



МИНИСТЕРСТВО НАУКИ
И ВЫСШЕГО ОБРАЗОВАНИЯ
РОССИЙСКОЙ ФЕДЕРАЦИИ

Федеральное государственное бюджетное
образовательное учреждение высшего образования
«Новосибирский государственный технический университет»

НГТУ



НЭТИ

Кафедра теоретических и прикладных приколов

Лабораторная работа №2
по дисциплине «Методы оптимизации»
**Методы спуска (0-го, 1-го и 2-го порядка
и переменной метрики)**



ФПМИ

Группа	ПМ-92
Бригада	08
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Новосибирск

Цель работы

Ознакомиться с методами поиска минимума функции n переменных в оптимизационных задачах без ограничений.

Задание

Вариант 8:
$$f(x, y) = \frac{3}{1 + \left(\frac{x-2}{1}\right)^2 + \left(\frac{y-2}{2}\right)^2} + \frac{2}{1 + \left(\frac{x-2}{3}\right)^2 + \left(\frac{y-3}{1}\right)^2}.$$

1. Реализовать **два метода** поиска экстремума функции (разного порядка). Включить в реализуемый алгоритм собственную процедуру, реализующую одномерный поиск по направлению. Методы поиска для самостоятельной реализации выбираются студентом в зависимости от уровня сложности. Выбранные методы должны иметь разный порядок (например, метод Гаусса (нулевого порядка) и метод Ньютона (второго порядка)).
2. С использованием разработанного программного обеспечения исследовать алгоритмы на квадратичной функции $f(\bar{x}) = 100(x_2 - x_1)^2 + (1 - x_1)^2$, функции Розенброка $f(\bar{x}) = 100(x_2 - x_1^2)^2 + (1 - x_1)^2$ и на заданной в соответствии с вариантом тестовой функции, осуществляя спуск из различных исходных точек (не менее двух). Исследовать сходимость алгоритма, фиксируя точность определения минимума/максимума, количество итераций метода и количество вычислений функции в зависимости от задаваемой точности поиска. Результатом выполнения данного пункта должны быть выводы об объеме вычислений в зависимости от задаваемой точности и начального приближения.
3. Построить траекторию спуска различных алгоритмов из одной и той же исходной точки с одинаковой точностью. В отчете наложить эту траекторию на рисунок с линиями равного уровня заданной функции.
4. Реализовать метод квадратичной интерполяции (метод парабол) для приближенного нахождения экстремума при одномерном поиске. Исследовать влияние точности одномерного поиска на общее количество итераций и вычислений функции при разных методах одномерного поиска.

Исследования

Сравнение сходимости методов

№	name	x_{01}	x_{02}	ϵ	iters	calcs	x_1	x_2	$f(x_1, x_2)$
1	bfgs (quad)	-1.00000000	2.00000000	$1.00 \cdot 10^{-3}$	6	310	1.99977402	2.75646882	-4.51255712
2	bfgs (fib)	-1.00000000	2.00000000	$1.00 \cdot 10^{-3}$	6	270	1.99946121	2.75632340	-4.51255654
3	simplex	-1.00000000	2.00000000	$1.00 \cdot 10^{-3}$	28	552	1.99689215	2.76853641	-4.51228393
4	bfgs (quad)	-1.00000000	2.00000000	$1.00 \cdot 10^{-4}$	9	506	1.99969911	2.75636543	-4.51255704
5	bfgs (fib)	-1.00000000	2.00000000	$1.00 \cdot 10^{-4}$	3	178	1.99913415	2.75588406	-4.51255501
6	simplex	-1.00000000	2.00000000	$1.00 \cdot 10^{-4}$	31	608	2.00120401	2.76135791	-4.51251191
7	bfgs (quad)	-1.00000000	2.00000000	$1.00 \cdot 10^{-5}$	5	390	1.99778669	2.74825904	-4.51243592
8	bfgs (fib)	-1.00000000	2.00000000	$1.00 \cdot 10^{-5}$	6	407	1.99911268	2.75638067	-4.51255530
9	simplex	-1.00000000	2.00000000	$1.00 \cdot 10^{-5}$	35	678	2.00063196	2.75770707	-4.51255326
10	bfgs (quad)	-1.00000000	2.00000000	$1.00 \cdot 10^{-6}$	5	464	1.99881162	2.75468524	-4.51254904
11	bfgs (fib)	-1.00000000	2.00000000	$1.00 \cdot 10^{-6}$	4	317	2.00108923	2.75016973	-4.51249049
12	simplex	-1.00000000	2.00000000	$1.00 \cdot 10^{-6}$	39	742	2.00026362	2.75657612	-4.51255702
13	bfgs (quad)	-1.00000000	2.00000000	$1.00 \cdot 10^{-7}$	6	656	1.99896028	2.75672748	-4.51255435
14	bfgs (fib)	-1.00000000	2.00000000	$1.00 \cdot 10^{-7}$	4	358	2.00041918	2.75487266	-4.51255311
15	simplex	-1.00000000	2.00000000	$1.00 \cdot 10^{-7}$	43	812	2.00006707	2.75644623	-4.51255725
16	bfgs (quad)	-2.00000000	3.00000000	$1.00 \cdot 10^{-3}$	1	432	-667,572,023.48437500	3.00000000	0.00000000
17	bfgs (fib)	-2.00000000	3.00000000	$1.00 \cdot 10^{-3}$	2	104	2.00006533	2.75599759	-4.51255703
18	simplex	-2.00000000	3.00000000	$1.00 \cdot 10^{-3}$	27	532	1.99394278	2.76381383	-4.51237302
19	bfgs (quad)	-2.00000000	3.00000000	$1.00 \cdot 10^{-4}$	2	284	2.00009667	2.74852039	-4.51245507
20	bfgs (fib)	-2.00000000	3.00000000	$1.00 \cdot 10^{-4}$	2	125	2.00000567	2.75633094	-4.51255727
21	simplex	-2.00000000	3.00000000	$1.00 \cdot 10^{-4}$	30	582	2.00331265	2.75106432	-4.51248308
22	bfgs (quad)	-2.00000000	3.00000000	$1.00 \cdot 10^{-5}$	3	344	2.00000575	2.75632362	-4.51255727
23	bfgs (fib)	-2.00000000	3.00000000	$1.00 \cdot 10^{-5}$	2	149	2.00000010	2.75636531	-4.51255727
24	simplex	-2.00000000	3.00000000	$1.00 \cdot 10^{-5}$	33	638	2.00124821	2.75369686	-4.51254151
25	bfgs (quad)	-2.00000000	3.00000000	$1.00 \cdot 10^{-6}$	1	440	-1,335,144,044.96875000	3.00000000	0.00000000
26	bfgs (fib)	-2.00000000	3.00000000	$1.00 \cdot 10^{-6}$	3	188	2.00000007	2.75636541	-4.51255727
27	simplex	-2.00000000	3.00000000	$1.00 \cdot 10^{-6}$	39	744	1.99971855	2.75606684	-4.51255692
28	bfgs (quad)	-2.00000000	3.00000000	$1.00 \cdot 10^{-7}$	2	498	2.00000009	2.74814196	-4.51244502
29	bfgs (fib)	-2.00000000	3.00000000	$1.00 \cdot 10^{-7}$	2	193	2.00000000	2.75636537	-4.51255727
30	simplex	-2.00000000	3.00000000	$1.00 \cdot 10^{-7}$	42	798	2.00015276	2.75645321	-4.51255720

Исследование сходимости каждого из методов

Далее начальное приближение $x_0 = \{-1, 2\}$, $\varepsilon = 10^{-3}$.

Целевая функция варианта (многогранники)

№	x_i	y_i	f_i	s_1	s_2	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle
0	-1.0000000	2.0000000	-1.4026634	NaN	NaN	NaN	NaN	NaN	NaN
1	0.9659258	0.4829629	-1.4026634	1.9659258	-1.5170371	1.9659258	1.5170371	0.4359967	1.1208710
2	1.5866666	0.0866666	-1.6485032	0.6207407	-0.3962964	0.6207407	0.3962964	0.2458398	0.6227626
3	1.5866666	0.0866666	-1.6485032	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
4	1.5866666	0.0866666	-1.6485032	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
5	1.5866666	0.0866666	-1.6485032	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
6	1.5866666	0.0866666	-1.6485032	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
7	1.5186342	0.2774419	-1.7571517	-0.0680324	0.1907754	0.0680324	0.1907754	0.1086485	1.7326484
8	1.5186342	0.2774419	-1.7571517	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
9	1.6962500	0.3768747	-1.9668585	0.1776158	0.0994327	0.1776158	0.0994327	0.2097068	0.2917209
10	1.3668172	0.8027484	-2.0458222	-0.3294328	0.4258738	0.3294328	0.4258738	0.0789637	1.6981592
11	1.5573323	1.2145508	-2.6970183	0.1905152	0.4118023	0.1905152	0.4118023	0.6511961	0.4751239
12	1.5573323	1.2145508	-2.6970183	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
13	1.4442134	2.6769661	-3.8639573	-0.1131189	1.4624153	0.1131189	1.4624153	1.1669390	0.5719403
14	2.0465196	2.5564262	-4.4497393	0.6023062	-0.1205399	0.6023062	0.1205399	0.5857820	1.0932477
15	2.0465196	2.5564262	-4.4497393	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
16	2.0465196	2.5564262	-4.4497393	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
17	2.0465196	2.5564262	-4.4497393	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
18	2.0465196	2.5564262	-4.4497393	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
19	2.0465196	2.5564262	-4.4497393	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
20	2.0465196	2.5564262	-4.4497393	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
21	1.9909022	2.8262669	-4.5038186	-0.0556174	0.2698406	0.0556174	0.2698406	0.0540793	0.8169574
22	1.9909022	2.8262669	-4.5038186	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
23	1.9909022	2.8262669	-4.5038186	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
24	1.9909022	2.8262669	-4.5038186	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
25	2.0159252	2.7353153	-4.5111890	0.0250230	-0.0909516	0.0250230	0.0909516	0.0073704	2.2379825
26	2.0159252	2.7353153	-4.5111890	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
27	2.0159252	2.7353153	-4.5111890	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
28	1.9873955	2.7628651	-4.5120916	-0.0285297	0.0275498	0.0285297	0.0275498	0.0009025	1.4264463

Квадратичная функция (многогранники)

№	x_i	y_i	f_i	s_1	s_2	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle
0	-1.0000000	2.0000000	23.3264786	NaN	NaN	NaN	NaN	NaN	NaN
1	0.9659258	0.4829629	23.3264786	1.9659258	-1.5170371	1.9659258	1.5170371	880.6735214	1.1208710
2	0.9659258	0.4829629	23.3264786	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
3	0.9659258	0.4829629	23.3264786	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
4	0.9399999	0.5649999	14.0661000	-0.0259259	0.0820370	0.0259259	0.0820370	9.2603786	1.3356899
5	0.7179629	0.7449536	0.1523949	-0.2220370	0.1799537	0.2220370	0.1799537	13.9137051	1.6566558
6	0.7179629	0.7449536	0.1523949	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
7	0.7179629	0.7449536	0.1523949	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
8	0.7179629	0.7449536	0.1523949	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
9	0.7179629	0.7449536	0.1523949	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
10	0.7179629	0.7449536	0.1523949	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
11	0.7347540	0.7489850	0.0906076	0.0167911	0.0040314	0.0167911	0.0040314	0.0617872	0.5593585
12	0.7450542	0.7388492	0.0688476	0.0103002	-0.0101358	0.0103002	0.0101358	0.0217601	1.5585710
13	0.7508747	0.7433988	0.0676522	0.0058205	0.0045496	0.0058205	0.0045496	0.0011953	0.1169379
14	0.7508747	0.7433988	0.0676522	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
15	0.7471797	0.7496042	0.0645059	-0.0036950	0.0062053	0.0036950	0.0062053	0.0031463	1.3208480
16	0.7471797	0.7496042	0.0645059	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
17	0.7530002	0.7541538	0.0611420	0.0058205	0.0045496	0.0058205	0.0045496	0.0033639	0.1227063
18	0.7530002	0.7541538	0.0611420	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
19	0.7592131	0.7544634	0.0602343	0.0062129	0.0003096	0.0062129	0.0003096	0.0009077	0.7324734
20	0.7615348	0.7630983	0.0571101	0.0023217	0.0086349	0.0023217	0.0086349	0.0031242	0.5217114
21	0.7751213	0.7680349	0.0555921	0.0135866	0.0049366	0.0135866	0.0049366	0.0015180	0.4322922
22	0.7865580	0.7877731	0.0457051	0.0114367	0.0197382	0.0114367	0.0197382	0.0098870	0.2594767
23	0.8001446	0.7927097	0.0454699	0.0135866	0.0049366	0.0135866	0.0049366	0.0002352	0.4322167
24	0.8298112	0.8346543	0.0313098	0.0296667	0.0419446	0.0296667	0.0419446	0.0141602	0.1668924
25	0.8718177	0.8654999	0.0204222	0.0420065	0.0308455	0.0420065	0.0308455	0.0108876	0.1483814
26	0.9014844	0.9074445	0.0132577	0.0296667	0.0419446	0.0296667	0.0419446	0.0071645	0.1665073
27	0.9434908	0.9382901	0.0058981	0.0420065	0.0308455	0.0420065	0.0308455	0.0073596	0.1492542
28	0.9731575	0.9802347	0.0057292	0.0296667	0.0419446	0.0296667	0.0419446	0.0001689	0.1661791
29	1.0151640	1.0110803	0.0018976	0.0420065	0.0308455	0.0420065	0.0308455	0.0038316	0.1500025
30	0.9688258	0.9669738	0.0013148	-0.0463382	-0.0441065	0.0463382	0.0441065	0.0005828	3.1178796

Функция Розенброка (многогранники)

№	x_i	y_i	f_i	s_1	s_2	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle
0	-1.0000000	2.0000000	20.2556423	NaN	NaN	NaN	NaN	NaN	NaN
1	0.9659258	0.4829629	20.2556423	1.9659258	-1.5170371	1.9659258	1.5170371	83.7443577	1.1208710
2	0.7244444	0.7244444	4.0609340	-0.2414815	0.2414815	0.2414815	0.2414815	16.1947083	1.5707963
3	0.7244444	0.7244444	4.0609340	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
4	0.7244444	0.7244444	4.0609340	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
5	0.8214814	0.6133796	0.4095050	0.0970370	-0.1110648	0.0970370	0.1110648	3.6514289	1.4940742
6	0.8214814	0.6133796	0.4095050	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
7	0.8214814	0.6133796	0.4095050	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
8	0.8223726	0.6319957	0.2278090	0.0008912	0.0186162	0.0008912	0.0186162	0.1816960	0.8677219
9	0.8003385	0.6468516	0.0438463	-0.0220341	0.0148559	0.0220341	0.0148559	0.1839627	1.8686441
10	0.8003385	0.6468516	0.0438463	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
11	0.8003385	0.6468516	0.0438463	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
12	0.8003385	0.6468516	0.0438463	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
13	0.8067723	0.6476183	0.0384018	0.0064338	0.0007667	0.0064338	0.0007667	0.0054445	0.5577934
14	0.8067723	0.6476183	0.0384018	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN
15	0.8067723	0.6476183	0.0384018	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	NaN

Целевая функция варианта (BFGS, метод Фибоначчи)

№	x_i	y_i	f_i	s_1	s_2	λ	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle	∇_x	∇_y	H_{11}	H_{12}	H_{21}	H_{22}
0	-1.0000000	2.0000000	-0.9666667	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	1.000000	0.000000	0.000000	1.000000
1	-0.0863226	3.2917508	-1.7948350	0.9136774	1.2917508	2.8378186	0.9136774	1.2917508	0.8281684	0.6418378	-0.321965	-0.455191	1.000000	0.000000	0.000000	1.000000
2	1.8754245	1.9069881	-3.8584573	1.9617471	-1.3847627	2.5985069	1.9617471	1.3847627	2.0636222	1.4084058	-0.754952	0.532907	1.000000	0.000000	0.000000	1.000000
3	2.2149726	2.4108337	-4.2353306	0.3395481	0.5038456	0.4932867	0.3395481	0.5038456	0.3768733	0.1500799	-0.688338	-1.021405	0.161954	0.152576	0.152576	0.972222
4	2.1682988	2.7948206	-4.4423834	-0.0466738	0.3839869	0.6462134	0.0466738	0.3839869	0.2070528	0.7807840	1.199041	-0.799361	0.117689	-0.005214	-0.005214	0.409757
5	1.9986034	2.7680266	-4.5123236	-0.1696953	-0.0267940	0.2011157	0.1696953	0.0267940	0.0699401	2.3527581	0.843769	0.133227	0.208779	-0.072803	-0.072803	0.993301
6	1.9994612	2.7563234	-4.5125565	0.0008578	-0.0117032	0.2653103	0.0008578	0.0117032	0.0002330	2.4408535	0.000000	0.044409	0.204859	-0.019315	-0.019315	0.263533

Целевая функция варианта (BFGS, метод парабол)

№	x_i	y_i	f_i	s_1	s_2	λ	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle	∇_x	∇_y	H_{11}	H_{12}	H_{21}	H_{22}
0	-1.0000000	2.0000000	-0.9666667	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	1.000000	0.000000	0.000000	1.000000
1	-0.0270499	3.3755502	-1.7893340	0.9729501	1.3755502	3.0219158	0.9729501	1.3755502	0.8226673	0.6236332	-0.321965	-0.455191	-5.106763	-1.104240	-1.104240	0.800329
2	1.1848726	3.9064913	-2.2210058	1.2119224	0.5309411	-0.3884631	1.2119224	0.5309411	0.4316718	0.8633944	-0.754952	0.666134	-16.826059	0.113943	0.113943	0.673703
3	1.9427073	2.5546781	-4.4457722	0.7578347	-1.3518132	0.9224281	0.7578347	1.3518132	2.2247664	1.9804869	-0.821565	1.465494	1.000000	0.000000	0.000000	1.000000
4	2.0385823	2.7190353	-4.5065113	0.0958750	0.1643572	0.3084163	0.0958750	0.1643572	0.0607391	0.1152632	-0.310862	-0.532907	0.415825	-0.314553	-0.314553	0.830626
5	1.9953063	2.7450009	-4.5122881	-0.0432760	0.0259656	0.1948978	0.0432760	0.0259656	0.0057768	1.6589210	0.222045	-0.133227	0.234295	0.215641	0.215641	0.939270
6	1.9997740	2.7564688	-4.5125571	0.0044677	0.0114679	0.2235963	0.0044677	0.0114679	0.0002690	0.2561294	-0.044409	-0.044409	0.136356	-0.035752	-0.035752	0.293986

Квадратичная функция (BFGS, метод Фибоначчи)

№	x_i	y_i	f_i	s_1	s_2	λ	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle	∇_x	∇_y	H_{11}	H_{12}	H_{21}	H_{22}
0	-1.0000000	2.0000000	904.0000000	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	1.000000	0.000000	0.000000	1.000000
1	0.4929924	0.4630961	0.3464358	1.4929924	-1.5369039	0.0025750	1.4929924	1.5369039	903.6535642	1.5540288	-579.802872	596.855898	1.000000	0.000000	0.000000	1.000000
2	0.4802206	0.4784765	0.2704748	-0.0127718	0.0153805	0.0025750	0.0127718	0.0153805	0.0759610	1.4802163	4.959921	-5.973000	1.000000	0.000000	0.000000	1.000000
3	0.4971105	0.4870232	0.2630731	0.0168899	0.0085467	0.0244387	0.0168899	0.0085467	0.0074017	0.3066934	-0.691114	-0.349720	0.498909	0.498746	0.498746	0.503588
4	1.0002990	1.0001522	0.0000022	0.5031885	0.5131290	1.0016996	0.5031885	0.5131290	0.2630709	0.0098539	1.007527	-2.015055	1.000000	0.000000	0.000000	1.000000
5	1.0002219	1.0002277	0.0000001	-0.0000771	0.0000756	0.0025750	0.0000771	0.0000756	0.0000022	1.5808737	0.029938	-0.029340	0.498754	0.498746	0.498746	0.503742
6	1.0000000	1.0000000	0.0000000	-0.0002220	-0.0002278	1.0034830	0.0002220	0.0002278	0.0000001	3.1286108	-0.000720	0.001164	1.000000	0.000000	0.000000	1.000000

Квадратичная функция (BFGS, метод парабол)

№	x_i	y_i	f_i	s_1	s_2	λ	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle	∇_x	∇_y	H_{11}	H_{12}	H_{21}	H_{22}
0	-1.0000000	2.0000000	904.0000000	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	1.000000	0.000000	0.000000	1.000000
1	0.4795246	0.4769600	0.2715524	1.4795246	-1.5230400	0.0025518	1.4795246	1.5230400	903.7284476	1.5826067	-579.802872	596.855898	1.000000	0.000000	0.000000	1.000000
2	0.9599785	0.9447703	0.0247306	0.4804538	0.4678103	0.9110618	0.4804538	0.4678103	0.2468218	0.0053484	-0.527356	-0.513478	0.499122	0.498779	0.498779	0.503311
3	0.9525911	0.9523572	0.0022531	-0.0073873	0.0075870	0.0024963	0.0073873	0.0075870	0.0224775	1.5575881	2.959265	-3.039236	0.498753	0.498746	0.498746	0.503742
4	1.0000000	1.0000000	0.0000000	0.0474089	0.0476428	1.0033549	0.0474089	0.0476428	0.0022531	0.0024608	-0.048008	-0.046729	1.000000	0.000000	0.000000	1.000000

Функция Розенброка (BFGS, метод Фибоначчи)

№	x_i	y_i	f_i	s_1	s_2	λ	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle	∇x	∇y	H_{11}	H_{12}	H_{21}	H_{22}
0	-1.0000000	2.0000000	104.0000000	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	1.000000	0.000000	0.000000	1.000000
1	-1.3964828	1.7982059	8.0522679	-0.3964828	-0.2017941	0.0010000	0.3964828	0.2017941	95.9477321	1.3812791	396.482847	201.794137	0.186347	0.000000	0.000000	0.000000
2	-0.8478101	0.6692751	3.6594961	0.5486727	-1.1289308	0.1116372	0.5486727	1.1289308	4.3927719	2.6914442	-89.706020	-30.375702	1.000000	0.000000	0.000000	1.000000
3	-0.8273598	0.6791560	3.3421257	0.0204503	0.0098810	0.0010000	0.0204503	0.0098810	0.3173704	2.0041606	-20.450308	-9.880985	0.255422	-0.434988	-0.434988	0.745876
4	-0.6539857	0.3849571	2.9183410	0.1733741	-0.2941989	0.1915941	0.1733741	0.2941989	0.4237847	2.6353368	-5.395684	-1.080119	0.068629	-0.107097	-0.107097	0.170305
5	-0.6250311	0.4020102	2.6535999	0.0289546	0.0107530	0.0020000	0.0289546	0.0107530	0.2647411	2.0377636	-14.477308	-8.526513	1.000000	0.000000	0.000000	1.000000
6	-0.6216553	0.3828809	2.6310437	0.0033758	-0.0191293	0.0084462	0.0033758	0.0191293	0.0225562	2.2975051	-0.399680	2.264855	0.390074	-0.486551	-0.486551	0.611868
7	-0.6110205	0.3847677	2.6084324	0.0106348	0.0025750	0.0018868	0.0106348	0.0025750	0.0226113	2.2404019	-4.130030	-0.732747	1.000000	0.000000	0.000000	1.000000
8	-0.6074572	0.3654508	2.5851814	0.0035633	-0.0193169	0.0084462	0.0035633	0.0193169	0.0232510	2.2948124	-0.421885	2.287059	0.404480	-0.489561	-0.489561	0.597544
9	-0.5970511	0.3672880	2.5622588	0.0104061	0.0018296	0.0025750	0.0104061	0.0018296	0.0229226	2.4160572	-4.041212	-0.710543	1.000000	0.000000	0.000000	1.000000
10	-0.5893038	0.3404390	2.5305614	0.0077481	-0.0246222	0.0127481	0.0077481	0.0246222	0.0316974	2.3756764	-0.621725	2.153833	0.416203	-0.491692	-0.491692	0.585882
11	-0.5770101	0.3439840	2.4991563	0.0122929	0.0035449	0.0025750	0.0122929	0.0035449	0.0314051	2.3232545	-4.773959	-1.376677	1.000000	0.000000	0.000000	1.000000
12	-0.5695393	0.3173026	2.4684556	0.0074708	-0.0266814	0.0120162	0.0074708	0.0266814	0.0307007	2.3520994	-0.621725	2.220446	0.431095	-0.493988	-0.493988	0.571064
13	-0.5573035	0.3209047	2.4358394	0.0122358	0.0036021	0.0025750	0.0122358	0.0036021	0.0326162	2.3328404	-4.751755	-1.398881	1.000000	0.000000	0.000000	1.000000
14	-0.5431645	0.2843790	2.3926964	0.0141390	-0.0365258	0.0176879	0.0141390	0.0365258	0.0431429	2.424471	-0.799361	2.065015	0.450025	-0.496254	-0.496254	0.552220
15	-0.5292707	0.2898679	2.3481564	0.0138939	0.0054889	0.0025750	0.0138939	0.0054889	0.0445400	2.2642948	-5.395684	-2.131628	1.000000	0.000000	0.000000	1.000000
16	-0.5005418	0.2343254	2.2779237	0.0287289	-0.0555425	0.0287519	0.0287289	0.0555425	0.0702328	2.4859809	-0.999201	1.931788	0.486741	-0.498561	-0.498561	0.515716
17	-0.4844752	0.2426732	2.2099979	0.0160666	0.0083478	0.0025750	0.0160666	0.0083478	0.0679258	2.1980430	-6.239453	-3.241851	1.000000	0.000000	0.000000	1.000000
18	-0.3555181	0.0952936	1.9341471	0.1289571	-0.1473795	0.0921859	0.1289571	0.1473795	0.2758508	2.5515119	-1.398881	1.598721	0.632998	-0.480458	-0.480458	0.371010
19	-0.3270076	0.1201626	1.7784488	0.0285105	0.0042860	0.0025750	0.0285105	0.0042860	0.1556982	2.0721635	-7.127632	-6.217249	1.000000	0.000000	0.000000	1.000000
20	-0.3180978	0.0948121	1.7414446	0.0089098	-0.0253505	0.0095538	0.0089098	0.0253505	0.0370043	2.1984509	-0.932587	2.653433	0.707340	-0.453846	-0.453846	0.296194
21	-0.2988375	0.1019571	1.7029892	0.0192602	0.0071449	0.0055962	0.0192602	0.0071449	0.0384553	2.4575669	-3.441691	-1.276756	0.727097	-0.444344	-0.444344	0.276514
22	-0.1083749	-0.0156884	1.3037546	0.1904627	-0.1176454	0.0994133	0.1904627	0.1176454	0.3992346	2.4445109	-1.088019	2.531308	1.000000	0.000000	0.000000	1.000000
23	-0.0893010	0.0150037	1.1915175	0.0190738	0.0036921	0.0055962	0.0190738	0.0036921	0.1123271	1.9603859	-3.408385	-5.484502	0.956433	-0.203614	-0.203614	0.483888
24	-0.0732505	-0.0201455	0.9239465	0.1625516	-0.0765273	0.0752573	0.1625516	0.0752573	0.2675710	0.0554311	-1.920686	1.409983	1.000000	0.000000	0.000000	1.000000
25	0.0794635	0.0084031	0.8478237	0.0062130	0.0285486	0.0025750	0.0062130	0.0285486	0.0761229	0.1521153	-1.110223	-5.101475	0.979303	0.142012	0.142012	0.025604
26	0.2332562	0.0305274	0.6449268	0.1537927	0.0221242	0.0851801	0.1537927	0.0221242	0.2028969	0.0127422	-1.904032	0.416334	1.000000	0.000000	0.000000	1.000000
27	0.2298355	0.0538750	0.5932637	-0.0034207	0.0048006	0.0034207	0.0034207	0.0048006	0.0516631	1.4860233	0.699441	-4.773959	0.819973	0.383247	0.383247	0.184133
28	0.3819893	0.1248658	0.4262477	0.1521537	-0.0709908	0.1208046	0.1521537	0.0709908	0.1670160	0.1206159	-1.632028	0.205391	1.000000	0.000000	0.000000	1.000000
29	0.3798635	0.1379665	0.3906607	-0.0061534	0.0131007	0.0031094	0.0061534	0.0131007	0.0355870	1.978973	-0.971458	-4.213296	1.000000	0.000000	0.000000	1.000000
30	0.5658518	0.3053118	0.2162284	0.1900159	0.1655654	0.2516929	0.1900159	0.1655654	0.1744323	0.6243899	-0.754952	-0.657807	0.407382	0.485704	0.485704	0.601922
31	0.5583974	0.3120114	0.1950214	-0.0074544	0.0085693	0.0025750	-0.0074544	0.0085693	0.1212070	1.7770577	2.894907	-3.327894	1.000000	0.000000	0.000000	1.000000
32	0.5621889	0.3118625	0.1934374	0.0037914	-0.0040000	0.0040000	0.0037914	-0.0040000	0.0002387	0.0015840	-0.947853	0.059674	1.000000	0.000000	0.000000	1.000000
33	0.5619113	0.3152153	0.1919497	-0.0002776	0.0033529	0.0040000	0.0002776	0.0033529	0.0014877	1.1421631	0.069389	-0.838218	1.000000	0.000000	0.000000	1.000000
34	0.5656910	0.3157484	0.1904373	0.0037797	0.0005330	0.0049882	0.0037797	0.0005330	0.0051124	0.3689879	-0.757727	-0.106859	0.434662	0.494456	0.494456	0.567539
35	0.5653024	0.3195152	0.1889793	-0.0003886	0.0034028	0.0040000	0.0003886	0.0034028	0.0014580	1.1705379	0.097145	-0.850708	1.000000	0.000000	0.000000	1.000000
36	0.5690896	0.3195584	0.1875367	0.0037572	0.004072	0.0048006	0.0037572	0.004072	0.0014426	0.1405337	-0.774381	-0.083267	1.000000	0.000000	0.000000	1.000000
37	0.5686122	0.3230001	0.1861057	-0.0004774	0.0034417	0.0040000	0.0004774	0.0034417	0.1920310	1.1920310	0.119349	-0.860423	1.000000	0.000000	0.000000	1.000000
38	0.5717652	0.3232555	0.1847246	0.0031530	0.0040000	0.0040000	0.0031530	0.0040000	0.0013811	0.4337529	-0.788258	-0.063838	1.000000	0.000000	0.000000	1.000000
39	0.5718740	0.3273483	0.1833014	0.0001087	0.0040928	0.0040000	0.0001087	0.0040928	0.0014232	1.0243490	-0.019429	-0.731359	0.431186	0.494000	0.494000	0.570973
40	0.6890449	0.4614914	0.1143594	0.1171709	0.1341431	0.3170546	0.1171709	0.1341431	0.0689420	0.2626918	-0.927036	0.061062	0.180555	0.220381	0.220381	0.272256
41	0.6829678	0.4668038	0.1055223	-0.0060771	0.0033124	0.0020000	0.0060771	0.0033124	0.0138373	1.8236703	3.038542	-2.656209	1.000000	0.000000	0.000000	1.000000
42	0.6848511	0.4666198	0.0989594	0.0018833	-0.0001840	0.0025750	0.0018833	-0.0001840	0.0006269	0.6955094	-0.731359	0.071471	1.000000	0.000000	0.000000	1.000000
43	0.6847400	0.4685377	0.0993998	-0.0001110	0.0019179	0.0040000	0.0001110	0.0019179	0.0004956	1.0285375	0.027756	-0.479478	1.000000	0.000000	0.000000	1.000000
44	0.6864165	0.4687426	0.0989227	0.0016764	0.0020050	0.0031094	0.0016764	0.0020050	0.0004772	0.4774846	-0.539152	-0.065919	1.000000	0.000000	0.000000	1.000000
45	0.6862638	0.4706800	0.0984381	-0.0001527	0.0019373	0.0040000	0.0001527	0.0019373	0.0004845	1.0482585	0.038164	-0.484335	1.000000	0.000000	0.000000	1.000000
46	0.6879769	0.4708326	0.0979634	0.0017131	0.0001726	0.0031094	0.0017131	0.0001726	0.0004747	0.4997637	-0.550948	-0.055511	1.000000	0.000000	0.000000	1.000000
47	0.6877687	0.4728205	0.0974926	-0.0002082	0.0019679	0.0040000	0.0002082	0.0019679	0.0004708	1.0739201	0.052042	-0.491968	1.000000	0.000000	0.000000	1.000000
48	0.6895315	0.4729499	0.0970176	0.0017627	0.0001295	0.0031094	0.0017627	0.0001295	0.0004750	0.5278925	-0.566908	-0.041633	1.000000	0.000000	0.000000	1.000000
49	0.6892484	0.4749511	0.0965678	-0.0002831	0.0020012	0.0040000	0.0002831	0.0020012	0.0004497	1.1079707	0.070777	-0.500294	1.000000	0.000000	0.000000	1.000000
50	0.6907671	0.47750083	0.0960876	0.0015188	0.000572	0.0025750	0.0015188	0.000572	0.0004802	0.5647621	-0.589806	-0.024980	1.000000	0.000000	0.000000	1.000000
51	0.6909069	0.4774119	0.0955389	0.0001398	0.0024036	0.0055962	0.0001398	0.0024036	0.0005487	0.9080480	-0.024980	-0.429518	0.433417	0.473660	0.473660	0.658301
52	0.7911469	0.6156390	0.0541759	0.1002400	0.1382271	0.4730887	0.1002400	0.1382271	0.0413630	0.2820867	-0.634215	0.012490	0.204618	0.294968	0.294968	0.428249
53	0.7883134	0.6176922														

Функция Розенброка (BFGS, метод парабол)

N _б	x_i	y_i	f_i	s_1	s_2	λ	$ x_i - x_{i-1} $	$ y_i - y_{i-1} $	$ f_i - f_{i-1} $	angle	∇_x	∇_u	H_{11}	H_{12}	H_{21}	H_{22}
0	-1.000000	2.000000	104.000000	NaN	-0.1583414	0.0007847	0.3111075	0.1583414	97.1543382	1.4229076	NaN	NaN	1.000000	0.000000	0.000000	1.000000
1	-1.3111075	1.8416586	6.8456618	-0.3111075	-0.1583414	0.0007847	0.3111075	0.1583414	97.1543382	1.4229076	396.482847	201.794137	0.217729	-0.411832	0.000000	1.000000
2	-1.4177628	2.0396104	5.9325508	-0.1066553	0.1979519	0.0366587	0.1066553	0.1979519	0.9127110	0.1132403	59.729999	24.513724	0.016286	-0.036351	-0.036351	0.083308
3	-1.42344506	2.0362292	5.8831012	-0.0066878	-0.0033812	0.0005598	0.0066878	0.0033812	0.498496	1.4284689	11.946000	6.039613	0.113843	-0.316856	-0.316856	0.866705
4	-1.2303335	1.493212	5.0152612	0.1941121	-0.5427080	0.3463768	0.1941121	0.5427080	0.8678400	2.7960109	-0.843769	1.465494	0.112633	-0.311384	-0.311384	0.861946
5	-1.2199205	1.4964563	4.9348538	0.0104180	0.0029351	0.0007263	0.0104180	0.0029351	0.0804074	1.9801251	-14.344081	-4.041212	0.144289	-0.350515	-0.350515	0.856422
6	-1.0158460	0.9980654	4.1784042	0.2040745	-0.4983909	0.3174922	0.2040745	0.4983909	0.7564496	2.7360065	-0.355271	1.687539	1.000000	0.000000	0.000000	1.000000
7	-0.9979960	1.0048760	3.9998734	0.0178500	-0.068106	0.0010024	0.0178500	0.068106	0.1785308	1.9868261	-17.807977	-6.794565	1.06364	-0.396251	-0.396251	0.804620
8	-0.8271766	0.6582647	3.4059480	0.1708193	-0.3466113	0.2171485	0.1708193	0.3466113	0.5939254	2.7008619	-0.466294	1.754152	0.108447	-0.208211	-0.208211	0.402435
9	-0.8101351	0.6655020	3.2850220	0.0170416	0.0072372	0.0013929	0.0170416	0.0072372	2.0522948	-12.234658	-12.234658	-5.195844	0.269347	-0.442505	-0.442505	0.732005
10	-0.6653161	0.4262293	2.8002272	0.1448189	-0.2392726	0.1479043	0.1448189	0.2392726	0.4847948	2.2848330	0.4847948	1.820766	0.155038	-0.242039	-0.242039	0.380445
11	-0.6503674	0.4326236	2.7330168	0.0149488	0.0063943	0.0019458	0.0149488	0.0063943	0.0672104	2.1504130	-7.682743	-3.286260	0.366541	-0.480658	-0.480658	0.635285
12	-0.4719954	0.1973131	2.2316249	0.1783720	-0.2353105	0.1460237	0.1783720	0.2353105	0.5013919	2.6153767	-0.799361	1.931788	0.116182	-0.139691	-0.139691	0.170918
13	-0.4496936	0.2120528	2.1112714	0.0223018	0.0147397	0.0028862	0.0223018	0.0147397	0.1203535	2.1169501	-7.727152	-5.107026	0.536004	-0.497449	-0.497449	0.466686
14	-0.3032945	0.0727550	1.7265076	0.1463991	-0.1367778	0.0927165	0.1463991	0.1367778	0.3847638	2.6334332	-1.132427	1.953993	0.160519	-0.133368	-0.133368	0.113663
15	-0.2828114	0.0901093	1.6558608	0.0204832	0.0148343	0.0044244	0.0204832	0.0148343	0.0706468	2.2063449	-4.629630	-3.352874	0.740343	-0.437349	-0.437349	0.263361
16	-0.1174431	-0.0084460	1.2981359	0.1653682	-0.0985553	0.0852126	0.1653682	0.0985553	0.3577249	2.0223462	-1.421085	2.031708	1.000000	0.000000	0.000000	1.000000
17	-0.0985302	0.0171760	1.2123453	0.0189130	0.0256220	0.0057552	0.0189130	0.0256220	0.0857906	2.0340853	-3.286260	-4.451994	1.000000	0.000000	0.000000	1.000000
18	-0.0620925	0.0115906	1.1518986	0.0364377	-0.0287666	0.0191931	0.0364377	0.0287666	0.0604468	2.2887607	-1.898481	1.498801	1.000000	0.000000	0.000000	1.000000
19	-0.0445219	0.0101006	1.0976168	0.0175707	0.0276912	0.0070028	0.0175707	0.0276912	0.0542818	2.0285344	-2.509104	-3.097522	1.000000	0.000000	0.000000	1.000000
20	-0.0181677	-0.0118663	1.0515894	0.0263542	-0.0219869	0.0135644	0.0263542	0.0219869	0.0460274	1.8669314	-1.942890	1.620926	1.000000	0.000000	0.000000	1.000000
21	-0.0001744	0.0088389	1.0081614	0.0179932	0.0207252	0.0084853	0.0179932	0.0207252	0.0434279	0.7346874	-2.120526	-2.442491	1.000000	0.000000	0.000000	1.000000
22	0.0209699	-0.0099429	0.9692800	0.0211443	-0.0187818	0.0106397	0.0211443	0.0187818	0.0388815	0.2835384	-1.987299	1.765255	1.000000	0.000000	0.000000	1.000000
23	0.0398744	0.0110372	0.9307661	0.0189045	0.0209801	0.0101055	0.0189045	0.0209801	0.0385139	0.5673534	-1.870726	-2.076117	0.996946	0.055036	0.055036	0.008068
24	0.1864994	0.0184215	0.6885501	0.1466249	0.0073843	0.0747945	0.1466249	0.0073843	0.2422160	0.0481363	-2.070566	1.887379	1.000000	0.000000	0.000000	1.000000
25	0.1887596	0.0366890	0.6582231	0.0022602	0.0182676	0.0055776	0.0022602	0.0182676	0.0303270	1.2557178	-0.405231	-3.275158	0.877123	0.327474	0.327474	0.127261
26	0.3004351	0.0783006	0.5036969	0.1116755	0.0416115	0.0783298	0.1116755	0.0416115	0.1545262	0.1017224	-1.704192	0.10942	0.198257	0.089649	0.089649	0.043944
27	0.3002450	0.0900348	0.4896584	-0.0001901	0.0117342	0.0048932	0.0001901	0.0117342	0.0140385	1.2956602	0.038858	-2.398082	0.734847	0.440313	0.440313	0.268818
28	0.4195472	0.1615324	0.3579143	0.1193023	0.0714976	0.1161045	0.1193023	0.0714976	0.1317441	0.1723804	-1.385003	-0.022204	0.171959	0.117304	0.117304	0.083462
29	0.4154984	0.1707728	0.3419903	-0.0040488	0.0092405	0.0031920	0.0040488	0.0092405	0.0159239	1.5938008	1.268430	-2.894907	0.584584	0.491556	0.491556	0.418349
30	0.5384973	0.2745355	0.2368361	0.1229989	0.1037626	0.1794155	0.1229989	0.1037626	0.1051543	0.2292997	-0.857647	-0.374700	0.161555	0.148938	0.148938	0.140858
31	0.5327625	0.2818993	0.2186859	-0.0057348	0.0073638	0.0023859	0.0057348	0.0073638	0.181501	1.7457846	2.403633	-3.086420	0.460480	0.497183	0.497183	0.541833
32	0.6400779	0.3982497	0.1426542	0.1073154	0.1163504	0.2477590	0.1073154	0.1163504	0.0760317	0.2691957	-0.523193	-0.387190	0.194195	0.222657	0.222657	0.258812
33	0.6358040	0.4026766	0.1328853	-0.0042739	0.0044269	0.0019345	0.0042739	0.0044269	0.0097689	1.7740390	2.209344	-2.288447	0.377731	0.483603	0.483603	0.624163
34	0.7188089	0.5094186	0.0843502	0.0830049	0.1067421	0.3002665	0.0830049	0.1067421	0.0485350	0.2933107	-0.330291	-0.313638	0.247127	0.328742	0.328742	0.440538
35	0.7162635	0.5118501	0.0806464	-0.0025454	0.0024315	0.0016742	0.0024315	0.0024315	0.0037038	1.7586011	1.520312	-1.452310	0.326889	0.467903	0.467903	0.674744
36	0.7987257	0.6304117	0.0462133	0.0824622	0.1185615	0.4454719	0.0824622	0.1185615	0.0344331	0.2949166	-0.227596	-0.236616	0.237691	0.352099	0.352099	0.524400
37	0.7958762	0.6325572	0.0417408	-0.0028496	0.0021456	0.0014220	0.0028496	0.0021456	0.0044725	1.8246523	2.003953	-1.508862	0.282051	0.448872	0.448872	0.719358
38	0.8743110	0.7579699	0.0195579	0.0784349	0.1254126	0.6825252	0.0784349	0.1254126	0.0217829	0.2976557	-0.133574	-0.172085	0.246819	0.402183	0.402183	0.657485
39	0.8718328	0.7595637	0.0164548	-0.0024782	0.0015939	0.0012364	0.0024782	0.0015939	0.0035031	1.8533565	2.004300	-1.289073	0.246026	0.429615	0.429615	0.755205
40	0.9331901	0.8672209	0.0057760	0.0613572	0.1076572	0.9712604	0.0613572	0.1076572	0.0106788	0.3040063	-0.071991	-0.105818	1.000000	0.000000	0.000000	1.000000
41	0.9318287	0.8680302	0.0046549	-0.0013613	0.0008092	0.0011178	0.0008092	0.0008092	0.0011211	1.8553065	1.217863	-0.723943	0.223001	0.415217	0.415217	0.778114
42	0.9722063	0.9435758	0.0010315	0.0403775	0.0755457	1.3294809	0.0403775	0.0755457	0.0036234	0.3094931	-0.034044	-0.054861	0.429853	0.821671	0.821671	1.576775
43	0.9716096	0.9439126	0.0008073	-0.0005966	0.0003368	0.0010472	0.0005966	0.0003368	0.0002242	1.8567892	0.569759	-0.321596	0.209296	0.405789	0.405789	0.791749
44	0.9960044	0.9914413	0.0005000	0.0243947	0.0475287	2.0588935	0.0243947	0.0475287	0.0007573	1.8794095	-0.012951	-0.021951	0.000000	0.000000	0.000000	1.000000
45	0.9957787	0.9915585	0.0000178	-0.0002257	0.0001172	0.0010050	0.0002257	0.0001172	0.0000322	1.8794095	0.224531	-0.116582	0.201018	0.399758	0.399758	0.799987
46	0.9999983	0.9999914	0.0000000	0.0042195	0.0084329	2.4885046	0.0042195	0.0084329	0.0000178	0.3214603	-0.001784	-0.003345	1.000000	0.000000	0.000000	1.000000
47	0.9999962	0.9999924	0.0000000	-0.0000020	0.0000010	0.0009992	0.0000020	0.0000010	0.0000000	1.8918663	0.002039	-0.001021	1.000000	0.000000	0.000000	1.000000

Вывод

BFGS совершает меньшее количество итераций, чем метод многогранников и производит меньше вычислений функций (но это связано с неоптимальной реализацией алгоритма, в теории должно быть меньше вычислений). Правильно выбранная начальная точка может сильно сократить объём вычислений для BFGS, но не для метода многогранников. Точность вычислений не влияет на количество итераций у BFGS, но увеличение точности для метода многогранников увеличивает количество итераций. Метод парабол позволяет сойтись BFGS за меньшее количество итераций, но требует больше вычислений целевой функции.

Листинги

simplex_algorithm.py

```
1 import numpy as np
2 from math import sqrt
3
4 #-----
5 # General computation class
6 #-----
7 class SimplexMethod:
8     iters = 0
9     calcs = 0
10
11     def __init__(self, n, f, t=1., max_iters=100, x0=None, alpha=1.,
12         ↪ beta=.5, gamma=2.0, omega=.5, eps=1e-7):
13         # n is number of dimensions
14         # f is function taken numpy array as arg with n variables
15         # t is edge length
16         # max_iters is max possible iterations
17         self.n = n
18         self.f = f
19         self.max_iters = max_iters
20         self.alpha = alpha
21         self.beta = beta
22         self.gamma = gamma
23         self.omega = omega
24         self.eps = eps
25
26         # Compute simplex coefficients
27         d1 = t / (n * sqrt(2.)) * (sqrt(n + 1.) + n - 1.)
28         d2 = t / (n * sqrt(2.) * (sqrt(n + 1.) - 1.))
29
30         # Setup begining coordinates
31         self.x = np.array([[d1 if j == i else d2 for j in range(n+1)] for
32             ↪ i in range(1,n+1)])
33         self.x[:,0] = np.zeros(n)
```

```

33     if not x0 is None:
34         self.x[0,0] = x0[0]
35         self.x[0,1] = x0[1]
36
37     self.finished = False
38     self.x_min = self.x[:,0]
39
40     def __iter__(self):
41         self.calcs = 0
42         self.iters = 0
43         return self
44
45     def __next__(self):
46         self.iters += 1
47
48         if self.finished:
49             raise StopIteration
50
51         # Sort verteces by function values
52         self.x_res = self.f(self.x)
53         self.calcs += self.n
54         self.x = self.x.take(self.x_res.argsort(), 1)
55         self.x_res = self.x_res.take(self.x_res.argsort())
56         self.s_k = self.x_min - self.x[:,0]
57         self.x_min = self.x[:,0]
58
59
60         # Calculate centroid
61         x_o = np.sum(self.x[:, :-1], 1) / self.n
62
63         self.calcs += 1
64         if np.sqrt(np.sum(np.power(self.x_res - self.f(x_o), 2)) / (self.n
65             ↪ + 1)) < self.eps:
66             self.finished = True
67             return self.x_min
68
69         # Calculate reflected point
70         x_r = x_o + self.alpha * (x_o - self.x[:, -1])
71         self.calcs += 1
72         x_r_res = self.f(x_r)
73
74         if self.x_res[0] ≤ x_r_res and x_r_res < self.x_res[-2]:
75             self.x[:, -1] = x_r
76             return self.termination()
77
78         # Calculate expanded point
79         elif x_r_res < self.x_res[0]:
80             x_e = x_o + self.gamma * (x_r - x_o)

```

```

81         self.calcs += 1
82         if self.f(x_e) < x_r_res:
83             self.x[:, -1] = x_e
84             return self.termination()
85
86         else:
87             self.x[:, -1] = x_r
88             return self.termination()
89
90         # Calculate contracted point
91         else:
92             if x_r_res < self.x_res[-1]:
93                 x_c = x_o + self.beta * (x_r - x_o)
94
95             else:
96                 x_c = x_o + self.beta * (self.x[:, -1] - x_o)
97
98             self.calcs += 1
99             if self.f(x_c) < x_r_res:
100                 self.x[:, -1] = x_c
101                 return self.termination()
102
103         # Shrink
104         self.x[:, 1:] = self.x[:, 0] + self.omega * (self.x[:, 1:] -
105             ↪ self.x[:, 0])
106
107         return self.termination()
108
109     def termination(self):
110         if self.iters > self.max_iters:
111             raise StopIteration
112         return self.x_min

```

BFGS_algorithm.py

```

1  import numpy as np
2
3  from linear_search import FibonacciSearch, QuadraticInterpolationSearch
4  from interval_search import IntervalSearch
5
6  class BFGSMethod:
7      iters = 0
8      calcs = 0
9
10     def __init__(self, n, f, eps=1e-7, h=1e-14, x0=None, max_iters=5):
11         # n is number of dimensions
12         # f is function taken numpy array as arg with n variables
13         # t is edge length

```

```

14     # max_iters is max possible iterations
15     self.n = n
16     self.f = f
17     self.eps = eps
18     self.h = h
19     self.max_iters = max_iters
20
21     self.H_k = np.eye(n) # approx matrix
22
23     if x0 is None:
24         self.x_k = np.ones(n)
25
26     elif x0.shape != (n,):
27         raise ValueError('Initial approx vector has invalid shape:
28             ↪ needed ({}, 1), but {} was given'.format(n, x0.shape))
29
30     else:
31         self.x_k = x0
32
33     def __iter__(self):
34         self.calcs = 0
35         self.iters = 0
36         return self
37
38     def __next__(self):
39         self.iters += 1
40
41         if self.iters % self.n == 0:
42             self.H_k = np.eye(self.n)
43
44         grad_xk = self.grad(self.x_k, self.h)
45         self.g = grad_xk
46
47         if np.linalg.norm(grad_xk) < self.eps:
48             raise StopIteration
49
50         if self.iters ≥ self.max_iters:
51             raise StopIteration
52
53         p_k = -np.dot(self.H_k, grad_xk)
54
55         interval = IntervalSearch(0., p_k, self.x_k, self.f, eps=self.eps)
56         a, b = interval.compute()
57
58         minimizer = FibonacciSearch(a, b, p_k, self.x_k, self.f,
59             ↪ eps=self.eps)
60         self.alpha = minimizer.compute()

```

```

61     print(self.alpha)
62
63     x_k1 = self.x_k + self.alpha * p_k
64
65     self.calcs += interval.calcs
66     self.calcs += minimizer.calcs
67
68     grad_xk1 = self.grad(x_k1, self.h)
69
70     self.s_k = x_k1 - self.x_k
71     y_k = grad_xk1 - grad_xk
72
73     if np.equal(self.s_k, self.alpha * p_k).all():
74         self.H_k = np.eye(self.n)
75
76     btm = np.dot((self.s_k - self.H_k @ y_k), y_k)
77
78     if btm == 0.:
79         self.x_k = x_k1
80         self.H_k = np.eye(self.n)
81
82         return self.x_k
83
84     self.H_k += (self.s_k - self.H_k @ y_k)[:, np.newaxis] * \
85         (self.s_k - self.H_k @ y_k)[np.newaxis] / btm
86
87     self.x_k = x_k1
88
89     return self.x_k
90
91     def grad(self, x, h):
92         n = np.size(x, 0)
93         g = np.zeros(n)
94         hx = np.zeros(n)
95
96         for i in range(0, n):
97             hx[i] = h
98             g[i] = (self.f(x + hx) - self.f(x - hx)) / (2. * h)
99             hx[i] = 0.
100             self.calcs += 2
101
102
103     return g

```

linear_search.py

```

1  from math import log, sqrt, fabs
2

```

```

3 class QuadraticInterpolationSearch:
4     iters = 0
5     calcs = 0
6
7     def __init__(self, a0, b0, dx, X0, f, eps=1e-7, max_iters=10000):
8         self.f = f
9         self.ai = a0
10        self.bi = b0
11        self.dx = dx
12        self.X0 = X0
13        self.eps = eps
14        self.max_iters = max_iters
15
16        self.x0 = (a0 + b0) / 2.
17        self.h = (b0 - a0) / 2.
18        self.xk = 0.0
19
20
21    def __iter__(self):
22        self.iters = 0
23        return self
24
25    def __next__(self):
26        self.iters += 1
27
28        if (fabs(self.xk - self.x0) < self.eps):
29            raise StopIteration
30
31        else:
32            self.x0 = self.xk
33
34        self.x1 = self.x0 - self.h
35        self.x2 = self.x0 + self.h
36
37        c = (self.f(self.X0 + self.x1 * self.dx) - \
38             2. * self.f(self.X0 + self.x0 * self.dx) + \
39             self.f(self.X0 + self.x2 * self.dx)) / \
40            (2. * self.h * self.h)
41
42        b = (-self.f(self.X0 + self.x1 * self.dx) * \
43            (2. * self.x0 + self.h) + 4. * self.f(self.X0 + self.x0 * \
44            ↪ self.dx) * \
45            self.x0 - self.f(self.X0 + self.x2 * self.dx) * \
46            (2. * self.x0 - self.h)) / (2. * self.h * self.h)
47
48        self.xk = -b / (2. * c)
49
50        if self.iters ≥ self.max_iters:
51            raise StopIteration

```

```

51         return self.iters
52
53     def compute(self):
54         for i in self:
55             pass
56         return (self.ai + self.bi) / 2.
57
58
59 class FibonacciSearch:
60     iters = 0
61     Fib = lambda n: (((1. + sqrt(5.)) / 2.) ** n - ((1. - sqrt(5.)) / 2.)
62         ↪ ** n) / sqrt(5.)
63
64     def __init__(self, a0, b0, dx, X0, f, eps=1e-7, max_iters=10000):
65         self.f = f
66         self.ai = a0
67         self.bi = b0
68         self.dx = dx
69         self.X0 = X0
70         self.eps = eps
71         self.delta = eps / 10.
72
73         n = 0
74
75         while (b0 - a0) / eps ≥ FibonacciSearch.Fib(n + 2):
76             n += 1
77
78         self.max_iters = max_iters if max_iters < n else n
79
80         self.x1 = self.ai + FibonacciSearch.Fib(self.max_iters-2) * \
81             (self.bi - self.ai) / FibonacciSearch.Fib(self.max_iters)
82         self.x2 = self.ai + FibonacciSearch.Fib(self.max_iters-1) * \
83             (self.bi - self.ai) / FibonacciSearch.Fib(self.max_iters)
84
85         self.f_x1 = self.f(X0 + self.x1 * dx)
86         self.f_x2 = self.f(X0 + self.x2 * dx)
87
88         self.calcs = 2
89
90     def __iter__(self):
91         self.iters = 0
92         return self
93
94     def __next__(self):
95         self.iters += 1
96
97         # Algorithm from Wikipedia
98         if self.f_x1 < self.f_x2:
99             self.bi = self.x2

```

```

99         self.x2 = self.x1
100         self.x1 = self.ai + FibonacciSearch.Fib(self.max_iters -
    ↪     self.iters + 0) / \
101             FibonacciSearch.Fib(self.max_iters - self.iters + 2) *
    ↪     (self.bi - self.ai)
102         self.f_x2 = self.f_x1
103         self.f_x1 = self.f(self.X0 + self.x1 * self.dx)
104
105     else:
106         self.ai = self.x1
107         self.x1 = self.x2
108         self.x2 = self.ai + FibonacciSearch.Fib(self.max_iters -
    ↪     self.iters + 1) / \
109             FibonacciSearch.Fib(self.max_iters - self.iters + 2) *
    ↪     (self.bi - self.ai)
110         self.f_x1 = self.f_x2
111         self.f_x2 = self.f(self.X0 + self.x2 * self.dx)
112
113     self.calcs += 1
114
115     if self.iters ≥ self.max_iters:
116         raise StopIteration
117     return (self.ai + self.bi) / 2.
118
119     def compute(self):
120         for i in self:
121             pass
122         return (self.ai + self.bi) / 2.

```

interval_search.py

```

1  import numpy as np
2
3  class IntervalSearch:
4      iters = 0
5
6      def __init__(self, x0, dx, X0, f, eps=1e-7, max_iters=100):
7          self.f = f
8          self.xk1 = x0
9          self.eps = eps
10         self.max_iters = max_iters
11         self.dx = dx
12         self.X0 = X0
13
14         self.h = eps if f(X0 + x0 * dx) > f(X0 + (x0 + eps) * dx) else -eps
15         self.calcs = 2
16
17         self.xk0 = x0

```



```

18         self.xk2 = self.xk1 + self.h
19
20     def __iter__(self):
21         self.iters = 0
22         return self
23
24     def __next__(self):
25         self.calcs += 2
26         if self.f(self.X0 + self.xk1 * self.dx) ≤ \
27             self.f(self.X0 + (self.xk2 + self.eps) * self.dx):
28             raise StopIteration
29
30         if self.iters ≥ self.max_iters:
31             raise Exception("There is no extremum.")
32
33         self.iters += 1
34
35         self.h *= 2.
36         self.xk0 = self.xk1
37         self.xk1 = self.xk2
38         self.xk2 = self.xk1 + self.h
39
40         return (self.xk0, self.xk2) if self.xk0 ≤ self.xk2 else
41             ↪ (self.xk2, self.xk0)
42
43     def compute(self):
44         for i in self:
45             pass
46         return (self.xk0, self.xk2) if self.xk0 ≤ self.xk2 else
47             ↪ (self.xk2, self.xk0)

```

graphics.py

```

1 import numpy as np
2 import matplotlib.pyplot as plt
3 import matplotlib.ticker as ticker
4 from decimal import Decimal as dcm
5
6 def rosen():
7     xList = np.arange(-10, 10, 0.05)
8     yList = np.arange(-10, 10, 0.05)
9     X, Y = np.meshgrid(xList, yList)
10
11     Z = 100 * (Y - X**2)**2 + (1 - X)**2
12
13     return X, Y, Z
14

```

```

15 def quadratic():
16     xList = np.arange(-10, 10, 0.05)
17     yList = np.arange(-10, 10, 0.05)
18     X, Y = np.meshgrid(xList, yList)
19
20     Z = 100 * (Y - X)**2 + (1 - X)**2
21
22     return X, Y, Z
23
24 def variant():
25     xList = np.arange(-10, 10, 0.05)
26     yList = np.arange(-10, 10, 0.05)
27     X, Y = np.meshgrid(xList, yList)
28
29     x1 = 1 + (X - 2)**2 + ((Y - 2) / 2)**2
30     x2 = 1 + ((X - 2)/3)**2 + (Y - 3)**2
31     Z = (3.0/x1) + (2.0/x2)
32
33     return X, Y, Z
34
35
36 def testing(num):
37     switch = {
38         "1": rosen(),
39         "2": quadratic(),
40         "3": variant(),
41     }
42     return switch.get(num, "Invalid input")
43
44 def main():
45     x = []
46     y = []
47
48     with open("coords.txt") as file:
49         for line in file:
50             xC, yC = line.split()
51             x.append(dcm(xC))
52             y.append(dcm(yC))
53
54     _levels = np.arange(0, 900, 30)
55     figure, axes = plt.subplots(1, 1)
56
57     num = input("Enter the test: \n1) Rosenbrock \n2) Quadratic \n3)
58         ↵ Function for 8 variant\n")
59
60     X, Y, Z = testing(num)
61
62     plt.xlim(-5, 5)
63     plt.ylim(-5, 5)

```

```

63 axes.xaxis.set_major_locator(ticker.MultipleLocator(1))
64 axes.xaxis.set_minor_locator(ticker.MultipleLocator(1))
65 axes.yaxis.set_major_locator(ticker.MultipleLocator(1))
66 axes.yaxis.set_minor_locator(ticker.MultipleLocator(1))
67
68 plt.xlabel("x1")
69 plt.ylabel("x2")
70
71
72 plt.plot(x, y, '-o', markersize=6, color='c')
73 plt.plot(x[-1], y[-1], 'o', markersize=9, color='r')
74
75 _contourf = axes.contourf(X, Y, Z, levels=_levels, extend='max')
76 cs = _contourf
77 cs.cmap.set_over('blue', alpha = 0.2)
78 cs.changed()
79
80 figure.colorbar(_contourf, shrink=1)
81
82 plt.grid()
83 axes.set_aspect(1)
84 plt.savefig('kek.eps')
85
86 if __name__ == "__main__":
87     main()

```