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ЛАБОРАТОРНА РОБОТА №5

з дисципліни «Методи оптимізації та планування експерименту» на тему:

**«ПРОВЕДЕННЯ ТРЬОХФАКТОРНОГО ЕКСПЕРИМЕНТУ ПРИ
ВИКОРИСТАННІ РІВНЯННЯ РЕГРЕСІЇ З УРАХУВАННЯМ
КВАДРАТИЧНИХ ЧЛЕНІВ (ЦЕНТРАЛЬНИЙ ОРТОГОНАЛЬНИЙ
КОМПОЗИЦІЙНИЙ ПЛАН)»**

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ЛАБОРАТОРНА РОБОТА №5.

Мета: провести трьохфакторний експеримент з урахуванням квадратичних членів, використовуючи центральний ортогональний композиційний план. Знайти рівняння регресії, яке буде адекватним для опису об'єкту.

Завдання

	X ₁		X ₂		X ₃	
	min	max	min	max	min	max
107	-9	7	-4	7	-10	5

$$Y_{\max} = 206.33(3)$$

$$Y_{\min} = 192.33(3)$$

Лістинг програми

```
from prettytable import PrettyTable as prtt
from scipy.stats import f, t
import numpy as np
import functools as ft
import itertools as itr
from math import sqrt

# ~ Дано-----
x1_min = -9
x1_max = 7

x2_min = -4
x2_max = 7

x3_min = -10
x3_max = 5

x_max_list = [x1_max, x2_max, x3_max]
x_min_list = [x1_min, x2_min, x3_min]

k = len(x_max_list)
m = 3
p = 0.95
with_interactions_and_squares = True

y_max = 200 + sum(x_max_list)/len(x_max_list)
y_min = 200 + sum(x_min_list)/len(x_min_list)
# ~ -----

def fisher_critical(prob, f4, f3):
    return f.ppf(p, f4, f3)
```

```

def student_critical(q, f3):
    return t.ppf((1 + (1 - q)) / 2, f3)

def cochrans_critical(q, f1, f2):
    return 1 / (1 + (f2 - 1) / f.ppf(1 - q/f2, f1, (f2 - 1)*f1) )

def print_matrix(x_max_list, k, x_matr, y_matr, y_avg, y_disp):
    adequate_table = prtt()
    group = ['x'+str(n+1) for n in range(len(x_max_list))]
    if with_interactions_and_squares :
        group_quantity = k+1
    else:
        group_quantity = 1
    header = []
    for j in range(group_quantity):
        header.extend(list(itr.combinations(group,j+1)))
    print(header)
    header.extend(['x'+str(n+1)+'^2',) for n in range(len(x_max_list))])
    print(['x'+str(n+1)+'^2' for n in range(len(x_max_list))])
    for i in range(len(y_matr[0])):
        header.append('y'+str(i+1))
    header.append('y_avg')
    header.append('s2{y}') # ~ variance or disp
    print(header)
    # ~ add squares
    final_matrix = np.hstack((x_matr,y_matr,[[round(avg,2)] for avg in y_avg],
[[round(disp,2)] for disp in y_disp]))
    header = list([ft.reduce(lambda x,y : x+y, i) for i in header])
    adequate_table.field_names = header
    for row_number in range(len(final_matrix)):
        adequate_table.add_row(final_matrix[row_number])
    print(adequate_table)

def print_equation(x_max_list, k, beta_list, ):
    group = ['x'+str(n+1) for n in range(len(x_max_list))]
    if with_interactions_and_squares:
        group_quantity = k+1
        header = []
        for j in range(group_quantity):
            header.extend(list(itr.combinations(group,j+1)))
        header.extend(['x'+str(n+1)+'^2',) for n in
range(len(x_max_list))])
        x_names = list([ft.reduce(lambda x,y : x+y, i) for i in header])
        print(x_names)
        form = '*{:.4f} + '.join(x_names)+'*{:.4f} = y'
    else:
        group_quantity = 1
        header = []
        for j in range(group_quantity):
            header.extend(list(itr.combinations(group,j+1)))
        x_names = list([ft.reduce(lambda x,y : x+y, i) for i in header])
        form = '{:.4f} + '+'*{:.4f} + '.join(x_names)+'*{:.4f} = y'
    print(form.format(*beta_list))

adequacy = False
while adequacy == False :
    # ~ Normalized matrix
    # ~ factors
    items = [(-1,1) for i in range(k)]
    f_matrix = list(itr.product(*items))
    # ~ add z or t
    initial_f_matrix = f_matrix.copy()

```

```

l = 1.215
zor_t_list = []
for i in range(k):
    zor_t_row_pos = tuple([ l if i==j else 0 for j in range(k)])
    zor_t_row_neg = tuple([ -l if i==j else 0 for j in range(k)])
    zor_t_list.append(zor_t_row_pos)
    zor_t_list.append(zor_t_row_neg)
zero_t_row = tuple([0 for j in range(k)])
zor_t_list.append(zero_t_row)
f_matrix.extend(zor_t_list)
# ~ with interactions-----
if with_interractions_and_squares :
    interractions_matrix1 = []
    group_quantity = k - 1
    for i in f_matrix:
        comb_list = []
        for j in range(group_quantity):
            comb_list.extend(list(itertools.combinations(i,j+2)))
        comb_values = [round(np.prod(k),2) for k in comb_list]
        squared_values = [round(x**2,2) for x in i]
        comb_and_squared_values = []
        comb_and_squared_values.extend(comb_values)
        comb_and_squared_values.extend(squared_values)
        interractions_matrix1.append(comb_and_squared_values)
# ~ -----
if with_interractions_and_squares :
    norm_matrix = np.hstack((f_matrix, interractions_matrix1))
#x0_vector,
else:
    norm_matrix = np.hstack((f_matrix)) #x0_vector,
# ~ Naturalized matrix
col_list = []
for i in range(len(f_matrix[0])):
    col1 = [row[i] for row in initial_f_matrix]
    col1 = list(map(lambda x : x_max_list[i] if x==1 else x_min_list[i],
col1))

    col2 = [row[i] for row in zor_t_list]
    x0i =(x_max_list[i]+x_min_list[i])/2
    deltaxi = x_max_list[i]-x0i
    col2 = list(map(lambda x : round(x0i,2) if x==0 else
round(x*deltaxi+x0i,2), col2))

    col12 = col1+col2
    col_list.append(col12)
print(col_list)
nf_matrix = list(zip(*col_list)) # ~ naturalized factors

# ~ with interactions-----
if with_interractions_and_squares :
    print("here")
    interractions_matrix2 = []
    group_quantity = k - 1
    for i in nf_matrix:
        comb_list = []
        for j in range(group_quantity):
            comb_list.extend(list(itertools.combinations(i,j+2)))
        comb_values = [round(np.prod(k),2) for k in comb_list]
        squared_values = [round(x**2,2) for x in i]
        comb_and_squared_values = []
        comb_and_squared_values.extend(comb_values)
        comb_and_squared_values.extend(squared_values)

```

```

        interactions_matrix2.append(comb_and_squared_values)
# ~ -----
if with_interactions_and_squares :
    natur_matrix = np.hstack((nf_matrix, interactions_matrix2))
#x0_vector,
else:
    natur_matrix = np.hstack((nf_matrix)) #x0_vector,
# ~
-----
escape = False
while escape == False:
    y_matr = np.random.randint(y_min, y_max, (len(natur_matrix), m))
    y_avg = [sum(i)/len(i) for i in y_matr]
    y_disp = [] # ~ i.e. variance
    for i in range(len(natur_matrix)):
        tmp_disp = 0
        for j in range(m):
            tmp_disp += ((y_matr[i][j] - y_avg[i]) ** 2) / m
        y_disp.append(tmp_disp)
    f1 = m - 1
    f2 = len(natur_matrix)
    q = 1 - p
# ~ Cochran test
    Gp = max(y_disp) / sum(y_disp)
    Gt = cochrans_critical(q, f1, f2)
    # ~ print(Gt, Gp)
    if Gt > Gp:
        escape = True
        form = 'Cochran`s test passed with significance level {:.4f} :
Gt > Gp'
    else:
        m += 1
        form = 'Cochran`s test failed with significance level {:.4f} :
Gt < Gp'
    print(form.format(q))
    print('Gt = {}\nGp = {}'.format(Gt, Gp))
# ~
-----
if with_interactions_and_squares :
    beta_list_norm1 = list(np.linalg.solve(norm_matrix[3:13],
y_avg[3:13]))
    beta_list_natur1 = list(np.linalg.solve(natur_matrix[3:13],
y_avg[3:13]))
    beta_list_norm2 = list(np.linalg.solve(norm_matrix[1:11],
y_avg[1:11]))
    beta_list_natur2 = list(np.linalg.solve(natur_matrix[1:11],
y_avg[1:11]))
    beta_list_norm = list(zip(beta_list_norm1, beta_list_norm2))
    beta_list_norm = list(map(lambda x : sum(x)/2, beta_list_norm))
    beta_list_natur = list(zip(beta_list_natur1, beta_list_natur2))
    beta_list_natur = list(map(lambda x : sum(x)/2, beta_list_natur))

print_matrix(x_max_list, k, norm_matrix, y_matr, y_avg, y_disp)
print('Equation with normalized coefficients : ')
print_equation(x_max_list, k, beta_list_norm)
print_matrix(x_max_list, k, natur_matrix, y_matr, y_avg, y_disp)
print('Equation with naturalized coefficients : ')
print_equation(x_max_list, k, beta_list_natur)
print(beta_list_natur)
# ~
-----

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```

print('\nStudent`s test')
N = len(beta_list_norm)
f3 = f1 * f2
S2b = sum(y_disp)**2 / (N * N * m)
Sb = sqrt(S2b)
betast_list = []
for i in range(len(norm_matrix[0])):
    x_list_tmp = norm_matrix[:,i]
    beta_tmp = ((sum([np.prod(i) for i in list(zip(x_list_tmp,
y_avg))])) / N)
    betast_list.append(beta_tmp)

T_list = [abs(beta)/Sb for beta in betast_list]
T = student_critical(q, f3)
print('T = '+str(T)+ '\nT_list = '+str(list(map(lambda x : round(x, 2),
T_list))))
for i in range(len(T_list)):
    if T_list[i] < T :
        T_list[i] = 0
        beta_list_natur[i] = 0
print('Fixed beta_list = '+ str(list(map(lambda x :round(x, 2),
beta_list_natur))))
print('Equation without insignificant coefficients : ')
print_equation(x_max_list, k, beta_list_natur)

print("\nFisher test")
equation_y_list = []
for i in range(len(natur_matrix[0])):
    x_list_tmp = natur_matrix[i]
    y_tmp = sum([np.prod(i) for i in list(zip(x_list_tmp,
beta_list_natur))])
    equation_y_list.append(y_tmp)

beta_list_natur = list(filter(lambda i : (i != 0), beta_list_natur))
d = len(beta_list_natur)
f4 = N - d
S2ad = m * (sum([(i[0]-i[1])**2 for i in list(zip(equation_y_list,
y_avg))])) / f4
Fp = sqrt(S2ad) / Sb
Ft = fisher_critical(p, f4, f3)
print('Fp = '+ str(Fp)+"\nFt = "+str(Ft))
if Fp > Ft:
    print("      The regression equation is inadequate at the
significance level {:.2f}".format(q))
    with_interractions_and_squares = True
else:
    print("      The regression equation is adequate at the significance
level {:.2f}".format(q))
    adequacy = True

```

Результат виконання

Equation with normalized coefficients :

$$x_1 \cdot 1.2346 + x_2 \cdot 0.9160 + x_3 \cdot 123.0028 + x_1 x_2 \cdot -0.6660 + x_1 x_3 \cdot 123.9194 + x_2 x_3 \cdot 123.7675 + x_1 x_2 x_3 \cdot 122.0175 + x_1^2 \cdot 132.3198 + x_2^2 \cdot 132.8066 + x_3^2 \cdot -67.6110 = y$$

x1	x2	x3	x1x2	x1x3	x2x3	x1x2x3	x1^2	x2^2	x3^2	y1	y2	y3	y_avg	s2{y}
-9.0	-4.0	-10.0	36.0	90.0	40.0	-360.0	81.0	16.0	100.0	198.0	202.0	195.0	198.33	8.22
-9.0	-4.0	5.0	36.0	-45.0	-20.0	180.0	81.0	16.0	25.0	193.0	193.0	204.0	196.67	26.89
-9.0	7.0	-10.0	-63.0	90.0	-70.0	630.0	81.0	49.0	100.0	200.0	196.0	192.0	196.0	10.67
-9.0	7.0	5.0	-63.0	-45.0	35.0	-315.0	81.0	49.0	25.0	198.0	204.0	195.0	199.0	14.0
7.0	-4.0	-10.0	-28.0	-70.0	40.0	280.0	49.0	16.0	100.0	195.0	198.0	200.0	197.67	4.22
7.0	-4.0	5.0	-28.0	35.0	-20.0	-140.0	49.0	16.0	25.0	196.0	198.0	204.0	199.33	11.56
7.0	7.0	-10.0	49.0	-70.0	-70.0	-490.0	49.0	49.0	100.0	204.0	203.0	198.0	201.67	6.89
7.0	7.0	5.0	49.0	35.0	35.0	245.0	49.0	49.0	25.0	192.0	192.0	205.0	196.33	37.56
8.72	1.5	-2.5	13.08	-21.8	-3.75	-32.7	76.04	2.25	6.25	194.0	194.0	204.0	197.33	22.22
-10.72	1.5	-2.5	-16.08	26.8	-3.75	40.2	114.92	2.25	6.25	195.0	195.0	193.0	194.33	0.89
-1.0	8.18	-2.5	-8.18	2.5	-20.45	20.45	1.0	66.91	6.25	195.0	203.0	195.0	197.67	14.22
-1.0	-5.18	-2.5	5.18	2.5	12.95	-12.95	1.0	26.83	6.25	195.0	192.0	198.0	195.0	6.0
-1.0	1.5	6.61	-1.5	-6.61	9.92	-9.92	1.0	2.25	43.69	195.0	197.0	204.0	198.67	14.89
-1.0	1.5	-11.61	-1.5	11.61	-17.42	17.42	1.0	2.25	134.79	194.0	192.0	204.0	196.67	27.56
-1.0	1.5	-2.5	-1.5	2.5	-3.75	3.75	1.0	2.25	6.25	199.0	202.0	202.0	201.0	2.0

Equation with naturalized coefficients :

$$x_1 \cdot -6.4416 + x_2 \cdot -32.3208 + x_3 \cdot 26.6530 + x_1 x_2 \cdot 1.8009 + x_1 x_3 \cdot -5.1166 + x_2 x_3 \cdot -5.1273 + x_1 x_2 x_3 \cdot 0.7264 + x_1^2 \cdot 3.0864 + x_2^2 \cdot 6.5513 + x_3^2 \cdot -1.8209 = y$$

Student's test

T = 2.0422724563012373

T_list = [0.07, 0.04, 0.0, 0.01, 0.04, 0.02, 0.1, 18.04, 18.06, 18.09]

Fixed beta_list = [0, 0, 0, 0, 0, 0, 3.09, 6.55, -1.82]

Equation without insignificant coefficients :

$$x_1 \cdot 0.0000 + x_2 \cdot 0.0000 + x_3 \cdot 0.0000 + x_1 x_2 \cdot 0.0000 + x_1 x_3 \cdot 0.0000 + x_2 x_3 \cdot 0.0000 + x_1 x_2 x_3 \cdot 0.0000 + x_1^2 \cdot 3.0864 + x_2^2 \cdot 6.5513 + x_3^2 \cdot -1.8209 = y$$

Fisher test

Fp = 2.328352915185639

Ft = 2.3343439648447806

The regression equation is adequate at the significance level 0.05

Висновки

Під час виконання лабораторної роботи було реалізовано завдання . Отримані результати збігаються , отже, експеримент було поставлено правильно.