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**ITMO UNIVERSITY**

**Вариант №15**  
**Лабораторная работа №4**  
по дисциплине  
**Вычислительная математика**

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# Содержание

<b>1</b>	<b>Цель работы:</b>	<b>3</b>
<b>2</b>	<b>Порядок выполнения работы:</b>	<b>3</b>
2.1	Методика проведения исследования: . . . . .	3
2.2	Программная реализация задачи: . . . . .	3
2.3	Вычислительная реализация задачи: . . . . .	3
<b>3</b>	<b>Рабочие формулы используемых методов.</b>	<b>4</b>
<b>4</b>	<b>Вычислительная реализация задачи:</b>	<b>4</b>
4.1	Линейная аппроксимация . . . . .	4
4.2	Квадратичная аппроксимация . . . . .	5
4.3	Наилучшее приближение . . . . .	6
4.4	Графики функций . . . . .	6
<b>5</b>	<b>Листинг программы, по крайней мере, коды используемых методов.</b>	<b>6</b>
<b>6</b>	<b>Результаты выполнения программы при различных исходных данных.</b>	<b>11</b>
<b>7</b>	<b>Выводы</b>	<b>28</b>

## 1 Цель работы:

Найти функцию, являющуюся наилучшим приближением заданной табличной функции по методу наименьших квадратов.

## 2 Порядок выполнения работы:

### 2.1 Методика проведения исследования:

1. Вычислить меру отклонения:  $S = \sum_{i=1}^n [\varphi(x_i) - y_i]^2$  для всех исследуемых функций;
2. Уточнить значения коэффициентов эмпирических функций, минимизируя функцию S;
3. Сформировать массивы предполагаемых эмпирических зависимостей  $\phi(x_i)$ ;
4. Определить среднеквадратичное отклонение для каждой аппроксимирующей функции. Выбрать наименьшее значение и, следовательно, наилучшее приближение;
5. Построить графики полученных эмпирических функций.

### 2.2 Программная реализация задачи:

1. Предусмотреть ввод исходных данных из файла/консоли (таблица  $y = f(x)$  должна содержать от 8 до 12 точек);
2. Реализовать метод наименьших квадратов, исследуя все указанные функции;
3. Предусмотреть вывод результатов в файл/консоль: коэффициенты аппроксимирующих функций, среднеквадратичное отклонение, массивы значений  $x_i, y_i, \varphi(x_i), \varepsilon_i$ ;
4. Для линейной зависимости вычислить коэффициент корреляции Пирсона;
5. Программа должна отображать наилучшую аппроксимирующую функцию;
6. Организовать вывод графиков функций, графики должны полностью отображать весь исследуемый интервал (с запасом);
7. Программа должна быть протестирована при различных наборах данных, в том числе и некорректных;

### 2.3 Вычислительная реализация задачи:

1. Сформировать таблицу табулирования заданной функции на указанном интервале (см. табл. 1)
2. Построить линейное и квадратичное приближения по 11 точкам заданного интервала;
3. Найти среднеквадратичные отклонения для каждой аппроксимирующей функции. Ответы дать с тремя знаками после запятой;
4. Выбрать наилучшее приближение;

5. Построить графики заданной функции, а также полученные линейное и квадратичное приближения;
6. Привести в отчете подробные вычисления.

### 3 Рабочие формулы используемых методов.

Линейная функция:

$$\varphi(x, a, b) = ax + b$$

Квадратичная функция:

$$\varphi(x, a_0, a_1, a_2) = a_0 + a_1x + a_2x^2$$

Степенная функция:

$$\varphi(x) = ax^b$$

Экспоненциальная функция:

$$\varphi(x) = ae^{bx}$$

Логарифмическая функция:

$$\varphi(x) = a \ln(x) + b$$

Коэффициент корреляции Пирсона:

$$r = \frac{\sum_{i=1}^n (x_i - \bar{x})(y_i - \bar{y})}{\sqrt{\sum_{i=1}^n (x_i - \bar{x})^2 \sum_{i=1}^n (y_i - \bar{y})^2}}$$

Среднеквадратичное отклонение:

$$\delta = \sqrt{\frac{\sum_{i=1}^n (\varphi(x_i) - y_i)^2}{n}}$$

### 4 Вычислительная реализация задачи:

$$y = \frac{4x}{x^4 + 15}$$

#### 4.1 Линейная аппроксимация

X	-2	-1.8	-1.6	-1.4	-1.2	-1	-0.8	-0.6	-0.4	-0.2	0
Y	-0.258	-0.282	-0.297	-0.297	-0.281	-0.250	-0.208	-0.159	-0.106	-0.053	0.000

$$SX = -11$$

$$SXX = 15.4$$

$$SY = -2.192$$

$$SXY = 2.818$$

$$\Delta = 48.4$$

$$\Delta_1 = 6.883$$

$$\begin{aligned}\Delta_2 &= -2.761 \\ a &= \frac{\Delta_1}{\Delta} = \frac{6.883}{48.4} \approx 0.142 \\ b &= \frac{\Delta_2}{\Delta} = \frac{-2.761}{48.4} \approx -0.057 \\ P(x) &= 0.142x - 0.057\end{aligned}$$

X	-2	-1.8	-1.6	-1.4	-1.2	-1	-0.8	-0.6	-0.4	-0.2	0
Y	-0.258	-0.282	-0.297	-0.297	-0.281	-0.250	-0.208	-0.159	-0.106	-0.053	0.000
ax+b	-0.341	-0.313	-0.285	-0.256	-0.228	-0.199	-0.171	-0.142	-0.114	-0.085	-0.057
$\varepsilon$	-0.083	-0.031	0.012	0.041	0.053	0.051	0.037	0.016	-0.007	-0.032	-0.057
S	0.007	0.001	0.000	0.002	0.003	0.003	0.001	0.000	0.000	0.001	0.003
$\delta$	0.044										

## 4.2 Квадратичная аппроксимация

X	-2	-1.8	-1.6	-1.4	-1.2	-1	-0.8	-0.6	-0.4	-0.2	0
Y	-0.258	-0.282	-0.297	-0.297	-0.281	-0.250	-0.208	-0.159	-0.106	-0.053	0.000

n	11.000
SX	-11.000
S2X	15.400
S3X	-24.200
S4X	40.533
SY	-2.192
SXY	2.818
S2XY	-4.154

$$\begin{cases} a_0 n + a_1 \sum_{i=1}^n x_i + a_2 \sum_{i=1}^n x_i^2 = \sum_{i=1}^n y_i \\ a_0 \sum_{i=1}^n x_i + a_1 \sum_{i=1}^n x_i^2 + a_2 \sum_{i=1}^n x_i^3 = \sum_{i=1}^n x_i y_i \\ a_0 \sum_{i=1}^n x_i^2 + a_1 \sum_{i=1}^n x_i^3 + a_2 \sum_{i=1}^n x_i^4 = \sum_{i=1}^n x_i^2 y_i \end{cases} = \begin{cases} a_0(11) + a_1(-11) + a_2(15.4) = (-2.192) \\ a_0(-11) + a_1(15.4) + a_2(-24.2) = (2.818) \\ a_0(15.4) + a_1(-24.2) + a_2(40.533) = (-4.154) \end{cases}$$

$$\begin{aligned}a_0 &= 0.016 \\ a_1 &= 0.384 \\ a_2 &= 0.121\end{aligned}$$

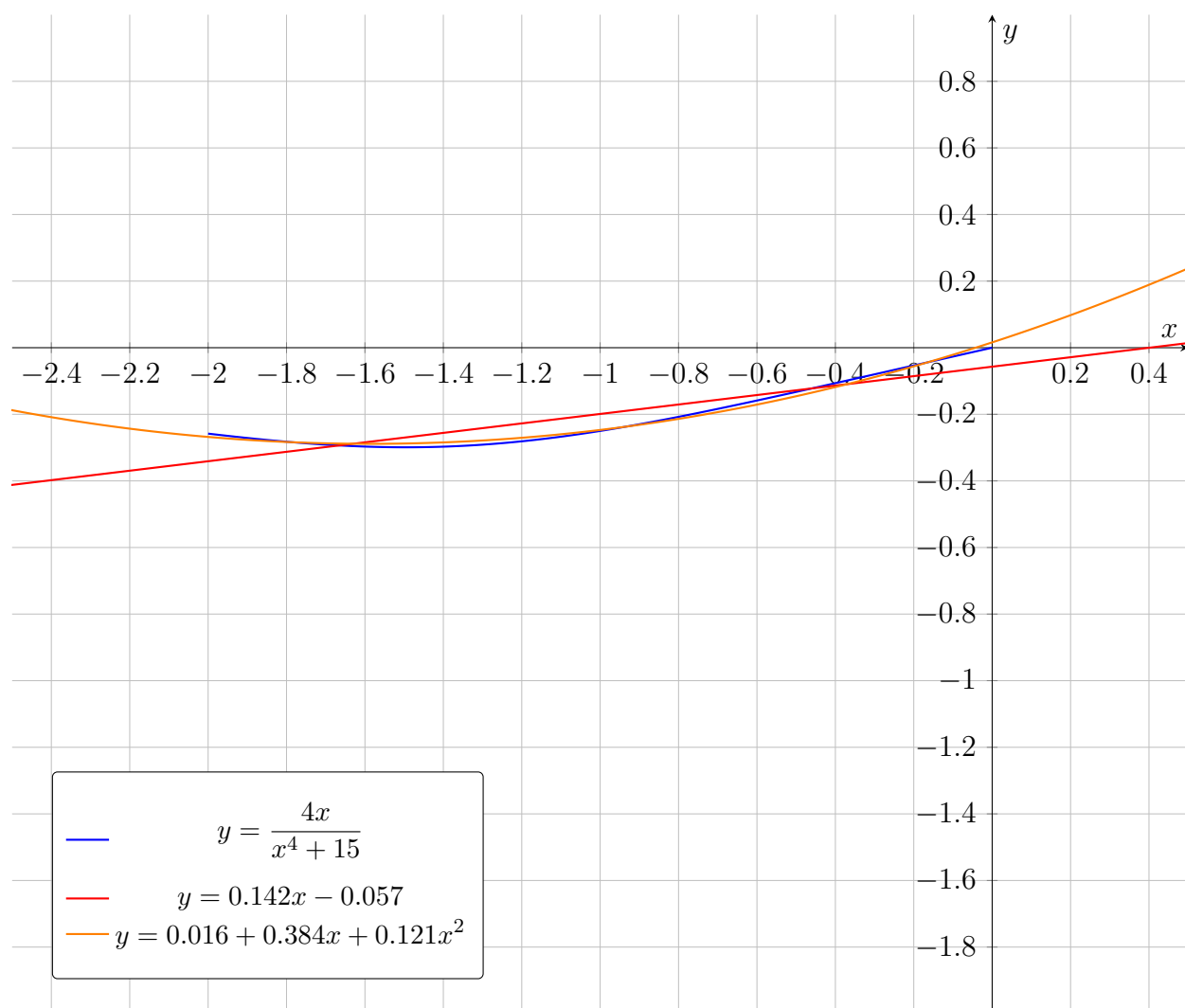
$$P(x) = 0.016 + 0.384x + 0.121x^2$$

X	-2	-1.8	-1.6	-1.4	-1.2	-1	-0.8	-0.6	-0.4	-0.2	0
Y	-0.258	-0.282	-0.297	-0.297	-0.281	-0.250	-0.208	-0.159	-0.106	-0.053	0.000
$a_0 + a_1x + a_2x^2$	-0.269	-0.284	-0.289	-0.285	-0.271	-0.248	-0.214	-0.171	-0.119	-0.056	0.016
$\varepsilon$	-0.011	-0.002	0.008	0.012	0.010	0.002	-0.007	-0.013	-0.012	-0.003	0.016
S	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000
$\delta$	0.010										

### 4.3 Наилучшее приближение

Квадратичная аппроксимация:  $\delta = 0.01$

### 4.4 Графики функций



## 5 Листинг программы, по крайней мере, коды используемых методов.

```

#include "Linear.h"

void approx::Linear::fit() {
    auto n = static_cast<double>(_points.size());
    double SX = 0, SY = 0, SXX = 0, SXY = 0;
    for(auto point : _points) {
        SX+=point.first;
        SXX+=point.first*point.first;
        SY+=point.second;
        SXY+=point.first*point.second;
    }
    std::vector<std::vector<double>> A = {{SX, SXX}, {n, SX}};
    std::vector<double> b = {SXY, SY};
    _params = std::move(GaussianElimination::solve(A, b));
    set_s();
    set_standard_deviation();
    set_pearson_correlation_coefficient();
}

void approx::Linear::set_pearson_correlation_coefficient() {
    double X = 0, Y = 0;
    for(auto point : _points) {
        X+=point.first;
        Y+=point.second;
    }
    double Sx = X / _points.size();
    double Sy = Y / _points.size();
    double Sxy = 0, Sxx = 0, Syy = 0;
    for(auto point : _points) {
        Sxy += (point.first - Sx)*(point.second - Sy);
        Sxx += (point.first - Sx)*(point.first - Sx);
        Syy += (point.second - Sy)*(point.second - Sy);
    }
    _extras["Pearson Correlation Coefficient"] = Sxy / sqrt(Sxx*Syy);
}

#include "Quadratic.h"

void approx::Quadratic::fit() {
    auto n = static_cast<double>(_points.size());
    double SX = 0, S2X = 0, S3X=0, S4X = 0, SY = 0, SXY = 0, S2XY = 0;
    for(auto point : _points) {
        SX+=point.first;
        S2X+=point.first*point.first;
        S3X+=point.first*point.first*point.first;
        S4X+=point.first*point.first*point.first*point.first;
        SY+=point.second;
        SXY+=point.first*point.second;
    }
}

```

```

        S2XY+=point.first*point.first*point.second;
    }
    std::vector<std::vector<double>> A = {{n, SX, S2X},
                                           {SX, S2X, S3X}, {S2X, S3X, S4X}};
    std::vector<double> b = {SY, SXY, S2XY};
    _params = std::move(GaussianElimination::solve(A, b));
    set_s();
    set_standard_deviation();
}

#include "Cubic.h"

void approx::Cubic::fit() {
    auto n = static_cast<double>(_points.size());
    std::vector<std::vector<double>> A(4);
    for(int i = 0; i < A.size(); i++) {
        A[i].push_back(pair_sum(_points, i));
        A[i].push_back(pair_sum(_points, i+1));
        A[i].push_back(pair_sum(_points, i+2));
        A[i].push_back(pair_sum(_points, i+3));
    }
    std::vector<double> b(4);
    for(int i = 0; i < b.size(); i++) {
        b[i] = two_pair_sum(_points, i, 1);
    }
    _params = std::move(GaussianElimination::solve(A, b));
    set_s();
    set_standard_deviation();
}

#include "Exponential.h"
#include "Linear.h"

void approx::Exponential::fit() {
    auto new_points = _points;
    for(auto & point : new_points) {
        point.second = log(point.second);
    }
    Linear linear(new_points);
    linear.fit();
    auto params = linear.getParams();
    _params.push_back(exp(params[0]));
    _params.push_back(params[1]);
    set_s();
    set_standard_deviation();
}

#include "Logarithmic.h"

```



```

#include "Linear.h"

void approx::Logarithmic::fit() {
    auto new_points = _points;
    for(auto & point : new_points) {
        point.first = log(point.first);
    }
    Linear linear(new_points);
    linear.fit();
    auto params = linear.getParams();
    _params.push_back(params[0]);
    _params.push_back(params[1]);
    set_s();
    set_standard_deviation();
}

#include "Power.h"
#include "Linear.h"

void approx::Power::fit() {
    auto new_points = _points;
    for(auto & point : new_points) {
        point.first = log(point.first);
        point.second = log(point.second);
    }
    Linear linear(new_points);
    linear.fit();
    auto params = linear.getParams();
    _params.push_back(exp(params[0]));
    _params.push_back(params[1]);
    set_s();
    set_standard_deviation();
}

#include "AbstractApproximation.h"

approx::AbstractApproximation::AbstractApproximation(const
std::function<double(double, std::vector<double>)>> &f,
const std::vector<std::pair<double,double>> &points) : _f(f),
    _points(points) {}

void approx::AbstractApproximation::set_s() {
    double S = 0;
    if(_params.empty()){
        return;
    }
    for(auto point : _points) {
        double test = _f(point.first, _params);

```

```

        S+=pow(_f(point.first, _params) - point.second, 2);
    }
    _extras["Minimization criterion"] = S;
}

void approx::AbstractApproximation::set_standard_deviation() {
    if(_extras.find("Minimization criterion") == _extras.end()){
        set_s();
    }
    _extras["Standard Deviation"] =
    sqrt(_extras["Minimization criterion"] / (_points.size()));
}

std::pair<std::vector<std::vector<std::string>>,
std::vector<std::string>>
approx::AbstractApproximation::get_info() {
    std::vector<std::vector<std::string>> res(_points.size());
    for(int i = 0; i < _points.size(); ++i) {
        res[i].push_back(std::to_string(static_cast<int>(i + 1)));
        res[i].push_back(std::to_string(_points[i].first));
        res[i].push_back(std::to_string(_points[i].second));
        res[i].push_back(std::to_string(_f(_points[i].first, _params)));
        res[i].push_back(std::to_string(_f(_points[i].first, _params) -
        _points[i].second));
    }
    return std::make_pair<std::vector<std::vector<std::string>> &,
    std::vector<std::string>>(res, {"N p.p.", "xi", "yi", "fi", "ei"});
}

double approx::AbstractApproximation::
get_extra_info(std::string key) {
    return _extras[key];
}

std::pair<std::vector<std::vector<std::string>>,
std::vector<std::string>>
approx::AbstractApproximation::get_extras_info() {
    std::vector<std::vector<std::string>> res(_extras.size());
    int i = 0;
    for(auto extra : _extras) {
        res[i].push_back(extra.first);
        res[i].push_back(std::to_string(extra.second));
        ++i;
    }
    for(int i = 0; i < _params.size(); ++i) {
        res.push_back({"a" + std::to_string(i),
        std::to_string(_params[i])});
    }
}

```

```

        return std::make_pair<std::vector<std::vector<std::string>> &,
        std::vector<std::string>>(res, {"Key", "Value"});
    }

    const std::function<double(double, std::vector<double>)> &

approx::AbstractApproximation::getF() const {
    return _f;
}

const std::vector<double>
&approx::AbstractApproximation::getParams() const {
    return _params;
}

double approx::AbstractApproximation::pair_sum(const
std::vector<std::pair<double, double>> array, int powNum, bool choice)

const {
    double sum = 0;
    for(auto& el : array) {
        if(choice) {
            sum += pow(el.first, powNum);
        } else {
            sum += pow(el.second, powNum);
        }
    }
    return sum;
}

double approx::AbstractApproximation::two_pair_sum(const
std::vector<std::pair<double, double>> array, int powNum1,
int powNum2) const {
    double sum = 0;
    for(auto& el : array) {
        sum += pow(el.first, powNum1) * pow(el.second, powNum2);
    }
    return sum;
}

```

## 6 Результаты выполнения программы при различных исходных данных.

```

Do you want to load points from a file? (y/n): y
Enter _filename: test1
Do you want to output to a file? (y/n): n

```

-----POWER-----

N p.p.	xi	yi	fi	ei
1	1.100000	2.730000	2.753465	0.023465
2	2.300000	5.120000	5.108953	-0.011047
3	3.700000	7.740000	7.609647	-0.130353
4	4.500000	8.910000	8.966163	0.056163
5	5.400000	10.590000	10.446321	-0.143679
6	6.800000	12.750000	12.672535	-0.077465
7	7.500000	13.430000	13.757005	0.327005

Key	Value
Standard Deviation	0.148514
Minimization criterion	0.154396
a0	2.542090
a1	0.838036

-----LOGARITHMIC-----

N p.p.	xi	yi	fi	ei
1	1.100000	2.730000	1.737381	-0.992619
2	2.300000	5.120000	5.904843	0.784843
3	3.700000	7.740000	8.591004	0.851004
4	4.500000	8.910000	9.696968	0.786968
5	5.400000	10.590000	10.727092	0.137092
6	6.800000	12.750000	12.029559	-0.720441
7	7.500000	13.430000	12.583152	-0.846848

Key	Value
Standard Deviation	0.774576
Minimization criterion	4.199778
a0	1.198875
a1	5.650037

-----EXPONENTIAL-----

N p.p.	xi	yi	fi	ei
1	1.100000	2.730000	3.534788	0.804788
2	2.300000	5.120000	4.683819	-0.436181
3	3.700000	7.740000	6.504437	-1.235563
4	4.500000	8.910000	7.846950	-1.063050
5	5.400000	10.590000	9.691220	-0.898780
6	6.800000	12.750000	13.458233	0.708233
7	7.500000	13.430000	15.859622	2.429622

Key	Value
Standard Deviation	1.236764
Minimization criterion	10.707090
a0	2.730945
a1	0.234550

-----CUBIC-----

N p.p.	xi	yi	fi	ei
1	1.100000	2.730000	2.757914	0.027914
2	2.300000	5.120000	5.064653	-0.055347
3	3.700000	7.740000	7.669250	-0.070750

4	4.500000	8.910000	9.079564	0.169564
5	5.400000	10.590000	10.569680	-0.020320
6	6.800000	12.750000	12.624264	-0.125736
7	7.500000	13.430000	13.504675	0.074675

Key	Value
Standard Deviation	0.092117
Minimization criterion	0.059399
a0	0.639772
a1	1.911877
a2	0.019107
a3	-0.006042

-----QUADRATIC-----

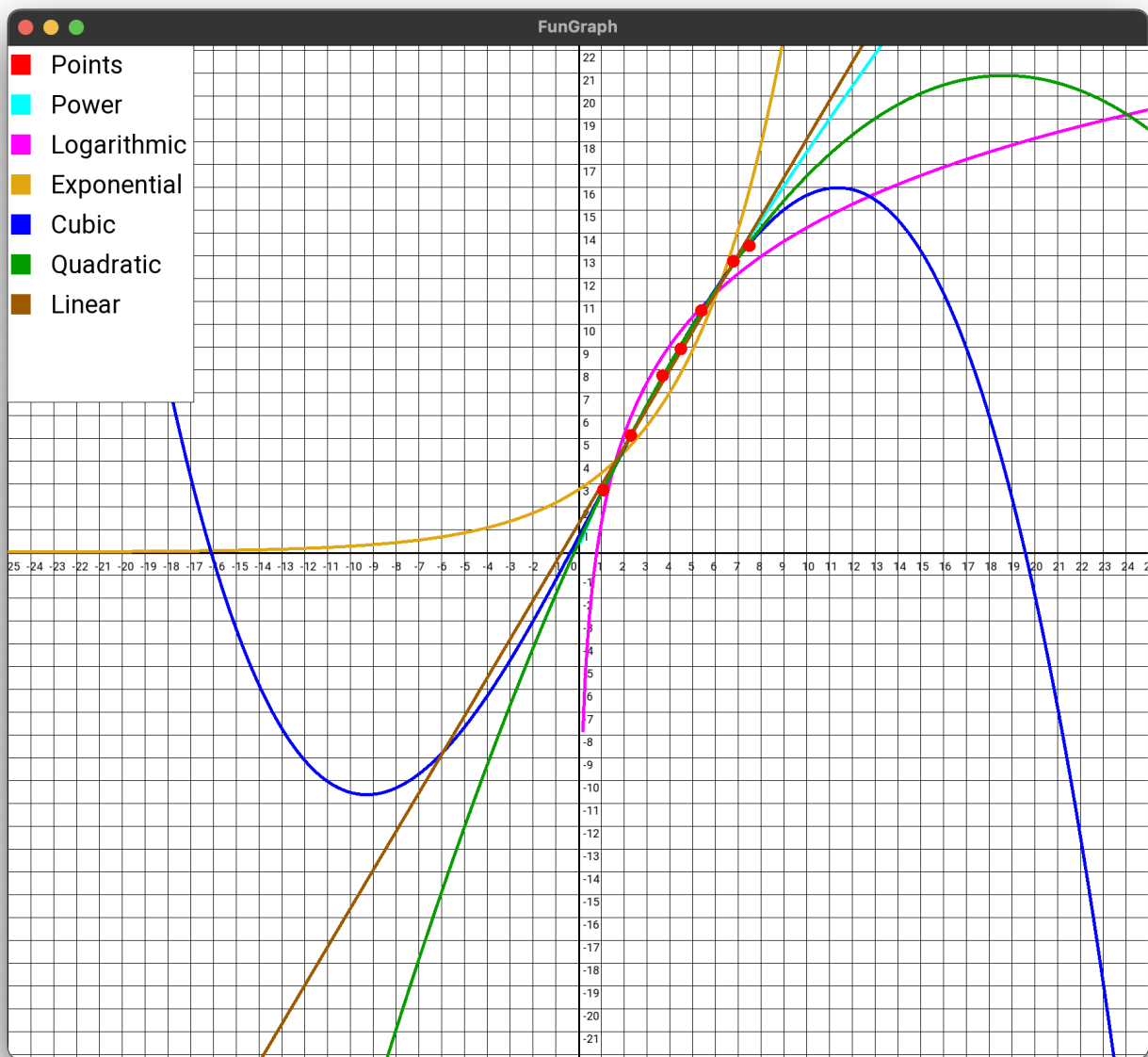
N p.p.	xi	yi	fi	ei
1	1.100000	2.730000	2.720172	-0.009828
2	2.300000	5.120000	5.116916	-0.003084
3	3.700000	7.740000	7.698891	-0.041109
4	4.500000	8.910000	9.070725	0.160725
5	5.400000	10.590000	10.523993	-0.066007
6	6.800000	12.750000	12.595125	-0.154875
7	7.500000	13.430000	13.544178	0.114178

Key	Value
Standard Deviation	0.099289
Minimization criterion	0.069008

```

+-----+-----+
| a0          | 0.374260 |
+-----+-----+
| a1          | 2.197386 |
+-----+-----+
| a2          | -0.058853 |
+-----+-----+
-----LINEAR-----
+-----+-----+-----+-----+
| N p.p. | xi      | yi      | fi      | ei      |
+-----+-----+-----+-----+
| 1      | 1.100000 | 2.730000 | 3.070710 | 0.340710 |
+-----+-----+-----+-----+
| 2      | 2.300000 | 5.120000 | 5.093169 | -0.026831 |
+-----+-----+-----+-----+
| 3      | 3.700000 | 7.740000 | 7.452705 | -0.287295 |
+-----+-----+-----+-----+
| 4      | 4.500000 | 8.910000 | 8.801011 | -0.108989 |
+-----+-----+-----+-----+
| 5      | 5.400000 | 10.590000 | 10.317855 | -0.272145 |
+-----+-----+-----+-----+
| 6      | 6.800000 | 12.750000 | 12.677391 | -0.072609 |
+-----+-----+-----+-----+
| 7      | 7.500000 | 13.430000 | 13.857159 | 0.427159 |
+-----+-----+-----+-----+
+-----+-----+
| Key          | Value    |
+-----+-----+
| Pearson Correlation Coefficient | 0.997419 |
+-----+-----+
| Standard Deviation          | 0.259950 |
+-----+-----+
| Minimization criterion      | 0.473020 |
+-----+-----+
| a0          | 1.216788 |
+-----+-----+
| a1          | 1.685383 |
+-----+-----+
-----BEST APPROXIMATION-----
Best approximation: Cubic
Standard Deviation: 0.0921169

```



Do you want to load points from a file? (y/n): y

Enter \_filename: test2

Do you want to output to a file? (y/n): n

-----POWER-----

N p.p.	xi	yi	fi	ei
1	-2.000000	-0.258000	nan	nan
2	-1.800000	-0.282000	nan	nan
3	-1.600000	-0.297000	nan	nan
4	-1.400000	-0.297000	nan	nan



5	-1.200000	-0.281000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
6	-1.000000	-0.250000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
7	-0.800000	-0.208000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
8	-0.600000	-0.159000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
9	-0.400000	-0.106000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
10	-0.200000	-0.053000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
11	0.000000	0.000000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
+-----+					
Key	Value				
+-----+	+-----+				
Standard Deviation	nan				
+-----+	+-----+				
Minimization criterion	nan				
+-----+	+-----+				
a0	nan				
+-----+	+-----+				
a1	nan				
+-----+	+-----+				
-----LOGARITHMIC-----					
+-----+	+-----+	+-----+	+-----+	+-----+	
N p.p.	xi	yi	fi	ei	
+-----+	+-----+	+-----+	+-----+	+-----+	
1	-2.000000	-0.258000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
2	-1.800000	-0.282000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
3	-1.600000	-0.297000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
4	-1.400000	-0.297000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
5	-1.200000	-0.281000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
6	-1.000000	-0.250000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
7	-0.800000	-0.208000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
8	-0.600000	-0.159000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
9	-0.400000	-0.106000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
10	-0.200000	-0.053000	nan	nan	

11	0.000000	0.000000	nan	nan
----	----------	----------	-----	-----

Key	Value
Standard Deviation	nan
Minimization criterion	nan
a0	nan
a1	nan

-----EXPONENTIAL-----

N p.p.	xi	yi	fi	ei
1	-2.000000	-0.258000	nan	nan
2	-1.800000	-0.282000	nan	nan
3	-1.600000	-0.297000	nan	nan
4	-1.400000	-0.297000	nan	nan
5	-1.200000	-0.281000	nan	nan
6	-1.000000	-0.250000	nan	nan
7	-0.800000	-0.208000	nan	nan
8	-0.600000	-0.159000	nan	nan
9	-0.400000	-0.106000	nan	nan
10	-0.200000	-0.053000	nan	nan
11	0.000000	0.000000	nan	nan

Key	Value
Standard Deviation	nan
Minimization criterion	nan
a0	nan

```

+-----+-----+
| a1          | nan    |
+-----+-----+
-----CUBIC-----
+-----+-----+-----+-----+-----+
| N p.p. | xi      | yi      | fi      | ei      |
+-----+-----+-----+-----+-----+
| 1      | -2.000000 | -0.258000 | -0.254427 | 0.003573 |
+-----+-----+-----+-----+-----+
| 2      | -1.800000 | -0.282000 | -0.286678 | -0.004678 |
+-----+-----+-----+-----+-----+
| 3      | -1.600000 | -0.297000 | -0.299760 | -0.002760 |
+-----+-----+-----+-----+-----+
| 4      | -1.400000 | -0.297000 | -0.296040 | 0.000960 |
+-----+-----+-----+-----+-----+
| 5      | -1.200000 | -0.281000 | -0.277886 | 0.003114 |
+-----+-----+-----+-----+-----+
| 6      | -1.000000 | -0.250000 | -0.247667 | 0.002333 |
+-----+-----+-----+-----+-----+
| 7      | -0.800000 | -0.208000 | -0.207751 | 0.000249 |
+-----+-----+-----+-----+-----+
| 8      | -0.600000 | -0.159000 | -0.160506 | -0.001506 |
+-----+-----+-----+-----+-----+
| 9      | -0.400000 | -0.106000 | -0.108301 | -0.002301 |
+-----+-----+-----+-----+-----+
| 10     | -0.200000 | -0.053000 | -0.053503 | -0.000503 |
+-----+-----+-----+-----+-----+
| 11     | 0.000000  | 0.000000  | 0.001517  | 0.001517  |
+-----+-----+-----+-----+-----+
+-----+-----+
| Key          | Value    |
+-----+-----+
| Standard Deviation | 0.002496 |
+-----+-----+
| Minimization criterion | 0.000069 |
+-----+-----+
| a0          | 0.001517 |
+-----+-----+
| a1          | 0.271717 |
+-----+-----+
| a2          | -0.026807 |
+-----+-----+
| a3          | -0.049340 |
+-----+-----+
-----QUADRATIC-----
+-----+-----+-----+-----+-----+
| N p.p. | xi      | yi      | fi      | ei      |
+-----+-----+-----+-----+-----+

```

1	-2.000000	-0.258000	-0.268636	-0.010636	
+-----+	+-----+	+-----+	+-----+	+-----+	+
2	-1.800000	-0.282000	-0.283836	-0.001836	
+-----+	+-----+	+-----+	+-----+	+-----+	+
3	-1.600000	-0.297000	-0.289339	0.007661	
+-----+	+-----+	+-----+	+-----+	+-----+	+
4	-1.400000	-0.297000	-0.285145	0.011855	
+-----+	+-----+	+-----+	+-----+	+-----+	+
5	-1.200000	-0.281000	-0.271255	0.009745	
+-----+	+-----+	+-----+	+-----+	+-----+	+
6	-1.000000	-0.250000	-0.247667	0.002333	
+-----+	+-----+	+-----+	+-----+	+-----+	+
7	-0.800000	-0.208000	-0.214382	-0.006382	
+-----+	+-----+	+-----+	+-----+	+-----+	+
8	-0.600000	-0.159000	-0.171400	-0.012400	
+-----+	+-----+	+-----+	+-----+	+-----+	+
9	-0.400000	-0.106000	-0.118721	-0.012721	
+-----+	+-----+	+-----+	+-----+	+-----+	+
10	-0.200000	-0.053000	-0.056345	-0.003345	
+-----+	+-----+	+-----+	+-----+	+-----+	+
11	0.000000	0.000000	0.015727	0.015727	
+-----+	+-----+	+-----+	+-----+	+-----+	+
+-----+					
Key	Value				
+-----+					
Standard Deviation	0.009681				
+-----+					
Minimization criterion	0.001031				
+-----+					
a0	0.015727				
+-----+					
a1	0.384606				
+-----+					
a2	0.121212				
+-----+					
-----LINEAR-----					
+-----+					
N p.p.	xi	yi	fi	ei	
+-----+					
1	-2.000000	-0.258000	-0.341364	-0.083364	
+-----+					
2	-1.800000	-0.282000	-0.312927	-0.030927	
+-----+					
3	-1.600000	-0.297000	-0.284491	0.012509	
+-----+					
4	-1.400000	-0.297000	-0.256055	0.040945	
+-----+					
5	-1.200000	-0.281000	-0.227618	0.053382	

6	-1.000000	-0.250000	-0.199182	0.050818
7	-0.800000	-0.208000	-0.170745	0.037255
8	-0.600000	-0.159000	-0.142309	0.016691
9	-0.400000	-0.106000	-0.113873	-0.007873
10	-0.200000	-0.053000	-0.085436	-0.032436
11	0.000000	0.000000	-0.057000	-0.057000

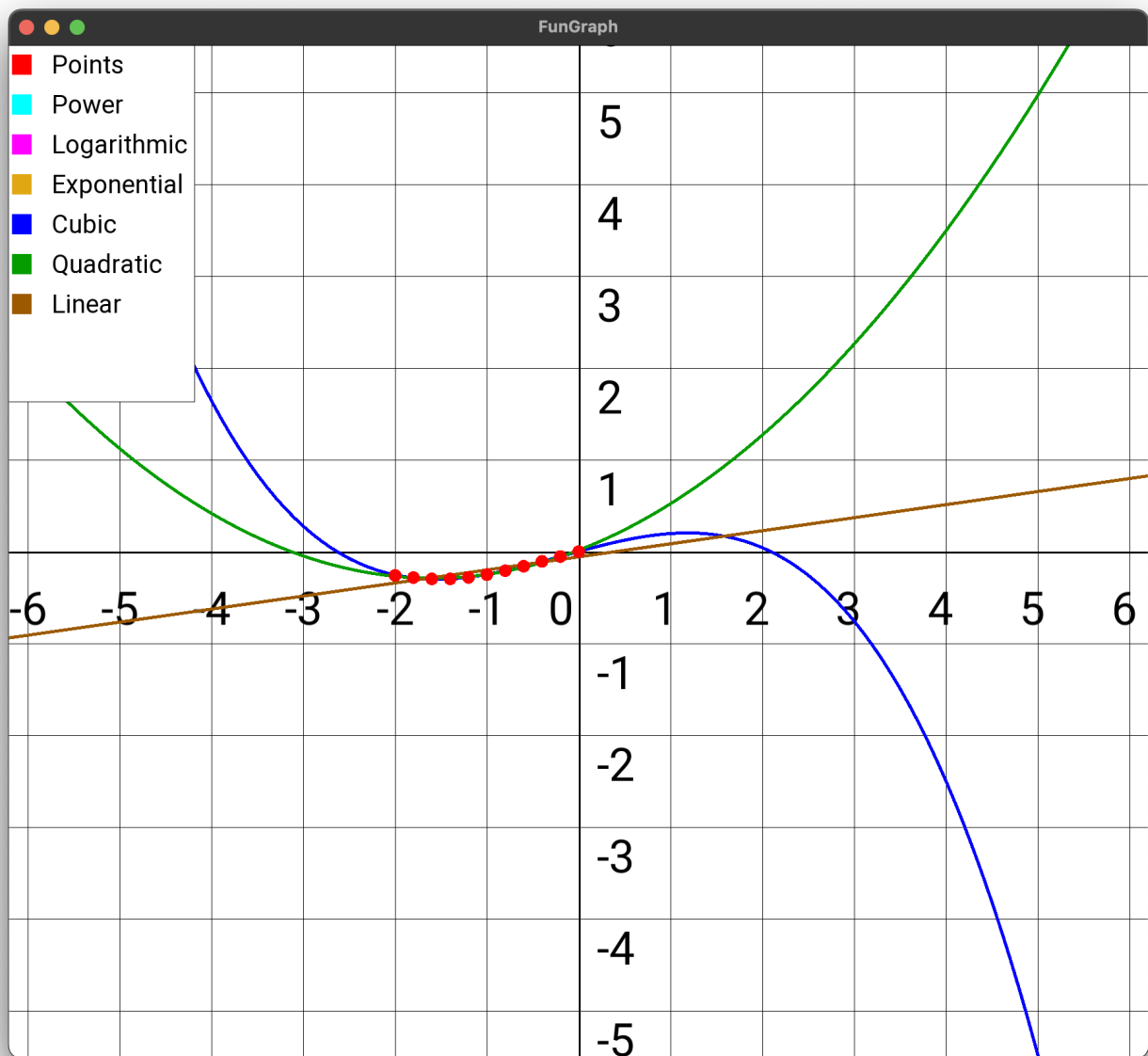
  

Key	Value
Pearson Correlation Coefficient	0.898626
Standard Deviation	0.043901
Minimization criterion	0.021201
a0	-0.057000
a1	0.142182

-----BEST APPROXIMATION-----

Best approximation: Cubic

Standard Deviation: 0.00249577



Do you want to load points from a file? (y/n): n

Enter number of points: 11

Enter x and y for point 1: 0 0

Enter x and y for point 2: 0.2 2.396

Enter x and y for point 3: 0.4 4.680

Enter x and y for point 4: 0.6 6.374

Enter x and y for point 5: 0.8 6.810

Enter x and y for point 6: 1 6

Enter x and y for point 7: 1.2 4.685

Enter x and y for point 8: 1.4 3.470

Enter x and y for point 9: 1.6 2.542

Enter x and y for point 10: 1.8 1.879

Enter x and y for point 11: 2 1.412

Do you want to output to a file? (y/n): n

-----POWER-----

N p.p.	xi	yi	fi	ei
1	0.000000	0.000000	nan	nan
2	0.200000	2.396000	nan	nan
3	0.400000	4.680000	nan	nan
4	0.600000	6.374000	nan	nan
5	0.800000	6.810000	nan	nan
6	1.000000	6.000000	nan	nan
7	1.200000	4.685000	nan	nan
8	1.400000	3.470000	nan	nan
9	1.600000	2.542000	nan	nan
10	1.800000	1.879000	nan	nan
11	2.000000	1.412000	nan	nan

Key	Value
Standard Deviation	nan
Minimization criterion	nan
a0	nan
a1	nan

-----LOGARITHMIC-----

N p.p.	xi	yi	fi	ei
1	0.000000	0.000000	nan	nan
2	0.200000	2.396000	nan	nan
3	0.400000	4.680000	nan	nan
4	0.600000	6.374000	nan	nan

5	0.800000	6.810000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
6	1.000000	6.000000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
7	1.200000	4.685000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
8	1.400000	3.470000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
9	1.600000	2.542000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
10	1.800000	1.879000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
11	2.000000	1.412000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
+-----+-----+					
Key	Value				
+-----+	+-----+				
Standard Deviation	nan				
+-----+	+-----+				
Minimization criterion	nan				
+-----+	+-----+				
a0	nan				
+-----+	+-----+				
a1	nan				
+-----+	+-----+				
-----EXPONENTIAL-----					
+-----+	+-----+	+-----+	+-----+	+-----+	
N p.p.	xi	yi	fi	ei	
+-----+	+-----+	+-----+	+-----+	+-----+	
1	0.000000	0.000000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
2	0.200000	2.396000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
3	0.400000	4.680000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
4	0.600000	6.374000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
5	0.800000	6.810000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
6	1.000000	6.000000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
7	1.200000	4.685000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
8	1.400000	3.470000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
9	1.600000	2.542000	nan	nan	
+-----+	+-----+	+-----+	+-----+	+-----+	
10	1.800000	1.879000	nan	nan	



```

+-----+-----+-----+-----+-----+
| 11      | 2.000000 | 1.412000 | nan  | nan  |
+-----+-----+-----+-----+-----+
+-----+-----+-----+
| Key      | Value    |
+-----+-----+-----+
| Standard Deviation | nan      |
+-----+-----+-----+
| Minimization criterion | nan      |
+-----+-----+-----+
| a0      | nan      |
+-----+-----+-----+
| a1      | nan      |
+-----+-----+-----+
-----CUBIC-----
+-----+-----+-----+-----+-----+
| N p.p. | xi      | yi      | fi      | ei      |
+-----+-----+-----+-----+-----+
| 1      | 0.000000 | 0.000000 | -0.435566 | -0.435566 |
+-----+-----+-----+-----+-----+
| 2      | 0.200000 | 2.396000 | 2.984385 | 0.588385 |
+-----+-----+-----+-----+-----+
| 3      | 0.400000 | 4.680000 | 5.096664 | 0.416664 |
+-----+-----+-----+-----+-----+
| 4      | 0.600000 | 6.374000 | 6.121599 | -0.252401 |
+-----+-----+-----+-----+-----+
| 5      | 0.800000 | 6.810000 | 6.279515 | -0.530485 |
+-----+-----+-----+-----+-----+
| 6      | 1.000000 | 6.000000 | 5.790739 | -0.209261 |
+-----+-----+-----+-----+-----+
| 7      | 1.200000 | 4.685000 | 4.875597 | 0.190597 |
+-----+-----+-----+-----+-----+
| 8      | 1.400000 | 3.470000 | 3.754415 | 0.284415 |
+-----+-----+-----+-----+-----+
| 9      | 1.600000 | 2.542000 | 2.647520 | 0.105520 |
+-----+-----+-----+-----+-----+
| 10     | 1.800000 | 1.879000 | 1.775238 | -0.103762 |
+-----+-----+-----+-----+-----+
| 11     | 2.000000 | 1.412000 | 1.357895 | -0.054105 |
+-----+-----+-----+-----+-----+
+-----+-----+-----+
| Key      | Value    |
+-----+-----+-----+
| Standard Deviation | 0.335814 |
+-----+-----+-----+
| Minimization criterion | 1.240482 |
+-----+-----+-----+
| a0      | -0.435566 |

```

```

+-----+-----+
| a1          | 20.736144 |
+-----+-----+
| a2          | -19.099971 |
+-----+-----+
| a3          | 4.590132  |
+-----+-----+
-----QUADRATIC-----
+-----+-----+-----+-----+
| N p.p. | xi      | yi      | fi      | ei      |
+-----+-----+-----+-----+
| 1      | 0.000000 | 0.000000 | 0.886392 | 0.886392 |
+-----+-----+-----+-----+
| 2      | 0.200000 | 2.396000 | 2.719993 | 0.323993 |
+-----+-----+-----+-----+
| 3      | 0.400000 | 4.680000 | 4.127228 | -0.552772 |
+-----+-----+-----+-----+
| 4      | 0.600000 | 6.374000 | 5.108098 | -1.265902 |
+-----+-----+-----+-----+
| 5      | 0.800000 | 6.810000 | 5.662601 | -1.147399 |
+-----+-----+-----+-----+
| 6      | 1.000000 | 6.000000 | 5.790739 | -0.209261 |
+-----+-----+-----+-----+
| 7      | 1.200000 | 4.685000 | 5.492510 | 0.807510  |
+-----+-----+-----+-----+
| 8      | 1.400000 | 3.470000 | 4.767916 | 1.297916  |
+-----+-----+-----+-----+
| 9      | 1.600000 | 2.542000 | 3.616956 | 1.074956  |
+-----+-----+-----+-----+
| 10     | 1.800000 | 1.879000 | 2.039629 | 0.160629  |
+-----+-----+-----+-----+
| 11     | 2.000000 | 1.412000 | 0.035937 | -1.376063 |
+-----+-----+-----+-----+
+-----+-----+
| Key          | Value      |
+-----+-----+
| Standard Deviation | 0.932766 |
+-----+-----+
| Minimization criterion | 9.570580 |
+-----+-----+
| a0          | 0.886392  |
+-----+-----+
| a1          | 10.233922 |
+-----+-----+
| a2          | -5.329575 |
+-----+-----+
-----LINEAR-----
+-----+-----+-----+-----+

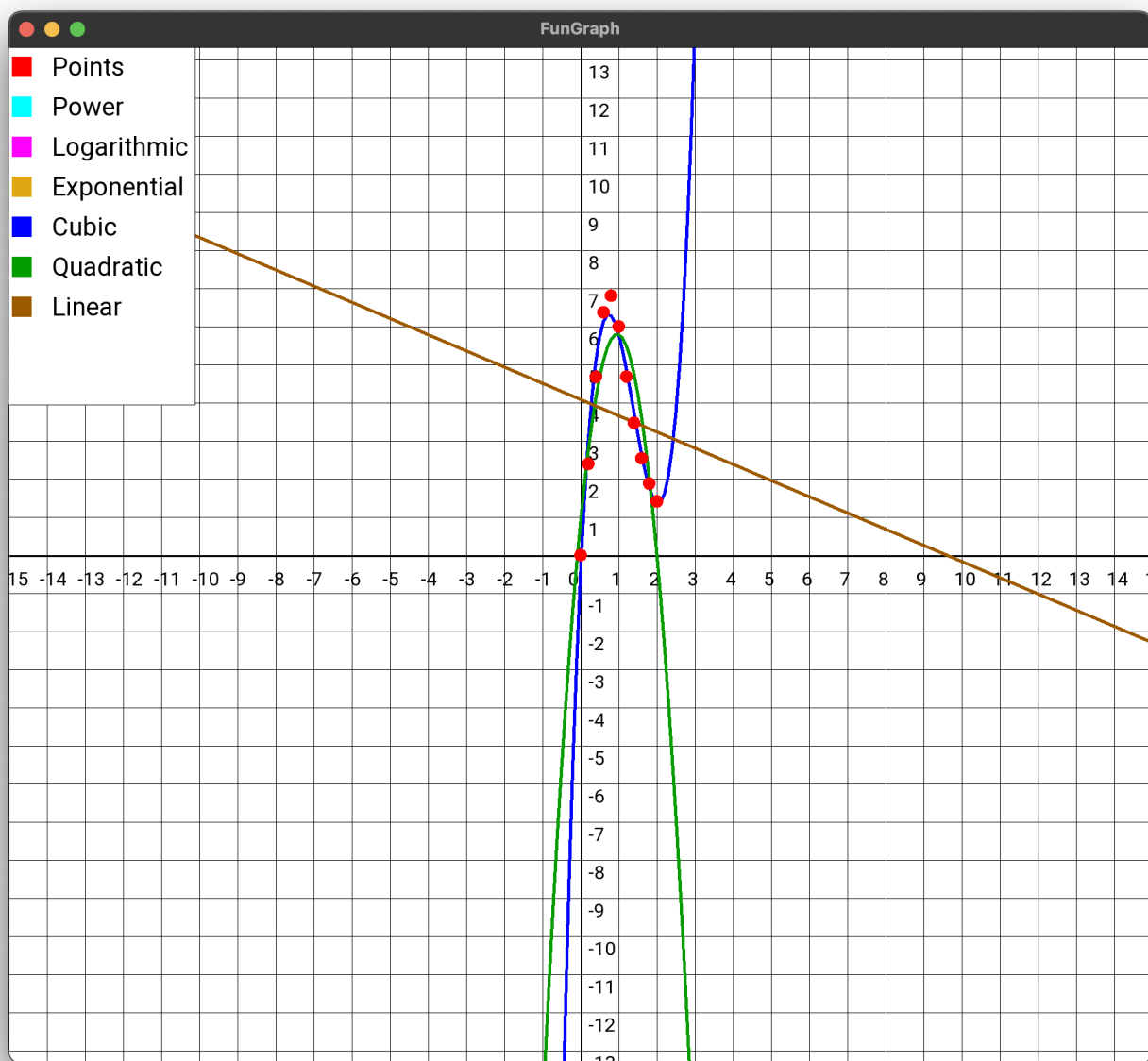
```

N p.p.	$x_i$	$y_i$	$f_i$	$e_i$
1	0.000000	0.000000	4.084136	4.084136
2	0.200000	2.396000	3.999091	1.603091
3	0.400000	4.680000	3.914045	-0.765955
4	0.600000	6.374000	3.829000	-2.545000
5	0.800000	6.810000	3.743955	-3.066045
6	1.000000	6.000000	3.658909	-2.341091
7	1.200000	4.685000	3.573864	-1.111136
8	1.400000	3.470000	3.488818	0.018818
9	1.600000	2.542000	3.403773	0.861773
10	1.800000	1.879000	3.318727	1.439727
11	2.000000	1.412000	3.233682	1.821682
Key			Value	
Pearson Correlation Coefficient			-0.126958	
Standard Deviation			2.101171	
Minimization criterion			48.564093	
a0			4.084136	
a1			-0.425227	

-----BEST APPROXIMATION-----

Best approximation: Cubic

Standard Deviation: 0.335814



## 7 Выводы

В этой лабораторной работе я изучил методы нахождения функции являющейся наилучшим приближением заданной табличной функции по методу наименьших квадратов, выполнил программную реализацию методов.