A Statistical Technique for Medium Range Forecasting of Rainfall over Calcutta during the Southwest Monsoon Season

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ABSTRACT. An objective procedure for predicting the rainfall of Calcutta during each of the 5-day periods of the monsoon season has been evolved. The technique is the same as was developed by Jagannathan and Ramamurthi (1961) for the prediction of 5-day rainfall at Bombay. The daily rainfall data of Alipore (Calcutta) for the period 1921 to 1950 were used for the classification of the rainfalls. The technique was evolved on the basis of available Indian radiosonde data for 1950 to 1958 and tested on the basis of independent data for 1959 to 1961. This has shown a skill score of 0-46.

Besides, the study has revealed the close relationship between the topography of the 700 and 500 mb pressure surfaces over India and the subsequent pentad rainfall over Calcutta particularly during the monsoon season.

1. Introduction

Attempts at forecasting weather for periods longer than 3 days or for seasons of the year, have been made in several countries. Considering the importance of the problem, a scheme for developing suitable techniques for forecasting weather 4-7 days ahead has been in operation during the Third Five Year Plan.

Jagannathan and Ramamurthi (1961) have evolved a technique for forecasting 5-day rainfall over Bombay during the monsoon season on the basis of Indian upper air data. The aim has been to predict the class (A, N)or S each of which has a climatological probability of one-third) in which the rainfall at Bombay, during successive pentads of the southwest monsoon season, will fall. In brief, the technique has been evolved after studying the contrasting upper air patterns associated with abnormal rainfall at Bombay on the one hand and subnormal rainfall on the other. The upper air parameters which also satisfied certain statistical tests were selected and graphically correlated by means of scatter diagrams, with precipitation during the subsequent pentad; and the prospective

predictors chosen along with their classification character. Using the classification thus obtained, contingency tables-parameter versus rainfall-were constructed. The information ratio I_c calculated was compared with its expectancy Ie on the 'Null hypothesis'. If the probability of $I_c - I_e$ was less than 5 per cent, the 'parameter' was used in the prediction. Three such parameters were chosen as predictors. The combined effect of several predictors is obtained as the product of the normalised contingency ratios separately in each class of the predictand for the appropriate class of each predictor. The class of the predictand having the highest product is selected as the forecast. The technique was tested on independent data for the subsequent period and claimed a 'skill score' of 0.46. As the relationship between the pressure heights at the selected stations and the subsequent rainfall over Bombay was not linear they stressed that the contingency technique was the most appropriate for the purpose under consideration.*

Prompted by the success, attempts are being made for evolving the necessary techniques for forecasting pentad rainfall at a

*For greater details of the technique described, the reader may refer to the original paper

network of selected stations in India. Further, work is on hand for deriving "factors of representativeness" of single station rainfall for representing area rainfall over areas round the station. Thus with the techniques of forecasting single station rainfall, the forecasting of rainfall over small areas could be achieved with sufficient degree of accuracy.

In this paper, the results of attempts made in regard to forecasting Calcutta rainfall are discussed. The method and the procedure adopted are practically similar to those of Jagannathan and Ramamurthi (loc.cit.)

2. Data utilised

The daily rainfall data of Alipore (Calcutta) for the 30-year period (1921-50) were used for the classification of Calcutta rainfall as 'Abnormal A', 'Subnormal S' and 'Normal N. For each pentad, the lower limit a of abnormal rainfall and the upper limit s of ubnormal rainfall have been determined : uch that a third of the frequency occurs above a, a third below s and the remaining third between a and s. The value of the limits a and s for Calcutta for each of the 24 pentads commencing from 31 May to 27 September are given in Table 1. All available upper air data from 1950 to 1958 have been utilised for the evolution of the technique and subsequent data for the period 1959-61 were used for testing the technique and assessing the skill score.

The predictors chosen are generally based on height contour values at some significant points on the 700 and 500 mb surfaces pertaining to the previous 5-day or 1-day periods as found appropriate.

3. Composite charts

Corresponding to the occasions of abnormal and subnormal rainfall over Calcutta in each month, composite 5-day charts and composite 1-day charts of upper-air contour heights and their anomalies were prepared. Six spells, one for each pentad of the month when rainfall of the pentad was abnormal and imilarly when it was subnormal, were

chosen. Contour heights and their anomalies over 5 days or 1 day (prior to the pentadof abnormal and subnormal rainfall) were averaged for all the occasions of abnormal and subnormal rainfall at Calcutta. These are referred to as 5-day (or 1-day) mean circulation patterns corresponding to abnormal and subnormal rainfall. Two series of composite charts, one representing the 5-day mean circulation pattern and the other the mean circulation pattern prevailing on the day just prior to the rainfall pentads concerned, were prepared. The rainfall pentads and the corresponding periods used for the 5-day and 1-day mean upper air composite charts are given in Table 2. The scrutinized data of available radiosonde stations were used in the preparation of these charts. Isopleths of mean heights were drawn at intervals of 20 metres and those of anomalies at intervals of 10 metres. Sample composite 5-day and 1-day mean anomaly charts for 700 mb and 500 mb levels corresponding to excessive rainfall and scanty rainfall at Calcutta are given in Figs. 1 (a) and 1 (b). The contrasting patterns revealed in these composite charts are utilised for drawing up the preliminary list of predictors. The important features revealed by the 5-day and 1-day mean anomaly charts in the different months June to September are given in Table 3.

Utilising the composite charts as guide, the parameters, for further graphical correlation with the precipitation of the subsequent pentad at Calcutta, were selected. As in the previous work, the actual values of pressure heights at the chosen stations were used instead of the anomaly values. For each of the parameters the range of values amongst the six members of each group was utilised to estimate the standard deviation in the group. The significance of the difference between the means of the two contrasting groups one corresponding to excessive rainfall and the other to deficient rainfall was ested by the usual *t*-test. The parameters which showed significant difference at the 5 per cent level were selected for further consideration.



(A), (C) 5-day mean anomaly chart antecedent to abnormal rainfall at Calcutta

(a), (c) 5-day mean anomaly chart antecedent to subnormal rainfall at Calcutta (B), (D) 1-day mean anomaly chart antecedent to abnormal rainfall at Calcutta

(b), (d) 1-day mean anomaly chart antecedent to subnormal rainfall at Calcutta

4. Graphical correlation

The selected parameters were classified according to their values into three different groups α , ν and σ so that the association between the parameters and the rainfall at Calcutta classified as A, N and S could be determined by the contingency analysis. As the upper air data available are rather meagre we have to resort to graphical methods.

With the values of two predictors X and Y on the co-ordinate axes, the classification of rainfall (W_i) in a particular pentad as A, N or S is plotted against X_i and Y_i which are the antecedent values of the predictors.* As in the Bombay case, the scatter of values A, N or S in the $(X_i \ Y_i)$ field could be easily separated into plots a, ν and σ .

the final stage, and the others rejected. The scatter diagrams which are henceforward to be used in the prediction scheme are given in Figs. 2 (a) and (b).

Contingency Analysis

Utilising the classifications obtained from the scatter diagrams, contingency tables were constructed with the selected pairs of parameters on the one hand and the rainfall of the following pentad on the other, and the Shannon Information ratios I_c calculated in respect of each of the predictor-pairs

$$I_c = 1 - \frac{\sum\limits_{i=1}^{k} f_i \log f_i - \sum\limits_{i=1}^{k} \sum\limits_{j=1}^{l} f_{ij} \log f_{ij}}{N \log N - \sum\limits_{j=1}^{l} f_j \log f_j} \dots \dots \dots (1)$$

The predictor pairs $(X \ Y)$ which showed where f_{ij} is the frequency in the cell at such clear cut grouping were considered at the i^{th} row of the predictor class (divided

*The 5-day or 1-day periods corresponding to a particular rainfall pentad are given in Table 2

TABLE 1

Values of the lower limit a of 'Abnormal' and upper limit s of 'Subnormal' rainfall at Calcutta (Alipore) during each of the pentads from 31 May to 27 September

Pentad	Pentad period	Upper lin subnorm	nits of al rain	Lower l abnorn	imit a of nal rain
140.		(cents)	(mm)	(cents)	(mm)
31	31.5-4.6	0	0	058	14.7
32	$5 \cdot 6 - 9 \cdot 6$	041	$10 \cdot 4$	094	23.9
33	$10 \cdot 6 - 14 \cdot 6$	027	6-9	195	$49 \cdot 5$
34	$15 \cdot 6 - 19 \cdot 6$	069	17.5	192	$48 \cdot 8$
35	$20 \cdot 6 - 24 \cdot 6$	094	$23 \cdot 9$	294	$74 \cdot 7$
36	$25 \cdot 6 - 29 \cdot 6$	109	$27 \cdot 7$	216	$54 \cdot 9$
37	$30 \cdot 6 - 4 \cdot 7$	078	$19 \cdot 8$	189	$48 \cdot 0$
38	$5 \cdot 7 - 9 \cdot 7$	106	$26 \cdot 9$	230	$58 \cdot 4$
39	$10 \cdot 7 - 14 \cdot 7$	121	30.7	211	$58 \cdot 6$
40	$15 \cdot 7 - 19 \cdot 7$	045	11.4	152	38.6
41	$20 \cdot 7 - 24 \cdot 7$	116	$29 \cdot 5$	189	48·0
42	$25 \cdot 7 - 29 \cdot 7$	181	$46 \cdot 0$	325	$82 \cdot 5$
43	30.7-3.8	122	$31 \cdot 0$	274	$69 \cdot 6$
44	4.8-8.8	127	$32 \cdot 3$	192	48-8
45	$9 \cdot 8 - 13 \cdot 8$	140	$35 \cdot 6$	261	$66 \cdot 3$
46	$14 \cdot 8 - 18 \cdot 8$	092	$23 \cdot 4$	205	$52 \cdot 1$
47	$19 \cdot 8 - 23 \cdot 8$	110	$27 \cdot 9$	266	$67 \cdot 6$
48	$24 \cdot 8 - 28 \cdot 8$	078	$19 \cdot 8$	174	$44 \cdot 2$
49	29.8-2.9	122	$31 \cdot 0$	226	$57 \cdot 4$
50	3.9-7.9	074	$18 \cdot 8$	164	41.7
51	$8 \cdot 9 - 12 \cdot 9$	104	$26 \cdot 4$	200	$50 \cdot 8$
52	$13 \cdot 9 - 17 \cdot 9$	082	$20 \cdot 8$	266	67.6
53	$18 \cdot 9 - 22 \cdot 9$	064	$16 \cdot 3$	155	$39 \cdot 4$
54	$23 \cdot 9 - 27 \cdot 9$	040	$10 \cdot 2$	145	$36 \cdot 8$

TABLE 2

Pentad periods to which rainfall forecasts relate and the corresponding periods for the composite 5 -day and 1-day charts of upper air contour anomalies

Pentad per rainfall for	iods to which ecasts relate	Periods to which upper air	Dates to which upper air
Pentad No.	Period	data (for the preparation of composite 5-day charts) relate	data (ter the preparation of composite 1-day charts) relate
4		JUNE	
		05 5 00 5	20 Mar
31		20.5 2.6	20 May
32	5·0- 9·0	30.5- 3.6	o Jun
33	10.6-14.6	4.0-8.0	8 Jun
34	15.6-19.6	9.6-13.6	13 Jun
35	20.6 - 24.6	14.6-18.6	18 Jun
36	$25 \cdot 6 - 29 \cdot 6$	19.6-23.6	23 Jun
		JULY	
37	30.6-4.7	24.6-28.6	28 Jun
38	$5 \cdot 7 - 9 \cdot 7$	29.6-3.7	3 Jul
39	10.7 - 14.7	4.7-8.7	8 Jul
40	$15 \cdot 7 - 19 \cdot 7$	9.7-13.7	13 Jul
41	$20 \cdot 7 - 24 \cdot 7$	14.7-18.7	18 Jul
42	$25 \cdot 7 - 29 \cdot 7$	$19 \cdot 7 - 23 \cdot 7$	23 Jul
	147 1	AUGUST	
43	30.7-3.8	24.7-28.7	28 Jul
44	4.8-8.8	29.7-2.8	2 Aug
45	9.8-13.8	3.8-7.8	7 Aug
46	14.8-18.8	8.8-12.8	12 Aug
47	19.8-23.8	13.8-17.8	17 Aug
48	$24 \cdot 8 - 28 \cdot 8$	18.8-22.8	22 Aug
		SEPTEMBER	
49	29.8-2.9	23.8-27.8	27 Aug
50	3.9-7.9	28.81.9	1 Sep
51	8.9-12.9	2.9-6.9	6 Sep
52	13.9-17.9	7.9-11.9	11 Sep
53	18.9-22.9	$12 \cdot 9 - 16 \cdot 9$	16 Sep
54	23.9-27.9	17.9-21.9	21 Sep

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TABLE 3

Contrasting features revealed by composite charts

Serial No	Month	Particulars of	Salient features	associated with
		, ,	'Abnormal' rainfall at Calcutta	'Subnormal' rainfall at Calcutta
(1)	June	5-day mean anomaly charts 700 mb	Two distinct areas of negative anomalies exist— one over northwest and the other over northeast India and Bay of Bengal with large negative values over north Bay and adjoin- ing West Bengal	A general reversal of the pattern. The areas of negative anomalics repla- eed by positive values and vice versa
		1-day mean anomaly charts 700 mb	Anomalies generally nega- tive over the country north of Lat, 13°N with largest anomalies over north Andhra Pradesh and adjoining Madhya Pradesh, The south Bay of Bengal and south peninsula are under the regime of positive ano- malies	The system has moved generally northwestwards with another negative anomaly area appearing over Andaman Sea. Two wedges of positive ano- malies from the north- west and southwest have made the anomalies over the eastern peninsula posi- tive
		5-day mean anomaly charts 500 mb	Two wedges of positive anomalies extending from Nepal to north Madhya Pradesh and from west Arabian Sea to Kutch flank the area of negative anomalies	Pattern almost reversed
		1-day mean anomaly charts 500 mb	Two areas of negative anomalies are over north Arabian Sea and the other over Bay of Bengal and adjoining parts of east and central India flanked by areas of positive anomalies	A steep wedge of positive anomalies extending from Upper Burma to coastal Andhra Pradesh has broken up the area of negative anomalies over the Bay and neighbourhood into two concentrated cells, one over central and north- west India and the other over Andaman Sea
(2)	July	5-day mean anomaly charts 700 mb	Except for a stretch of positive anomalies along the sub-Himalayan region and the extreme south- Peninsula, the entire country is under negative anomalies with probably two concentrated areas one over the Andaman Sea and the other over north Arabian Sea and Baluchistan	General reversal of condi- tions

Serial I	Month	Particulars of	Salient feature	es associated with
No.		composite charts	'Abnormal' rainfall at Calcutta	'Subnormal' rainfall at Calcutta
(2)	July	1-day mean anomaly charts 700 mb	The entire Peninsula, Ara- bian Sea and adjoining parts of Sind and Balu- chistan are under negative anomalies while the Hindu- stan plains and the central and south Bay of Bengal under positive ano- malies	More or loss reversal of the pattern with a shift of the col westwards
		5-day mean anomaly charts 500 mb	Two systems of negative anomalies exist-one over north India and north Peninsula and the other over the Indian Ocean with positive anomalies in between	A general reversal of the pattern
		1-day mean anomaly charts 500 mb	A steep wedge of positive anomalies advancing from the northeast lies over east U.P., Bihar and northeast Madhya Pradesh. Another steep wedge of positive anomalies lies over southeast Bay and South Burma. Flanked by these two wedges is a flat area of negative	The wedge of positive anomalies over east U.P., Bihar and northeast Madhya Pradesh has with- drawn making the whole area extending from West Bengal and Orissa to Rajasthan and Punjab an area of negative anomalies. An area of positive anomalies moving in from the
\$			anomalies with large nega- tive values concentrated over Madras—Kerəla, the north Bay of Bengal and the northwest India and adjoining West Pakis- tan	west has spread over the whole of Arabian Sea Kutch and Saurashtra. The wedge of positive anomalies over southeast Bay and South Burma has shifted northwards and now lies over the whole of Burma and east Bay of Bengal
(3) Aı	ngust	5-day mean anomaly *charts 700 mb	An area of negative anoma- lies extends from Punjab to West Bengal. Anomalies are also negative over extreme south Peninsula and the Indian Ocean. In between there is an extensive area of positive anomalies with Targe values concentrated over Andhra Pradesh	A wedge of positive anomalies protruding from the northeast has made the anomalies over east U.P. Bihar and West Benga positive. The area o negative anomalies in the south has deepened and also extended to South Burma and east Bay o Bengal
		1-day mean anomaly charts 700 mb	A belt of positive anomalies runs across the country between Latitudes 21°N and 11°N with negative anomalies on either side	The eastern end of the belt of positive anomalie has deepened and extended northwestwards making anomalies over Wes Bengal, Bihar and eas U.P. positive

TABLE 3 (contd)

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Serial No.	Month	Particulars of	Salient features	associated with
		composite charts	'Abnormal' rainfall at Calcutta	'Subnormal' rainfall at Calcutta
(3)	August	5-day mean anomaly charts 500 mb	A steep wedge of positive anomalies extends from southwest Bay to south Orissa with large values concentrated near coastal Andhra Pradesh. Another wedge of positive anomalies with fairly large values lies over northwest India. Negative anomalies prevail in the area lying between the two wedges	A general reversal of the pattern
		l-day mean anomaly charts 500 mb	Anomalies are negative over south Peninsula and the area extending from north Rajasthan to Bihar	Except for pockets of negative anomalies over the extreme northern parts, the country was under a regime of positive ano- malies
(4)	September	5-day mean anomaly charts 700 mb	Nogative anomalies over the country except in the extreme north and the Andaman Sea where anomalies are slightly posi- tive	Positive anomalies provail over the whole country with concentration of large values over the central and eastern parts
		1-day mean anomaly charts 700 mb	An area of negative ano- malies lies over northwest India. Tongue of negative anomalies projecting from the extreme south penin- sula and Ceylon extends upto west Bay of Bengal	Negative anomalies com- pletely wiped out. The whole country is under a regime of positive anoma- lics with larger values towards north
		5-day mean anomaly charts 500 mb	The entire country except northeast India and the extreme northern parts are in the grip of negative anomalies	Anomalies have become -positive over the whole country except the north- ern parts where anomalies are slightly negative
		l-day mean anomaly charts 500 mb	An area of negative ano- malies lies over northwest India with another nega- tive zone over central and south Bay and the adjoining east coast. Positive anomalies prevail over rest of the country	Generally positive anomalies over the country outside west Rajasthan and south Bay which are under the regime of negative ano- malies



## Fig. 2 (a). Scatter diagram

(The pressure height level and composite period are indicated as 700/5, 700/1 etc. 700/5 means 5-day mean height at 700-mb level)



Fig. 2(b). Scatter diagram

(The pressure height level and composite period are indicated as 700/5, 700/1 etc. 700/5 means 5-day mean height at 700-mb level)

#### TABLE 4

Predictors, their Information ratios  $I_c$  and 95 per cent Upper Confidence Limits  $L_{IE}$ 

	Predictors*	$I_c$	$L_{IE}$
June	(1) Pressure height values of 700-mb level over Calcutta and Veraval	0.2044	0.1160
	(2) 5-day mean pressure height values of 700-mb level over Madras and Veraval	$0 \cdot 2519$	0.0803
	(3) 5-day mean pressure height values of 500-mblevel over Trivandrum and Jodhpur	0.1157	0.0922
July	(1) 5-day mean pressure height values of 500-mb level over Visakhapatnam and Calcutta	0.1636	0.0832
	(2) 5-day mean pressure height values of 500-mb level over Calcutta and Madras	0.1846	0.0821
	<ul> <li>(3) Pressure height values of 700-mb level over Allahabad and Veraval</li> </ul>	0.1851	0.1091
August	(1) Pressure height values of 700-mb level over Trivandrum and Allahabad	0.1665	0.0935
	(2) 5-day mean pressure height values of 500-mb level over Visakhapatnam and Allahabad	0.2619	0.0894
	(3) 5-day mean pressure height values of 500-mb level over Madras and Allahabad	0.0935	0.0863
September	(1) Pressure height values of 500-mb level over Port Blair and Jodhpur	0.1620	0.1240
	<ul> <li>(2) 5-day mean pressure height values of 500-mb level over Delhi and Nagpur</li> </ul>	0.0711	0.0616
	<ul> <li>(3) Pressure height values of 500-mb level over Visakha- patnam and Allahabad</li> </ul>	0.1784	0.1210

*For predicting the rainfall of a particular pentad, the predictors should correspond to the periods indicated in Table 2

into k classes) and the  $j^{\text{th}}$  column of the predictand class (divided into l classes).

$$\begin{array}{c} {}^{k}_{\Sigma} f_{ij} = f_{j} \\ {}^{i}_{i=1} \end{array}; \begin{array}{c} {}^{l}_{\Sigma} f_{ij} = f_{i} \\ {}^{j}_{j=1} \end{array}; \\ {}^{k}_{i=1} {}^{l}_{j=1} f_{ij} = {}^{l}_{j=1} f_{ij} = {}^{k}_{i=1} f_{i} = N \end{array}$$

and logarithms are to the base e. The expectancy of the Information ratio on the Null hypothesis is

$$I_e = \frac{1}{2} (k-1) (l-1) / (N \log N - \frac{\Sigma}{j=1}^{l} f_j \log f_j) \dots (2)$$

If the probability of  $I_c - I_e$  is less than 0.05 then the predictor is used in the prediction scheme.

The predictors selected for prediction of pentad rainfall of Calcutta in the different months of June—September, the respective information ratios and the 95 per cent upper confidence limits are given in Table 4.

#### 5. Preparation of the forecast

Corresponding to the observed frequency  $f_{ij}$  in the (i, j) cell, the frequency  $f_{ij}^{\circ}$  expected on the hypothesis of independence, is calculated as —

$$f^{\circ}_{ij} = (f_i \cdot f_j) / N$$
 (3)

The contingency ratio  $R_{ij}$  and the normalized contingency ratio  $R'_{ij}$  are then calculated as under

$$R_{ij} = f_{ij} / f^{\circ}_{ij} \tag{4}$$

$$R'_{ij} = 1 + (R_{ij} - 1) \left[ f^{\circ}_{ij} \cdot k \cdot l/N_{0} \right]^{\frac{1}{2}}$$
 (5)

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							Predicta	nd Class					
Pred	ictor	<u> </u>	JUY	 NE		JULY	/	·	AFGUS	г		EPTEMI	21. D
No.	Class	$S_{-}$	N	А	8	N	. t	8	N	А	8	N	A
1	σ	10.2032	9.7423	9.8701	10.2842	9.9074	9.5237	10-1862	9.7978	9.8515	10.1926	9-6632	9.566
	v	$9 \cdot 9554$	$10\cdot 2748$	$9 \cdot 5944$	$9 \cdot 7339$	10.2676	9.7886	$9 \cdot 7259$	$10 \cdot 1842$	9.8879	9.8723	10.2744	9.6739
	a	9.5884	$9 \cdot 9681$	$10\cdot 2271$	$9 \cdot 8504$	$9 \cdot 7035$	$10\!\cdot\!2393$	$9 \cdot 8138$	$9 \cdot 9134$	$10 \cdot 2032$	$9 \cdot 9371$	$9 \cdot 8479$	10.142
п	σ	$10 \cdot 2600$	$9 \cdot 5228$	$9 \cdot 8833$	10.3135	$9 \cdot 6769$	9.7279	$10 \cdot 2115$	9.3269	10.0041	10.1710	9.7834	9.5120
	ν	$9 \cdot 7497$	$10\cdot 2628$	$9 \cdot 8484$	9.5006	10.3138	$9 \cdot 8270$	$9 \cdot 6907$	10.3449	9.5552	$9 \cdot 8586$	10.2482	9.692
	a	$9 \cdot 9729$	9.7069	$10\cdot 1838$	$9 \cdot 9211$	$9 \cdot 7366$	$10\!\cdot\!1881$	$9 \cdot 3911$	$10 \cdot 1006$	$10\cdot 2435$	$9 \cdot 9702$	$9 \cdot 8929$	10.113
Ш	σ	$10 \cdot 2010$	9 • 7035	$9 \cdot 8908$	10.2818	9.8140	9.7456	10.1604	9.8048	9.9109	10.1574	$9 \cdot 8973$	9.886
	v	$9 \cdot 8914$	$10\cdot 2321$	$9 \cdot 8238$	$9 \cdot 6037$	$10 \cdot 2694$	$9 \cdot 8582$	9.6619	10.3335	$9 \cdot 7335$	$9 \cdot 9613$	10.1587	9.7480
	α	$9 \cdot 6856$	$9 \cdot 9113$	$10\cdot 2236$	$9 \cdot 9775$	9.6753	10.1785	$9 \cdot 6556$	9-9730	$10 \cdot 2335$	9.5689	9.9136	10.2794

## TABLE 5

Values of  $(10.0000 + \log R'_{ij})$  based on data for 1950-58*, used in the present study

*Data for the subsequent three years 1959-1961 were used for testing the technique and assessing the skill score

#### TABLE 6

Values of  $(10 \cdot 0000 + \log R'_{ij})$  (based on data for the period 1950-1960) to be used by field forecasters for preparing forecasts of 5-day rainfall at Calcutta

Pro	diatore*						Predicta	und Class					
No	Class		JUNE			JULY		~	AUGUS	т	5	SEPTEM	BER
	Crass	S	$\mathcal{N}$	A	S	N	A	S	N	А	S	N	A
I	σ	10.1830	9.9121	9.7719	$10 \cdot 2875$	9.8781	9.5201	10.210	9.8289	9.7356	10.2693	9+6020	9.8553
	ν	$9 \cdot 9157$	$10 \cdot 2719$	$9 \cdot 6328$	$9 \cdot 8758$	$10 \cdot 2448$	9.7257	$9 \cdot 7495$	10.2918	9.8621	9.8300	10.3025	9+6272
	CZ,	$9 \cdot 7141$	$9 \cdot 8310$	$10\cdot 2565$	$9 \cdot 7537$	$9 \cdot 7897$	$10\!\cdot\!2483$	9.7050	$9 \cdot 8698$	$10 \cdot 2507$	$9 \cdot 8446$	$9 \cdot 8403$	10.1909
п	σ	$10 \cdot 2550$	$9 \cdot 5528$	9.8781	10.3124	9+6679	$9 \cdot 6995$	10.2370	9.5986	$9 \cdot 8162$	$10 \cdot 2095$	9.8573	9.8424
	v	$9 \cdot 8478$	$10\cdot 2543$	9.7370	$9 \cdot 6824$	$10\cdot 2824$	$9 \cdot 8305$	$9 \cdot 8262$	10.3498	9.4857	9.9106	$10 \cdot 2146$	9.7395
	Cl ₂	9.9157	$9 \cdot 7163$	$10 \cdot 2203$	$9 \cdot 8530$	$9 \cdot 8516$	$10 \cdot 1805$	$9 \cdot 2076$	$9 \cdot 9430$	$10\cdot 3282$	$9 \cdot 9036$	$9 \cdot 8929$	10.1459
ш	σ	$10 \cdot 2320$	$9 \cdot 6257$	$9 \cdot 8652$	$10 \cdot 2783$	$9 \cdot 8534$	$9 \cdot 6339$	10.1480	$9 \cdot 8011$	$9 \cdot 9183$	10.1928	9.9414	9.7601
	ν	9.7218	$10\cdot 2709$	9.8886	$9 \cdot 6976$	$10\cdot 2617$	$9 \cdot 8458$	$9 \cdot 6936$	10.3500	9.7538	9.9376	10.1495	9.8427
	Cl.	9.8442	$9 \cdot 8236$	$10\cdot 2053$	$9 \cdot 8991$	$9 \cdot 7172$	$10\cdot 2121$	$9 \cdot 6324$	9.9980	$10\cdot\underline{2}\underline{2}3\underline{2}$	$9 \cdot 5253$	9.8347	10.3015

*For details of different predictors for each month, see Table 4

where  $N_o$  is the largest N in the different contingeny tables. The combined effect of the several predictors is then determined by obtaining the product of the normalized contingency ratios  $R'_{ij}$  in respect of each predictand class for the appropriate class of each predictor

$$\pi_j = \frac{k}{\pi} R'_{ij} \tag{6}$$

or taking logarithms

$$\log_{10} \pi_j = \sum_{i=1}^k \log_{10} R'_{ij}$$
(7)

The class of the predictand having the highest log-sum is selected as the forecast.

To speed up and simplify the preparation of forecasts, the number 10.0000 has been added to  $\log R'_{ij}$  to avoid negative values. In this way the simple addition of  $(10.0000 + \log R'_{ij})$  for each predictand class j will give the forecast as outlined above. The values of  $(10.0000 + \log R'_{ij})$  for each of the three predictors based on data for 1950 to 1958 used in this study are given in Table 5.

Another set of values of  $(10.0000 + \log R'_{ij})$  utilising the data from 1950 to 1960 are given in Table 6. These values may be used by the field forecaster in preparing forecasts of pentad rainfall at Calcutta in the coming years.

#### 6. Verification of forecasts

Forecasts were prepared for each of the 24 pentads for the subsequent three years 1959 to 1961 and compared with the actual rainfall at Calcutta. The results are presented below.

		Pr	ecipitat foreca	tion el sted	lass
		S	N	A	Total
Observed	r s	18	4	7	29
precipitation	) N	5	6	7	18
class	A	2	1	22	25
	Total	25	11	36	72

It is recalled that the limits of the three classes S, N and A have been fixed such that each class has one-third probability.

It is seen that on 36 occasions abnormal rain was forecast against an actual number of 22 (approx. 60 per cent).

Holloway, J. L. and Woodbury, Max A.

Jagannathan, P. and Ramamurthi, K. M. 1961

Lund, I. A. and Wahl, E. W. 1955

Ramaswamy, C.

The extent to which each class of rainfall was correctly forecast is shown below—

Percentage of occasions	each observed
category was correct	ly forecast

Observed	Forecast class						
class	S	N	A	Total			
Subnormal	62	14	24	100			
Normal	28	33	39	100			
Abnormal	8	4	88	100			

It is seen from above that the occurrence of abnormal rainfall was correctly forecast on 88 per cent of the occasions.

#### 7. The Skill Score

The Skill Score S given by the expression S = (R-E)/(T-E) has been calculated, where T is the total number of forecasts issued, R is the number of correct forecasts and E the number expected on climatological considerations alone. It will be seen that

$$S=0$$
 when  $R=E$   
and  $S=1$  when  $R=T$ 

The Skill Score of the present technique for forecasting Calcutta rainfall is 0.46. This is of the same order as was obtained in the previous study.

#### 8. Acknowledgements

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#### Appendix 1

## An example illustrating the method of working out of different steps leading to the preparation of final forecast

## Procedure

- From Table 2 determine the 5-day and 1-day periods (corresponding to the forecast period) to which the predictors should refer.
- (2) From Table 4 select the predictors to be used. In respect of each predictor the relevant upper air data for the periods determined by reference to Table 2 to be collected.
- (3) The classification of the predictors is then determined from the scatter diagrams given in Fig. 2.
- (4) The values of  $(10 \cdot 0000 + \log R'_{ij})$  corresponding to each predictor class are determined from Table 5 and summed up for each class of the predictand.
- (5) The predict and class having the highest total is given as the forecast.

As an illustration let us take the case of preparing forecast of 5-day rainfall at Calcutta during the period 5 to 9 June 1959.

The classification of predictors (selected by reference to Tables 2 and 4) determined from the scatter diagrams is as under—

Predictor I  $\alpha$  , Predictor II  $\alpha,$  Predictor III  $\nu$ 

Referring to Table 5, we get the values of  $(10 \cdot 0000 + \log R'_{ij})$  for each of the predictors and find the total for each predictand class as under —

		S	N	A
Predictor Ι Class α		$9 \cdot 5884$	$9 \cdot 9681$	$10 \cdot 2271$
Predictor II Class $\alpha$		$9 \cdot 9729$	9.7069	$10 \cdot 1838$
Predictor III Class $\nu$		$9 \cdot 8914$	$10 \cdot 2321$	$9 \cdot 8238$
	Total	$29 \cdot 4527$	$29 \cdot 9071$	$30 \cdot 2347$

# Values of $(10.0000 + \log R'_{ij})$ for the predictand class

As predict and class A (underlined) has the highest total, that is the forecast. The forecast may, therefore, be issued as—

'The rainfall at Calcutta during the period 5 to 9 June 1959 will be Abnormal'*.

^{*}The lower limit of Abnormal rainfall at Calcutta during the period 5 to 9 June determined from Table 1 is 0.94 inches or 23.9 mm