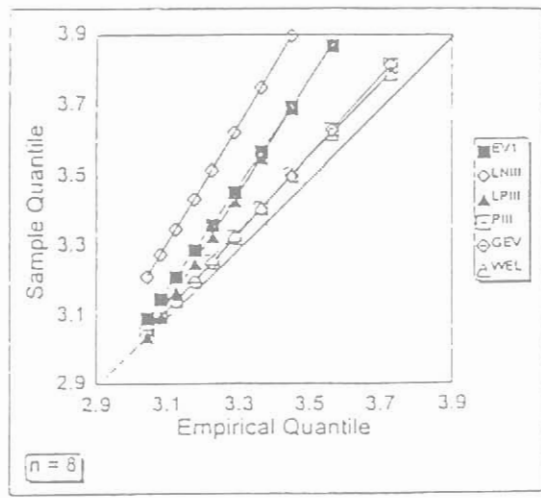
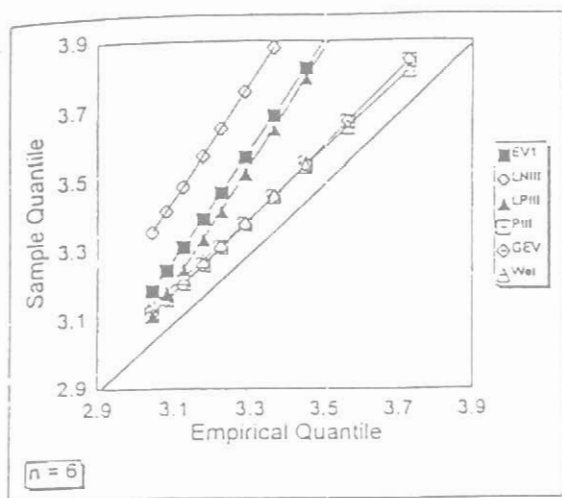
$$\text{where } y = \frac{-\ln(1-t)}{\delta} \text{ and } t = \frac{\delta(x-\xi)}{\alpha}$$

Weibull Distribution



$$f(x) = \frac{\delta}{\alpha} (x-\xi)^{\delta-1} \exp\left[-\left(\frac{x-\xi}{\alpha}\right)^{\delta}\right]$$

Figure 4 : Histogram And The EV1, LNIII, PIII, LPIII, GEV and Weibull Distributions of Maxima Peaks of AR(1) Process, $\alpha = 0.9$



(Continue)

Figure 5a and 5b : Graph of Sample Quantile Against Empirical Quantile for EVI, LNIII, PIII, LPIII, GEV and Weibull. $\alpha = 0.3$

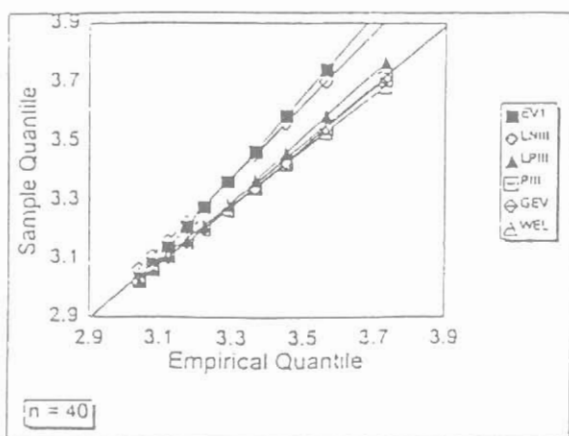
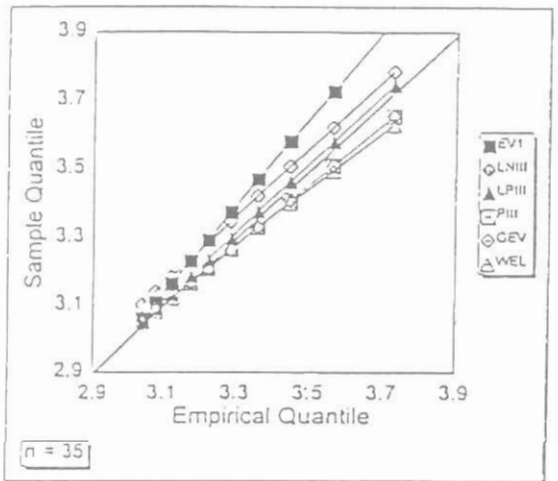
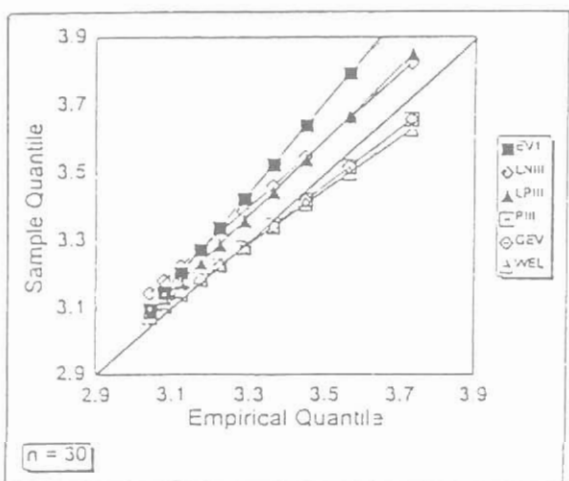
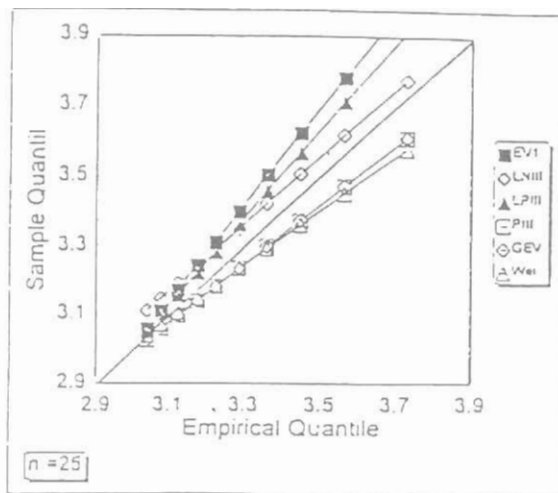
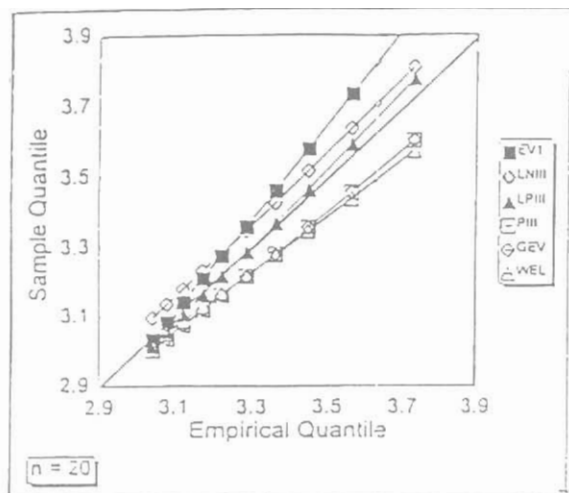
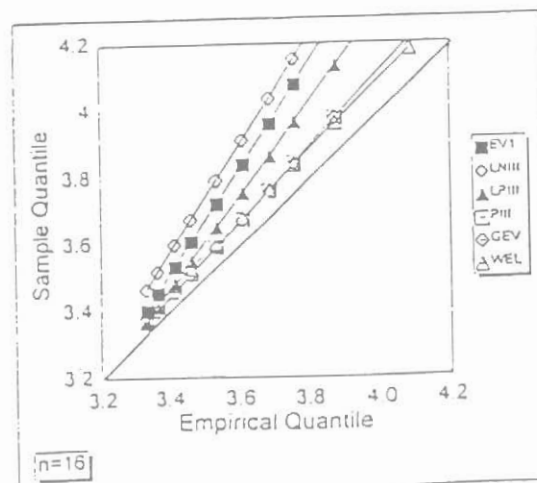
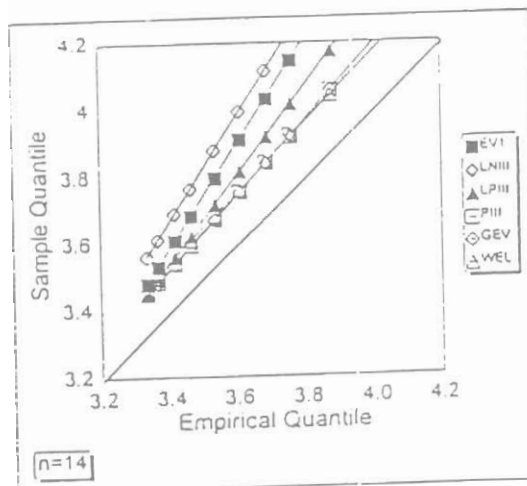
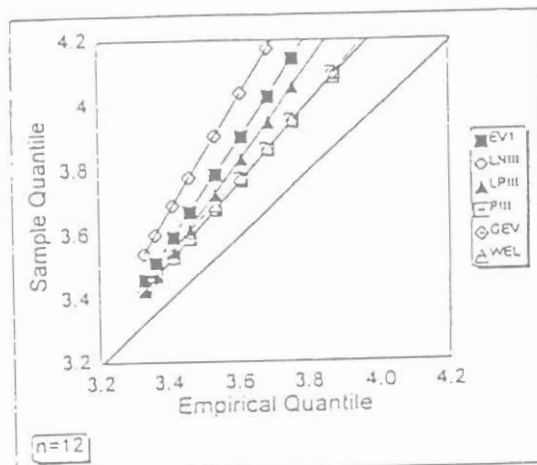
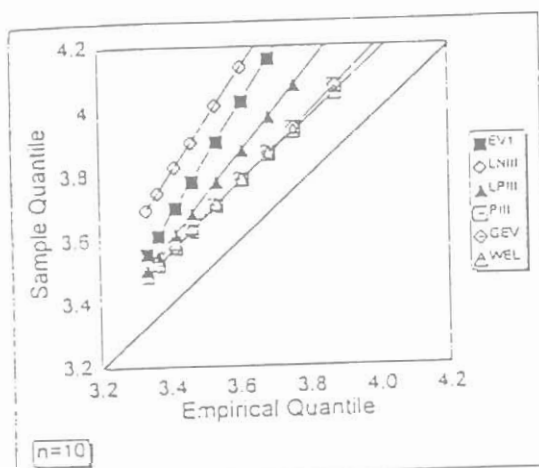
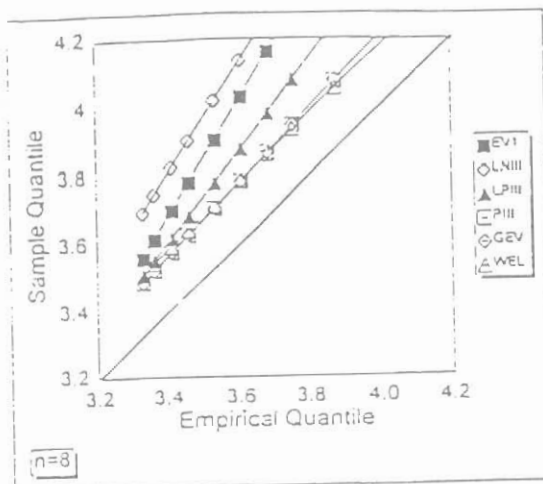
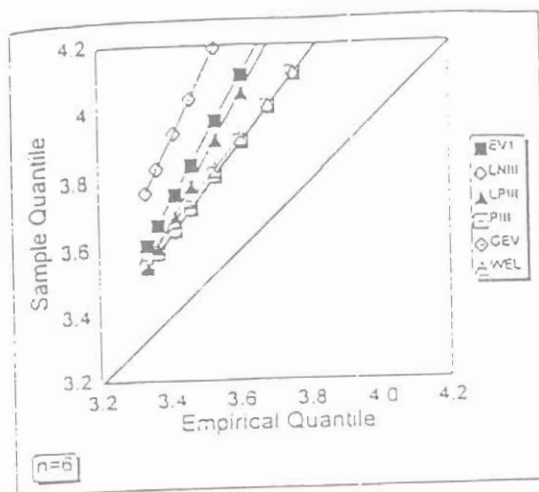


Figure 5 b



(continue)

Figure 6a and 6b : Graph of Sample Quantile Against Empirical Quantile for EV1, LNIII, PIII, LPIII, GEV and Weibull. $\alpha = 0.5$

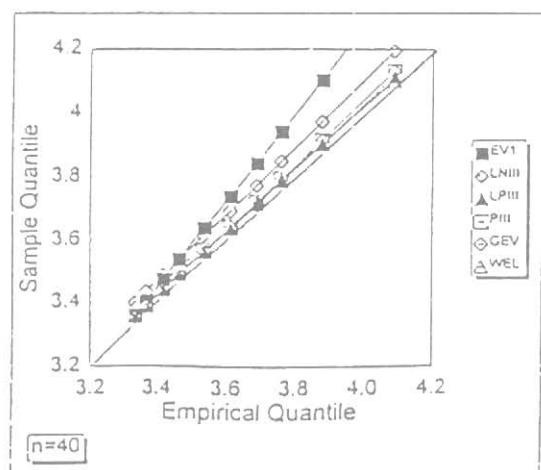
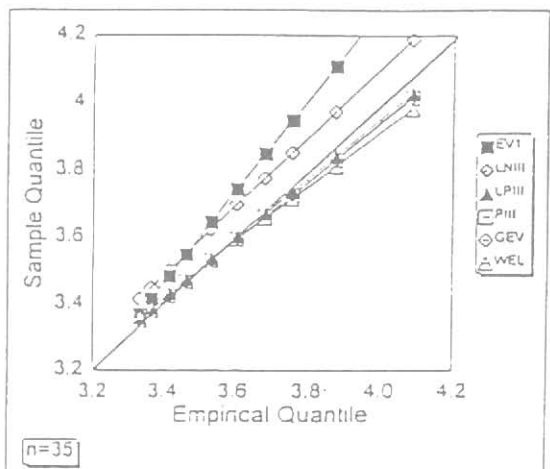
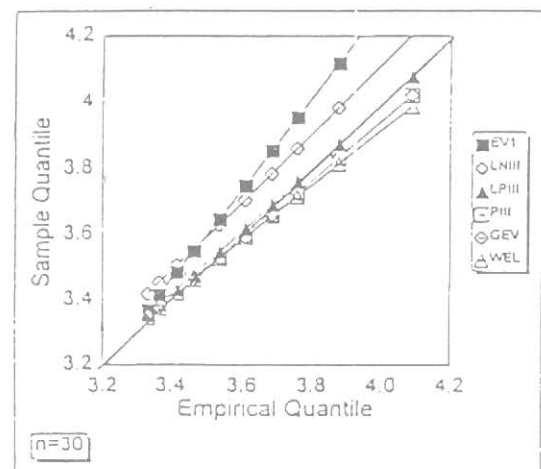
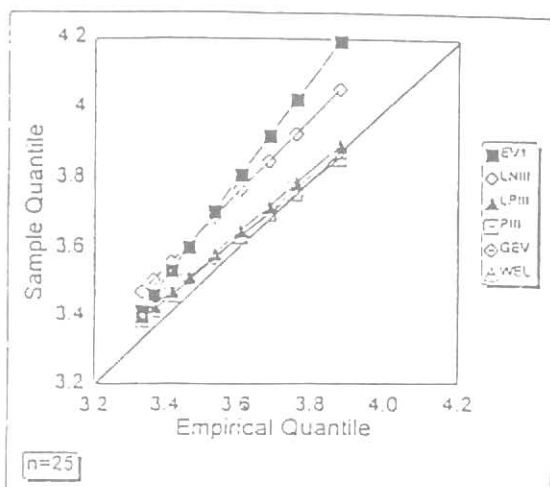
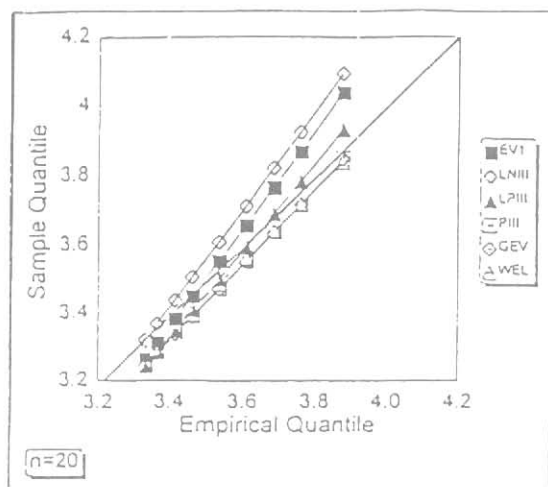
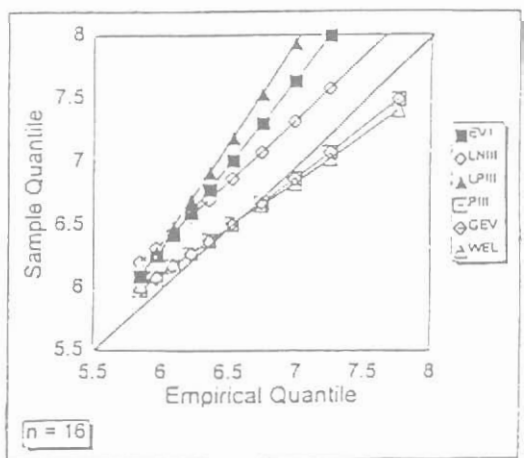
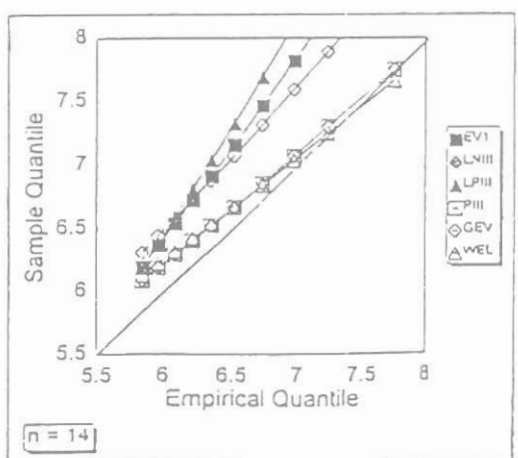
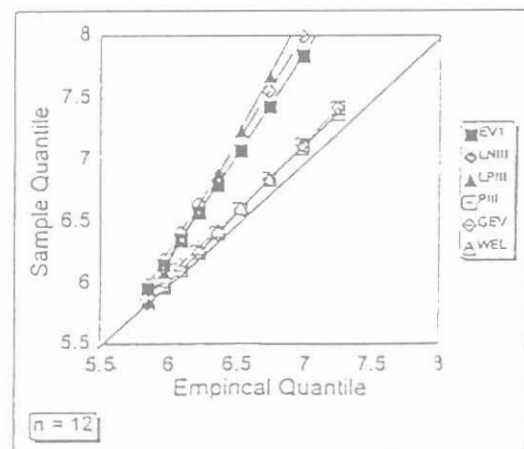
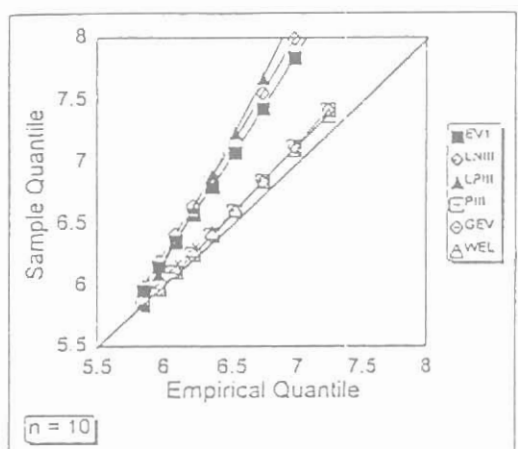
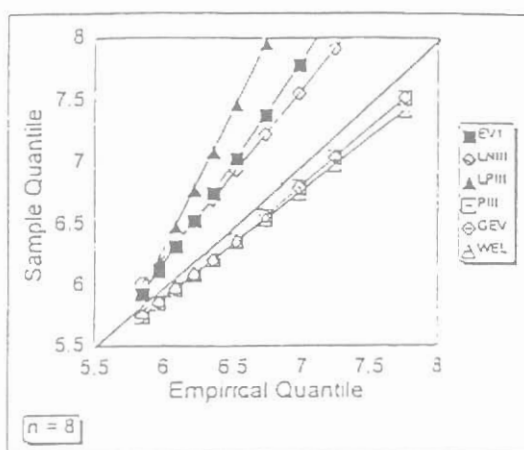
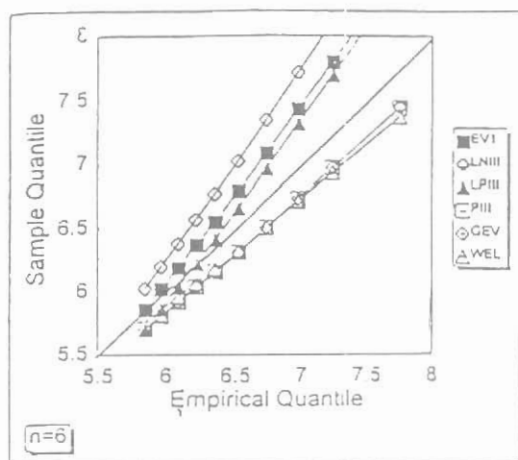


Figure 6 b



(continue)

Figure 7a and 7b : Graph of Sample Quantile Against Empirical Quantile for EV1, LNIII, PIII, LPIII, GEV and Weibull. $\alpha = 0.7$

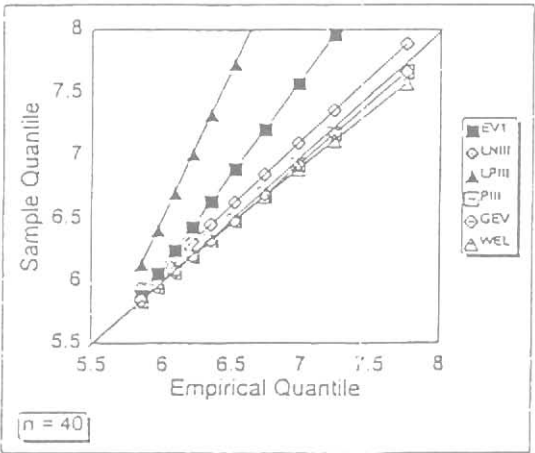
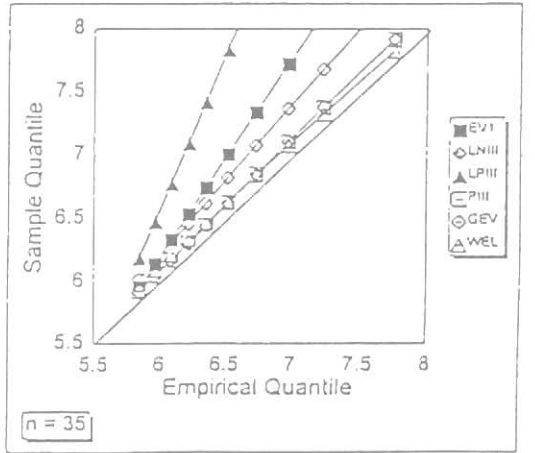
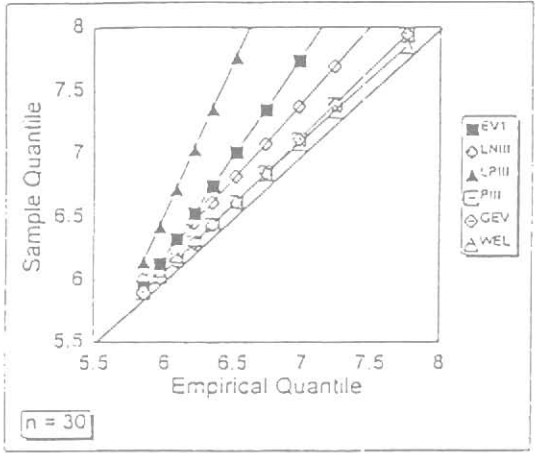
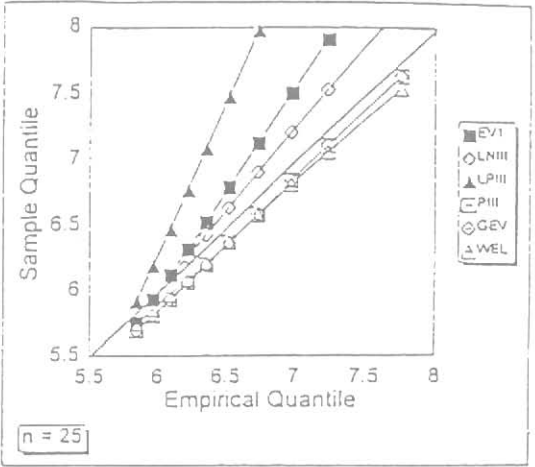
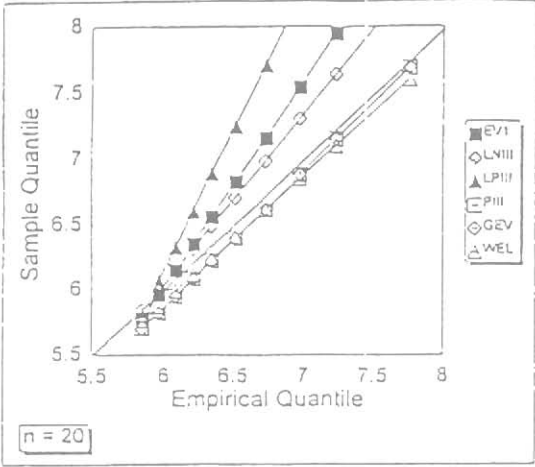
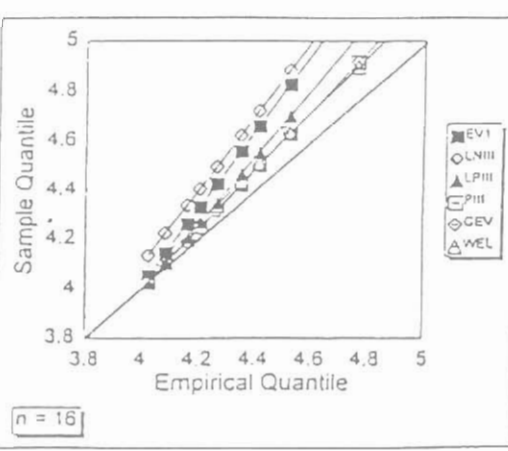
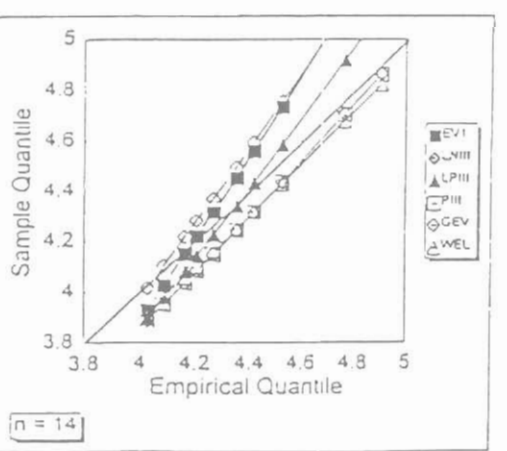
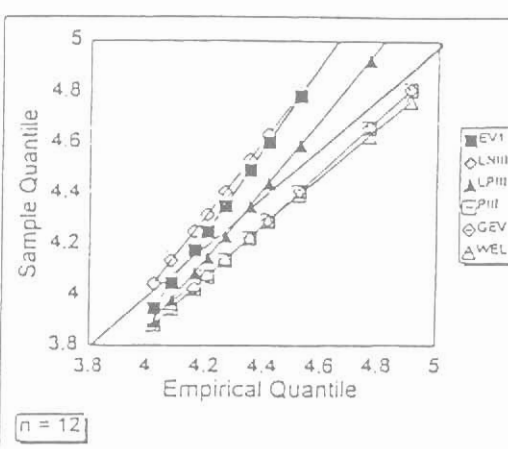
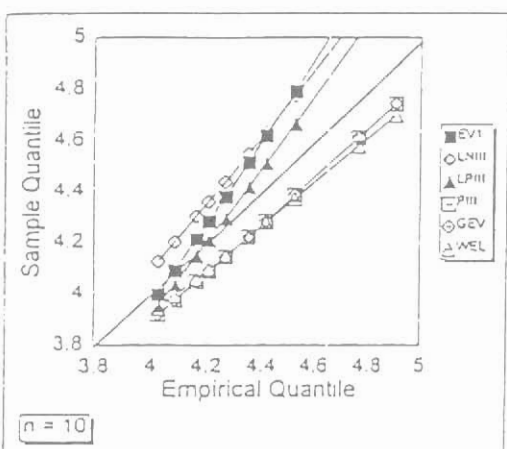
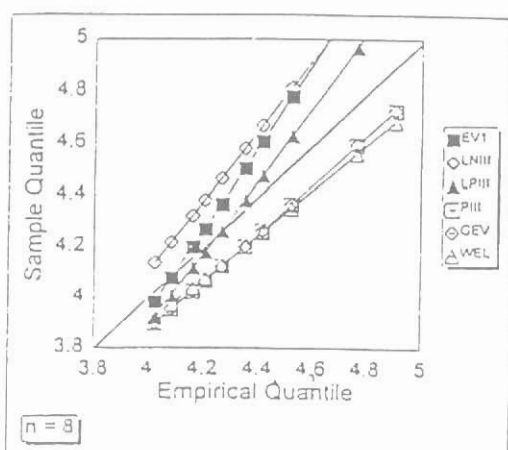
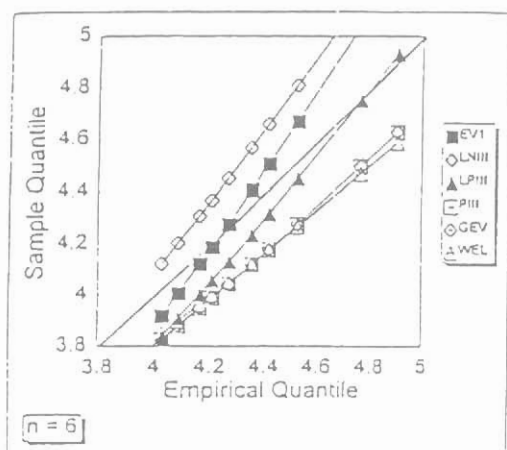


Figure 7 b



(Continue)

Figure 8a and 8b : Graph of Sample Quantile Against Empirical Quantile for EV1, LNIII, PIII, LPIII, GEV and Weibull. $\alpha = 0.9$

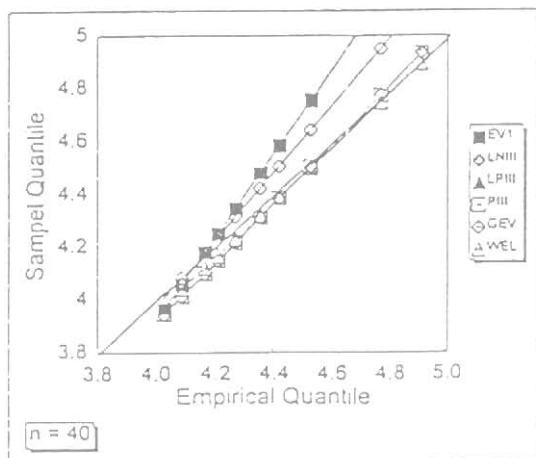
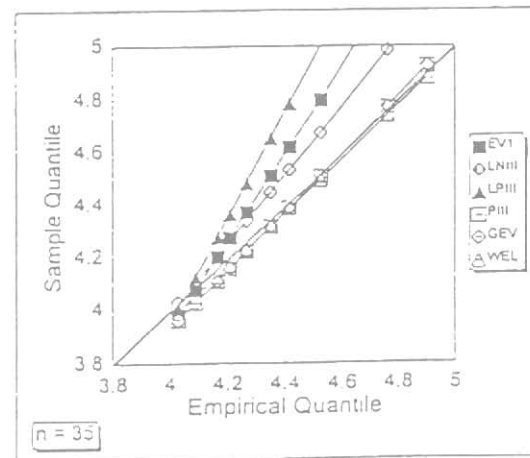
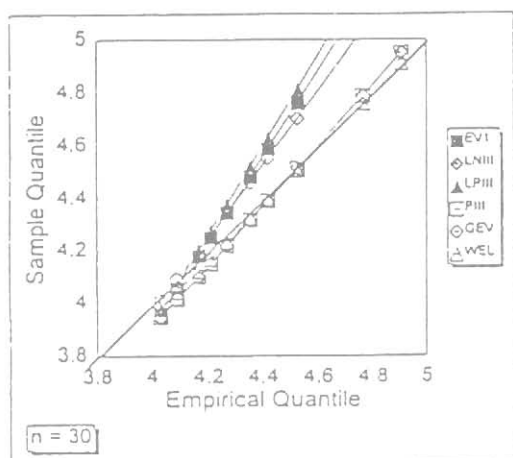
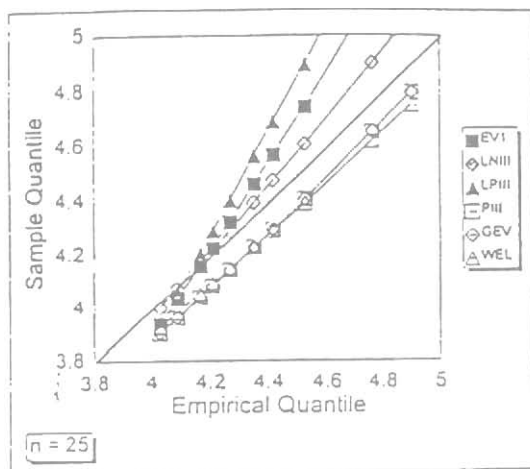
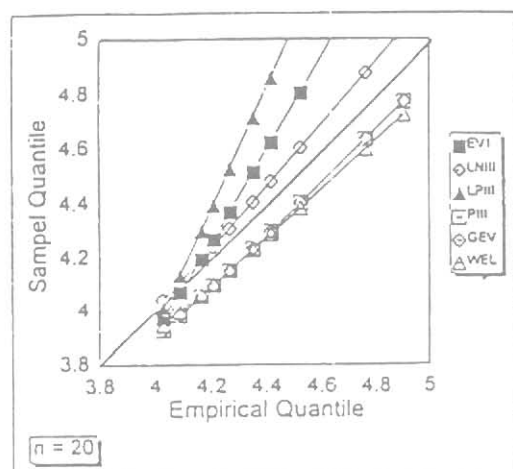


Figure 8 b

Table 1 : List of Stations Name

Station Name	Station Number	Area	Recod Length (Years)
Sayong River	1836402	Johor Tenggara	11
Bekok River	2130422	Yong Peng	18
Linggui River	1836401	Tanah Jengli	10
Johor River	1737451	Rantau Panjang	23
Kahang River	2235401	Kluang	11

Table 2 (a) : Quantilies values of LNIII, PIII, Weibull ,LPIII, EVI and GEV Distributions (T from 10 to 100 years)

a). Sayung River (Station Number. : 1836402)

Station Name	T p	10 0.90	12.5 0.92	20 0.95	25 0.96	50 0.98	100 0.99
Sayung River	LNIII	207.933	221.053	248.472	261.432	301.593	341.660
	PIII	209.879	223.299	251.081	264.081	303.749	342.396
	Weibull	212.383	225.778	253.041	265.591	303.237	339.192
	LPIII	211.533	227.734	263.019	280.356	336.700	396.754
	EVI	208.780	221.614	248.265	260.790	299.374	337.673
	GEV	208.291	223.581	256.872	273.265	326.956	385.375

b). Bekok River (Station Number : 2130422)

Station Name	T p	10 0.90	12.5 0.92	20 0.95	25 0.96	50 0.98	100 0.99
Bekok River	LNIII	61.005	63.148	67.332	69.186	74.504	79.270
	PIII	61.005	63.149	67.332	69.186	74.503	79.267
	Weibull	62.756	65.107	69.663	71.670	77.397	82.520
	LPIII	64.216	68.055	76.102	80.089	92.366	104.888
	EVI	61.300	64.360	70.710	73.690	82.880	92.000
	GEV	62.316	64.502	68.647	70.425	75.299	79.347

c). Linggui River (Station Number : 1836401)

Station Name	T p	10 0.90	12.5 0.92	20 0.95	25 0.96	50 0.98	100 0.99
Linggui River	LNIII	43.151	45.146	49.287	51.232	57.210	63.110
	PIII	43.409	45.435	49.606	51.546	57.436	63.130
	Weibull	43.819	45.834	49.905	51.787	57.313	62.559
	LPIII	42.870	45.857	52.748	56.332	68.905	83.932
	EVI	42.915	44.885	48.977	50.900	56.824	62.703
	GEV	42.531	45.198	51.248	54.349	65.065	77.686

Table 2(b)

(d). Johor River (Station Number : 1836401)

Station Name	T P	10 0.90	12.5 0.92	20 0.95	25 0.96	50 0.98	100 0.99
Johor River	LNIII	405.246	431.469	485.729	511.136	588.981	665.438
	PIII	408.393	434.958	489.493	514.812	591.449	665.287
	Weibull	413.927	440.282	493.380	517.602	589.507	657.253
	LPIII	413.125	447.117	520.358	555.928	669.561	787.397
	EV1	405.730	432.547	488.238	514.411	595.036	675.066
	GEV	404.592	436.725	506.804	541.369	654.829	778.681

(e). Kahang River (Station Number : 2235401)

Station Name	T P	10 0.90	12.5 0.92	20 0.95	25 0.96	50 0.98	100 0.99
Kahang River	LNIII	346.485	359.268	384.293	395.413	427.420	456.238
	PIII	346.503	359.283	384.300	395.415	427.401	456.190
	Weibull	348.125	360.220	383.469	393.632	422.389	447.818
	LPIII	352.035	365.647	391.685	402.945	434.066	460.197
	EV1	347.773	365.625	402.698	420.121	473.792	527.068
	GEV	358.432	372.327	398.976	410.542	442.700	470.024