# Министерство образования Республики Беларусь Учреждение образования «Брестский государственный технический университет» Кафедра ИИТ

# Аттестационная работа

по дисциплине: **Математическая статистика** Тема: Выборочный метод. Элементы теории корреляции

## Выполнил

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# Проверил

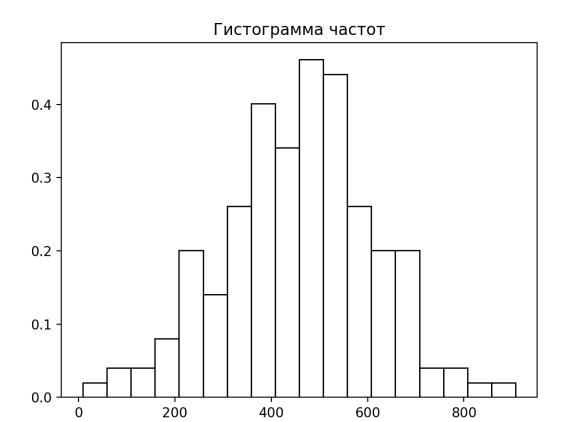
Юхимук Т. Ю.

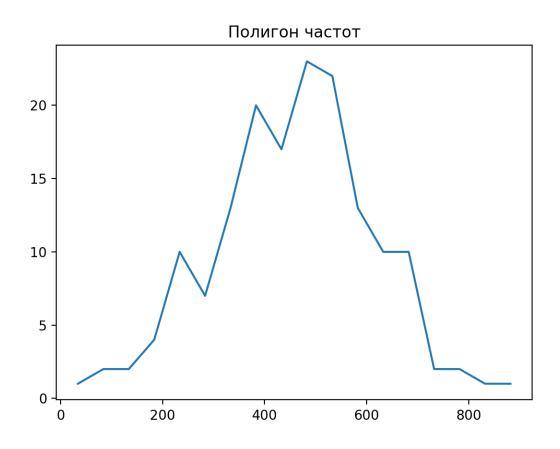
#### Задание 1 Изначальная выборка:

 $596.33\ 383.19\ 647.44\ 477.37\ 792.69\ 482.05\ 400.08\ 381.28\ 313.42\ 900.00\ 463.59\ 488.34$   $471.48\ 475.06\ 414.22\ 321.03\ 534.87\ 667.84\ 472.06\ 593.00\ 583.34\ 454.50\ 397.68\ 553.65$   $684.05\ 796.19\ 715.45\ 688.49\ 324.96\ 661.44\ 559.07\ 698.96\ 382.79\ 568.19\ 627.06\ 552.12$   $338.17\ 243.64\ 599.94\ 548.57\ 532.31\ 209.61\ 611.21\ 320.79\ 717.78\ 567.37\ 403.42\ 705.66$   $624.11\ 471.04\ 354.48\ 429.41\ 388.35\ 670.01\ 438.85\ 621.10\ 611.86\ 662.92\ 362.38\ 358.76$   $398.89\ 273.35\ 469.37\ 434.85\ 494.38\ 188.17\ 477.30\ 216.81\ 190.81\ 408.04\ 9.00\ 240.83$   $585.51\ 705.23\ 564.10\ 558.02\ 400.77\ 428.32\ 405.27\ 221.73\ 496.03\ 372.93\ 428.31\ 457.70$   $518.59\ 508.23\ 342.10\ 314.49\ 417.41\ 461.55\ 517.25\ 584.51\ 435.63\ 484.29\ 808.20\ 506.08$   $359.76\ 489.47\ 235.19\ 393.88\ 542.45\ 656.96\ 518.78\ 537.45\ 465.59\ 551.23\ 329.04\ 127.73$   $498.11\ 469.92\ 268.03\ 74.54\ 491.10\ 289.69\ 354.53\ 533.77\ 552.07\ 231.61\ 517.18\ 435.38$   $59.80\ 225.38\ 468.84\ 528.83\ 161.00\ 259.54\ 151.32\ 260.25\ 544.46\ 374.75\ 317.44\ 374.20$   $595.16\ 516.74\ 290.70\ 455.10\ 392.82\ 532.09\ 269.01\ 324.98\ 552.81\ 414.07\ 388.27\ 632.44$   $670.02\ 249.29\ 642.66\ 641.95\ 318.12\ 482.56\ 532.18\ 489.71\ 445.34\ 224.29\ 594.73\ 425.48$   $437.70\ 185.61\ 543.90\ 455.33$ 

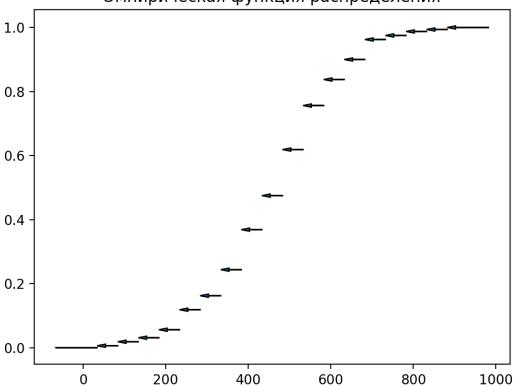
$$h = \frac{x_{\text{max}} - x_{\text{min}}}{1 + 3.322 \cdot \ln n} = 48.889$$

$[x_i$	$x_{i+1}$	$n_i$	$W_i$	$W_i/h_i$	F'(x)	$x_i$
9	58.889	1	0.006	0.020	0.006	33.945
58.889	108.778	2	0.013	0.040	0.019	83.834
108.778	158.667	2	0.013	0.040	0.031	133.722
158.667	208.556	4	0.025	0.080	0.056	183.612
208.556	258.445	10	0.062	0.200	0.119	233.500
258.445	308.334	7	0.044	0.140	0.162	283.389
308.334	358.223	13	0.081	0.261	0.244	333.279
358.223	408.112	20	0.125	0.401	0.369	383.168
408.112	458.001	17	0.106	0.341	0.475	433.057
458.001	507.890	23	0.144	0.461	0.619	482.946
507.890	557.779	22	0.138	0.441	0.756	532.835
557.779	607.668	13	0.081	0.261	0.837	582.724
607.668	657.557	10	0.062	0.200	0.900	632.612
657.557	707.446	10	0.062	0.200	0.962	682.502
707.446	757.335	2	0.013	0.040	0.975	732.390
757.335	807.224	2	0.013	0.040	0.987	782.280
807.224	857.113	1	0.006	0.020	0.994	832.168
857.113	907.002	1	0.006	0.020	1.000	882.058





#### Эмпирическая функция распределения



$$\bar{x}_s = 457.3773$$
 $\bar{D}_s = 24017.6150$ 
 $\sigma = 154.9761$ 
 $S^2 = 24168.6691$ 
 $S = 155.4627$ 

Задание 2 Доверительный интервал для мат ожидания:

$$\bar{x_s} - t \frac{s}{\sqrt{n}} < \bar{x_{tr}} < \bar{x_s} + t \frac{s}{\sqrt{n}}$$

$$t_{0.025;159} = 1.975$$

$$\bar{x_{tr}} \in (433.1038; 481.6509)$$

Доверительный интервал среднего квадратического отклонения генеральной

совокупности:

$$s \cdot q_1 < \sigma_{tr} < s \cdot q_2$$

$$q_1 = \sqrt{\frac{n-1}{\chi_{0.025;159}}}$$

$$q_2 = \sqrt{\frac{n-1}{\chi_{0.975;159}}}$$

$$\sigma_{tr} \in (142.0230; 170.7810)$$

$$(\alpha - 3\sigma; \alpha + 3\sigma) \approx (\bar{x}_s - 3s; \bar{x}_s + 3s) \approx (-9.0108; 923.7656)$$

Выборочные данные удовлетворяют правилу  $3\sigma$  нормального распределения.

$$p_i = P(x_{i-1} < X < x_i) = \Phi(\frac{x_i - \bar{x}}{\sigma}) - \Phi(\frac{x_{i-1} - \bar{x}}{\sigma})$$

$[x_i$	$x_{i+1}$	Частоты $n_i$	Выравнивающие частоты $n' = np_i$
9	58.889	1	0.505
58.889	108.778	2	1.149
108.778	158.667	2	2.355
158.667	208.556	4	4.356
208.556	258.445	10	7.272
258.445	308.334	7	10.954
308.334	358.223	13	14.889
358.223	408.112	20	18.261
408.112	458.001	17	20.211
458.001	507.890	23	20.185
507.890	557.779	22	18.191
557.779	607.668	13	14.793
607.668	657.557	10	10.856
657.557	707.446	10	7.188
707.446	757.335	2	4.295
757.335	807.224	2	2.316
807.224	857.113	1	1.127
857.113	907.002	1	0.495

Частоты $n_i$	Выравнивающие частоты $n' = np_i$	$(n_i'-n_i)/n_i'$
5	4.009	0.245
4	4.356	0.029
10	7.272	1.024
7	10.954	1.427
13	14.889	0.240
20	18.261	0.166
17	20.211	0.510
23	20.185	0.392
22	18.191	0.797
13	14.793	0.217
10	10.856	0.067
10	7.188	1.100
6	8.232	0.605

 $\chi^2_{watch} = \sum (n_i' - n_i)/n_i' = 6.8199$  Для уровня значимости  $\alpha = 0.05$  и k = 10 соответствует значение  $\chi^2_{crit} = 18.3070$ .

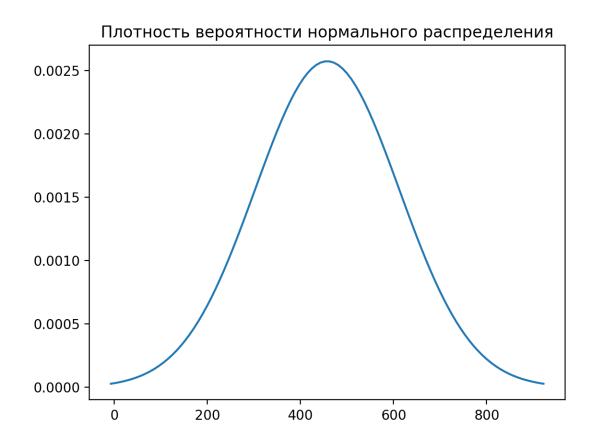
TT	l n		
Частоты	Эмпирическая	Теоретическая	Разности $ F'(x) - F(x) $
	функция распреде-	функция распреде-	
	ления $F'(x)$	ления $F(x)$	
1	0.006	0.005	0.001
2	0.019	0.012	0.007
2	0.031	0.027	0.004
4	0.056	0.054	0.002
10	0.119	0.100	0.019
7	0.162	0.168	0.006
13	0.244	0.261	0.017
20	0.369	0.375	0.007
17	0.475	0.502	0.027
23	0.619	0.628	0.009
22	0.756	0.741	0.015
13	0.837	0.834	0.004
10	0.900	0.902	0.002
10	0.962	0.947	0.016
2	0.975	0.974	0.001
2	0.987	0.988	0.001
1	0.994	0.995	0.001
1	1.000	0.998	0.002

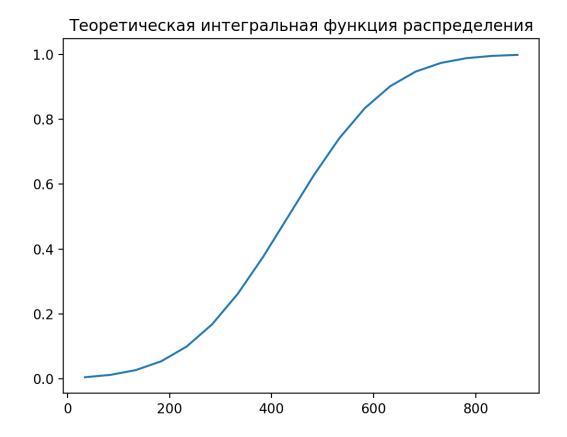
$$\lambda_{watch} = \sqrt{n} \cdot \max_{x} |F'(x) - F(x)| = 0.3365$$
$$\lambda_{crit} = 1.36$$

Так как:

$$\chi_{watch}^2 < \chi_{crit}^2 \lambda_{watch} < \lambda_{crit}$$

Нет оснований отвергать гипотезу о нормальном распределении.





Задание 3 Для начала нужно заполнить таблицы:

	Y	18.500	19.700	20.900	22.100	23.300	24.500	25.700	26.900
X	u	-3.500	-2.500	-1.500	-0.500	0.500	1.500	2.500	3.500
12.500	-2.500	4	8	6					
20	-1.500		7	14	8				
27.500	-0.500				15	13	7		
35	0.500				9	18	9	6	
42.500	1.500						9	5	1
50	2.500							6	3

$n_i$	$n_i u_i$	$\sum n_{ij}v_j$	$n_i u_i^2$	$u_i \sum n_{ij} v_j$
18	-45	-43	112.500	107.500
29	-43.500	-42.500	65.250	63.750
35	-17.500	9.500	8.750	-4.750
42	21	33.000	10.500	16.500
15	22.500	29.500	33.750	44.250
9	22.500	25.500	56.250	63.750

$m_i$	$m_i v_i$	$\sum n_{ij}u_i$	$m_j v_j^2$	$v_j \sum n_{ij} u_i$
-3.500	-14.000	-10	49.000	35.000
-2.500	-37.500	-30.500	93.750	76.250
-1.500	-30.000	-36	45.000	54.000
-0.500	-16.000	-15	8.000	7.500
0.500	15.500	2.500	7.750	1.250
1.500	37.500	14.500	56.250	21.750
2.500	42.500	25.500	106.250	63.750
3.500	14.000	9	49.000	31.500

Выборочные средние Х и У:

$$\bar{u} = \frac{\sum n_i u_i}{n} = -0.2702$$

$$\bar{v} = \frac{\sum m_j v_j}{n} = 0.0810$$

$$\bar{x} = 29.2229$$

$$\bar{y} = 22.7972$$

Дисперсии признаков Х и У:

$$\sigma_u = \sqrt{\bar{u^2} - (\bar{u})^2} = 1.3660$$

$$\sigma_v = \sqrt{\bar{v^2} - (\bar{v})^2} = 1.6725$$

$$\sigma_x = \sigma_u h_x = 10.2455$$

$$\sigma_y = \sigma_v h_y = 2.0070$$

Таблицы условных средних:

X	12.500	20	27.500	35	42.500	50
$\bar{x_y}$	19.833	20.941	23.026	23.643	25.060	26.100

Y	18.500	19.700	20.900	22.100	23.300	24.500	25.700	26.900
$\bar{y_x}$	12.500	16	17.750	27.734	31.855	35.600	42.500	48.125

Коэффициент корреляции признаков X и Y совпадает с коэффициентом корреляции условных вариант:

$$r = \frac{1}{\sigma_u \sigma_v} \left( \frac{\sum n_{ij} u_i v_j}{n} - \bar{u}\bar{v} \right) = 0.9328$$

Следовательно коэффициент детерминации  $r^2=0.8701$ . Значит 87% рассеивания зависимой переменной объясняется линейной регрессией Y на X.

$$\sigma_{\bar{x}}^{2} = \sqrt{\frac{1}{n} \sum (\bar{x}_{i} - \bar{x})^{2} n_{i}} = 9.0427$$

$$\sigma_{\bar{y}} = \sqrt{\frac{1}{n} \sum (\bar{y}_{i} - \bar{y})^{2} n_{i}} = 1.7722$$

$$\eta_{Y/X} = \frac{\sigma_{\bar{y}}}{\sigma_{y}} = 0.88299$$

$$\eta_{Y/X} = \frac{\sigma_{\bar{x}}}{\sigma_{x}} = 0.88260$$

Эмпирическая линейная регрессия Y на X:

$$\bar{y}_x - \bar{y} = b_1(x - \bar{x})$$

$$b = r \frac{\sigma_y}{\sigma_x} = 0.1827$$

$$y - 22.7972 = 0.1827(x - 29.2229)$$

$$y = 0.1827x + 17.4586$$

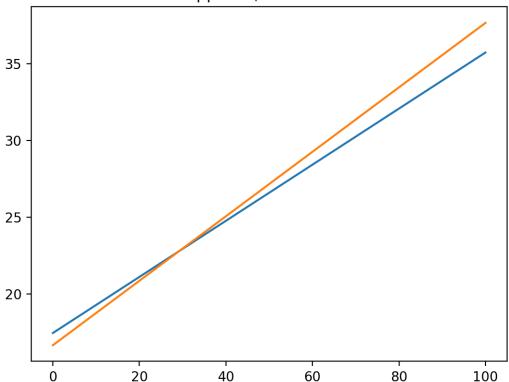
Эмпирическая линейная регрессия X на Y:

$$\bar{x}_y - \bar{x} = a(y - \bar{y})$$

$$a = r \frac{\sigma_x}{\sigma_y} = 4.7617$$

$$x - 29.2229 = 4.7617(y - 22.7972)$$

#### Корреляционное поле



95% доверительный интервал для коэффициентов регрессии. Если уравнение имеет вид  $\bar{y}_x = b_0 + b_1 x$ , то  $b_0 \in (-0.1754; 0.5409)$ , а  $b_1 \in (17.4456; 17.8154)$  Для оценки значимости выборочного коэффициента вычислим:

$$t_{watch} = r\sqrt{\frac{n-2}{1-r^2}} = 31.2775$$
$$t_{crit} = 1.98$$
$$t_{watch} > t_{crit}$$

Нулевую гипотезу отвергаем. Коэффициент корреляции значимо отличается от нуля.

### data.py

```
import numpy as np
1
2
   initArray = np.sort(
3
4
       np.array(
5
6
               596.33, 383.19, 647.44, 477.37, 792.69, 482.05, 400.08,
7
               381.28, 313.42, 900.00, 463.59, 488.34, 471.48,
               414.22, 321.03, 534.87, 667.84, 472.06, 593.00, 583.34,
8
9
               454.50, 397.68, 553.65, 684.05, 796.19, 715.45, 688.49,
               324.96, 661.44, 559.07, 698.96, 382.79, 568.19,
10
                                                                 627.06,
               552.12, 338.17, 243.64, 599.94, 548.57, 532.31,
11
               611.21, 320.79, 717.78, 567.37, 403.42, 705.66,
12
13
               471.04, 354.48, 429.41, 388.35, 670.01, 438.85, 621.10,
               611.86, 662.92, 362.38, 358.76, 398.89, 273.35,
14
                                                                 469.37,
               434.85, 494.38, 188.17, 477.30, 216.81, 190.81,
15
```

```
9.00, 240.83, 585.51, 705.23, 564.10, 558.02, 400.77,
16
17
               428.32, 405.27, 221.73, 496.03, 372.93, 428.31, 457.70,
               518.59, 508.23, 342.10, 314.49, 417.41, 461.55, 517.25,
18
               584.51, 435.63, 484.29, 808.20, 506.08, 359.76, 489.47,
19
20
               235.19, 393.88, 542.45, 656.96, 518.78, 537.45, 465.59,
               551.23, 329.04, 127.73, 498.11, 469.92, 268.03, 74.54,
21
22
               491.10, 289.69, 354.53, 533.77, 552.07, 231.61, 517.18,
23
               435.38, 59.80, 225.38, 468.84, 528.83, 161.00, 259.54,
               151.32, 260.25, 544.46, 374.75, 317.44, 374.20, 595.16,
24
25
               516.74, 290.70, 455.10, 392.82, 532.09, 269.01, 324.98,
26
               552.81, 414.07, 388.27, 632.44, 670.02, 249.29, 642.66,
27
               641.95, 318.12, 482.56, 532.18, 489.71, 445.34, 224.29,
               594.73, 425.48, 437.70, 185.61, 543.90, 455.33
28
29
           ]
30
       )
31
  )
```

#### task.py

```
1 from scipy import *
2 from scipy import stats
3
4 from data import initArray
5 import matplotlib.pyplot as plt
6 import numpy as np
7 from latextable import *
8
9
10 def task():
11
       n = initArray.size
12
       step = (initArray.max() - initArray.min()) / (1 + 3.322 * np.log())
      initArray.size))
13
       step = np.round(step, 3)
14
       intervals = create_intervals(step)
15
       intervalMiddles = create_interval_middles(intervals)
       frequencies = create_frequencies(intervals)
16
       relativeFrequencies = np.array([x / initArray.size for x in
17
      frequencies])
18
       frequenciesOfDensities = np.array([x / step for x in frequencies
      ])
19
       distributionFunction = create_distribution_function(
      relativeFrequencies)
       Exini = np.sum(np.array([intervalMiddles[i] * frequencies[i] for
20
      i in range(intervalMiddles.size)]))
       Exi2ni = np.sum(np.array([(intervalMiddles[i] ** 2) * frequencies
21
      [i] for i in range(intervalMiddles.size)]))
22
       En = np.sum(frequencies)
23
       X = Exini / En
24
       D = (Exi2ni / En) - (X ** 2)
25
       sigma = D ** 0.5
26
       S2 = En / (En - 1) * D
27
       S = S2 ** 0.5
28
29
       a = 0.05
30
31
       t = 1.975
```

```
32
       alpha = (X - t * S / (n ** 0.5), X + t * S / (n ** 0.5))
33
       print("Доверительный интервал alpha:", alpha)
34
       delta = (np.sqrt((n - 1) / stats.chi2.ppf((1 - a)/2, df=n)) * S,
      np.sqrt((n - 1) / stats.chi2.ppf(a / 2, df=n)) * S)
35
       print("Доверительный интервал delta:", delta)
36
37
       laplassianAplphas = np.array([(intervals[i] - X) / sigma for i in
       range(intervals.size)])
       laplassians = np.array(
38
           [laplas_integral(laplassianAplphas[i]) - laplas_integral(
39
      laplassianAplphas[i - 1])
40
            for i in range(1, intervals.size)])
41
42
       npi = np.array([x * n for x in laplassians])
43
       merge_config = create_merge_config(5, frequencies)
44
       mergedFrequencies = merge_limits(merge_config, frequencies)
       mergedNpi = merge_limits(merge_config, npi)
45
46
47
       niNpiDeltas = np.array([mergedNpi[i] - mergedFrequencies[i] for i
       in range(mergedNpi.size)])
       niNpiSquaredDeltas = np.array([(mergedNpi[i] - mergedFrequencies[
48
      i]) ** 2 for i in range(mergedNpi.size)])
       niNpiSquaredDividedDeltas = np.array([niNpiSquaredDeltas[i] /
49
      mergedNpi[i] for i in range(mergedNpi.size)])
50
51
       xSquaredWatched = np.sum(niNpiSquaredDividedDeltas)
52
       k = niNpiDeltas.size - 2 - 1
53
54
       print("k =", k)
55
       X2Crit = stats.chi2.ppf(1 - a, df=k)
       print("X^2Watched =", xSquaredWatched)
56
       \label{eq:continuous} \mbox{print("X^2Crit =", X2Crit, xSquaredWatched < X2Crit)}
57
58
59
       hypotheticalFunction = np.array([laplas_integral(
      laplassianAplphas[i]) for i in range(1, laplassianAplphas.size)])
60
       hypotheticalDistributionFunctionDifferences = np.array(
61
           [np.abs(distributionFunction[i] - hypotheticalFunction[i])
62
            for i in range(distributionFunction.size)])
63
       maxDifference = np.max(
      hypotheticalDistributionFunctionDifferences)
64
       print(hypotheticalFunction)
65
       print(distributionFunction)
66
67
       lambdaWatched = (n ** 0.5) * maxDifference
68
       print("lambdaWatched =", lambdaWatched)
69
       lambdaCrit = 1.36
       print("lambdaCrit =", lambdaCrit, lambdaWatched < lambdaCrit)</pre>
70
71
72
       print(X - 3*S, X + 3 * S)
73
74
       def print_values1():
75
           print(f"XB = {X}")
76
           print(f"DB = {D}")
           print(f"DB ^{\circ} 0.5 = {D ** 0.5}")
77
           print(f"S ^ 2 = {S2}")
78
           print(f"S = {S}")
79
```

```
80
81
        def draw_graphs1():
82
            plt.figure(dpi=200)
83
            plt.bar(intervalMiddles, frequenciesOfDensities, width=step,
      edgecolor="black", color='white')
84
            plt.title('Гистограмма частот')
85
            plt.savefig("gr11.png")
86
87
            plt.figure(dpi=200)
            plt.plot(intervalMiddles, frequencies)
88
            plt.title('Полигон частот')
89
90
            plt.savefig("gr12.png")
91
92
            plt.figure(dpi=200)
            x = np.insert(intervalMiddles, 0, [intervalMiddles[0] - 100])
93
94
            x = np.append(x, [intervalMiddles[-1] + 100])
            y = np.insert(distributionFunction, 0, [0])
95
            plt.title('Эмпирическая функция распределения')
96
97
            for i in range(1, y.size):
                plt.arrow(x[i + 1], y[i], x[i] - x[i + 1] + 20, 0,
98
      head_width=0.01, head_length=20)
99
            plt.arrow(x[1], y[0], x[0] - x[1], 0)
100
            plt.savefig("gr13.png")
101
102
        def draw_graphs2():
103
            plt.figure(dpi=200)
104
            plt.title('Плотность вероятности нормального распределения')
            x = np.linspace(X - 3 * sigma, X + 3 * sigma, 100)
105
            plt.plot(x, stats.norm.pdf(x, X, sigma))
106
107
            plt.savefig("gr21.png")
108
109
            plt.figure(dpi=200)
            plt.title('Теоретическая интегральная функция распределения')
110
111
            plt.plot(intervalMiddles, hypotheticalFunction)
            plt.savefig("gr22.png")
112
113
114
        def print_tables1():
115
            table = Texttable()
            table.set_cols_align(["1", "1", "1", "1", "1", "1", "1"])
116
            table.header(['start', 'end', 'ni', 'Wi', 'Wi / h', 'F\'(x)',
117
        'xi'])
            for i in range(intervalMiddles.size):
118
                table.add_row(
119
120
                     [intervals[i], intervals[i + 1], frequencies[i],
      relativeFrequencies[i],
121
                      frequenciesOfDensities[i], distributionFunction[i],
      intervalMiddles[i]])
122
            print(draw_latex(table))
123
124
        def print_tables2():
            table = Texttable()
125
            table.set_cols_align(["1", "1", "1", "1"])
126
            table.header(['start', 'end', 'ni', 'n\' = npi'])
127
            for i in range(intervalMiddles.size):
128
                table.add_row(
129
                     [intervals[i], intervals[i + 1], frequencies[i], npi[
130
```

```
i]])
131
            print(draw_latex(table))
132
133
            table = Texttable()
            table.set_cols_align(["1", "1", "1"])
134
            table.header(['Частоты', 'Выравнивающие частоты', '(n\'i - ni
135
       ) / n\'i'])
            for i in range(mergedFrequencies.size):
136
137
                table.add_row(
                     [mergedFrequencies[i], mergedNpi[i],
138
       niNpiSquaredDividedDeltas[i]])
            print(draw_latex(table))
139
140
141
            table = Texttable()
            table.set_cols_align(["1", "1", "1", "1"])
142
143
            table.header(
                 ['Частоты', 'Эмпирическая функция распределения', 'Теорет
144
      ическая функция распределения', 'Разности'])
            for i in range(intervalMiddles.size):
145
146
                table.add_row(
                     [frequencies[i], distributionFunction[i],
147
      hypotheticalFunction[i],
148
                      hypotheticalDistributionFunctionDifferences[i]])
            print(draw_latex(table))
149
150
151
        print_values1()
152
        print_tables1()
        draw_graphs1()
153
        draw_graphs2()
154
155
        print_tables2()
156
157
   def create_merge_config(count: int, array: np.ndarray) -> []:
158
159
        left = 0
        right = 0
160
161
        acc = 0
162
        for i in range(array.size):
163
            acc += array[i]
164
            if acc >= count:
165
                left = i + 1
166
                break
167
        acc = 0
        for i in reversed(range(array.size)):
168
            acc += array[i]
169
170
            if acc >= count:
171
                right = i
172
                break
173
        return [left, right]
174
175
176 def merge_limits(config: [], arr: np.ndarray):
        arr = np.split(arr, config)
177
        return np.array([np.sum(arr[0]), *arr[1], np.sum(arr[2])])
178
179
180
   def laplas_integral(x: float) -> float:
```

```
182
        return stats.norm.cdf(x)
183
184
185
   def gaussian(x: float) -> float:
186
        return 1 / np.sqrt(2 * np.pi) * np.exp(-x ** 2 / 2)
187
188
189 def create_frequencies(intervals: np.ndarray) -> np.ndarray:
        frequencies = np.zeros(intervals.size - 1)
190
        for i in range(intervals.size - 1):
191
            if i == intervals.size - 1:
192
193
                ni = np.count_nonzero((initArray >= intervals[i]) & (
       initArray <= intervals[i + 1]))</pre>
194
            else:
195
                ni = np.count_nonzero((initArray >= intervals[i]) & (
       initArray < intervals[i + 1]))</pre>
            frequencies[i] = ni
196
197
        return frequencies
198
199
200 def create_intervals(step: float) -> np.ndarray:
        intervals = np.array([initArray.min()])
201
202
        while intervals.max() < initArray.max():</pre>
            intervals = np.append(intervals, intervals.max() + step)
203
204
        return intervals
205
206
207 def create_interval_middles(intervals: np.ndarray) -> np.ndarray:
        intervalMiddles = np.zeros(intervals.size - 1)
208
        for i in range(intervals.size - 1):
209
            intervalMiddles[i] = (intervals[i] + intervals[i + 1]) / 2
210
211
        return intervalMiddles
212
213
214 def create_distribution_function(relative_frequencies: np.ndarray) ->
       np.ndarray:
215
        distributionFunction = np.zeros(relative_frequencies.size)
        distributionFunction[0] = relative_frequencies[0]
216
        for i in range(1, relative_frequencies.size):
217
            distributionFunction[i] = distributionFunction[i - 1] +
218
      relative_frequencies[i]
        return distributionFunction
219
220
221
222 if __name__ == "__main__":
223
        task()
```

#### task3.py

```
1 import matplotlib.pyplot as plt
2 import numpy as np
3 from latextable import draw_latex
4 from scipy import stats
5 from texttable import Texttable
6
7 matrix = np.asarray([
```

```
8
       [4, 8, 6, 0, 0, 0, 0, 0],
9
       [0, 7, 14, 8, 0, 0, 0, 0],
       [0, 0, 0, 15, 13, 7, 0, 0],
10
11
       [0, 0, 0, 9, 18, 9, 6, 0],
12
       [0, 0, 0, 0, 0, 9, 5, 1],
13
       [0, 0, 0, 0, 0, 0, 6, 3],
14 ])
15
16 \text{ stepX} = 7.5
17 \text{ stepY} = 1.2
18
19
20 def task():
21
       n = np.sum(matrix)
22
       xAxis = create_axis(12.5, stepX, 6)
23
       yAxis = create_axis(18.5, stepY, 8)
24
       Ui = np.array((xAxis - np.average(xAxis)) / stepX)
25
       Vj = np.array((yAxis - np.average(yAxis)) / stepY)
26
       Ni = np.array(matrix.sum(1)).flatten()
27
       Mj = np.array(matrix.sum(0)).flatten()
28
       NiUi = np.array(Ni * Ui)
29
       MjVj = np.array(Mj * Vj)
30
       sumNijVj = np.zeros(matrix.shape[0])
31
32
       for i in range(matrix.shape[0]):
           for j in range(matrix.shape[1]):
33
34
                sumNijVj[i] += Vj[j] * matrix.item((i, j))
35
36
       sumNijUi = np.zeros(matrix.shape[1])
37
       for i in range(matrix.shape[0]):
38
           for j in range(matrix.shape[1]):
39
                sumNijUi[j] += Ui[i] * matrix.item((i, j))
40
41
       MjVjpow2 = np.array(Mj * (Vj ** 2))
42
       NiUipow2 = np.array(Ni * (Ui ** 2))
43
44
       UiSumNijVj = np.array(sumNijVj * Ui)
45
       ViSumNijUi = np.array(sumNijUi * Vj)
46
47
       barU = NiUi.sum() / n
48
       barV = MjVj.sum() / n
49
50
       barX = np.average(xAxis) + stepX * barU
       barY = np.average(yAxis) + stepY * barV
51
52
53
       sigmaU = (NiUipow2.sum() / n - barU ** 2) ** 0.5
54
       sigmaV = (MjVjpow2.sum() / n - barV ** 2) ** 0.5
55
56
       sigmaX = sigmaU * stepX
57
       sigmaY = sigmaV * stepY
58
59
       rSquare = 1 / (sigmaU * sigmaV) * (UiSumNijVj.sum() / n - barU *
      barV)
60
       r = rSquare ** 0.5
61
62
       barYs = np.array([(matrix[i:i + 1] * yAxis).sum() / matrix[i:i +
```

```
1].sum() for i in range(matrix.shape[0])])
63
        barXs = np.array(
            [(matrix[:, i:i + 1].flatten() * xAxis).sum() / matrix[:, i:i
64
       + 1].sum() for i in range(matrix.shape[1])])
65
        sigmaBarX = ((1 / n) * np.sum(Mj * (barXs - barX) ** 2)) ** 0.5
66
67
        sigmaBarY = ((1 / n) * np.sum(Ni * (barYs - barY) ** 2)) ** 0.5
68
69
        NuyYtoX = sigmaBarY / sigmaY
70
        NuyXtoY = sigmaBarX / sigmaX
71
72
        XtoYRegressionA = r * sigmaX / sigmaY
73
        YtoXRegressionB = r * sigmaY / sigmaX
74
75
        BO = YtoXRegressionB
76
        B1 = barY - barX * YtoXRegressionB
77
        a = 0.05
78
        t = 1.98
79
        sigmaYX = (n * sigmaY ** 2 * (1 - rSquare) / (n - 2)) ** 0.5
80
        bigSquareRoot = (1 / sigmaX) * ((sigmaX ** 2 + barX ** 2) / n) **
       0.5
81
        bigSquareRoot2 = 1 / (sigmaX * n ** 0.5)
82
        BOInterval = (BO - t * sigmaYX * bigSquareRoot, BO + t * sigmaYX
      * bigSquareRoot)
83
        B1Interval = (B1 - t * sigmaYX * bigSquareRoot2, B1 + t * sigmaYX
       * bigSquareRoot)
84
85
        TWatch = r * ((n - 2) / (1 - rSquare)) ** 0.5
86
87
        TCrit = 1.984
88
89
        print('barU', barU)
90
        print('barV', barV)
        print('barX', barX)
91
        print('barY', barY)
92
93
        print('sigmaU', sigmaU)
94
        print('sigmaV', sigmaV)
95
        print('sigmaX', sigmaX)
96
        print('sigmaY', sigmaY)
97
        print('r', r)
98
        print('rSquare', rSquare)
99
        print('sigmaBarX', sigmaBarX)
100
        print('sigmaBarY', sigmaBarY)
        print('NuyYtoX', NuyYtoX)
101
102
        print('NuyXtoY', NuyXtoY)
103
        print('sigmaBarX', sigmaBarX)
104
        print('sigmaBarY', sigmaBarY)
105
        print('XtoYRegressionA', XtoYRegressionA)
106
        print('YtoXRegressionB', YtoXRegressionB)
107
        print('B0', B0)
        print('B1', B1)
108
109
        print('t', t)
        print('sigmaYX', sigmaYX)
110
        print('bigSquareRoot', bigSquareRoot)
111
        print('bigSquareRoot2', bigSquareRoot2)
112
113
        print('B0Interval', B0Interval)
```

```
114
        print('B1Interval', B1Interval)
115
        print('Twatch', TWatch)
        print('TCrit', TCrit, TWatch < TCrit)</pre>
116
117
118
        def draw_correlation_field():
            plt.figure(dpi=200)
119
120
            plt.title('Корреляционное поле')
121
            x = np.linspace(0, 100, 2)
122
123
            y1 = (x - barX) * YtoXRegressionB + barY
124
125
            plt.plot(x, y1)
126
127
            y2 = (x - barX) / XtoYRegressionA + barY
128
            plt.plot(x, y2)
129
130
            plt.savefig("gr31.png")
131
132
        def print_tables():
133
            table = Texttable()
            table.set_cols_align(["1"] * (matrix.shape[1] + 2))
134
            table.add_row(['~', '~', *yAxis])
table.add_row(['~', '~', *Vj])
135
136
            for i in range(Ui.size):
137
                 table.add_row(
138
                      [xAxis[i], Ui[i], *matrix[i]])
139
140
            print(draw_latex(table))
141
142
            table = Texttable()
            table.set_cols_align(["1"] * 5)
143
            table.add_row(['n_{i}', 'n_{i}u_{i}', 'sum', 'a', 'a'])
144
145
            for i in range(Ui.size):
                 table.add_row(
146
147
                      [Ni[i], NiUi[i], sumNijVj[i], NiUipow2[i], UiSumNijVj
       [i]]
                 )
148
149
            print(draw_latex(table))
150
            table = Texttable()
151
            table.set_cols_align(["1"] * 5)
152
            table.add_row(['m_{i}', 'm_{i}v_{i}', 'sum', 'a', 'a'])
153
            for i in range(Vj.size):
154
155
                 table.add_row(
                     [Vj[i], MjVj[i], sumNijUi[i], MjVjpow2[i], ViSumNijUi
156
       [i]]
157
            print(draw_latex(table))
158
159
            table = Texttable()
160
            table.set_cols_align(["1"] * (xAxis.size + 1))
161
            table.add_row(['$X$', *xAxis])
162
            table.add_row(['$\\bar{x_y}$', *barYs])
163
            print(draw_latex(table))
164
165
            table = Texttable()
166
            table.set_cols_align(["1"] * (yAxis.size + 1))
167
```

```
168
             table.add_row(['$Y$', *yAxis])
             table.add_row(['$\\bar{y_x}$', *barXs])
169
             print(draw_latex(table))
170
171
172
        print_tables()
173
174 def create_axis(start: float, step: float, count: int) -> np.ndarray:
175
        result = np.zeros(count)
176
        for i in range(count):
177
             result[i] = start + step * i
178
        return result
179
180 \text{ if } \_\_name\_\_ == "\_\_main\_\_":
181
        task()
```