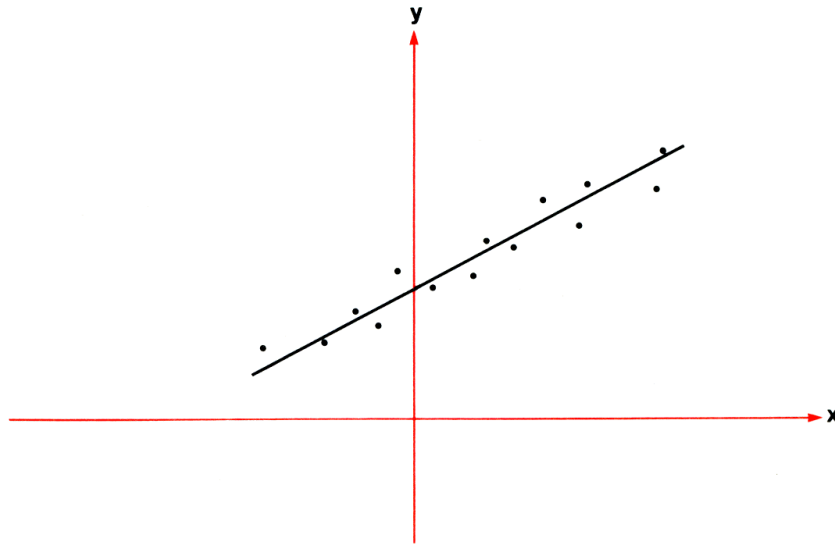


CHAPTER 6 STATISTICS

CURVE FITTING—LINEAR REGRESSION



When investigating the relationship between two variables in the real world, it is a reasonable first step to make experimental observations of the system to gather paired values of the variables, (x, y) . The investigator might then ask the question: What mathematical formula best describes the relationship between the variables x and y ? His first guess will often be that the relationship is linear, i.e., that the form of the equation is $y = a_1 x + a_0$, where a_1 and a_0 are constants. The purpose of this program is to find the constants a_1 and a_0 , which give the closest agreement between the experimental data and the equation $y = a_1 x + a_0$. The technique used is linear regression by the method of least squares.

The user must input the paired values of data he has gathered, (x_i, y_i) , $i = 1, \dots, n$. When all data pairs have been input, the regression constants a_1 and a_0 may be calculated. A third value may also be found, the coefficient of determination, r^2 . The value of r^2 will lie between 0 and 1 and will indicate how closely the equation fits the experimental data: the closer r^2 is to 1, the better the fit.

Equations:

$$y = a_1 x + a_0$$

All summations below are performed for $i = 1, \dots, n$.

Regression constants:

$$a_1 = \frac{\Sigma xy - \frac{\Sigma x \Sigma y}{n}}{\Sigma x^2 - \frac{(\Sigma x)^2}{n}}$$

$$a_0 = \bar{y} - a_1 \bar{x}$$

where $\bar{y} = \frac{\Sigma y}{n}$

$$\bar{x} = \frac{\Sigma x}{n}$$

Coefficient of determination:

$$r^2 = \frac{\left[\Sigma xy - \frac{\Sigma x \Sigma y}{n} \right]^2}{\left[\Sigma x^2 - \frac{(\Sigma x)^2}{n} \right] \left[\Sigma y^2 - \frac{(\Sigma y)^2}{n} \right]}$$

Note:

The values for a_0 and a_1 are stored in R_0 and R_1 , respectively. After the calculation of a_0 , a_1 , and r^2 , the estimated y-value, \hat{y} , corresponding to any x-value may be calculated by $y = a_1 x + a_0$.

Programming Remarks:

The intermediate value $C = \Sigma xy - (\Sigma x \Sigma y/n)$ is first calculated at line 14 but is also needed near the end of the program to find r^2 . Since all registers R_0 through R_7 are in use, the only place to save this value is in the stack. Hence C is preserved in one or more of the stack registers from lines 14 through 36, when it is used. It is due to the presence of C in the stack that users are warned not to disturb the contents of the stack after calculation of a_0 and a_1 (see step 4 of User Instructions).

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	REG	f	PRGM	
3	Perform for $i = 1, \dots, n$:						
	Input x-value and y-value	x_i	↑				
		y_i	R/S				i
4	Compute regression constants		GTO	08	R/S		a_0^*
			R/S				a_1^*
5	Compute coefficient of determination						r^2
6	To calculate a projected y-value, input the x-value	x	RCL	1	x	RCL	
			0	+			↕
7	Perform step 6 as many times as desired						
8	For a new case, go to step 2.						
	* The contents of the stack should not be disturbed at these points.						

Example:

An eccentric professor of numerical analysis wakes up one morning and feels feverish. A search through his medicine cabinet reveals one oral thermometer which, unfortunately, is in degrees centigrade, a scale he is not familiar with. As he stares disconsolately out his window, he spies the outdoor thermometer affixed to the windowframe. This thermometer, however, will not fit comfortably into his mouth. Still, with some ingenuity....

The professor suspects that the relationship is $F = a_1 C + a_0$. If he can get a few data pairs for F and C , he can run a linear regression program to find a_1 and a_0 , then convert any reading in $^{\circ}\text{C}$ to $^{\circ}\text{F}$ through the equation. So tossing both thermometers into a sink of lukewarm water, he reads the following pairs of temperatures as the water cools:

C	40.5	38.6	37.9	36.2	35.1	34.6
F	104.5	102	100	97.5	95.5	94

If the relationship is indeed $F = a_1 C + a_0$, what are the values for a_1 and a_0 ? What is the coefficient of determination?

Solution:

f	PRGM	f	REG	40.5	↑	104.5	R/S	→	1.00
38.6	↑	102	R/S	→	2.00				
37.9	↑	100	R/S	→	3.00				
36.2	↑	97.5	R/S	→	4.00				
35.1	↑	95.5	R/S	→	5.00				
34.6	↑	94	R/S	→	6.00				
GTO	0	8	R/S	→	33.53				
R/S	→	1.76							
R/S	→	0.99							

Thus, by the data above, $F = 1.76 C + 33.53$, with $r^2 = 0.99$. (The real equation, of course, is $F = 1.8C + 32$.)

Suppose the professor puts the centigrade thermometer in his mouth and finds he has a temperature of 37°C . Should he be worried?

37 RCL 1 × RCL 0 + → 98.65°F

It looks like he is safe.

EXPONENTIAL CURVE FIT

This program computes the least squares fit of n pairs of data points $\{(x_i, y_i), i = 1, 2, \dots, n\}$, where $y_i > 0$, for an exponential function of the form

$$y = a e^{bx} \quad (a > 0).$$

The equation is linearized into

$$\ln y = \ln a + bx.$$

The following statistics are computed:

1. Coefficients a, b

$$b = \frac{\sum x_i \ln y_i - \frac{1}{n} (\sum x_i)(\sum \ln y_i)}{\sum x_i^2 - \frac{1}{n} (\sum x_i)^2}$$

$$a = \exp \left[\frac{\sum \ln y_i}{n} - b \frac{\sum x_i}{n} \right]$$

2. Coefficient of determination

$$r^2 = \frac{\left[\sum x_i \ln y_i - \frac{1}{n} \sum x_i \sum \ln y_i \right]^2}{\left[\sum x_i^2 - \frac{(\sum x_i)^2}{n} \right] \left[\sum (\ln y_i)^2 - \frac{(\sum \ln y_i)^2}{n} \right]}$$

3. Estimated value \hat{y} for a given x

$$\hat{y} = a e^{bx}$$

Note:

n is a positive integer and $n \neq 1$.

DISPLAY		KEY ENTRY	DISPLAY		KEY ENTRY	REGISTERS
LINE	CODE		LINE	CODE		
00			25	61	x	R ₀ a
01	14 07	f LN	26	32	CHS	R ₁ b
02	31	↑	27	24 04	RCL 4	R ₂ $\sum (\ln y)^2$
03	15 02	g x ²	28	51	+	R ₃ n
04	23 51 02	STO + 2	29	24 03	RCL 3	R ₄ $\sum \ln y$
05	22	R↓	30	71	÷	R ₅ $\sum x \ln y$
06	21	x↔y	31	15 07	g e ^x	R ₆ $\sum x^2$
07	25	Σ+	32	23 00	STO 0	R ₇ $\sum x$
08	13 00	GTO 00	33	74	R/S	
09	24 05	RCL 5	34	24 01	RCL 1	
10	24 07	RCL 7	35	74	R/S	
11	24 04	RCL 4	36	21	x↔y	
12	61	x	37	22	R↓	
13	24 03	RCL 3	38	61	x	
14	71	÷	39	24 02	RCL 2	
15	41	-	40	24 04	RCL 4	
16	24 06	RCL 6	41	15 02	g x ²	
17	24 07	RCL 7	42	24 03	RCL 3	
18	15 02	g x ²	43	71	÷	
19	24 03	RCL 3	44	41	-	
20	71	÷	45	71	÷	
21	41	-	46	13 00	GTO 00	
22	71	÷	47			
23	23 01	STO 1	48			
24	24 07	RCL 7	49			

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	REG	f	PRGM	
3	Perform for i = 1, ..., n:						
	Input x-value and y-value	x _i	↑				
		y _i	R/S				i
4	Compute constants		GTO	09	R/S		a*
			R/S				b*
5	Compute coefficient of determination						
			R/S				r ²
6	To calculate \hat{y} , input x	x	RCL	1	x	g	
			e ^x	RCL	0	x	\hat{y}
7	Perform step 6 as many times as desired						
8	For new case, go to step 2.						
	* The stack must be maintained at these points.						

Example:

x_i	.72	1.31	1.95	2.58	3.14
y_i	2.16	1.61	1.16	.85	0.5

Solution:

$$a = 3.45, b = -0.58$$

$$y = 3.45 e^{-0.58x}$$

$$r^2 = 0.98$$

$$\text{For } x = 1.5, \hat{y} = 1.44$$

LOGARITHMIC CURVE FIT

This program fits a logarithmic curve

$$y = a + b \ln x$$

to a set of data points

$$\{(x_i, y_i), i = 1, 2, \dots, n\}$$

where $x_i > 0$.

Program computes:

1. Regression coefficients

$$b = \frac{\sum y_i \ln x_i - \frac{1}{n} \sum \ln x_i \sum y_i}{\sum (\ln x_i)^2 - \frac{1}{n} (\sum \ln x_i)^2}$$

$$a = \frac{1}{n} (\sum y_i - b \sum \ln x_i)$$

2. Coefficient of determination

$$r^2 = \frac{\left[\sum y_i \ln x_i - \frac{1}{n} \sum \ln x_i \sum y_i \right]^2}{\left[\sum (\ln x_i)^2 - \frac{1}{n} (\sum \ln x_i)^2 \right] \left[\sum y_i^2 - \frac{1}{n} (\sum y_i)^2 \right]}$$

3. Estimated value \hat{y} for given x

$$\hat{y} = a + b \ln x$$

Note:

n is a positive integer and $n \neq 1$.

DISPLAY		KEY ENTRY
LINE	CODE	
00		
01	31	↑
02	15 02	$g x^2$
03	23 51 02	STO + 2
04	22	R↓
05	21	$x \leftrightarrow y$
06	14 07	f LN
07	25	$\Sigma +$
08	13 00	GTO 00
09	24 05	RCL 5
10	24 07	RCL 7
11	24 04	RCL 4
12	61	x
13	24 03	RCL 3
14	71	÷
15	41	-
16	24 06	RCL 6
17	24 07	RCL 7
18	15 02	$g x^2$
19	24 03	RCL 3
20	71	÷
21	41	-
22	71	÷
23	23 01	STO 1
24	24 07	RCL 7

DISPLAY		KEY ENTRY
LINE	CODE	
25	61	x
26	32	CHS
27	24 04	RCL 4
28	51	+
29	24 03	RCL 3
30	71	÷
31	23 00	STO 0
32	74	R/S
33	24 01	RCL 1
34	74	R/S
35	21	$x \leftrightarrow y$
36	22	R↓
37	61	x
38	24 02	RCL 2
39	24 04	RCL 4
40	15 02	$g x^2$
41	24 03	RCL 3
42	71	÷
43	41	-
44	71	÷
45	13 00	GTO 00
46		
47		
48		
49		

REGISTERS
R ₀ a
R ₁ b
R ₂ Σy^2
R ₃ n
R ₄ Σy
R ₅ $\Sigma y \ln x$
R ₆ $\Sigma \ln x$
R ₇ $\Sigma (\ln x)^2$

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	REG	f	PRGM	
3	Perform for $i = 1, \dots, n$:						
	Input x-value and y-value	x_i	↑				
		y_i	R/S				i
4	Compute constants		GTO	09	R/S		a^*
			R/S				b^*
5	Compute coefficient of determination						r^2
			R/S				
6	To calculate \hat{y} , input x	x	f	ln	RCL	1	
			x	RCL	0	+	\hat{y}
7	Perform step 6 as many times as desired						
8	For new case, go to step 2.						
	* The stack must be maintained at these points						

Example:

x_i	3	4	6	10	12
y_i	1.5	9.3	23.4	45.8	60.1

Solution:

$$a = -47.02, b = 41.39$$

$$y = -47.02 + 41.39 \ln x$$

$$r^2 = 0.98$$

$$\text{For } x = 8, \hat{y} = 39.06$$

$$\text{For } x = 14.5, \hat{y} = 63.67$$

POWER CURVE FIT

This program fits a power curve

$$y = ax^b \quad (a > 0)$$

to a set of data points

$$\{(x_i, y_i), i = 1, 2, \dots, n\}$$

where $x_i > 0, y_i > 0$.

By writing this equation as

$$\ln y = b \ln x + \ln a$$

the problem can be solved as a linear regression problem.

Output statistics are:

1. Regression coefficients

$$b = \frac{\sum (\ln x_i) (\ln y_i) - \frac{(\sum \ln x_i) (\sum \ln y_i)}{n}}{\sum (\ln x_i)^2 - \frac{(\sum \ln x_i)^2}{n}}$$

$$a = \exp \left[\frac{\sum \ln y_i}{n} - b \frac{\sum \ln x_i}{n} \right]$$

2. Coefficient of determination

$$r^2 = \frac{\left[\sum (\ln x_i) (\ln y_i) - \frac{(\sum \ln x_i) (\sum \ln y_i)}{n} \right]^2}{\left[\sum (\ln x_i)^2 - \frac{(\sum \ln x_i)^2}{n} \right] \left[\sum (\ln y_i)^2 - \frac{(\sum \ln y_i)^2}{n} \right]}$$

3. Estimated value \hat{y} for given x

$$\hat{y} = ax^b$$

Note:

n is a positive integer and $n \neq 1$.

Example:

x_i	10	12	15	17	20	22	25	27	30	32	35
y_i	0.95	1.05	1.25	1.41	1.73	2.00	2.53	2.98	3.85	4.59	6.02

Solution:

$$a = .03, b = 1.46$$

$$y = .03x^{1.46}$$

$$r^2 = 0.94$$

$$\text{For } x = 18, \hat{y} = 1.76$$

$$x = 23, \hat{y} = 2.52$$

COVARIANCE AND CORRELATION COEFFICIENT

For a set of given data points $\{(x_i, y_i), i = 1, 2, \dots, n\}$, the covariance and the correlation coefficient are defined as:

$$\text{covariance } s_{xy} = \frac{1}{n-1} \left(\sum x_i y_i - \frac{1}{n} \sum x_i \sum y_i \right)$$

$$\text{or } s_{xy}' = \frac{1}{n} \left(\sum x_i y_i - \frac{1}{n} \sum x_i \sum y_i \right)$$

$$\text{correlation coefficient } r = \frac{s_{xy}}{s_x s_y}$$

where s_x and s_y are standard deviations

$$s_x = \sqrt{\frac{\sum x_i^2 - (\sum x_i)^2/n}{n-1}} \quad s_y = \sqrt{\frac{\sum y_i^2 - (\sum y_i)^2/n}{n-1}}$$

Note:

$$-1 \leq r \leq 1$$

DISPLAY		KEY ENTRY
LINE	CODE	
00		
01	31	↑
02	15 02	$g x^2$
03	23 51 02	STO + 2
04	22	R↓
05	21	$x \leftrightarrow y$
06	25	$\Sigma +$
07	13 00	GTO 00
08	24 05	RCL 5
09	24 04	RCL 4
10	24 07	RCL 7
11	61	x
12	24 03	RCL 3
13	71	÷
14	41	-
15	24 03	RCL 3
16	01	1
17	41	-
18	23 00	STO 0
19	71	÷
20	23 01	STO 1
21	74	R/S
22	24 00	RCL 0
23	61	x
24	24 03	RCL 3

DISPLAY		KEY ENTRY
LINE	CODE	
25	71	÷
26	74	R/S
27	14 22	$f s$
28	23 71 01	STO ÷ 1
29	24 02	RCL 2
30	24 04	RCL 4
31	15 02	$g x^2$
32	24 03	RCL 3
33	71	÷
34	41	-
35	24 00	RCL 0
36	71	÷
37	14 02	$f \sqrt{x}$
38	23 71 01	STO ÷ 1
39	24 01	RCL 1
40	13 00	GTO 00
41		
42		
43		
44		
45		
46		
47		
48		
49		

REGISTERS
R ₀ n - 1
R ₁ Used
R ₂ Σy^2
R ₃ n
R ₄ Σy
R ₅ Σxy
R ₆ Σx^2
R ₇ Σx

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	PRGM	f	REG	
3	Perform this step for $i = 1, 2, \dots, n$	x_i	↑				
		y_i	R/S				i
4	Compute covariance s_{xy}		GTO	08	R/S		s_{xy}
5	Compute s_{xy}'		R/S				s_{xy}'
6	Compute correlation coefficient		R/S				r
7	For new case, go to step 2.						

Example:

x_i	26	30	44	50	62	68	74
y_i	92	85	78	81	54	51	40

Solution:

$$s_{xy} = -354.14$$

$$s_{xy}' = -303.55$$

$$r = -0.96$$

MOMENTS AND SKEWNESS

This program computes the following statistics for a set of given data $\{x_1, x_2, \dots, x_n\}$:

$$1^{\text{st}} \text{ moment } \quad \bar{x} = \frac{1}{n} \sum_{i=1}^n x_i$$

$$2^{\text{nd}} \text{ moment } \quad m_2 = \frac{1}{n} \sum x_i^2 - \bar{x}^2$$

$$3^{\text{rd}} \text{ moment } \quad m_3 = \frac{1}{n} \sum x_i^3 - \frac{3}{n} \bar{x} \sum x_i^2 + 2\bar{x}^3$$

moment coefficient of skewness

$$\gamma_1 = \frac{m_3}{m_2^{3/2}}$$

DISPLAY		KEY ENTRY
LINE	CODE	
00		
01	31	↑
02	15 02	g x ²
03	25	Σ+
04	13 00	GTO 00
05	24 04	RCL 4
06	24 03	RCL 3
07	71	÷
08	23 02	STO 2
09	74	R/S
10	24 07	RCL 7
11	24 03	RCL 3
12	71	÷
13	24 02	RCL 2
14	15 02	g x ²
15	41	-
16	23 01	STO 1
17	74	R/S
18	24 05	RCL 5
19	24 03	RCL 3
20	71	÷
21	24 07	RCL 7
22	24 02	RCL 2
23	61	x
24	24 03	RCL 3

DISPLAY		KEY ENTRY
LINE	CODE	
25	71	÷
26	03	3
27	61	x
28	41	-
29	24 02	RCL 2
30	31	↑
31	15 02	g x ²
32	61	x
33	02	2
34	61	x
35	51	+
36	23 00	STO 0
37	74	R/S
38	24 00	RCL 0
39	24 01	RCL 1
40	01	1
41	73	·
42	05	5
43	14 03	f y ^x
44	71	÷
45	13 00	GTO 00
46		
47		
48		
49		

REGISTERS
R ₀ m ₃
R ₁ m ₂
R ₂ \bar{x}
R ₃ n
R ₄ Σ x
R ₅ Σ x ³
R ₆ Σ x ⁴
R ₇ Σ x ²

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	PRGM	f	REG	
3	Perform for $i = 1, 2, \dots, n$:						
	Input x-value	x_i	R/S				i
4	Delete erroneous data	x_k	\uparrow	g	x^2	f	
			$\Sigma-$				
5	Compute the mean		GTO	05	R/S		\bar{x}
6	Compute the second and third moments						
			R/S				m_2
			R/S				m_3
7	Compute the moment coefficient of skewness						
			R/S				γ_1
8	For new case, go to step 2.						

Example:

i	1	2	3	4	5	6	7	8	9
x_i	2.1	3.5	4.2	6.5	4.1	3.6	5.3	3.7	4.9

Solution:

$$\bar{x} = 4.21$$

$$m_2 = 1.39$$

$$m_3 = 0.39$$

$$\gamma_1 = 0.24$$

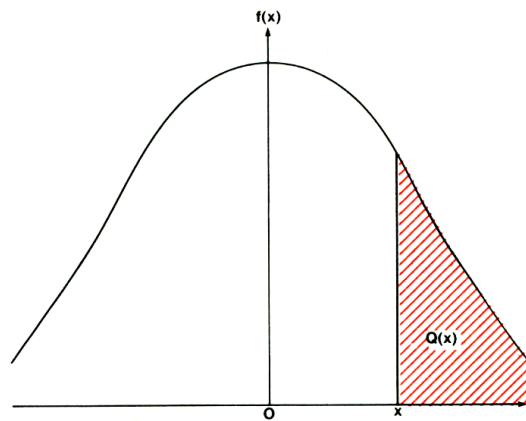
NORMAL DISTRIBUTION

The density function for a standard normal variable is

$$f(x) = \frac{1}{\sqrt{2\pi}} e^{-\frac{x^2}{2}} .$$

The upper tail area is

$$Q(x) = \frac{1}{\sqrt{2\pi}} \int_x^{\infty} e^{-\frac{t^2}{2}} dt .$$



For $x \geq 0$, polynomial approximation is used to compute $Q(x)$:

$$Q(x) = f(x) (b_1 t + b_2 t^2 + b_3 t^3 + b_4 t^4 + b_5 t^5) + \epsilon(x)$$

where $|\epsilon(x)| < 7.5 \times 10^{-8}$

$$t = \frac{1}{1 + rx}, \quad r = 0.2316419$$

$$b_1 = .31938153, \quad b_2 = -.356563782$$

$$b_3 = 1.781477937, \quad b_4 = -1.821255978$$

$$b_5 = 1.330274429$$

Note:

The program only works for $x \geq 0$. Equations $f(-x) = f(x)$, $Q(-x) = 1 - Q(x)$, where $x \geq 0$, can be used to find f and Q for negative numbers.

Reference:

Abramowitz and Stegun, *Handbook of Mathematical Functions*, National Bureau of Standards, 1968.

DISPLAY		KEY ENTRY
LINE	CODE	
00		
01	31	↑
02	23 06	STO 6
03	61	x
04	02	2
05	71	÷
06	32	CHS
07	15 07	$g e^x$
08	15 73	$g \pi$
09	02	2
10	61	x
11	14 02	$f \sqrt{x}$
12	71	÷
13	23 07	STO 7
14	74	R/S
15	24 00	RCL 0
16	24 06	RCL 6
17	61	x
18	01	1
19	51	+
20	15 22	$g 1/x$
21	31	↑
22	31	↑
23	31	↑
24	24 05	RCL 5

DISPLAY		KEY ENTRY
LINE	CODE	
25	61	x
26	24 04	RCL 4
27	51	+
28	61	x
29	24 03	RCL 3
30	51	+
31	61	x
32	24 02	RCL 2
33	51	+
34	61	x
35	24 01	RCL 1
36	51	+
37	61	x
38	24 07	RCL 7
39	61	x
40	13 00	GTO 00
41		
42		
43		
44		
45		
46		
47		
48		
49		

REGISTERS
R_0 r
R_1 b_1
R_2 b_2
R_3 b_3
R_4 b_4
R_5 b_5
R_6 x
R_7 $f(x)$

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	PRGM			
3	Store constants	r	STO	0			
		b_1	STO	1			
		b_2	STO	2			
		b_3	STO	3			
		b_4	STO	4			
		b_5	STO	5			
4	Input x and compute $f(x)$	x	R/S				$f(x)$
5	Compute $Q(x)$		R/S				$Q(x)$
6	For a new case, go to 4.						

Examples:

1. $x = 1.18$
2. $x = 2.28$

Solutions:

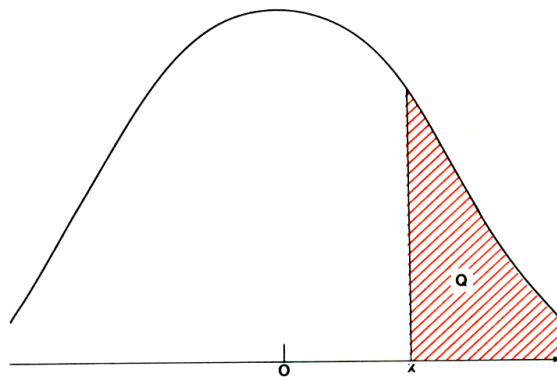
1. $f(x) = 0.20$
 $Q(x) = 0.12$
2. $f(x) = 0.03$
 $Q(x) = 0.01$

INVERSE NORMAL INTEGRAL

This program determines the value of x such that

$$Q = \int_x^{\infty} \frac{e^{-\frac{t^2}{2}}}{\sqrt{2\pi}} dt$$

where Q is given and $0 < Q \leq 0.5$.



The following rational approximation is used:

$$x = t - \frac{c_0 + c_1 t + c_2 t^2}{1 + d_1 t + d_2 t^2 + d_3 t^3} + \epsilon(Q)$$

where $|\epsilon(Q)| < 4.5 \times 10^{-4}$

$$t = \sqrt{\ln \frac{1}{Q^2}}$$

$$c_0 = 2.515517 \quad d_1 = 1.432788$$

$$c_1 = 0.802853 \quad d_2 = 0.189269$$

$$c_2 = 0.010328 \quad d_3 = 0.001308$$

Reference:

Abramowitz and Stegun, *Handbook of Mathematical Functions*, National Bureau of Standards, 1968.

DISPLAY		KEY ENTRY	DISPLAY		KEY ENTRY	REGISTERS
LINE	CODE		LINE	CODE		
00			25	51	+	$R_0 c_0$
01	31	↑	26	61	x	$R_1 c_1$
02	61	x	27	24 00	RCL 0	$R_2 c_2$
03	15 22	g 1/x	28	51	+	$R_3 d_1$
04	14 07	f LN	29	24 07	RCL 7	$R_4 d_2$
05	14 02	$f\sqrt{x}$	30	71	÷	$R_5 d_3$
06	23 06	STO 6	31	41	-	$R_6 t$
07	31	↑	32	13 00	GTO 00	$R_7 1 + d_1 t + d_2 t^2 + d_3 t^3$
08	31	↑	33			
09	31	↑	34			
10	24 05	RCL 5	35			
11	61	x	36			
12	24 04	RCL 4	37			
13	51	+	38			
14	61	x	39			
15	24 03	RCL 3	40			
16	51	+	41			
17	61	x	42			
18	01	1	43			
19	51	+	44			
20	23 07	STO 7	45			
21	34	CLX	46			
22	24 02	RCL 2	47			
23	61	x	48			
24	24 01	RCL 1	49			

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	PRGM			
3	Store constants	c_0	STO	0			
		c_1	STO	1			
		c_2	STO	2			
		d_1	STO	3			
		d_2	STO	4			
		d_3	STO	5			
4	Input Q	Q	R/S				
5	For a new case, go to 4.						

Examples:

1. $Q = 0.12$
2. $Q = 0.05$

Solutions:

1. $x = 1.18$
2. $x = 1.65$

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	PRGM			
3	Key in n ($2 \leq n \leq 69$)	n	R/S				n!
4	For a new n, go to step 3.						

Examples:

1. $5! = 120.00$
2. $10! = 3628800.00$

PERMUTATION

A permutation is an ordered subset of a set of distinct objects. The number of possible permutations, each containing n objects, that can be formed from a collection of m distinct objects is given by

$${}_m P_n = \frac{m!}{(m-n)!} = m(m-1) \dots (m-n+1)$$

where m, n are integers and $0 \leq n \leq m$.

Notes:

1. ${}_m P_n$ can also be denoted by P_n^m , $P(m,n)$ or $(m)_n$.
2. ${}_m P_0 = 1$, ${}_m P_1 = m$, ${}_m P_m = m!$

DISPLAY			KEY ENTRY			
LINE	CODE	KEY ENTRY				
00						REGISTERS
01	24 00	RCL 0	25	13 15	GTO 15	R_0 m
02	24 00	RCL 0	26	22	R↓	R_1 n
03	24 01	RCL 1	27	22	R↓	R_2
04	15 71	g x=0	28	13 00	GTO 00	R_3
05	13 29	GTO 29	29	01	1	R_4
06	14 71	f x=y	30	13 00	GTO 00	R_5
07	13 31	GTO 31	31	01	1	R_6
08	14 51	f x>=y	32	41	-	R_7
09	13 39	GTO 39	33	15 71	g x=0	
10	01	1	34	13 37	GTO 37	
11	14 71	f x=y	35	23 61 00	STO x 0	
12	13 41	GTO 41	36	13 31	GTO 31	
13	22	R↓	37	24 00	RCL 0	
14	41	-	38	13 00	GTO 00	
15	01	1	39	00	0	
16	51	+	40	71	÷	
17	61	x	41	22	R↓	
18	14 73	f LASTx	42	22	R↓	
19	24 00	RCL 0	43	13 00	GTO 00	
20	01	1	44			
21	41	-	45			
22	14 71	f x=y	46			
23	13 26	GTO 26	47			
24	22	R↓	48			
			49			

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Store m, n	m	STO	0			
		n	STO	1			
3	Compute permutations		f	PRGM	R/S		mP_n
4	For new case, go to step 2.						

Examples:

1. ${}_{43}P_3 = 74046.00$
2. ${}_{73}P_4 = 26122320.00$

COMBINATION

A combination is a selection of one or more of a set of distinct objects without regard to order. The number of possible combinations, each containing n objects, that can be formed from a collection of m distinct objects is given by

$${}_m C_n = \frac{m!}{(m-n)! n!} = \frac{m(m-1) \dots (m-n+1)}{1 \cdot 2 \cdot \dots \cdot n}$$

where m, n are integers and $0 \leq n \leq m$.

This program computes ${}_m C_n$ using the following algorithm:

- i. If $n \leq m - n$

$${}_m C_n = \frac{m-n+1}{1} \cdot \frac{m-n+2}{2} \cdot \dots \cdot \frac{m}{n} .$$

2. If $n > m - n$, program computes ${}_m C_{m-n}$.

Notes:

1. ${}_m C_n$, which is also called the binomial coefficient, can be denoted by C_n^m , $C(m,n)$, or $\binom{m}{n}$.
2. ${}_m C_n = {}_m C_{m-n}$
3. ${}_m C_0 = {}_m C_m = 1$
4. ${}_m C_1 = {}_m C_{m-1} = m$

DISPLAY		KEY ENTRY	DISPLAY		KEY ENTRY	REGISTERS
LINE	CODE		LINE	CODE		
00			25	24 01	RCL 1	R_0 max (n, m - n)
01	41	-	26	71	÷	R_1 Used
02	14 73	f LASTx	27	23 61 02	STO x 2	R_2 Used
03	14 41	f x < y	28	22	R↓	R_3
04	21	x↔y	29	13 13	GTO 13	R_4
05	23 00	STO 0	30	01	1	R_5
06	01	1	31	13 00	GTO 00	R_6
07	23 01	STO 1	32			R_7
08	51	+	33			
09	23 02	STO 2	34			
10	22	R↓	35			
11	15 71	g x=0	36			
12	13 30	GTO 30	37			
13	01	1	38			
14	24 01	RCL 1	39			
15	51	+	40			
16	23 01	STO 1	41			
17	21	x↔y	42			
18	14 51	f x ≥ y	43			
19	13 22	GTO 22	44			
20	24 02	RCL 2	45			
21	13 00	GTO 00	46			
22	22	x↔y	47			
23	24 00	RCL 0	48			
24	51	+	49			

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Key in m and n	m	↑				
		n	f	PRGM	R/S		mC_n
3	For new case, go to step 2.						

Examples:

- ${}_{73}C_4 = 1088430.00$
- ${}_{43}C_3 = 12341.00$

RANDOM NUMBER GENERATOR

This program calculates uniformly distributed pseudo random numbers u_i in the range

$$0 \leq u_i \leq 1$$

using the following formula:

$$u_i = \text{Fractional part of } [(\pi + u_{i-1})^5].$$

The user has to specify the starting value u_0 (the “seed” of the sequence) such that

$$0 \leq u_0 \leq 1.$$

DISPLAY		KEY ENTRY	DISPLAY		KEY ENTRY	REGISTERS	
LINE	CODE		LINE	CODE			
00			25			R ₀	u_i
01	15 73	$g \pi$	26			R ₁	
02	24 00	RCL 0	27			R ₂	
03	51	+	28			R ₃	
04	05	5	29			R ₄	
05	14 03	$f y^x$	30			R ₅	
06	15 01	$g \text{ FRAC}$	31			R ₆	
07	23 00	STO 0	32			R ₇	
08	13 00	GTO 00	33				
09			34				
10			35				
11			36				
12			37				
13			38				
14			39				
15			40				
16			41				
17			42				
18			43				
19			44				
20			45				
21			46				
22			47				
23			48				
24			49				

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Store seed	u_0	STO	0	f	PRGM	
3	Generate random number		R/S				u_i
4	Repeat step 3 as many times as desired						
5	For new sequence, go to step 2.						

Example:

Find the sequence of random numbers generated from a seed of 0.192743568.

Solution:

0.14, 0.76, 0.15, 0.35, 0.62, 0.54, 0.62, 0.91, 0.48, 0.24,

CHI-SQUARE EVALUATION

This program calculates the value of the χ^2 statistic for the goodness of fit test by the equation

$$\chi^2 = \sum_{i=1}^n \frac{(O_i - E_i)^2}{E_i}$$

where O_i = observed frequency
 E_i = expected frequency.

The χ^2 statistic measures the closeness of the agreement between the observed frequencies and expected frequencies.

Notes:

1. In order to apply this test to a set of given data, it may be necessary to combine some classes to make sure that each expected frequency is not too small (say, not less than 5).
2. If the expected frequencies E_i are all equal to some value E , then E should be computed beforehand as

$$E = \frac{\sum O_i}{n}$$

and then input at each step as the expected frequency E_i .

DISPLAY		KEY ENTRY	DISPLAY		KEY ENTRY	REGISTERS
LINE	CODE		LINE	CODE		
00			25	23 00	STO 0	R_0 n
01	00	0	26	13 04	GTO 04	R_1 χ^2
02	23 00	STO 0	27			R_2 E_i
03	23 01	STO 1	28			R_3
04	74	R/S	29			R_4
05	23 02	STO 2	30			R_5
06	41	-	31			R_6
07	15 02	$g x^2$	32			R_7
08	24 02	RCL 2	33			
09	71	\div	34			
10	23 51 01	STO + 1	35			
11	24 00	RCL 0	36			
12	01	1	37			
13	51	+	38			
14	23 00	STO 0	39			
15	13 04	GTO 04	40			
16	23 02	STO 2	41			
17	41	-	42			
18	15 02	$g x^2$	43			
19	24 02	RCL 2	44			
20	71	\div	45			
21	23 41 01	STO - 1	46			
22	24 00	RCL 0	47			
23	01	1	48			
24	41	-	49			

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	PRGM	R/S		0.00
3	Perform for $i = 1, \dots, n$:						
	Input observed and expected frequencies	O_i	\uparrow				
		E_i	R/S				i
4	Delete erroneous data	O_k	\uparrow				
		E_k	GTO	16	R/S		
5	Display χ^2		RCL	1			χ^2
6	For new case, go to step 2.						

Example:

O_i	8	50	47	56	5	14
E_i	9.6	46.75	51.85	54.4	8.25	9.15

Solution:

$$\chi^2 = 4.84$$

PAIRED t STATISTIC

Given a set of paired observations from two normal populations with means μ_1, μ_2 (unknown)

x_i	x_1	x_2	...	x_n
y_i	y_1	y_2	...	y_n

let

$$D_i = x_i - y_i$$

$$\bar{D} = \frac{1}{n} \sum_{i=1}^n D_i$$

$$s_D = \sqrt{\frac{\sum D_i^2 - \frac{1}{n} (\sum D_i)^2}{n - 1}}$$

$$s_{\bar{D}} = \frac{s_D}{\sqrt{n}}$$

The test statistic

$$t = \frac{\bar{D}}{s_{\bar{D}}},$$

which has $n - 1$ degrees of freedom (df), can be used to test the null hypothesis

$$H_0: \mu_1 = \mu_2.$$

DISPLAY		KEY ENTRY	DISPLAY		KEY ENTRY	REGISTERS
LINE	CODE		LINE	CODE		
00			25			R ₀
01	41	-	26			R ₁
02	25	Σ+	27			R ₂
03	13 00	GTO 00	28			R ₃ n
04	14 22	f s	29			R ₄ Used
05	24 03	RCL 3	30			R ₅ Used
06	14 02	f√x	31			R ₆ ΣD _i
07	71	÷	32			R ₇ ΣD _i ²
08	14 21	f x̄	33			
09	21	x↔y	34			
10	71	÷	35			
11	74	R/S	36			
12	24 03	RCL 3	37			
13	01	1	38			
14	41	-	39			
15	13 00	GTO 00	40			
16			41			
17			42			
18			43			
19			44			
20			45			
21			46			
22			47			
23			48			
24			49			

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	REG	f	PRGM	
3	Perform for i = 1, ..., n:						
	Input one pair of observations	x _i	↑				
		y _i	R/S				i
4	Delete erroneous data	x _k	↑				
		y _k	-	f	Σ-		
5	Compute t and df		GTO	04	R/S		t
			R/S				df
6	For new case, go to step 2.						

Example:

x_i	14	17.5	17	17.5	15.4
y_i	17	20.7	21.6	20.9	17.2

Solution:

$$t = -7.16$$

$$df = 4.00$$

t STATISTIC FOR TWO MEANS

Suppose $\{x_1, x_2, \dots, x_{n_1}\}$ and $\{y_1, y_2, \dots, y_{n_2}\}$ are independent random samples from two normal populations having means μ_1, μ_2 (unknown) and the same unknown variance σ^2 .

We want to test the null hypothesis

$$H_0: \mu_1 - \mu_2 = D$$

where D is a given number.

Define

$$\bar{x} = \frac{1}{n_1} \sum_{i=1}^{n_1} x_i$$

$$\bar{y} = \frac{1}{n_2} \sum_{i=1}^{n_2} y_i$$

$$t = \frac{\bar{x} - \bar{y} - D}{\sqrt{\frac{1}{n_1} + \frac{1}{n_2}} \sqrt{\frac{\sum x_i^2 - n_1 \bar{x}^2 + \sum y_i^2 - n_2 \bar{y}^2}{n_1 + n_2 - 2}}}$$

We can use this t statistic, which has the t distribution with $n_1 + n_2 - 2$ degrees of freedom, to test the null hypothesis H_0 .

DISPLAY		KEY ENTRY	DISPLAY		KEY ENTRY	REGISTERS
LINE	CODE		LINE	CODE		
00			25	24 01	RCL 1	R ₀ n ₁
01	24 03	RCL 3	26	24 02	RCL 2	R ₁ Σx ²
02	23 00	STO 0	27	15 02	g x ²	R ₂ \bar{x}
03	24 06	RCL 6	28	24 00	RCL 0	R ₃ n ₂
04	23 01	STO 1	29	61	x	R ₄ Used
05	14 21	f \bar{x}	30	41	-	R ₅ Used
06	23 02	STO 2	31	24 06	RCL 6	R ₆ Σy ²
07	34	CLX	32	51	+	R ₇ Σy
08	23 03	STO 3	33	14 21	f \bar{x}	
09	23 06	STO 6	34	15 02	g x ²	
10	23 07	STO 7	35	24 03	RCL 3	
11	74	R/S	36	61	x	
12	31	↑	37	41	-	
13	14 21	f \bar{x}	38	24 00	RCL 0	
14	51	+	39	24 03	RCL 3	
15	24 02	RCL 2	40	51	+	
16	21	x \leftrightarrow y	41	02	2	
17	41	-	42	41	-	
18	24 00	RCL 0	43	71	÷	
19	15 22	g 1/x	44	14 02	f \sqrt{x}	
20	24 03	RCL 3	45	71	÷	
21	15 22	g 1/x	46	13 00	GTO 00	
22	51	+	47			
23	14 02	f \sqrt{x}	48			
24	71	÷	49			

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	REG			
3	Perform for i = 1, ..., n ₁ :						
	Input x-value	x _i	Σ+				i
4	Initialize for y		f	PRGM	R/S		0.00
5	Perform for i = 1, ..., n ₂ :						
	Input y-value	y _i	Σ+				i
6	Input D and compute t	D	R/S				t
7	To find the means of x- and y- values						
			RCL	2			\bar{x}
			f	\bar{x}			\bar{y}
8	For a new case, go to step 2.						

Example:

x: 79, 84, 108, 114, 120, 103, 122, 120

y: 91, 103, 90, 113, 108, 87, 100, 80, 99, 54

$$n_1 = 8$$

$$n_2 = 10$$

$$D = 0 \text{ (i.e., } H_0: \mu_1 = \mu_2 \text{)}$$

Solution:

$$t = 1.73$$

$$\bar{x} = 106.25$$

$$\bar{y} = 92.50$$

ONE SAMPLE TEST STATISTICS FOR THE MEAN

For a normal population (x_1, x_2, \dots, x_n) with a known variance σ^2 , a test of the null hypothesis

$$H_0: \text{mean } \mu = \mu_0$$

is based on the z statistic (which has a standard normal distribution)

$$z = \frac{\sqrt{n} (\bar{x} - \mu_0)}{\sigma}$$

If the variance σ^2 is unknown, then

$$t = \frac{\sqrt{n} (\bar{x} - \mu_0)}{s}$$

is used instead. This t statistic has the t distribution with $n - 1$ degrees of freedom. \bar{x} and s are the sample mean and standard deviation.

DISPLAY			KEY ENTRY			REGISTERS		
LINE	CODE		LINE	CODE				
00			25			R ₀	$\sqrt{n} (\bar{x} - \mu_0)$	
01	14 21	f \bar{x}	26			R ₁		
02	21	$x \leftrightarrow y$	27			R ₂		
03	41	-	28			R ₃	n	
04	24 03	RCL 3	29			R ₄	Used	
05	14 02	f \sqrt{x}	30			R ₅	Used	
06	61	x	31			R ₆	Σx	
07	23 00	STO 0	32			R ₇	Σx^2	
08	34	CLX	33					
09	74	R/S	34					
10	24 00	RCL 0	35					
11	14 22	f s	36					
12	71	\div	37					
13	74	R/S	38					
14	24 00	RCL 0	39					
15	21	$x \leftrightarrow y$	40					
16	71	\div	41					
17	13 00	GTO 00	42					
18			43					
19			44					
20			45					
21			46					
22			47					
23			48					
24			49					

STEP	INSTRUCTIONS	INPUT DATA/UNITS	KEYS				OUTPUT DATA/UNITS
1	Key in program						
2	Initialize		f	REG			
3	Perform for $i = 1, \dots, n$:						
	Input value	x_i	$\Sigma+$				i
4	Input μ_0	μ_0	f	PRGM	R/S		0.00
5	Compute t		GTO	10	R/S		t
	or						
5	Input σ and compute z	σ	GTO	14	R/S		z
6	For new case, go to step 2.						

Example:

Suppose $\mu_0 = 2$, for the following set of data

$\{2.73, 0.45, 2.52, 1.19, 3.51, 2.75, 1.79, 1.83, 1, 0.87, 1.9, 1.62, 1.74, 1.92, 1.24, 2.68\}$

Solution:

test statistic $t = -.69$

or $z = -.57$ if $\sigma = 1$.