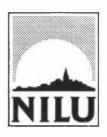
NILU OR: 34/85 REFERENCE: 0-8068

DATE : JUNE 1985 ISBN : 82-7247-596-0

#### CONSERVATION AND RESTORATION OF MONUMENTS

# PART B MULTIPLE REGRESSION ANALYSIS BETWEEN DETERIORATION OF CALCAREOUS STONES AND ENVIRONMENTAL VARIABLES

Jan F. Henriksen, Svein E. Haagenrud og Frederick Gram



NORSK INSTITUTT FOR LUFTFORSKNING Norwegian Institute For Air Research POSTBOKS 64 — N-2001 LILLESTRØM — NORWAY

#### SUMMARY

The results from the NATO/CCMS project "Conservation and restoration of monuments" have been statistically analysed for correlations between environmental factors and the weight loss of sandstone and limestone.

The weight loss and the pollutants used are taken from the German main report from Zollern-Institut (Zallmanzig, 1985). The meteorological data are collected from the participating countries.

Some of the most interesting data like time of wetness were not available and some countries did not provide any data at all. For some of the stations data like rain days and frost days were therefore generated from climatological maps. This will reduce the possibilities for detailed analysis of the deterioration results and the validity of the regression lines found.

The analysis showed that the deterioration of both the limestone and the sandstone increased with the amount of  ${\rm SO}_2$  deposition as determined by an IRMA apparatus and rain days at the test sites. The best equations are

weight loss sandstone = 
$$-0.05*SO_2$$
 (deposition)  
 $-0.08*$ rain days + 1.9 R = 0.79  
weight loss limestone =  $-0.03*SO_2$  (deposition)  
 $-0.01*$ rain days + 1.4 R = 0.69

Only 62% and 48% of the variances are explained by these equations.

Weight losses in the equations are given as per cent weight chances with negative values to distinguish the results from the weight gains measured on stones in sheltered positions.



#### CONTENTS

		Page
	SUMMARY	1
1	INTRODUCTION	5
2	STATISTICAL DATA	5
	2.1 Data	6 7 8
3	DISCUSSION	11
4	CONCLUSIONS	11
5	REFERENCES	12
	APPENDIX 1	

### MULTIPLE REGRESSION ANALYSIS BETWEEN DETERIORATION OF CALCAREOUS STONES AND ENVIRONMENTAL VARIABLES

#### 1 INTRODUCTION

As a part of the NATO/CCMS project "Conservation and Restoration of Monuments" it was decided to look for dose-response correlations by making regression analysis of the stone results. The analysis performed are based on the exposure program carried out at 25 sites in Europe and 2 sites in USA from 1980 to 1982. The deterioration results and the pollution data are taken from the main report from the FRG (Zallmanzig, 1985) and the meteorological data used were collected from nearby meteorological stations by the participating countries.

The Norwegian proposal for the meterological data needed was expressed in a letter of 27 October 1982 and later confirmed in a letter of 12 January 1984, Appendix 1. At the expert meeting in Münster 9 - 10 May 1984 it was agreed that the mathematical/statistical evaluation should be carried out as soon as the meterological data were received.

Data were received from FRG, Greece, Italy, Norway, Sweden and UK in due time. The rest of the data are still missing. In spring 1985 a decision was made to carry out the regression analyses on the data available.

#### 2 STATISTICAL DATA

#### 2.1 <u>DATA</u>

Table 1 gives the list of all parameters used and Table 2 gives the data available for the analysis from the measuring program. Since the main interest of the analysis was to find relations between weight loss and the other parameters, three stations were excluded: Stations Rouen (F2) and Ulmer Münster (D2) were excluded since the weight loss results were missing. The cathedral of Pisa (I2) was excluded because the test site was in a sheltered position.

Meteorological data were not reported from all stations. To complete some meteorological variables in the data base, the missing data were estimated for broader regions from climatological maps.

A preliminary correlation analysis of the remaining data sets gave the following conclusions:

- Good correlation between the amount of sulphate concentrations in the stone for the different test sites for the two stone materials.
- Good correlation between the weight losses found for the two stone materials.
- Good correlation between the weight increases of the sheltered samples found for the two stone materials.
- Fairly good correlation between frost days, ice days and snow days.
- Fairly good correlation between time of wetness, amount of rain, duration of rain, rain days and wet days.

For the first analysis performed, 24 data sets were used. Because of the lack of meteorological data and since fairly good correlations between several of the parameters were found, we decided to use rain days and frost days as the climatic parameters in the analysis.

#### 2.2 GROUPING OF DATA

Different statistical methods have been used in the analysis of the data. For creation and completion of the data, correlation analysis combined with bivariate data plots was performed (Gram, 1972).

In order to detect unknown groupings in the data an exploratory data analysis of the data was performed by the Norwegian Computing Center. The results are given in Appendix 2. The main conclusion was that by removing the three stations GB3, NL2 and NL3 from the data sets the

other stations seemed to be in one group where the weight losses were mainly effected by  $\mathrm{SO}_2$  and rain days. Table 3 gives the final data sets for stations affected by  $\mathrm{SO}_2$ , called the inland stations.

Since a small number of stations were situated along the coast, a group of 7 stations was sorted out to form a coast group, Table 4. Besides the three stations excluded in Table 3, the group included the two last stations from the Netherlands (NL1) and (NL4), the Norwegian station in Bergen (N1) and La Rochelle in France (F3).

#### 2.3 CORRELATIONS - INLAND

In all the correlation analyses carried out in this investigation the data sets were divided in two groups, one for sandstone and one for limestone. The correlation matrix for sandstone is shown in Table 5 and for limestone in Table 6.

In the correlation matrix shown in Table 5, the best correlation coefficients are found for variables which are related like " $SO_2$  in stone" and " $log\ SO_2$  in stone". The results also show that the IRMA values correlate fairly well with the " $SO_2$  in stone" results.

The greatest interest is to find variables which correlate with the weight loss results in Table 2. The most interesting correlation coefficients between the weight losses and environmental data will be for values close to -1. This is because the weight losses are given with negative values in the data base to distinguish them from the weight gain of the stones in the sheltered positions. Among the single correlations, the best correlation coefficients are found for the variables expressing the SO<sub>2</sub> flux.

The limestone results in Table 6 show the same trends as the sandstone results but the correlation coefficients are lower.

In Figures 1 and 2 the weight losses for sandstone are plotted against the  $SO_2$  flux to sandstone. In Figures 3 and 4 the same plots are shown for limestone. One of the data sets seems to be quite different from the others. The point is marked with a square on the figures. Particu-

larly the plot against "SO<sub>2</sub> in stone" seems to be special. The station is Lelystad in the Netherlands. The main reason seems to be that Lelystad also has a substantial weight loss for the sheltered stone samples. The weight loss is probably caused by a washing out of gypsum by "horizontal rain" and the amount of sulphate analysed will then be too low. A similar effect will occur with the IRMA apparatus if the drops from the paper housing are blown away in the wind instead of falling back into the reservoir. It is possible that the Lelystad results should have been taken out of the data base. This has not been done mainly because some of the other stations also have weight losses for the sheltered limestone and with the same argument we should then exclude several stations in the data base.

Except for Lelystad none of the other data sets have the same tendency to be outliers in all the correlation plots. The Greek stations seem to have less corrosion than expected from the  $\mathrm{SO}_2$  concentration of the IRMA apparatus. Differences in the climate pattern between Greece and the other countries will probably explain this.

#### 2.4 CORRELATION - COAST

Tables 7 and 8 give the correlation for sandstone and limestone for the seven selected coast stations.

The small number of data sets used, gave a high unexplained variance. The chloride effect seems to be more dominating for the coast results but the chloride values are completely dominated by the high chloride result from Texel as shown i Figure 5.

#### 2.5 MULTIPLE REGRESSION

Multiple regression of the coast data sets was not performed since the data sets were so few and many of the remaining missing climatic data were grouped to the same value.

The results of the multiple regression analysis (Gram, 1972) of the inland data are shown in Tables 9-14. The variables selected for the

tests were weight loss open exposured,  ${\rm SO}_2$  deposition on IRMA,  ${\rm SO}_2$  deposition on stone,  ${\rm log~SO}_2$  deposition on IRMA,  ${\rm log~SO}_2$  deposition on stone, chloride deposition on IRMA, chloride deposition on stone,  ${\rm NO}_2$  deposition on IRMA,  ${\rm NO}_2$  deposition on stone, frost days and rain days.

All the regressions are carried out with the weight losses as the main parameter. Because of fewer data sets in the regression analyses than in the correlation analysis the correlation coefficient for the variables will change. However, the dominating factor is still the  $SO_2$  concentration.

The F-tests for the regression with two or three variables showed that only a few of the combinations gave a substantial increase in the correlation. Some of best regressions found had to be excluded because of intercorrelation between the variables. For sandstone the only regression with two separate variables which gave a sufficient increase in the correlation coefficient according to the F-test are:

$$OWS = -0.05*SOI - 0.08*RD + 1.97$$
 R= 0.79

The limestone results are very similar to those for sandstone. Only two of the regressions with two variables gave sufficient increase in the correlation coefficient according to the F-test.

$$OWL = -0.03*SOI - 0.01*RD + 1.39$$
  $R = 0.69$   $OWL = -3.4*Log SOI - 0.01*RD + 5.31$   $R = 0.68$ 

The most interesting of the combinations with three variables are the combination with  $\mathrm{SO}_2$ , rain days and frost days. Both for sandstone and limestone this combination will increase the correlation coefficient but not sufficiently to be valid in the F-test. The regression equalions are

OWS = 
$$1.87 - 0.05*SOI + 0.003*FD - 0.01*RD$$
 R= 0.81  
OWL =  $1.31 - 0.03*SOI + 0.004*FD - 0.01*RD$  R= 0.73

 ${\rm SO}_2$  and rain days affect the stones as expected. Both give an increased deterioration with higher concentrations or higher amount of rain. Frost days can affect the stone detoriation in two different

ways. Geologically the effect of frost shattering are well known and the possibility that this effect also plays a major part in stone deterioration of monuments in colder areas of the world has been discussed. The other possible effect is that the chemical reactions on the surface are highly reduced at low temperatures and that low temperatures will reduce the deterioration. Both for limestone and sand-stone the frost days came out with possitive sign showing that frost reduces the deterioration of the stone.

There are several reasons for this result. First of all, two years is a very short time for frost shattering to occur. Secondly the stone samples selected were all very homogeneous and cracks or cleavage normally found in stones will hardly occur on the samples exposed in this research program. In stones with differences in the chemical compositions, the parts with high lime content will normally be attacked more then other parts, leaving cracks sensitive for frost shattering at a later stage.

In some of the regressions nitrogen dioxide will slightly improve the regression. The coefficients are sometimes positive and sometimes negative leaving no clue for a nitrogen dioxide effect. However, the nitrogen dioxide fluxes measured are very small and the exposure places situated in areas where the concentration and effect of nitrogen dioxide is minor.

In Figures 6 and 7 the calculated values for the weight losses of stones as a function of  $SO_2$  and rain days are plotted against the observed values. The correlation is expressed by the equations

Limestone Ycal = 0.64 ' Yobs - 1.2 R = 0.70 Sandstone Ycal = 0.48 ' Yobs - 1.85 R = 0.80

With equality between calculated and observed data, the first constant should be 1 and the second 0. Figures 6 and 7 show that sulphate concentration in the stone and rain days alone can only partly describe the stone deterioration. However, none of the other variables available will improve the equations found.

#### 3 DISCUSSION

The data used in the statistical calculations have a high degree of uncertainty. The weight losses are not only affected by the  $\mathrm{SO}_2$  deposition but also by the regularity of rain. If the rain only comes in seasons and the  $\mathrm{SO}_2$  exposure time from the last rain to the intake is long, it will affect the weight loss.

Rain days are not the best variable for expressing the water effect. Duration of rain or time of wetness are probably better terms but this was not possible to generate from the data available.

Frost days or ice days can be fairly good parameters for reduced chemical reactions. Frost shattering, however, is more affected by fluctuations in the temperature and the freezing point will most probably differ from zero. Frost days will therefore be less effective as a variable sensitive for possible frost shattering.

The  $SO_2$  effect is expressed both with the IRMA apparatures and by increased  $SO_4$  -concentration of the sheltered stone samples.  $SO_4$  -concentration in the stone is affected by horizontal rain in the coastal area as can be seen in several of the results from the Netherlands. The uncertainty in the  $SO_2$  in stone results can therefore be substantial.

The IRMA results are based on the assumption that  $\mathrm{SO}_2$  is adsorbed in alkaline solution and stays in the solution. The reduced amount of electrolyte left at the end of the 14 days period is therefore caused by evaporation of water. Many investigations of different types have proved that this assumption is valid. However, in strong wind, there is a danger that some droplets will blow away from the paper housing instead of dripping back into the bottle. This will reduce the accuracy of the results in some areas. Still we find that the IRMA results give the best  $\mathrm{SO}_2$  results available in this project.

#### 4 CONCLUSIONS

In the NATO/CCMS project the meteorological data were not measured. To get these data we had to use data from nearby meteorological stations

or to interpolate from climatological maps. This increased the uncertainties of the data. However, even if we take into account all the uncertainties in the data used for the analysis performed, some important conclusions can be drawn.

Baumberger sandstone seems to give higher and more homogeneous deterioration than the Krensheimer limestone.

The weight losses of both the sandstone and limestone have a good correlation with the  ${\rm SO}_2$  concentration measured by the IRMA apparatus and the  ${\rm SO}_2$  in stone.

The best correlations with multiple regression were found for the combination of  ${\rm SO}_2$  and rain days. The equations for the weight loss for sandstone (OWS) and limestone (OWL) were

OWS = 
$$-0.05*SO_2$$
 (IRMA) -  $0.08*RD + 2.0$  R =  $0.79$   
OWL =  $-0.03*SO_2$  (IRMA) -  $0.01*RD + 1.4$  R =  $0.69$ 

The equations therefore only explain 62% and 48% of the variance.

None of the other variables measured increased the correlation coefficient substantial according to a normal F-test. This equation do not apply to sites with high chloride levels which will be important at some coastal sites (see Appendix 2). However, the number of available data from coastal sites was too small for a regression analysis.

#### 5 REFERENCES

Gram, F. (1972) Program MULREG. Lillestrøm (NILU TR 22/72).

Zallmanzig, J. (1985) Investigation on the rate of immission and effects in selected places in Europe for the quantitative examination of the influence of air pollution in the destruction of ashlar. Part A. Measuring values and summary Zollern-Institut at Deutsches Bergbau-Museum (NATO/CCMS no. 158).

Table 1: List of all the parameters used in the regression analysis and the codes used for the parameters in the following tables and figures. All meteorological data are given as yearly values.

```
VARIABLE 1 - OPEN W.LOSS SAND OWS WEIGHT CHANGE IN PER CENT
VARIABLE 2 - SHEL W.LOSS SAND SWS WEIGHT CHANGE IN PER CENT
VARIABLE 3 - OPEN W.LOSS LIME OWL WEIGHT CHANGE IN PER CENT
VARIABLE 4 - SHEL W.LOSS LIME SWS WEIGHT CHANGE IN PER CENT
VARIABLE 5 - SO DEP IRMA
                                           SOI mg m 2 d 1
VARIABLE 6 - SO DEP SANDST 1 SOS1 mg m - 2 d

VARIABLE 7 - SO DEP SANDST 2 SOS2 mg m - 2 d

VARIABLE 8 - SO DEP LIMEST 1 SOL1 mg m - 2 d

VARIABLE 9 - SO DEP LIMEST 2 SOL2 mg m - 2 d

VARIABLE 10 - CL DEP IRMA CLI mg m - 2 d

VARIABLE 10 - CL DEP SANDST 1 CLS1 mg m - 2 d
VARIABLE 11 - CL DEP SANDST 1 CLS1 mg m -2 d
VARIABLE 12 - CL DEP SANDST 2 CLS2 mg m -2
VARIABLE 13 - CL DEP LIMEST 1 CLL1 mg m -2
VARIABLE 14 - CL DEP LIMEST 2 CLL2 mg m 2 d

      VARIABLE 15 - NO DEP IRMA
      NOI mg m - 2 d

      VARIABLE 16 - NO DEP SANDST 1 NOS1 mg m - 2 d

      VARIABLE 17 - NO DEP SANDST 2 NOS2 mg m - 2 d

      VARIABLE 18 - NO DEP LIMEST 1 NOL1 mg m - 2 d

      VARIABLE 19 - NO DEP LIMEST 2 NOL2 mg m - 2 d

      VARIABLE 20 - F DEP IRMA
      F1 days

                                                FD
VARIABLE 21 - FROST DAYS
                                                         days
VARIABLE 22 - ICE DAYS
                                               ID
                                                         days
                                               MRH %
VARIABLE 23 - MEAN RH
VARIABLE 24 - TIME RH>80%
                                              T80 hours
VARIABLE 25 - AMOUNT RAIN
                                               ARA mm
VARIABLE 26 - DURATION RAIN
                                               DRA hours
VARIABLE 27 - RAIN DAYS
                                               RD days
VARIABLE 28 - WET DAYS
                                               WD days
VARIABLE 29 - SNOW DAYS
                                               SD
                                                        days
                                                HAIL days
VARIABLE 30 - HAIL
```

Table 2: List of all data sets gathered in the measuring program.

EN-TALL:	PRNI																			
	WEI	I G H	T - L	0 5 5																
	sand-s	tone	lime-	stone	5 0 2							p o s								
STATION										IRMA :										I RH
GB 1 GB 2	-8.0	1.9	-7.2		108.7					8.0	4.9	3.3	2.2	2.4	3.4	2.5	1.8	1.5	1.5	
68 3		-1.6	-3.0	-1.4	99.7	37.5	17.9	20.5	21.1	40.7	* . 0	٠.٥	. 4	. 6	2.2	٤. ٥	2.3	1,0	. 1	
NL 1	-4.6	-2.2	-5.4	-2.5		13.0	12.7	2.6	2.5	12.7	. 6	. 3	. 8	. 8	6.1	. 2	. 5	. 0	. 1	
NL 2	-7.3	-5.6	-6.3	-6.4	68.6	. 3	. 3	2.1		365.9	. 2	. 2	1.7	1.6	5.0				. 2	
NL 3	-6.8	. 6	-7.4	5	63.6	34.4	33.9	20.9		40.2	6 , 1	6.4	3.1	3.3	8.7	. 6	. 5	. 1	. 3	
NL 4	- 3.9	1.0	-4.9	. 2			31.7	21.3	20.1	28.6	6.3	7.8	3.1	2.9	9.3	1.2	1.2	. 5	. 4	
I 1	- 3 . 3	. 8	-2.7	. 1		35.3			13.6	4.3			. 3	. 2	2 - 1	. 9	. 7	. 6	1.0	
1 3	-3.2	1.0	- 4 . 2	. 4		17.4	17.3	9.1	8.9	5.8 7.9	2.9	3.2	2.6	3.3	2.5	1.3	1.3	1.0	1.1	
I 4	-6.2	. 2	-4.3			32.9		11.0	11.7	8.9	1.2	. 6	. 2	. 3	4.1	. 8	. 5	. 4	. 4	
N 1	-2.7	. 6	-3.8	. 2			15.1	12.0	12.2	10.1	7.0	6.7	2.1	1.4	2.9	. 4	. 6	. 2	. 2	
S 1	-3.9	. 6	-4.2	2			29.8	12.1	13.3	4 . 8		. 2	. 9	. 9	2.4	. 0	1.0	1.0	1.1	
S 2	~ . 9	. 1	-1.3	2	7.3	5.1	4.8	2.8	2.9	1.2			. 1	, 1	1.3	. 5	. 5	. 5	. 4	
F 1	-3.1	1.1	- 3 . 1	. 4		29.0	28.8	12.1	12.4	7.6	. 9	. 6	1.0	1.0	6.5	. 2	. 5	. 0	. 1	
F 2					39.3					1.7					2.6	1.0	1.0	. 9	1.0	
F 3	-2.2	. 8	-2.9	9		10.2	10.0	2.4	1.9	13.8			. 6	. 7	6.1				. 1	
US 1	-2.9		-3.1	. 3		23.9		10.5	10.8	7.3	1.9	2.0	1.4	1.4	9.0	2.4	2.3	1.9	1.7	
US 2	-2.3		-1.8	. 3				11.9	10.7	7.1	2.7	2.1	1.8	1.6	6.6	3.7	4.0	2.5	2.7	
GR 1	-1.6	. 7	-2.1	. 3	53.2	18.1	19.3	8.1	6.8	8.0	2.8	3.0	1.6	1.2	7.8	4.0	4.3	2.8	2.7	
GR 2	-2.4		-2.3	. 5		21.8		12.9	12.4	16.5	5.4	4.7	1.8	2.1	3.7	1.9	2.2	1.0	1.1	
GR 3	-1.2		-1.4	. 2		17.1		4.7	5.3	2.4	. 3	. 2	. 4	. 3	2.1	1.7	1.7	. 8	. 8	
0 1	-2.6	. 0	-2.6	. 7	72.3	28.5	30.5	14.5	14.6	2.6	1.0	1.1	. 7	. 8	7.3	1.5	1.5	1.5	1.6	
D 3	-5.0	1.0	-6.3	. 7			32.6	15.7	15.4	2.5	1,1	1.0	1.0	1.2	2.3	. 1	٤. ٥	. 1	1.0	
0 4	-2.2		-3.3	. 4		20.8		11.0	10.9	1.3	. 2	. 2	. 5	. 6	1.5	1.5	1.3	1.1	1.2	
								11-6	Snow											
STATION	days		- Rel.		. Hen C rain															
GB 1	38	3		7358																
GB 2	52	3		7356	1363	617	334	252	4.0	20										
G8 3	6.5	3		12502	3492		504	419	54	3										
NL 1																				
HL 2																				
NL 3 NL 4																				
I 1																				
1 2																				
1 3																				
T 4	6	0			1172				0											
N 1	131		73.0				483													
S 1	270 376	121		7269	1265		372 345													
S 2	116	133			1365		343	2 10	199	10										
F 2																				
F 3																				
F 4																				
110 5																				

Table 3: The data used for all the calculations of the inland stations.

85 5 15 5 15 5 15 5 15 5 15 5 15 5 15 5	103 572 583 520
52 52 52 50 50 50 50 50 50 50 50 50 50 50 50 50	115
1.70 1.70 1.70 1.70 1.70 1.70 1.70 1.70	
# 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2	
Exw. 4 o v v 4 v v v + 4 x x o x v v v v v v v v v v v v v v v v	
2.85 2.85 2.85 3.85 3.00 3.00 3.00 3.00 3.00 3.00 3.00 3.0	. 35 . 75 1.10 52
ELL SM 6.10	201
11. 25. 25. 25. 25. 25. 25. 25. 25. 25. 25	
1.5591 1.5181 1.5181 1.5180 1.1717 1.1717 1.1718 1.	
1.6675 1.57675 1.57675 1.6775 1.6777 1.6777 1.6610 1.6610 1.6610 1.6610 1.6610 1.6610	1.2447 1.4603 1.5024 1.3504
1.05.50 1.05.81 1.05.82 1.05.83 1.05.83 1.06.83 1.06.83 1.06.84 1.06.8	1.68501 1.8501 1.7010
20.35 20.35 20.35 20.35 13.58 11.35 11.35 12.25 12.25 12.35 11.30 11.30 11.30 11.30 11.30	5.00 14.55 15.55 10.05
\$0.50 \$7.70 \$7.70 \$1.60 \$5.05	17.65 29.50 \$1.40 21.40
20 20 20 20 20 20 20 20 20 20 20 20 20 2	0: M @ 0:
5	22.72
54246744444444444	-1.4 -2.6 -5.3
x = + 1	7 % C ¢
6 x x x x x x x x x x x x x x x x x x x	-1.2 -5.0 -5.0
25 H	GR 5 0 1 0 5
2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2	2%

Table 4: The data used for all the calculations of the coast stations.

RD	330	330	330	330	483	340
FD	6.5	4.0	09	09	131	9
NOLM	9.99	9.99	. 20	4.	. 20	9.99
NOSM	0 .50 2.2 -9.99 · 5 · 6.1 · 35	- 9.99	. 45	1.20	. 50	-9.99
ION	2.2	5.0	8.7	9.3	2.3	6.1
CLLM	. 50	1.65	3.20	3.00	1.75	- 99.90
CLSM	6.99.9	. 2	6.2	7.0	9 . 9	- 99.9(
CLI	12.7	365.9	40.2	28.6	10.1	13.8
LOGSOLM	0000.66-	.3010	1.3170	1.3160	1.0828	.3324
LOGSOSM	1.1089	5229	1.5334	1.4997	1.1861	1.0043
108901	1.5428	1.8363	1.6035	2000	2696.	1.3036
	2.55					
SOSM	12.85	.30	21.00	15 35		0
105		68.6	0 0	24.0	7 00	
SWL	. 2 . 5					
	, ri , ri					
SWS	-2.5	0 0		9	•	
2 MO	9 6	- G	3	-2.7	2.2	
68 3	N - C	N L	Y JN	z	2	

Table 5: The correlation matrix for sandstone on the inland stations.

```
1.000
-.170 1.000
-.722 .300
-.678 .520
nus
                               1.000
                     .390
SOL
                                .829 1.000
          -.675
-.573
                                          .818 1.000
.949 .891
LSOI
                      .352
                                 .930
                      .491
                                                      .891 1.000
LSSM
                                 .805
Ci. I
          -.170 -.033
                                 .185
                                         -.045
                                                      .204
                                                               .018 1.000
                                           .123
                                                      .143
                                                                         .692 1.000
.452 .173
C1. SM
          -.130
                     .366
                                 .186
                                                                .002
                                                                                    .173 1.000
NOI
            .108 -.087
                                 .128
                                           .092
                                                      .254
                                                                .140
                              -.000 .275 .382 .331 -.074 .072 .484 1.000

-.335 -.254 -.480 -.577 -.384 -.231 -.208 -.058 1.000

-.254 -.058 -.316 -.156 -.004 .158 -.112 -.354 .442

SOI SOSM LSOI LSSH CLT CLSH NOT NOSM FD
           .039 .368
.245 -.152
-.148 -.040
HOSM
FD
                                                                                                                    .442 1.000
RD
            OWS
                      SWS
```

#### Table 6: The correlation matrix for limestone at the inland stations.

```
1.000
ONL
        .096 1.000
SHL
               .211 1.000
.604 .715
       -.468
SOI
                       .715 1.000
.930 .690
.685 .945
       -.566
-.420
-.402
SOLM
                               .690 1.000
.945 .714
                . 695
LSOE
                                              1.000
LSLM
       -.236
               -.225
                        .185
                                .163
                                       .206
                                               .050 1.000
CLI
                                                      .448 1.000
                        .394
CILLM
                                . 452
       -- 454
               -326
                                                               .281 1.000
ION
         .002
               -.069
                        .128
                                .072
                                       .256
                                               .052
                                                       .452
                                                             .228 .433 1.000
-.267 -.208 .155
               . 435
         .195
NOLM
                        .299
                                . 296
                                        .351
                                               .354
                                                      -.243
                                                               .267 -.208 .155 1.900
.115 -.112 -.168 .442
         .140
                .044
                       -.335
                               -.152 -.480
                                              -.130
                                                      -.384
FP
                                                                                      .442 1.000
FD RD
RD
        -.378 -.041
                      -.254
                                .123 -.314
                                               .013 -.004
                                                                              NOLM
                                SOLM LSOI LSIM
                                                       CI, I
                                                               CLLM
                                                                       IOF
                SVI
                        SOI
         OWI
```

#### Table 7: The correlation matrix for sandstone at the coast stations.

```
OWS
        1.000
S 4 S
S 0 I
        .573 1.000
-.692 -.126
                -.126 1.000
                        .412 1.000
.944 .206
SOSM
        -.016
       -.612
-.701
                                 .206 1.000
LSOI
                -. 188
                         .923
                                 . 994
                         .431 -.580
.099 .783
                                                .895 1.000
                -.850
                                         . 448
CLI
        -.683
                .909
                                 . 783
                                       -.127
                                                 .658 -.594 1.000
.702 -.107 .279
         .478
CLSM
                                                                        1.000
NOI
        -.372
                         . 761
                                 . 739
                                        .703
NOSM
                 .580
                       .752
                                 .529 .862
                                                 .560
                                                        .283
                                                                 .538
                                                                        .525 1.000
-.374 -.215 1.000
         .274
         .148
                                                                                 -.215 .625 1.000
NOSM FD RD
RD
          527
                   113
                          681
                                  .096 -.739 -.233 -.258
SOSM LSOI LSSM CLT
                                                                  428
                                                                        -.830 -.215
                         SOL
         OWS
                 SWS
                                 SOSH
                                                                 CLSM
                                                                         NOI
```

#### Table 8: The correlation matrix for limestone at the coast stations.

```
1.000
.348 1.000
OUL
SHL
SOI
         -.759
                  -.212
                           1.000
         -.339
                            .534 1.000
.944 .342
                  .646
SOLM
                                     .342 1.000
LSOI
                            .414
                                               .239 1.000
                                      .983
         -.253 .704
-.415 -.905
LSLM
         -.253
                                               .448 -.433 1.000
CLI
                                    -.371
                            .788
         -.505
                                               .655
                                                               -.050 1.000
-.107 .799
CILM
                   .359
                                     .922
                                                        .344 -.050 1.000

.450 -.107 .799 1.000

.770 .420 .734 .506 1.000

.544 -.251 -.046 -.374 -.101 1.000

.259 -.258 -.511 -.830 -.101 .625
                   . 198
                                      .594
ION
                   . 771
                                      .797
                                               .780
                   .341 -.125
.293 -.681
                                      .393 -.097
.084 -.739
FD
          .020
                                                                                                     .625 1.000
RD
           .609
                   SWI.
                             SOI
                                             LSOI
                                                                 CLI
                                      SOLM
                                                        LSLM
                                                                           CLLM NOI
                                                                                             NOI,M
```

Table 9: The relations for the sandstone weight losses with one variable.

R = correlation coefficient RR = unexplained variance

ous	Ξ	0481 #S01	+	55/9	R =	6263	, 98=	.5151
0.05	=	145/*SOSH	+	. 7362	₽ = -•	7493	, RR=	.4081
OWS	=	-5.2592*I.SOI	+	5.0204	R =	5811	, RR=	. 4624
nws	Ξ	-8.4177*1.55M	+	8.1392	?≃	, 6611	, RR=	.5630
OWS	=	0287*CLI	+	-3.4137	R = -	0000	, RR=	. 2005
OWS	=	1050 + CLSM	+	-3.3962	R =	,1301	, RR=	.9831
045	=	.1235*NOI	+	-4.270J	R =	1790	, RR=	.9880
nws	=	.2.)80±00SM	+	-4.0217	R =	,1241	, RR=	.9846
OWS	=	.0022+FD	+	-3.8405	R = .	,0885	, RR=	.992?
ONS	=	()()5')+RD	+	-2.2077	R =	2389	, RR=	.9429

Table 10: The ten best relations for the sandstone weight losses with two variables. The equations with two independent variables are underlined.

R = correlation coefficient RR = unexplained variance

F = F-test

```
-.6847+SOSM + 31.2914+LSSM + -20.3410 RE .9044, RR= .1785
OVERGANG FRA SOSM (R= -.7603) TIL TO VARIABLE: F= 18.01++ MOBS=
nus
                                           .2212 R= .8162, RR= .3338
OVERGANG FRA SOSM (R= -.7603) TIL TO VARIABLE: F= 3.12
0113
          -.1769+SOSH +
                                                                                                                       17
          -.1515*SOI + 15.0866*I.SOI + -18.6602 R= .7036, RR= .3702
OVERGANG FRA SOI (R= -.6043) TIL TO VARIABLE: F= 5.48* NOBS=
OWS
                                           -. 0524+S0t +
                          -. 0077+RD
045
                                                                                                                       17
                                                 o R= .7833, RR= .3865
♥OVERGANG FRA SOSN (R= -.7693) TIL TO VARIABLE: F=
                           -.0031+RD
          -. 1610+SOSH +
OWS
                                                                                                               NOBS =
                                                                                                                       17
                                                                                                       . 78
                                                  R= .7806, RR= .3006
OVERGANG FRA SOSM (R= -.7693) TIL TO VARIABLE: F=
          -_0153+S01 + -_1274+S0SM +
083 =
                                                                                                               NORS=
                                                                                                                       17
                                                                                                         .63
                                                 S R= .777%, RR= .3951
POVERGANG FRA SOSM (R= -.7693) TIL TO VARIABLE: F=
                            .0825 + HOT +
nws
          -. 1636+SOSM +
                                                                                                         .46
                                                                                                               NOBS=
                                                 O R= .7752, RR= .3091
-OVERGANG FRA SOSM (R= -.7603) TIL TO VARIABLE: F=
                           -.0275+CLI +
          -.1456+SOSM +
                                                                                                         .32
                                                                                                               NOBS =
                                                                                                                       17
                                             .5504 R= .7748, RR= .3998 OVERGANG FRA SOSM (R= -.7693) TIL TO VARIABLE: F=
          -.1658+SOSM +
                            . 0022*FD +
                                                                                                         .29
                                                                                                               MORS=
                                                                                                                       17
                                             OHS =
          -.1448+SOSM + -.0260+CLSM +
                                                                                                         .04
                                                                                                               NOBS = 17
```

Table 11: The ten best relations for the sandstone weight losses with three variables.

nws	=	6443+S0SM	+	28.5052*LSSM		.2373+NOSM + -26.9352 OVERGANG FRA SOSH OG LSS						FE	1.42
OWS	3	0124+501	+	4475+SOSM	+	30.9094*LSSM + -29.0154 OVERGANG FRA SOSM OG LSS	M	R = ( R =	.9127,	RR=	.1670 TRE VARIABLE:	F =	.89
ows	=	6/71*SOSM	+	8721*LS0I	+	31.7620±LSSM + -28.6774 OVERGANG FRA SOSM OG LSS	М	R = ( R =	.9086,	RR=	.1745 TRE VARIABLE:	F =	.30
ows	=	6775 + SOSH	+	50.9742*L\$\$M	+	0153*CLI + -28.9173 OVERGANG FRA SOSM OG LSS						F=	.20
0.12	=	6957*50\$/1	+	31.8589 + LSSM	+	.0420+CLSM + -29.9640 OVERGANG FRA SOSM OG LSS						F =	. 19
nus	=	5769 + \$9\$/1	+	30.8607*LSSM	+	.0307*HOI + -29.1039 OVERGANG FRA SOSM OG LSS						F =	.13
048	Ξ	6943 + 898:1	+	31.8639+L \$\$!1	+	0008*FD + -29.8318 OVERGANG FRA SOSM OG LSS	M ·	R =	.9070,	RR= TIL	.1774 TRE VARIABLE:	F=	.08
ดษร	=	6/79*595#	+	30.9101*LSSM	+	0004+RD + -28.8685 OVERGANG FRA SOSM OG LSS						F =	.03
OHS	=	1091*501	+	1942*snsm	+	11.3813*LSOI + -14.8883 OVERGANG FRA SOI OG LSO						F =	3.50
245	=	0186+501	+	1308+sosm		.4926+NOSM + .1437 OVERGANG FRA SOSM OG NOS						F=	1.00

Table 12: The relations for the limestone weight losses with one variable.

UMF	=	0269+SOI	+	-1.9540	R=4623 , RR=	.7863
0141	=	1702 + SOLM	+	-1,4678	R=5759 ,RR=	.6683
UNL	=	-2.4021*LS01	+	.5360	R=4122 ,RR=	.8301
OWL	=	-2.6014*LSLM	+	8957	R=4145 , RR=	.8282
UAL	=	0678*CLI	+	-3.0924	R=2642 ,RR=	.9302
OWL	=	8679*CLLM	+	-2.5357	R=4544 , RR=	.7935
ONL	=	.0490 +NO T.	+	-3.8367	R= .0815 , RR=	. 9934
OWL	=	. 22 65 * NOLM	+	-3.8443	R= .1047 ,RR=	. 9890
UAL	=	.0031*F0	+	-3.9094	R= .1847 ,RR=	.0650
OHL	=	0075*RD	+	-1.4295	R=3056 , RR=	.8435

Table 13: The ten best relations for the limestone weight losses with two variables. The equations with two independent variables are underlined.

UMF	=	504.J*SOLM	+	7.5083+LSLM	+	-5.1005 OVERGANG	FRA	SO L.M	( R =	5759)	RR= TIL	.5134 TO VARIABLE:	F=	5.13+	NOBS=	20
NYL	=	0340*SOT	+	U10J+RD	+	1.3896 OVERGANG	FRA	sot	( R =	.6916, 4623)	RR= TIL	.5216 TO VARIABLE:	F=	8.62**	นดคร=	>0
OWL	=	-3.3450+LS0I	+	U197+RD	+	5.3104 OVERGANG	FRA	Esni	( R =	.6792, 4122)	RR= TIL	.5387 TO VARIABLE:	F=	0.20**	1108S=	20
UMF	=	1536*SOLM	+	0056*RD	+	0382 OVERGANG	FRA	SOLM	R =	.6457, 5759)	RR= TIL	.5831 TO VARIABLE:	F =	2.48	NOBS =	20
NWL	=	1965+801,0	+	.652.1+NOU.M	+	-1.8166 OVERGANG	FRA	SOLM	R =	.6438, 5750)	RR= TIL	.5855 TO VARIABLE:	F=	2.40	N∩กร=	20
UHL	=	1764+SOLH	+	100+5000.	+	-1.8345 	FRA	SOLM	R =	.5774,	RR=	.6431 TO VARIABLE:	F=	.67	NOBS =	20
ONL	=	1607+S0LH	+	6203+CLI	+	-1.3613 OVERGANG	FRA	SOLM	R =	.5863,	RR=	.6563 TO VARIABLE:	F =	.31	NOBS=	20
OWI,	=	1437+S01,M	+	. 2650 6511.8		-1.4760 OVERGANG			R =	. 5853.	RR=	- 4574				
7WL	=	1078+501	4	1435+301.11	+	-1.3240 OVERGANG	FRA	SOLM	( 3 = 5 =	.5843, 5759)	RR=	.658.6 TO VARIABLE:	F =	.25	NOBS=	20
OME	=	.0082*FD	+	U117+RD	+	9204 OVERGANS	FRA	RD	( N =	.5831,	RR=	.6600 TO VARIABLE:	F =	4.73+	NOHS=	2.0

Table 14: The ten best relations for the limestone weight losses with three variables. The equations with three independent variables are underlined.

านเ.	=	U293+SOI +	.0')43*FD	+	-,0122+RD	+	1,2189	R =	.7295,	RR=	.4679		
					OVERGANG FR	A SOL	OG RD	( R =	. 4014)	TIL	TRE VARIABLE:	F =	1.84
OHL	=	4813*SOL# +	6.5746+LSLM	+									
					OVERGANG FR	A SOLA	4 OR LSEM	( 9 =	.6975)	TIL	TRE VARIABLE:	F =	1.35
OWL	=	4474+SOLM +	4.4757 * LSLM	+	0039+RD	+	-3.4172	9 =	.7245.	RR=	.4751		
					OVERGANG FR	A 501,1	M OR LSI.M	(8=	.6075)	TIL	TRE VARIABLE:	F=	1.29
OWL	=	03/4+501 +	.4577+NOLH	+	Rn	+	. 2280	R =	.7201,	RR=	.4814		
					OVERGANG FR	A SOT	OG RD	( R =	.4914)	TIL	TRE VARIABLE:	F =	1.34
UML	=	-3.8348+LSOI +	.5281+406.11	+	J104+RD	+	5.4746	R =	.7164.	RR=	. 4868		
					OVERGANG FR	A LSO	OG RD	( R =	.6777)	TII.	TRE VARIABLE:	F =	1.70
041_	=	4794+SOLH +	-1.2733+1.501	+	8.5443+LS	L13 +	-3.9331	Q =	.7159.	RR=	.4876		
					OVERGAMS FO	A S01.1	1 06 1,51,8	( 5 =	.6075)	TII.	TRE VARTABLE:	F =	.85
OHL	=	U237+SOT +	3922+CLLN	+									
-					OVERGANG FR	A SOT	OG RB	( B =	.4714)	TIL	TRE VARIABLE:	F=	1.10
041.	=	5045+S01(1 +	7,3938*1,51.11	+	.0862*10	t +	-5.3736	R =	.7110,	RR=	. 4933		
					OVERGANG FR	A SOL	1 OG LSEM	( K =	.6075)	TIL	TRE VARIABLE:	F =	.45
OHL	=	-3./550+LSOI +	.1264+401	+	0105+RD	+	5.3145	P ==	.7070.	RR=	.4987		
					OVERGANG FR	A I Sh	ा नद सम	( R =	.4702)	TII.	TRE VARIABLE:	F=	1.28
OUL	=	0093+S0t +	477:+5065	+	7.5451+1.5	[ * +	-4.9650	U =	.7054,	U B =	.5024		
					OVERGANG FR	5 571,1	1 06 1.51.4	( R =	.6075)	TIL	TRE VARIABLE:	F=	.35

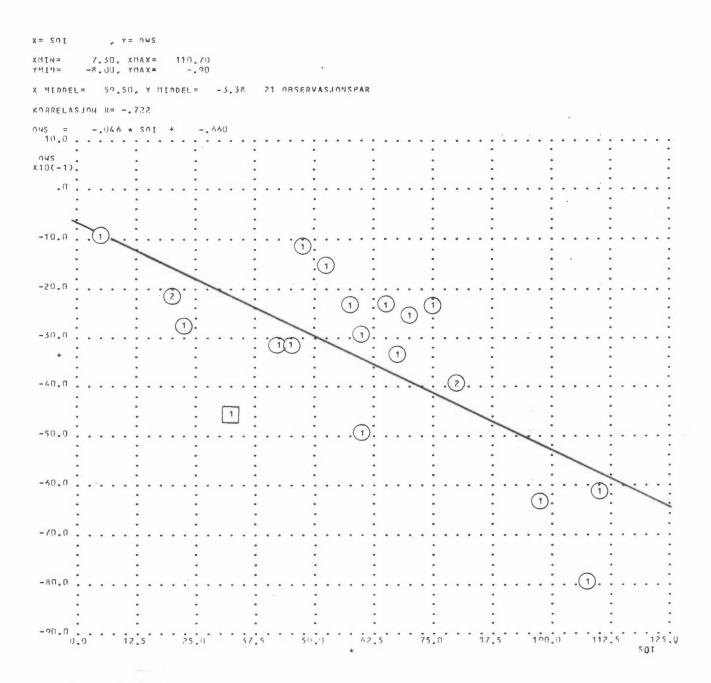


Figure 1: The weight loss for sandstone of inland stations against the  ${\rm SO}_2$  flux to the IRMA apparatus.

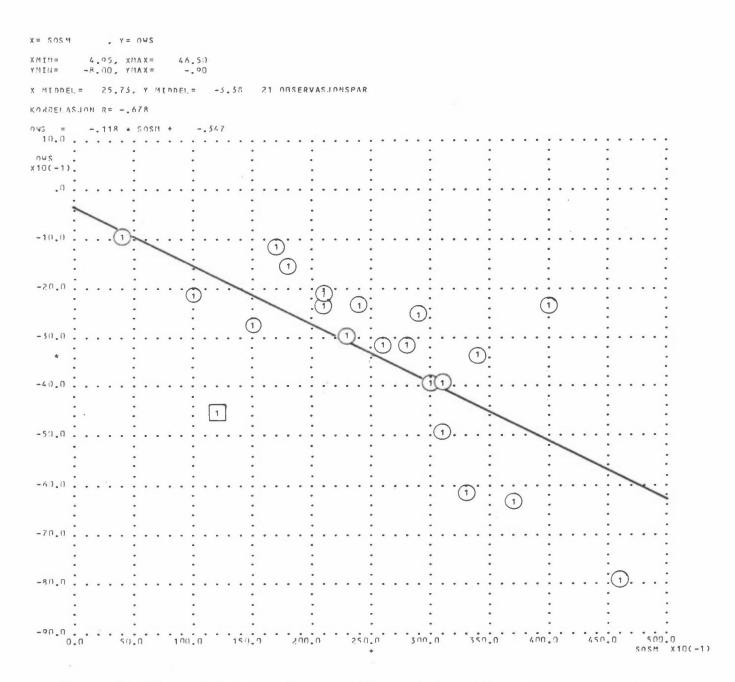


Figure 2: The weight loss for sandstone at inland stations against the  ${\rm SO}_2$  flux to the sheltered sandstone samples.

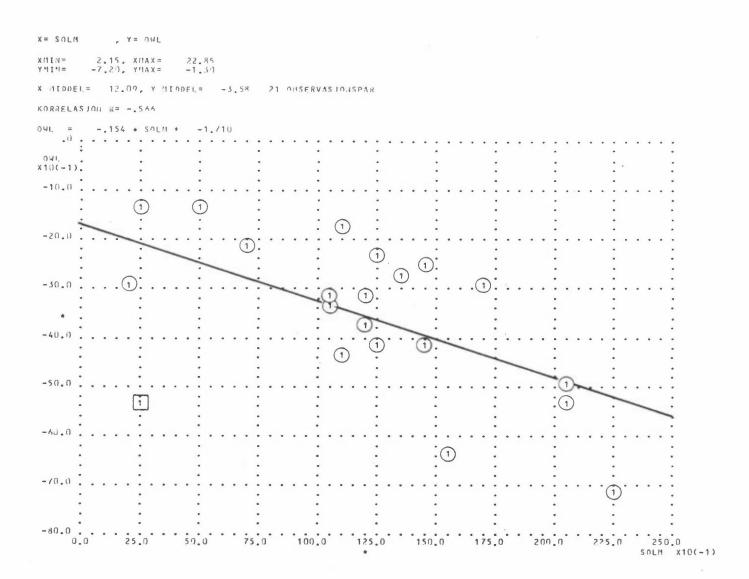


Figure 3: The weight loss for limestone at inland stations against the  ${\rm SO}_2$  flux to the IRMA apparatus.

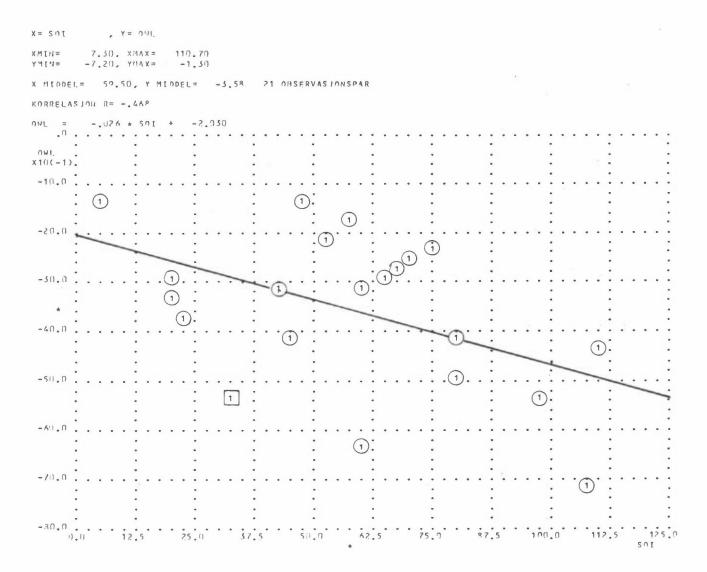


Figure 4: The weight loss for limestone at inland stations against the  ${\rm SO}_2$  flux to the sheltered limestone samples.

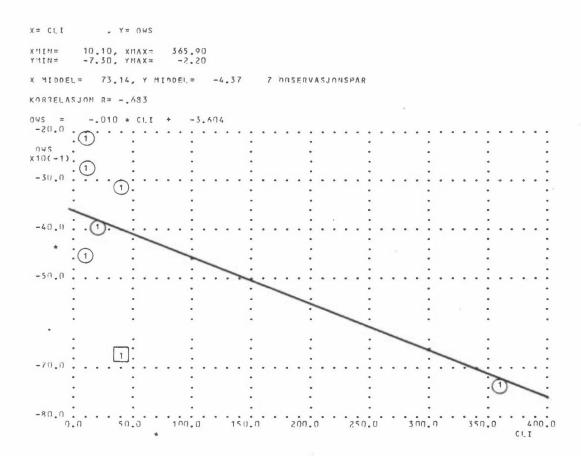


Figure 5: The weight loss for sandstone at coast stations against the Cl flux to the IRMA apparatus.

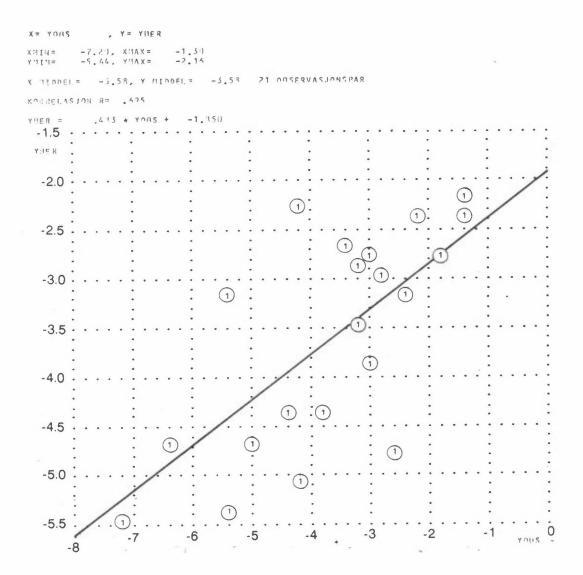


Figure 7: The observed weight loss for limestone at inland stations plotted against the calculated weight losses for the same stations using the equation:  ${\rm OWL} = -0.03~{\rm SO}_2~({\rm IRMA}) - 0.01~{\rm RD} + 1.4$ 

APPENDIX 1

#### NORWEGIAN INSTITUTE FOR AIR RESEARCH

ROYAL NORWEGIAN COUNCIL FOR SCIENTIFIC AND INDUSTRIAL RESEARCH

Telephone: (02) 714170 Address: Elvegaten 52 2000 Lillestrøm Postal address: P.O. Box 130 2001 Lillestrøm Bank account: 5102.05.19030 Postal account: 3 30 83 27 Fonotelex:

72400 fotex n

Att.: NILU, Lillestrøm

Members of the NATO/CCMS study

"Restoration and Conservation of Monuments"

Your ref.:

Our ref.:

Lillestrøm, 12 January 1984

JFH/SBH/0-8068

Dear colleagues,

#### NATO/CCMS RESTORATION AND CONSERVATION OF MONUMENTS

Before the expert meeting in the Federal Republic of Germany in 1984, we will again draw your attention to the Norwegian Proposal for regression analysis of our joint results on stone detoriation and pollution data together with normal available meteorological data (ref. our letter, 27 October 1982, JFH/MAa/02280).

now I have received positive answers from FRG, UK, (Strasbourg) and Sweden. So far, no one has been against our proposal, but we are still missing replys from some countries.

Norway is still willing to do the analysis in 1984. Particularly since we can see an increasing interest for stone detoriation caused by air pollution the last years, we find both the main program and the regression analysis to be of great importance for the general knowledge about this However, the comments given by Dr. Ross in FRG, has got me to realize that I must try to specify my parameters in more exact terms in this letter.

In the following I will refer to the same numeration as in my last letter. In table 1 I have also made a table which will cover the information we need for the analysis.

No 1 and 2 will give us information which will be useful for the classification of the general climatic conditions for the test stations and will not be used in the regression analysis.

- Annual average daily mean temperature (many years)
- 2. Annual average daily min and max temperature (many years)

Enclosure: 2

. . .

For the regression analysis we need information about temperature around zero, relative humidity, amount of precipitation and "time of wetness" for the exposure period of 25 months (Oct 1980 - Oct 1982). We would preferably have the values as monthly values.

- 3. "Number of days with temperature below  $0^9$  C". According to Dr. Ross, the German Weather Service distinguishes between frost days T min <0° C and ice days T max < 0° C. We would prefer to have both information if possible.
- 4. "Annual average relative humidity". We will prefer to get the average of the exposure period (25 months) or the monthly average values for the same period.
- 5. "Time with RH > 80%. It would have been a great help to find a way to express the "time of wetness" parameter for the exposed period. The time of wetness is the percentage of time where the surface has a substantial water film on the surface. For metals, the time of wetness is shown to follow the time with the relative humidity higher than 80% RF. We have proposed to use the same parameter but understand that this parameter could be difficult to obtain from normal meteorological data. We hope that we can find time during our next meeting to discuss this problem and hopefully find a possible solution.
- 6. "Total amount of rain". The information shall preferably be expressed for the exposure period.
- 7. "Duration of rain"

This information is normally only available if your meteorological stations are equipped with pluviograf. Often this information can't be found. From UK we have got some other type of information which can be of great help. They have given monthly values number of "Rain days" (> 0,2 mm) "Wet days" (> 1,0 mm), "Snow/sleet days" and "Hail".

We will appreciate if you all can think about your own country's possibilities for producing such information, and if you can be responsible for filling in the data in table 1.

We hope that most of the countries will be interested in the proposed regression analysis and we look forward to a more detailed discussion about the analysis at the next expert meeting in FRG.

Enclosed you will find the distribution list.

Yours sincerely

J.F. Henriksn Research scientist

				of the period										
								-					,	
			1	over the										
ŭ.				Oct										
			2	Sept										
				Aug										
				July										
			2											
			198	1ay J				·						
				Apr										
				Ma T										
				-										
												13.0		
				t Nov										
				00 d				1						
				ug Se							,			
				1 A			,			0.00				
	-		1981	Ju Ju										
				y Jur										
										-				
-				e b										
				Jan										
				Dec										
-			1980	No.										
mear	min	XaR		0ct										
	rage daily	daily			rost days	ce days	verage RH	H	mount rain	uration of ain	ain days	et days	now/sleet Bys	Hail
	Average daily mean	daily mean	daily mean daily max	daily mean daily max 1980	daily min       1980       1982         0ct Nov Dec       Jan Feb Mar Apr May June       July Aug Sep Oct Nov Dec       Jan Feb Mar Apr May June       July Aug Sep Oct Nov Dec       Jan Feb Mar Apr May June       June June	daily mean       1980       1982         daily max       1981       1982         daily max       1982       1986	daily min       1980       1982         daily max       1901       1901         1280       1901       1982         13ays       13an Feb Mar Apr May June July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec Jan Feb Mar Apr May July Aug Sep Oct Nov Dec J	daily min       1980       1982         daily max       1901       1901       1982         daily max       1980       1982       1982         days       1980       1980       1982         days       1980       1980       1980         days       1980       1980       1980       1980         days       1980       1980       1980       1980       1980         days       1980       1980       1980       1980       1980       1980       1980       1980 <t< td=""><td>daily mean       daily min         daily min       1980         1980       1901         1982       1902         1982       1903         1983       1904         1984       1905         1985       1907         1986       1907         1987       1907         1988       1907         1989       1907         1980       1907</td><td>daily mean       daily min         daily min       1980         1980       1981         1980       1981         1980       1982         1981       1982         1982       1982         1983       1984         1984       1986         1985       1986         1986       1987         1987       1988         1988       1988         1989       1988         1980       1988</td><td>daily mean         daily min         daily max         1980         1980         1980         1981         1982         1983         1984         1986         1987         1988         1989         1980         1981         1982         1983         1984         1986         1987         1988         1989         1980         1981         1982         1983         1984         1985         1986         1987         1988         1989         1980         1981         1982         1983         1984         1985         1986         1987         1988         1989         1980         1980         1981         1982         1983         1984         1985         1986         1986</td><td>daily mean       daily min         daily min       1980         1980       1901         1982       1986         1983       1986         1984       1986         1986       1987         1987       1988         1988       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1989         1989       1989         1989       1989         1989       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989</td><td>daily mean       daily min         daily max       1980       1981         1980       1980       1982         1980       1901       1982         1980       1980       1982         1980       1980       1980         1980       1980       1980         1981       1980       1980         1982       1980       1980         1983       1980       1980         1984       1980       1980         1985       1980       1980         1982       1980       1980         1982       1980       1980         1983       1980       1980         1984       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980</td><td>daily min         daily min         1980         1980         1980         1980         1980         1980         1980         1980         1980         1980         1981         1982         1983         1984         1986         1987         1988         1989         1980         1980         1981         1982         1983         1984         1985         1986         1987         1988         1989         1980         1981         1982         1983         1984         1985         1986         1987         1988         1989         1980         1980         1980         1980         1980         1980         1980         1980         1980         1980         1980     <!--</td--></td></t<>	daily mean       daily min         daily min       1980         1980       1901         1982       1902         1982       1903         1983       1904         1984       1905         1985       1907         1986       1907         1987       1907         1988       1907         1989       1907         1980       1907	daily mean       daily min         daily min       1980         1980       1981         1980       1981         1980       1982         1981       1982         1982       1982         1983       1984         1984       1986         1985       1986         1986       1987         1987       1988         1988       1988         1989       1988         1980       1988	daily mean         daily min         daily max         1980         1980         1980         1981         1982         1983         1984         1986         1987         1988         1989         1980         1981         1982         1983         1984         1986         1987         1988         1989         1980         1981         1982         1983         1984         1985         1986         1987         1988         1989         1980         1981         1982         1983         1984         1985         1986         1987         1988         1989         1980         1980         1981         1982         1983         1984         1985         1986         1986	daily mean       daily min         daily min       1980         1980       1901         1982       1986         1983       1986         1984       1986         1986       1987         1987       1988         1988       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1988         1989       1989         1989       1989         1989       1989         1989       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989         1980       1989	daily mean       daily min         daily max       1980       1981         1980       1980       1982         1980       1901       1982         1980       1980       1982         1980       1980       1980         1980       1980       1980         1981       1980       1980         1982       1980       1980         1983       1980       1980         1984       1980       1980         1985       1980       1980         1982       1980       1980         1982       1980       1980         1983       1980       1980         1984       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980         1985       1980       1980	daily min         daily min         1980         1980         1980         1980         1980         1980         1980         1980         1980         1980         1981         1982         1983         1984         1986         1987         1988         1989         1980         1980         1981         1982         1983         1984         1985         1986         1987         1988         1989         1980         1981         1982         1983         1984         1985         1986         1987         1988         1989         1980         1980         1980         1980         1980         1980         1980         1980         1980         1980         1980 </td

APPENDIX 2



#### EXPLORATORY DATA ANALYSIS

#### Rolf Volden

#### Norwegian Computing Center

Different principal component analyses have been carried out on the data given in Table 3 and 4. The tool for these analyses has been the PRINCOMP procedure in the SAS program package (SAS USER'GUIDE 1982).

Principal component analysis is a multivariate technique very often used in exploratory data analysis for examining relationships among several quantitative variables in a given data set. The method is used for summarizing multivariate data or for detecting underlying structures in a data set. It can be used to cluster variables or data units (objects), or to reduce the number of variables in a regression.

Application of principal components is discussed by Cooley and Lohnes (1971) and Gnanadesikan (1977).

The first principal component analysis for the data in Table 3 and 4 showed that there were two outliers among the data units. The stations Texel (NL2) and Floda (S2) where therefore excluded from the data set for the next principal component analyses to remove the effects from these two outliers.

Texel was removed because the extreme chloride value of IRMA caused a dominating effect in the three most significant principal components. Floda was not extreme in a single variable, but since this station had the smallest or largest value for most of the variables, Floda was an outlier station in a multivariate sense.

The results of the final analysis for the sandstone based on the 22 remaining stations are shown i Table B1 and Figure B1. Table B1 tells us that the 3 most significant principal components explain approximately 76% of the variation in the data. The contributions from the

components are respectively 28.8%, 25.4% and 21.8%, which are the ratios between the eigen values and the number of variables.

Table B1 also shows the linear relations between the variables and the principal components by a normalized loading matrix. The first principal component is essentially defined by the variables SOI, RD and OWS. Negative SOI values, positive RD or positive OWS values for station will give positive scores for the first principal component.

In the same way, the second principal component is mainly defined by CLI, OWS and RD, while the third component is defined from FD, NOI and CLI.

Figure B1 shows the different stations projected onto the axes defined by the first and second principal components. This score plot indicates 4 clusters or groups among the stations. The main group contains 15 stations which are characterized by negative scores or small positive scores on the second axis and scores around zero for the first axis. This group corresponds therefore essentially to smaller CLI, smaller RD or larger OWS values.

The other three groups seem in different ways to represent more extreme stations. Rome (I4) and the two stations in London (GB1 and GB2) are one group characterized by high amount of  $\mathrm{SO}_2$  and high weight loss. The second group is N1 and GB3 mostly effected by low  $\mathrm{SO}_2$ , low weight loss and high number of rain days. GB3 is also affected by high amount of chloride. The third group is mainly affected by high chloride concentration, particularly NL3.

#### References:

- SAS USER'S GUIDE: Statistics, 1982 Edition, SAS INSTITUTE INC., Box 8000, Cary, North Carolina 27511.
- Cooley, W.W. and Lohnes, P.R. (1971) Multivariate Data Analysis, John Wiley & Sons, New York.
- Gnanadesikan, R. (1977) Methods for Statistical Data Analysis of Multivariate Observations, John Wiley & Sons, New York.

Table B1: Results of the cluster analysis of sandstone with 22 data sets and 6 variables.

#### PRINCIPAL COMPONENT AVALYSIS

22 OBSTRUATIONS 6 VARIABLES

			SIMPLE STATIST	rics		
	OWS	SOI	CLI	HOI	FD	ZD.
	2 (2102	59.9182	11.1909	4.91818	76.4091	302.545
MEAN ST DEV	1.91092	27.5174	11.1794	2.65112	63.7775	93.035
			CORRELATION	rs.		
	0.48	SOT	CI.I	ion	FD	RD
285	1,0000	-0.6071	-0.2463	0.0545	0.0591	-0.1663
SOI	-0.6071	1.0020	-0.1854	0.0999	-0.0541	-0.3671
CLI	-0.2463	-0.1854	1.0000	0.2534	-0.2172	0.3539
IOI	0.0545	0.0939	0.2534	1.0000	-0.0184	-0.1433
מק	0.0591	-0.0541	-0.2172	-0.0194	1.0000	0.3916
d b	-0.1663	-0.3671	0.3539	-0.1433	0.3916	1.0000
		EIGENVALUE	DIFFERENCE	MOITROGOPG	CUMULATIVE	
	ווודמם	1.73013	0.207606	0.299356	0.29936	
	PULMS	1.52253	0.214532	0.253755	0.54211	
	ENIBA	1.30800	0.317431	0.217999	0.76011	
	PRIMA	0.99057	0.703901	0.165094	0.92520	
	PRINS	0.29565	0.124552	0.047777	0.97298	
	DISINE	0.16211	•	0.027019	1.00000	
			FIGENVECTO	RS		
	PRINI	<b>PRI43</b>	ENIPA	PRIN4	PRINS	PPIN6
OWS	3 0.411199	2586733	0.279936	0.120213	0.161173	0.606941
SOI	1663978	0.135149	272758	0.172700	0.103784	0.647464
CLI	0.140354	1 0.611156	3 2.463753	093211	0.502503	0.141083
MOT	117614	0.123039	2 0.493415	0.778930	334801	093453
FD	0.313181	0.034210	1571938	0.582994	0.459610	153492
DD	2 7.501775	3 0.497582	249317	02341R	526980	0.400273
	2 7.30 (175	3 00 13 73 13	• • • • • • • •	•		

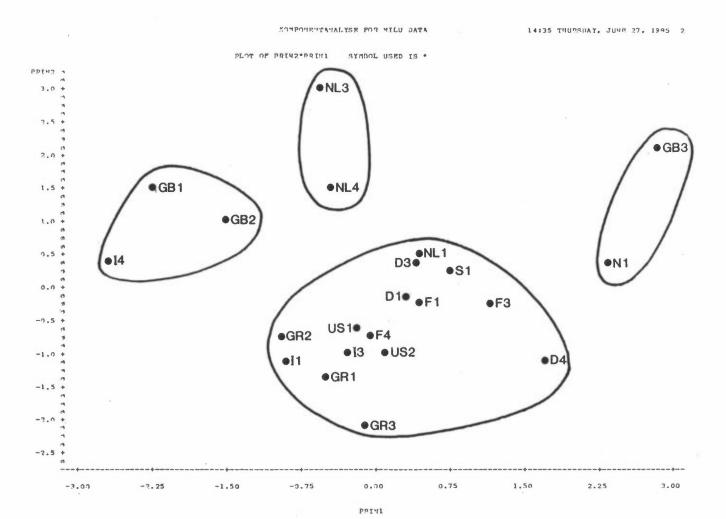


Figure B1: Cluster analyses of sandstone with principal component 1 and 2 as the axis.

## NORSK INSTITUTT FOR LUFTFORSKNING (NILU) NORWEGIAN INSTITUTE FOR AIR RESEARCH POSTBOKS 64. N-2001 LILLESTRØM

RAPPORTTYPE OPPDRAGSRAPPORT	RAPPORTNR. OR 34/85	ISBN-82-7247	-596-0
DATO JUNE 1985	ANSV. SIGN. J. Seljordyn	ANT. SIDER 38	PRIS Kr 30,-
FITTEL  Conservation and restoratio  Part B - Multiple regressio	PROSJEKTLEDER J. F. Henriksen		
ration of calcareous stones ables.	NILU PROSJEKT NR. 0-8068		
FORFATTER(E) J.F. Henriksen S.E. Haagenrud	TILGJENGELIGHET A		
F. Gram		OPPDRAGSGIVE	ERS REF.
OPPDRAGSGIVER (NAVN OG ADRES Miljøverndepartementet/ Riksantikvaren	SE)		
3 STIKKORD (à maks. 20 ansla Stone deterioration R		Air polluti	on
monuments" er blitt statist mellom vekttap på stein og	linjer) rosjektet "Restoration and p isk behandlet for å finne fo miljøparametrene. Den beste ble funnet ved en kombinasjo	ram til korre korrelasjone	elasjoner en for

#### TITLE

ABSTRACT (max. 300 characters, 7 lines)

The results from NATO/CCMS project "Restoration and preservation of monuments" have been statistically analysed for correlations between the weight loss of sandstone and limestone to environmental factors. The best correlations for weight loss found were with SO deposition and number of raindays.

\* Kategorier: Åpen - kan bestilles fra NILU A
Må bestilles gjennom oppdragsgiver B
Kan ikke utleveres C