



UNIVERSITAS GADJAH MADA  
DEPARTEMEN TEKNIK SIPIL DAN LINGKUNGAN  
PRODI MAGISTER TEKNIK SIPIL

## Statistika Teknik

# Analisis Frekuensi

# Analisis Frekuensi

- Diambilkan dari paparan pada
  - The Second ASEAN Natural Disaster Conference
    - University of Yangon, Myanmar
    - 29-30 September 2014

2nd ANDC  
Yangon, Myanmar  
29-30 September 2014

Istianto  
Master of Engineering in Natural Disaster Management  
Universitas Gadjah Mada, INDONESIA

# Frequency analysis on extreme hydrologic data

# Needs

- Engineers (hydraulics, hydrology) are frequently required to derive design values on hydrologic events, such as flow discharge or rainfall depth (precipitation)
  - Statistical method applied to time series data is a common practice
    - Fit those data to theoretical probability distributions
    - Use cumulative distribution function of the selected probability distribution to predict magnitude of hydrologic events
    - Define the design value(s) based on the magnitude of hydrologic event having particular probability of occurrence



this method is known as frequency analysis

# Frequency Analysis

Time series (annual or partial time series of hydrologic event data)



Fitting of the time series to theoretical distributions



Predicting probability of occurrence of the hydrologic events



Define design values of the hydrologic events

# Probability Distributions

Common probability distributions applicable to hydrologic events

Theoretical Probability Distributions

Gumbel

Log Normal

Log Pearson  
Type III

Normal

# Probability Distributions

- The theoretical probability distributions
  - their pdf and cdf have complex expression so that they are not readily solvable
  - graphical method is a practical solution to fit data to the theoretical distributions

Ven te Chow *et al.* (1988) developed a transformation coordinate such that the cdf of a theoretical distribution shows as a straight line



fitting data to theoretical distribution and predicting probability of occurrence can be easily carried out

# Transformed probability coordinate

- Chow *et al.* (1988)

$$y_T = \bar{y} + K_T \cdot s_Y$$

- $y_T$  is the hydrologic magnitude at  $T$ -year return period,
- $\bar{y}$  is the average value of the data,
- $K_T$  is a frequency factor, and
- $s_Y$  is the standard deviation of the data.



# Transformed probability coordinate

- Chow *et al.* (1988)

$$y_T = \bar{y} + K_T \cdot s$$

$\bar{y}$   
 $s_Y$  } constant 

plot of  $(y_T \text{ vs } K_T)$  is a straight line

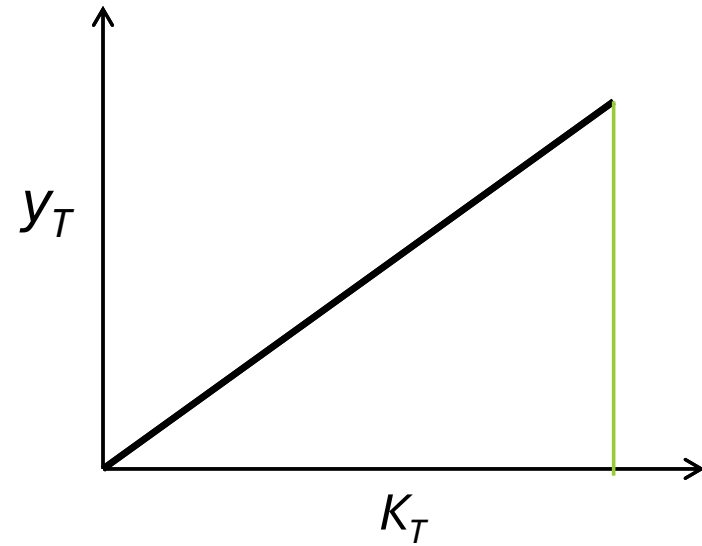
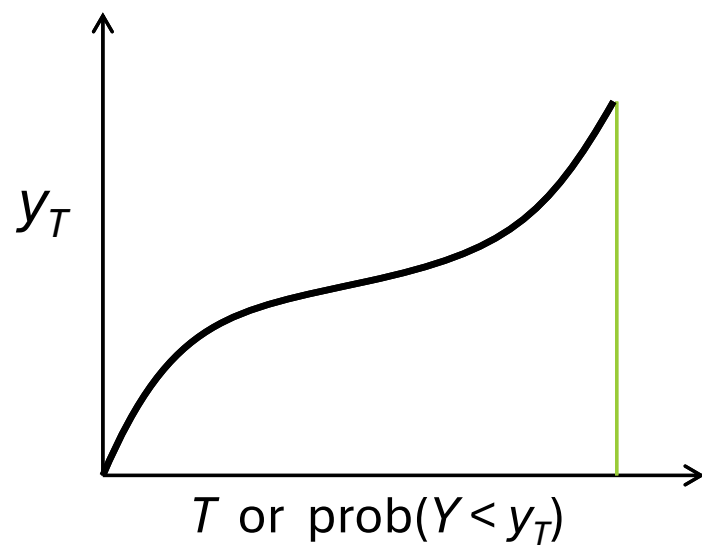


defined by data

$K_T$  is function of  $T$  and distribution

$$\text{prob}(Y < y_T) = 1 - \frac{1}{T} \Leftrightarrow T = \frac{1}{1 - \text{prob}(Y < y_T)}$$

# Normal Distribution



# Normal Distribution

$$K_T = z$$

$$z = w - \frac{2.515517 + 0.802853w + 0.010328w^2}{1 + 1.432788w + 0.189269w^2 + 0.001308w^3}$$

$$w = \begin{cases} \left[ \ln \left( \frac{1}{p^2} \right) \right]^{\frac{1}{2}} & 0 < p = \frac{1}{T} < 0.5 \\ \left[ \ln \left( \frac{1}{(1-p)^2} \right) \right]^{\frac{1}{2}} & p = \frac{1}{T} > 0.5 \end{cases}$$

# Probability Paper

- Nowadays
  - Frequency analysis can easily be carried out by spreadsheet computer application
    - Unfortunately, spreadsheet cannot provide data plot the way probability paper does
    - Most of frequency analysis application program do not provide data plot at all
    - Lost of insight into data pattern (distribution)
    - Lost of 'physical' meaning of the computed values

# Probability Paper

- In the past
  - Probability papers were available in the market
    - Normal, Log Normal, Gumbel distributions
    - Not available for Log Pearson Type III since  $K_T$  changes with data
      - Log Pearson Type III was plotted on Log Normal paper
      - It shows as a curve, not a straight line
  - Data were manually plotted on the paper
    - Scatter data plot and theoretical line give good insight into the distribution of the data
    - Fitting the data to the theoretical line can easily be performed

# Probability Paper

- AProb\_4E
  - A computer application on frequency analysis that has data plotting capability
  - Can be freely downloaded from website <https://istiarto.staff.ugm.ac.id/>



<https://istiarto.staff.ugm.ac.id/index.php/aprob/>

# Probability Paper

## ■ Nowadays

- There is no (or at least difficult to find) computer application on frequency analysis having data plot capability
  - Commercial application program may exist (?)
  - Practising engineers and students might be not able to afford for commercial application program



Need for frequency analysis application program, which is a free-ware and capable to produce graphical plot of the data on probability paper

# AProb\_4E

- Plotting position of data values on probability paper

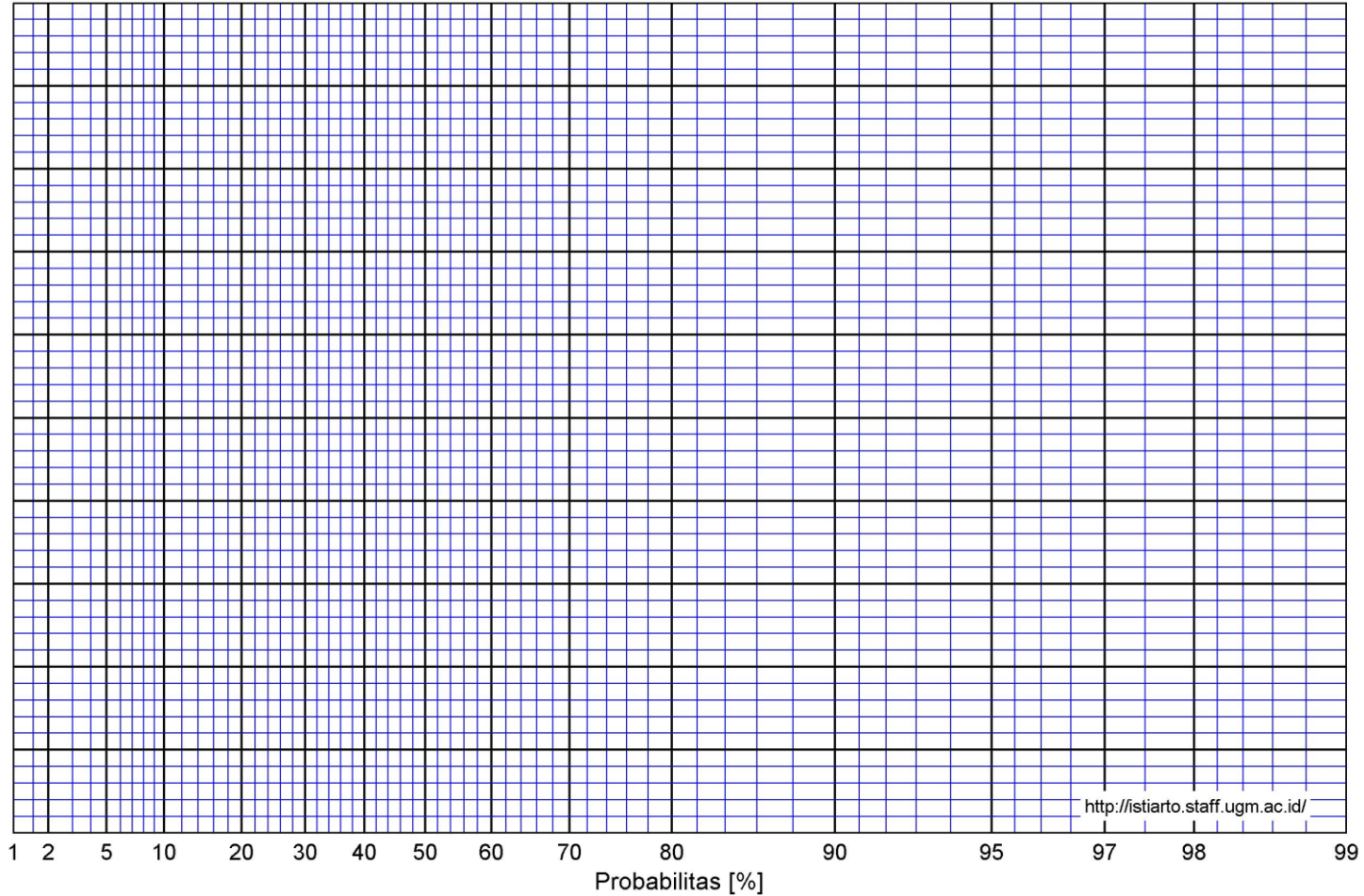
$$\text{prob}(Y < y_m) = \frac{m}{n + 1}$$

- $m$  is the rank of the data being sorted in ascending order
  - $n$  is the number of data
- This is known as Weibull formula of plotting time series data



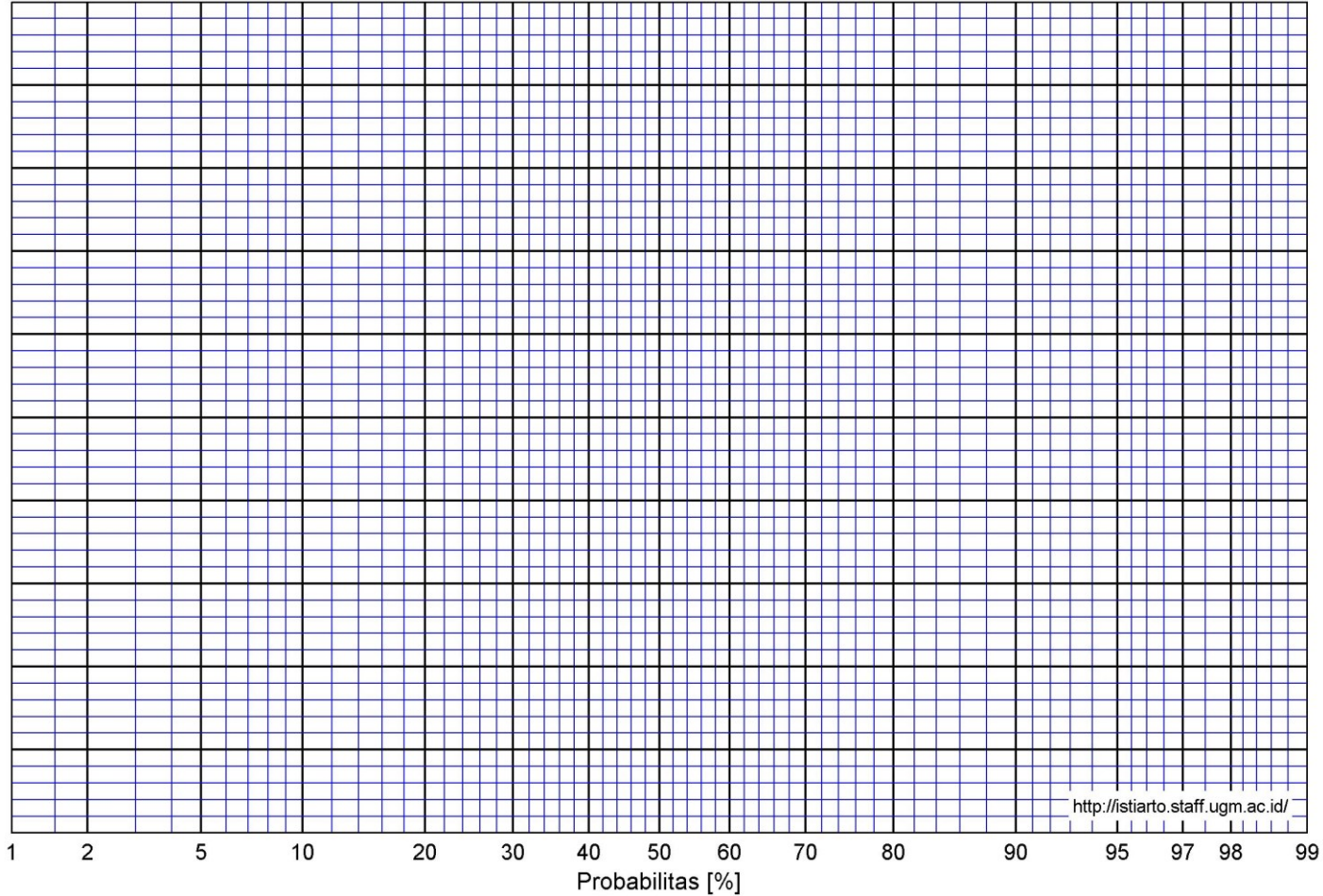
# Gumbel probability paper

Distribusi Gumbel



# Normal probability paper

Distribusi Normal



<http://fisiarto.staff.ugm.ac.id/>

Judul Data : **Debit Maksimum DPS Citarum**

Cara Urut Data : **b** Ket. : B = urutan debit besar ke kecil ; K = kecil ke besar

### UJI CHI-SQUARE

Jumlah kelas : **5** Ket. : Jumlah kelas yang dikehendaki untuk uji Chi-Kuadrat

confidence Interval : **0.05** Ket. : Derajat Ketidak-percayaan yang diinginkan

### KALA-ULANG

Jumlah kasus : **8** Ket. : Jumlah probabilitas yang dikehendaki

Tahun	Debit (m <sup>3</sup> /dt)	Probabilitas
1918	244.00	.900
1919	217.00	.500
1920	285.00	.200
1921	261.00	.100
1922	295.00	.050
1923	252.00	.020
1924	275.00	.010
1925	204.00	.001
1926	208.00	
1927	194.00	
1928	256.00	
1929	207.00	
1930	354.00	
1931	445.00	
1932	350.00	
1933	336.00	
1934	328.00	
1973	269.00	
1974	323.00	

PROSES

Example of frequency analysis performed by using spreadsheet application/computer program

## KALA-ULANG Debit Maksimum DPS Citarum

P(x >= Xm) Probabilitas	T Kala-Ulang	Karakteristik Debit (m <sup>3</sup> /dt) Menurut Probabilitasnya							
		NORMAL		LOG-NORMAL		GUMBEL		LOG-PEARSON III	
		X <sub>T</sub>	K <sub>T</sub>	X <sub>T</sub>	K <sub>T</sub>	X <sub>T</sub>	K <sub>T</sub>	X <sub>T</sub>	K <sub>T</sub>
0.9	1.1	214.997	-1.282	219.417	-1.202	225.065	-1.100	219.250	-1.286
0.5	2.	286.200	0.000	281.092	-0.092	277.073	-0.164	281.433	0.006
0.2	5.	332.961	0.842	330.748	0.802	326.173	0.719	330.862	0.843
0.1	10.	357.403	1.282	360.103	1.330	358.682	1.305	359.818	1.277
0.05	20.	377.588	1.645	386.299	1.802	389.865	1.866	385.496	1.634
0.02	50.	400.306	2.054	418.069	2.373	430.228	2.592	416.438	2.034
0.01	100.	415.452	2.326	440.687	2.781	460.475	3.137	438.336	2.299
0.001	1,000.	457.894	3.090	510.803	4.043	560.420	4.936	505.553	3.037

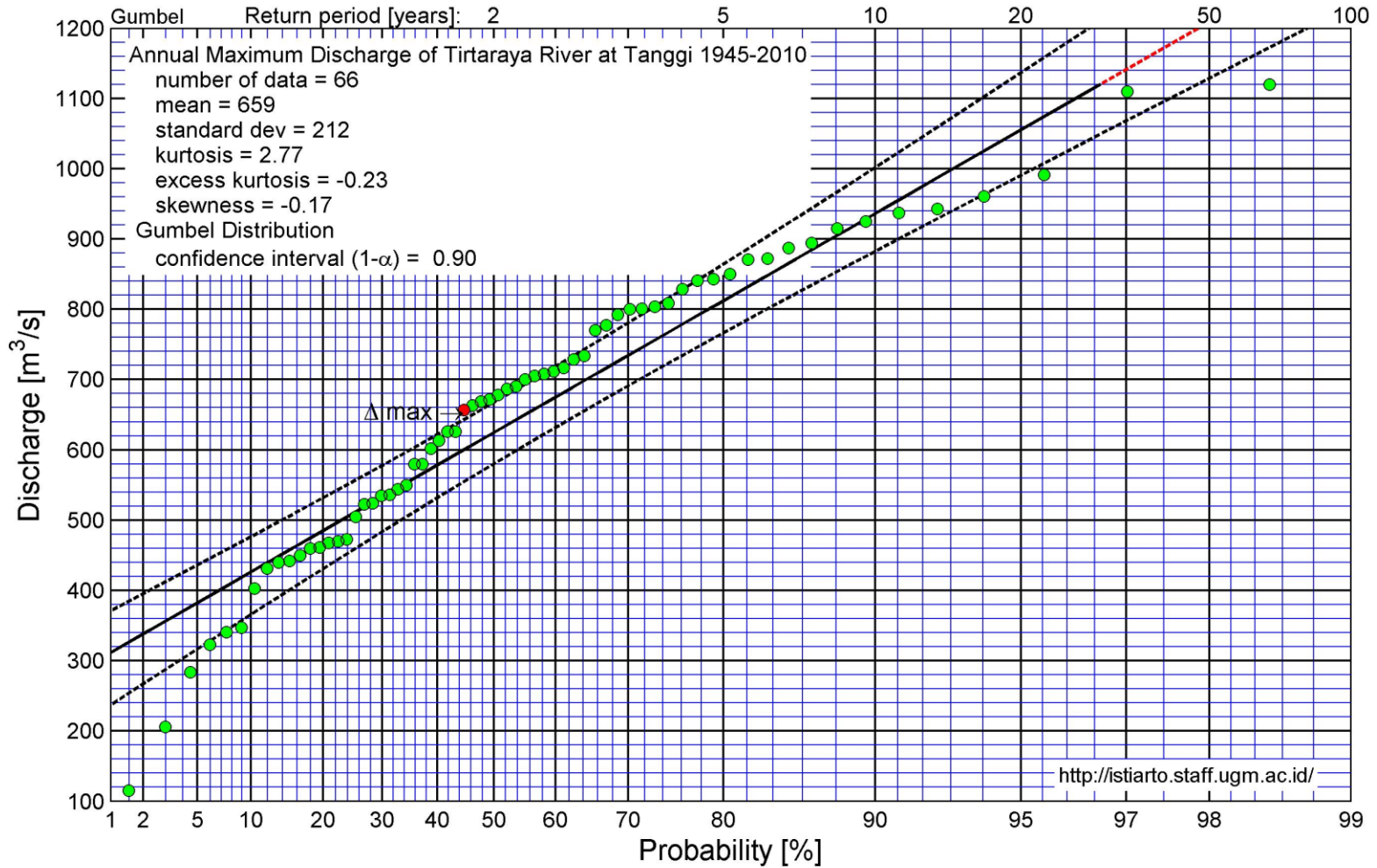
Ket : 1.  $X_T = \mu + K_T \cdot \sigma$

2. Menurut Uji Chi-Kuadrat, yang terbaik menggunakan distribusi NORMAL

3. Sedangkan menurut Uji Smirnov-Kolmogorov, yang terbaik menggunakan distribusi NORMAL

4. Hitungan dilakukan dengan menggunakan rumus dalam buku 'Applied Hidrology', 1988, Ven Te Chow, et. al.

Example of frequency analysis performed by using spreadsheet application/computer program



# istiarto

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## Hidrologi

1. Analisis Frekuensi
  - [Frequency Analysis on Hydrologic Data \(AProb\\_4E\)](#), in English
  - [Analisis Data Hidrologi Ekstrem \(AProb\\_3, AProb\\_31\)](#)
  - [Analisis Data Hidrologi Ekstrem \(AProb\\_2, AProb\\_21\)](#)
  - [Analisis Frekuensi Data Hidrologi Ekstrem](#)
2. Memplotkan Data pada Kertas Probabilitas
  - [Plot Data pada Kertas Probabilitas \(PProb\\_4\)](#)

### Cari di situs ini

### Terbaru

- [Site Visit ke PT Bukit Asam Tanjungenim SumSel](#)
- [Penyelesaian Numeris Persamaan Konveksi-Difusi](#)
- [Penyelesaian Numeris Persamaan Difusi](#)
- [Kursus HEC-RAS Juli 2014](#)

# AProb\_4E

- Confidence interval  $(1 - \alpha)$ 
  - An interval within which the true value (which is unknown) can reasonably be expected to lie.
  - The size of the interval depends on the confidence level  $(1 - \alpha)$
- The estimate of event value for a particular return period,  $y_T$ 
  - An upper and lower limits are specified by adjustment of  $K_T$

$$U_{T,\alpha} = \bar{Y} + s_Y \cdot K_{T,\alpha}^U$$

$$L_{T,\alpha} = \bar{Y} + s_Y \cdot K_{T,\alpha}^L$$

upper and lower confidence limit factors for normally distributed data; these are determined using the noncentral  $t$  distribution

# AProb\_4E

- Goodness of fit test
  - Smirnov-Kolmogorov test
  - Chi-square test
  
- Both tests are applied with confidence level of  $(1 - \alpha) = 0.90$



# Goodness of Fit Test

## ■ Smirnov-Kolmogorov Test

$$\Delta_{max} = \max \left| \text{prob}(Y < y) - \underline{\text{prob}}(Y < y) \right| \rightarrow \text{rejected if } \Delta_{max} < D_c$$

$D_c$  is critical value according to the Smirnov-Kolmogorov table



- according to the distribution being tested



- according to the observed data

# Goodness of Fit Test

## ■ Chi-square Test

$$\chi_c^2 = \sum_{i=1}^k \left( \frac{O_i - E_i}{E_i} \right)^2 \quad \rightarrow \text{rejected if } \chi_c^2 > \chi_{1-\alpha/2, k-p-1}^2$$

$p$  is the number of parameters estimated from the data

$O_i$  the observed relative frequency in the  $i$ th class interval

$E_i$  the expected relative frequency, according to the distribution being tested, in the  $i$ th class interval

$k$  the number of class intervals

# Goodness of Fit Test

## ■ Chi-square Test

$$\chi_c^2 = \sum_{i=1}^k \frac{n[f_s(x_i) - p(x_i)]^2}{p(x_i)}$$

→ rejected if  $\chi_c^2 > \chi_{1-\alpha/2, k-p-1}^2$

$p$  is the number of parameters estimated from the data

$k$  is the number of class intervals

theroretical probability according to distribution being tested

observed relative frequency

# Result of AProb\_4E in text format

```

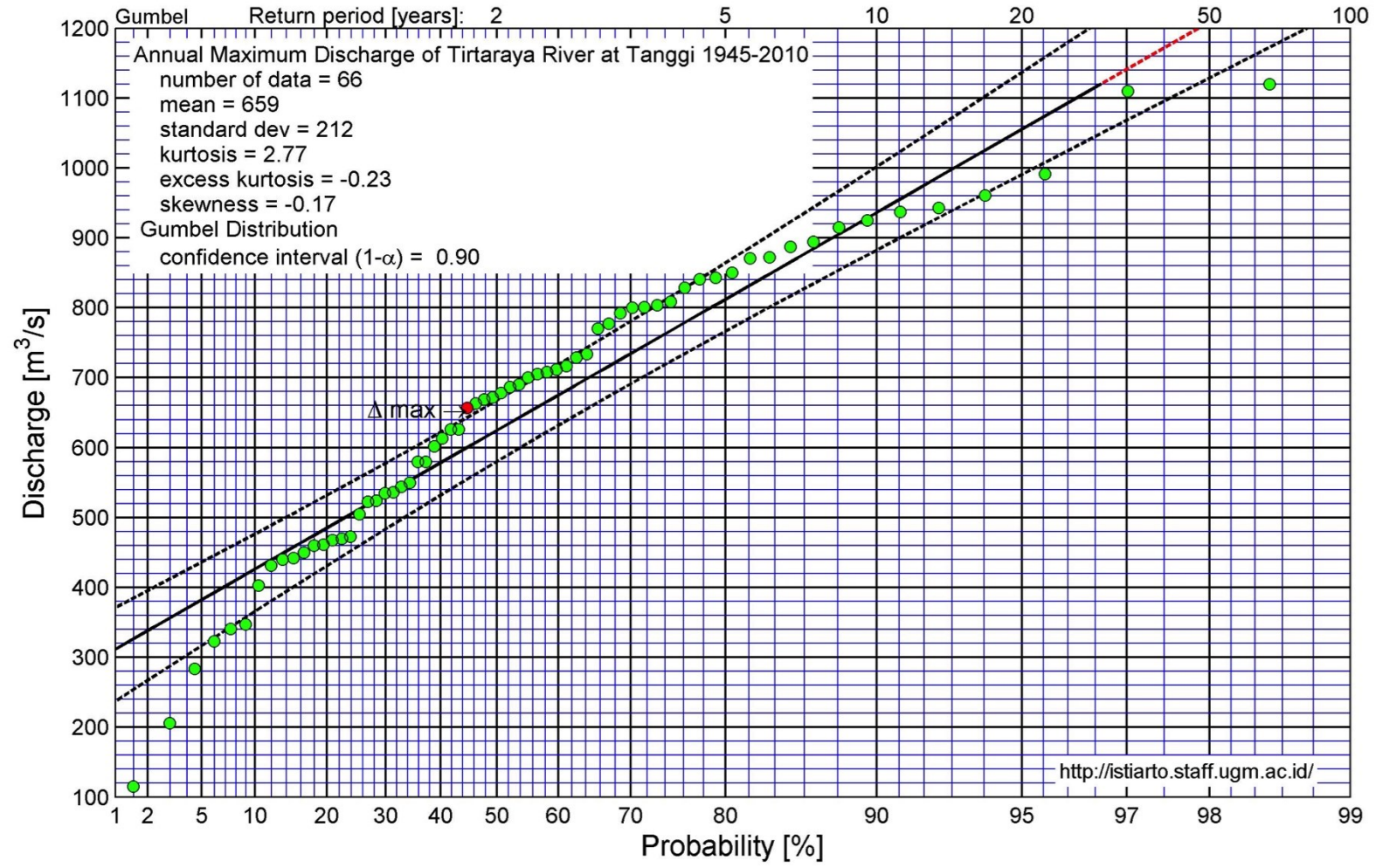
Tirtaraya Discharge resume.txt
Statistics of data
--> number of data : 66
--> minimum : 115
--> maximum : 1120
--> mean : 659.409091
--> standard dev : 212.143274
--> kurtosis : 2.772395
--> excess kurtosis : -0.227605
--> skewness : -0.167274

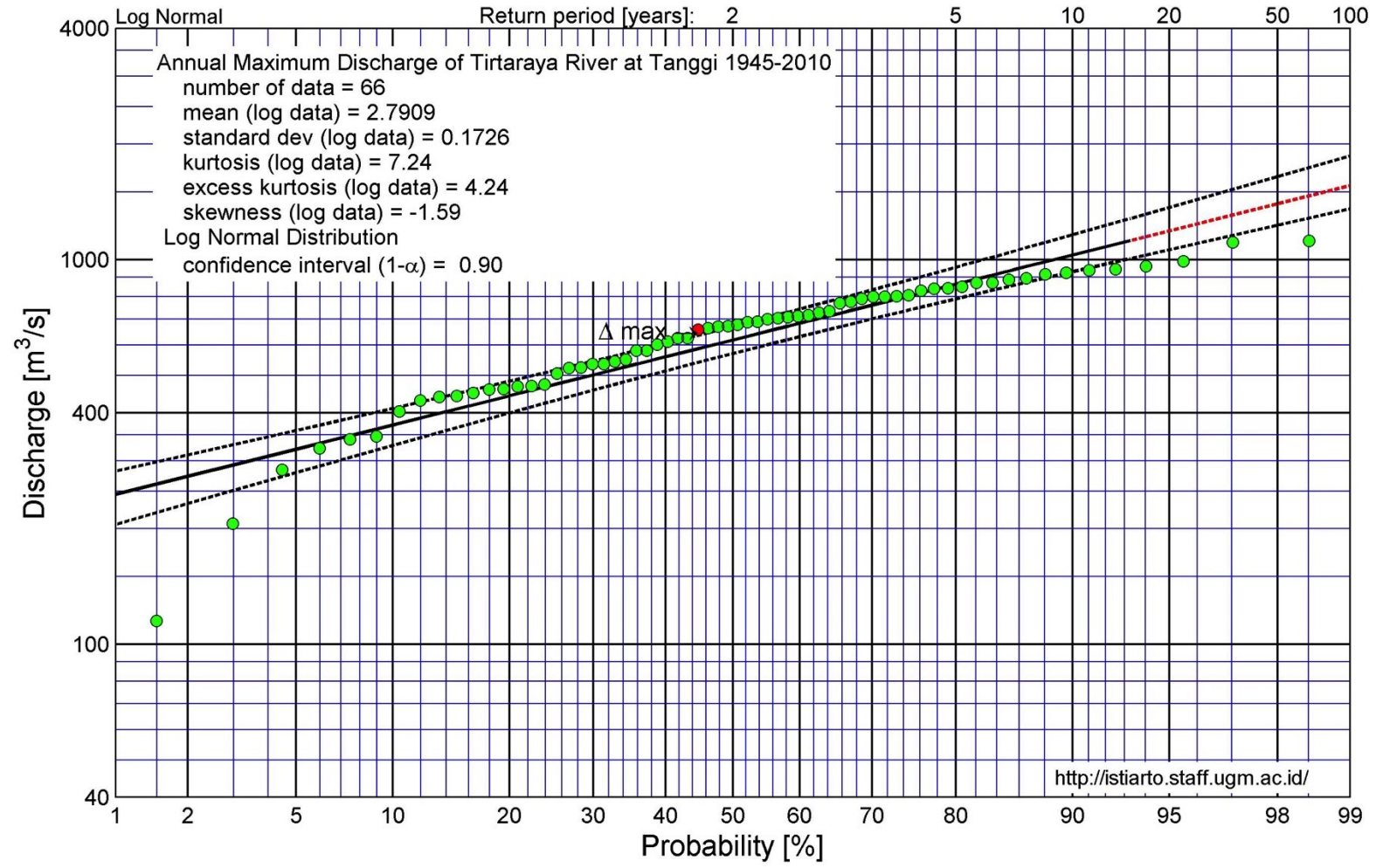
Statistics of log data
--> number of data : 66
--> minimum : 2.060698
--> maximum : 3.049218
--> mean : 2.790866
--> standard dev : 0.172613
--> kurtosis : 7.239843
--> excess kurtosis : 4.239843
--> skewness : -1.587294

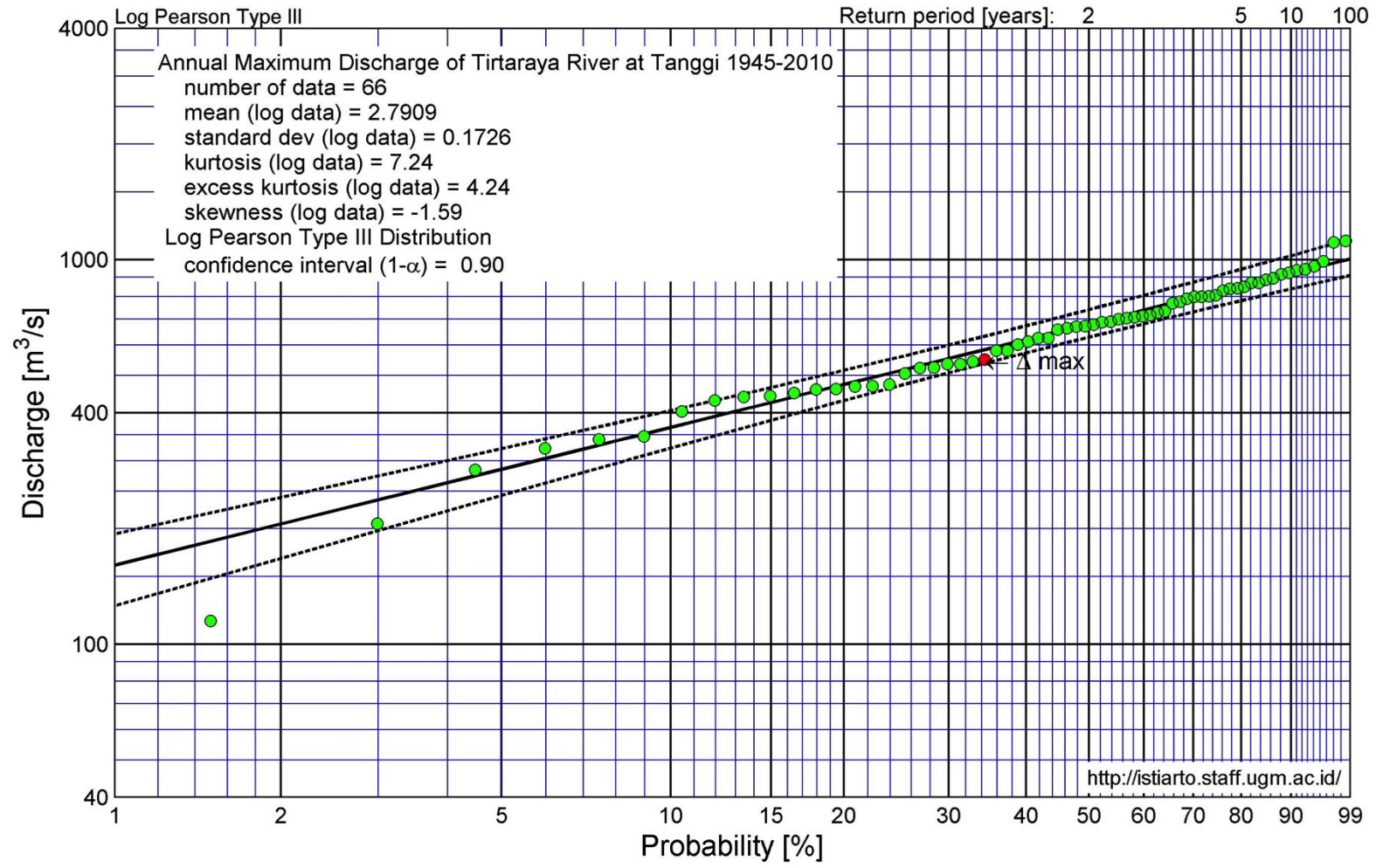
Goodness of fit test, \alpha = 0.10 (confidence level 1-\alpha) = 0.90
      Gumbel      Log Normal      Log Pearson III      Normal
Smirnov-Kolmogorov      OK      OK      OK      OK
Discrepancy (max) 0.118      0.114      0.047      0.049
Chi-square      OK      fail      fail      OK
Chi-square (max) 6.545      13.758      13.758      3.152

Estimates on values according to various return periods [years]
Return period      Gumbel      Log Normal      Log Pearson III      Normal
2      625      618      681      659
5      812      863      854      838
10     936      1030     919      931
20     1060     1190     959      1010
50     1210     1400     990      1100
100    1320     1560     1000     1150
200    1440     1720     1010     1210
500    1590     1940     1020     1270

```







# AProb\_4E

## ■ Improvement

- Feature that will be added: test for outliers

$$y_H = \bar{Y} + K_n \cdot s_Y$$

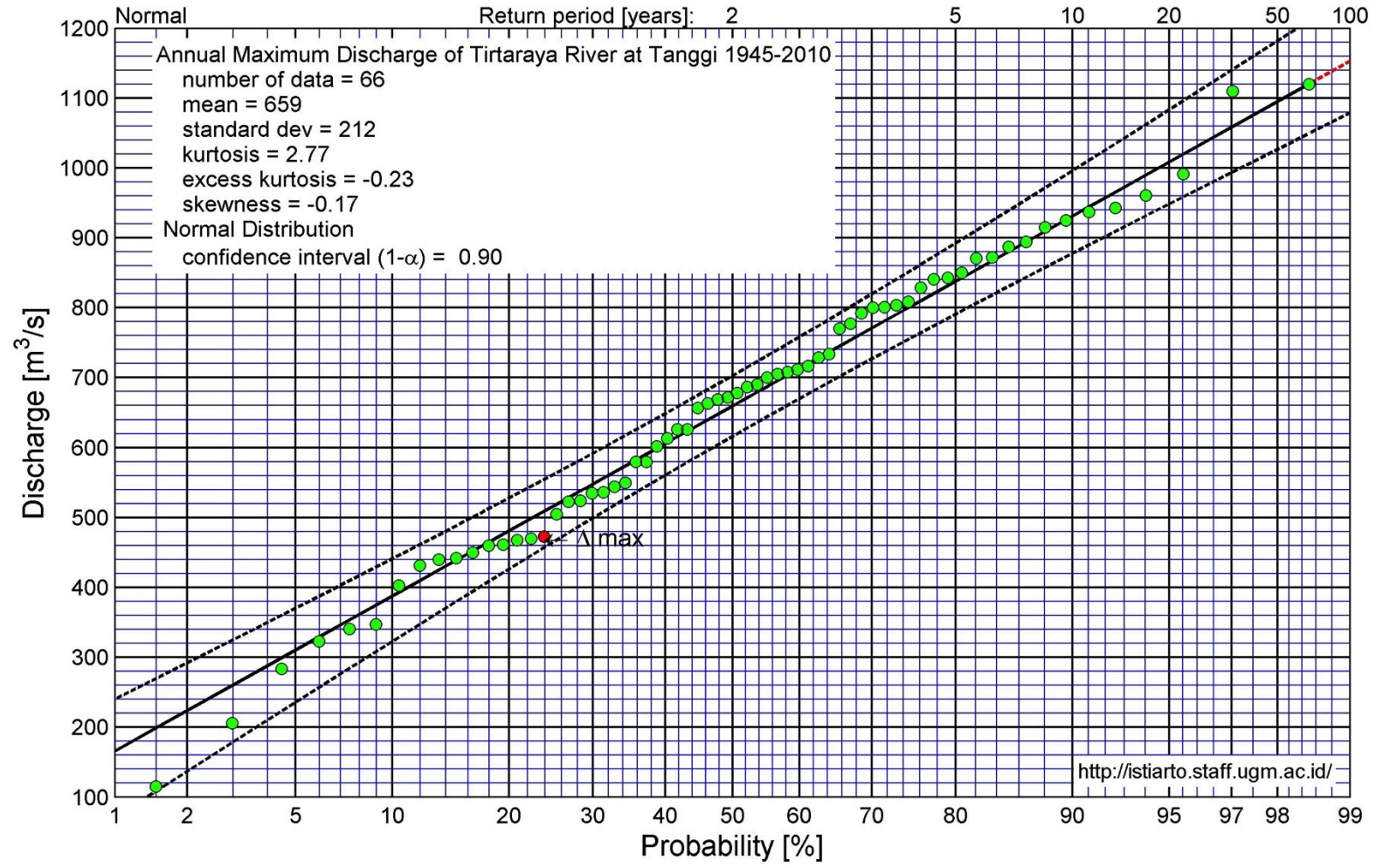
$$y_L = \bar{Y} - K_n \cdot s_Y$$

} high and low  
outlier thresholds

}  
in log unit

if logarithms of the data are greater than  $y_H$  or less than  $y_L \rightarrow$  they are considered as outliers





**TABLE 12.5.3**  
**Outlier test  $K_n$  values**

Sample size $n$	$K_n$	Sample size $n$	$K_n$	Sample size $n$	$K_n$	Sample size $n$	$K_n$
10	2.036	24	2.467	38	2.661	60	2.837
11	2.088	25	2.486	39	2.671	65	2.866
12	2.134	26	2.502	40	2.682	70	2.893
13	2.175	27	2.519	41	2.692	75	2.917
14	2.213	28	2.534	42	2.700	80	2.940
15	2.247	29	2.549	43	2.710	85	2.961
16	2.279	30	2.563	44	2.719	90	2.981
17	2.309	31	2.577	45	2.727	95	3.000
18	2.335	32	2.591	46	2.736	100	3.017
19	2.361	33	2.604	47	2.744	110	3.049
20	2.385	34	2.616	48	2.753	120	3.078
21	2.408	35	2.628	49	2.760	130	3.104
22	2.429	36	2.639	50	2.768	140	3.129
23	2.448	37	2.650	55	2.804		

*Source:* U.S. Water Resources Council, 1981. This table contains one-sided 10-percent significance level  $K_n$  values for the normal distribution.

# Outliers

- Transformasikan data debit ke data logaritma debit,  $y = \log x$
- Jika nilai logaritma debit banjir maksimum dalam sampel melampaui  $y_H$ , maka debit itu adalah outlier
  - Bandingkan debit banjir itu dengan data banjir historis dan informasi banjir di lokasi sekitar
    - Jika ada catatan yang menunjukkan bahwa debit outlier tsb adalah debit maksimum dalam periode yang panjang, maka debit outlier tsb dimasukkan sbg catatan historis banjir dan dikeluarkan dari analisis frekuensi
    - Jika tidak ada informasi banjir di lokasi sekitar, maka debit outlier tsb tetap diikuti dalam analisis frekuensi.

# Outliers

- Transformasikan data debit ke data logaritma debit,  $y = \log x$
- Jika nilai logaritma debit banjir dalam sampel lebih kecil daripada  $y_L$ , maka debit itu adalah outlier
  - Debit outlier itu dikeluarkan dari analisis frekuensi

# References

- Chow, Ven Te, Maidment, David R., Mays, Larry W., 1988, *Applied Hydrology*, McGraw-Hill, Inc., New York.
- Haan, C.T., 1982, *Statistical Methods in Hydrology*, 1<sup>st</sup> Ed., 3<sup>rd</sup> Printing, The Iowa State Univ. Press, Ames, Iowa, USA.

# Terima kasih