

# Numerical Optimization

Project 1 - Phase 2

Group 27

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## Implemented Tasks

1. Newton method
  - Eigenvalue Modification
  - No Modification
2. Linear Conjugate Gradient method
3. Non-Linear Conjugate Gradient method
  - Fletcher-Reeves method
  - Polak-Ribiere method
4. Quasi Newton method
  - BFGS
  - SR1
  - SR1 [within trust region framework]
5. Approximations
  - Gradient
  - Hessian

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Notes:

\* All runs are located in separate files by section for better readability.

\* Runs were limited to 1000 maximum iterations for file size limit. [reached 500 mbs]

# 1 Newton Method

## 1.1 Exact Solutions

All the runs are located in file "1.1 exact\_newton.txt"

### 1.1.1 Rosenbrock Function

#### 1. Starting point [1.2, 1.2]:

- Number of iterations: 8
- Final iterate  $\bar{x} \approx [1.0000000000000031, 1.0000000000000497]$
- $\nabla f(\bar{x}) \approx [7.801329535194528e - 07, -2.778961505356392e - 07]$
- $\|\nabla f(\bar{x})\| \approx 8.281507686704827e - 07$
- Distance  $\|\bar{x} - x^*\| \approx 5.865340917345583e - 14$

#### 1. Starting point [-1.2, 1.]:

- Number of iterations: 22
- Final iterate  $\bar{x} \approx [1.0, 1.0]$
- $\nabla f(\bar{x}) \approx [1.8439960666621747e - 10, -1.751043754438797e - 10]$
- $\|\nabla f(\bar{x})\| \approx 2.5429266060633147e - 10$
- Distance  $\|\bar{x} - x^*\| \approx 0.0$

#### 1. Starting point [0.2, 0.8]:

- Number of iterations: 14
- Final iterate  $\bar{x} \approx [1.0, 1.0]$
- $\nabla f(\bar{x}) \approx [1.3306467039102766e - 11, -1.4765966227514582e - 11]$
- $\|\nabla f(\bar{x})\| \approx 1.9877017474833328e - 11$
- Distance  $\|\bar{x} - x^*\| \approx 0.0$

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### 1.1.2 Quadratic Function

#### 1. Starting point [-0.2, 1.2]:

- Number of iterations: 29
- Final iterate  $\bar{x} \approx [-4.427683987331849e - 10, 1.0000000003900889]$
- $\nabla f(\bar{x}) \approx [-5.307632856456589e - 07, 2.2351740590584064e - 09]$
- $\|\nabla f(\bar{x})\| \approx 5.307679920572167e - 07$
- Distance  $\|\bar{x} - x^*\| \approx 5.900958955097454e - 10$

1. **Starting point [3.8, 0.1]:**

- Number of iterations: 19
- Final iterate  $\bar{x} \approx [4.000000381469727, -9.624910007318629e - 27]$
- $\nabla f(\bar{x}) \approx [1.9073486323684108e - 07, 7.629394529473644e - 07]$
- $\|\nabla f(\bar{x})\| \approx 7.864199876132347e - 07$
- Distance  $\|\bar{x} - x^*\| \approx 3.8146972691777137e - 07$

1. **Starting point [1.9, 0.6]:**

- Number of iterations: 30
  - Final iterate  $\bar{x} \approx [7.371031656641207e - 10, 0.9999999998855734]$
  - $\nabla f(\bar{x}) \approx [8.846634969683159e - 07, 5.587945520259472e - 10]$
  - $\|\nabla f(\bar{x})\| \approx 8.846636734485942e - 07$
  - Distance  $\|\bar{x} - x^*\| \approx 7.459319800676289e - 10$
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## 1.2 Approximated Solutions

All the runs are located in file "1.2 approx\_newton.txt"

\* Using Eigenvalue Modification.

### 1.2.1 Rosenbrock Function

1. **Starting point [1.2, 1.2]:**

- Number of iterations: 8
- Final iterate  $\bar{x} \approx [0.9999999998000344, 0.9999999996000563]$
- $\nabla f(\bar{x}) \approx [7.802436394697449e - 07, -2.7793448652924537e - 07]$
- $\|\nabla f(\bar{x})\| \approx 8.282679009446572e - 07$
- Distance  $\|\bar{x} - x^*\| \approx 4.471478950333974e - 10$

1. **Starting point [-1.2, 1.]:**

- Number of iterations: 22
- Final iterate  $\bar{x} \approx [0.9999999998000044, 0.9999999996000088]$
- $\nabla f(\bar{x}) \approx [8.815237416425712e - 11, -8.786305016742868e - 11]$
- $\|\nabla f(\bar{x})\| \approx 1.2446186827908086e - 10$
- Distance  $\|\bar{x} - x^*\| \approx 4.472037023659638e - 10$

1. **Starting point [0.2, 0.8]:**

- Number of iterations: 9

- Final iterate  $\bar{x} \approx [0.9999999998000817, 0.9999999996001488]$
  - $\nabla f(\bar{x}) \approx [8.05758870355523e - 07, -2.8192445044395916e - 07]$
  - $\|\nabla f(\bar{x})\| \approx 8.53656109282177e - 07$
  - Distance  $\|\bar{x} - x^*\| \approx 4.470439265151773e - 10$
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### 1.2.2 Quadratic Function

#### 1. Starting point [-0.2, 1.2]:

- Number of iterations: 6
- Final iterate  $\bar{x} \approx [-6.516034754523722e - 19, 1.0]$
- $\nabla f(\bar{x}) \approx [-2.993882863120485e - 08, 1.0060964953284623e - 08]$
- $\|\nabla f(\bar{x})\| \approx 3.158411745798626e - 08$
- Distance  $\|\bar{x} - x^*\| \approx 6.516034754523722e - 19$

#### 1. Starting point [3.8, 0.1]:

- Number of iterations: 8
- Final iterate  $\bar{x} \approx [4.0, 9.244834619306816e - 20]$
- $\nabla f(\bar{x}) \approx [8.437694991091607e - 15, 5.3985828940939125e - 12]$
- $\|\nabla f(\bar{x})\| \approx 5.398589487921837e - 12$
- Distance  $\|\bar{x} - x^*\| \approx 9.244834619306816e - 20$

#### 1. Starting point [1.9, 0.6]:

- Number of iterations: 8
- Final iterate  $\bar{x} \approx [4.0, 9.259077933451737e - 20]$
- $\nabla f(\bar{x}) \approx [4.4408920872884515e - 16, -7.475231195641711e - 15]$
- $\|\nabla f(\bar{x})\| \approx 7.488410822972015e - 15$
- Distance  $\|\bar{x} - x^*\| \approx 9.259077933451737e - 20$

## 2 Conjugate Gradient Method [Linear]

### 2.1 Exact Solutions

All the runs are located in file "2.1 exact\_cg\_linear.txt"

#### 2.1.1 Rosenbrock Function

##### 1. Starting point [1.2, 1.2]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [-1.3439864598640971, 1.6394023156614814]$
- $\nabla f(\bar{x}) \approx [-94.41105136594786, -33.37945772730939]$
- $\|\nabla f(\bar{x})\| \approx 100.13807876224148$
- Distance  $\|\bar{x} - x^*\| \approx 2.4296312159048927$
- $\alpha \approx 9.473244919935914e - 08$

##### 1. Starting point [-1.2, 1.]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [25.93328313588868, 664.4834137702009]$
- $\nabla f(\bar{x}) \approx [83573.29981758706, -1610.3520871934734]$
- $\|\nabla f(\bar{x})\| \approx 83588.81310465549$
- Distance  $\|\bar{x} - x^*\| \approx 663.9517369177477$
- $\alpha \approx 2.8876742852435617e - 10$

##### 1. Starting point [0.2, 0.8]:

- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [9.818929297187877, 87.05171572669302]$
  - $\nabla f(\bar{x}) \approx [36778.361269383706, -1871.931363296278]$
  - $\|\nabla f(\bar{x})\| \approx 36825.96889004003$
  - Distance  $\|\bar{x} - x^*\| \approx 86.50243518801297$
  - $\alpha \approx 2.9293646396947243e - 10$
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### 2.1.2 Quadratic Function

#### 1. Starting point [-0.2, 1.2]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [-0.00013099340897818518, 1.1461152100959844]$
- $\nabla f(\bar{x}) \approx [0.04284026256436663, 0.5843357469261601]$
- $\|\nabla f(\bar{x})\| \approx 0.5859040478033389$
- Distance  $\|\bar{x} - x^*\| \approx 0.14611526881427161$
- $\alpha \approx 3.405561869024827e - 08$

#### 1. Starting point [3.8, 0.1]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [3.999746852921016, 5.604964650524923e - 08]$
- $\nabla f(\bar{x}) \approx [-6.323071256023153e - 05, 1.6081370774433492e - 05]$
- $\|\nabla f(\bar{x})\| \approx 6.524364717625329e - 05$
- Distance  $\|\bar{x} - x^*\| \approx 0.0002531470851889546$
- $\alpha \approx 1.0892257588598292e - 05$

#### 1. Starting point [1.9, 0.6]:

- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [3.9974718646554854, 5.938187563088533e - 07]$
  - $\nabla f(\bar{x}) \approx [-0.0006314391716175313, 0.00032096808935862427]$
  - $\|\nabla f(\bar{x})\| \approx 0.0007083332138475224$
  - Distance  $\|\bar{x} - x^*\| \approx 0.0025281354142538573$
  - $\alpha \approx 1.4205276716883149e - 05$
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## 2.2 Approximated Solutions

All the runs are located in file "2.2 approx\_cg\_linear.txt"

### 2.2.1 Rosenbrock Function

#### 1. Starting point [1.2, 1.2]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [-1.3435915482324658, 1.6383313144228253]$
- $\nabla f(\bar{x}) \approx [-94.3890814673054, -33.381386809416824]$
- $\|\nabla f(\bar{x})\| \approx 100.11800879742627$

- Distance  $\|\bar{x} - x^*\| \approx 2.428968548976997$
- alpha  $\approx 9.470949492146962e - 08$

1. **Starting point [-1.2, 1.]:**

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [25.894010079262813, 661.7831723657958]$
- $\nabla f(\bar{x}) \approx [90332.73052045843, -1743.3171196898911]$
- $\|\nabla f(\bar{x})\| \approx 90349.55095550594$
- Distance  $\|\bar{x} - x^*\| \approx 661.2519282539987$
- alpha  $\approx 2.1016912122169093e - 10$

1. **Starting point [0.2, 0.8]:**

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [9.84327459748534, 87.53707308978255]$
- $\nabla f(\bar{x}) \approx [36843.27343853511, -1870.5963375396095]$
- $\|\nabla f(\bar{x})\| \approx 36890.729571596756$
- Distance  $\|\bar{x} - x^*\| \approx 86.98774927857886$
- alpha  $\approx 3.1730384284222637e - 10$

### 2.2.2 Quadratic Function

1. **Starting point [-0.2, 1.2]:**

- Number of iterations: 21
- Final iterate  $\bar{x} \approx [-4.833003494058178e - 10, 1.000000015038993]$
- $\nabla f(\bar{x}) \approx [-1.1515377344982489e - 07, 1.1934534212025934e - 07]$
- $\|\nabla f(\bar{x})\| \approx 1.6584240177209008e - 07$
- Distance  $\|\bar{x} - x^*\| \approx 1.5046756722730036e - 08$

1. **Starting point [3.8, 0.1]:**

- Number of iterations: 20
- Final iterate  $\bar{x} \approx [4.000000238598754, -1.342889995353454e - 10]$
- $\nabla f(\bar{x}) \approx [1.190307990333904e - 07, -1.684640791450059e - 07]$
- $\|\nabla f(\bar{x})\| \approx 2.062728219632974e - 07$
- Distance  $\|\bar{x} - x^*\| \approx 2.3859879187810766e - 07$

1. **Starting point [1.9, 0.6]:**

- Number of iterations: 20
- Final iterate  $\bar{x} \approx [8.535169233797172, -0.00024370879375275887]$
- $\nabla f(\bar{x}) \approx [2.267249278986583, 3.7421978995588745]$
- $\|\nabla f(\bar{x})\| \approx 4.37543876800122$
- Distance  $\|\bar{x} - x^*\| \approx 4.5351692403453265$
- $\alpha \approx 3.5061282166303206e - 09$



### 3 Conjugate Gradient Method [NonLinear]

#### 3.1 Fletcher-Reeves Method

##### 3.1.1 Exact Solutions

All the runs are located in file "3.1.1 exact\_cg\_nonlinear\_fr.txt"

##### 1. Rosenbrock Function:

###### (a) Starting point [1.2, 1.2]:

- Number of iterations: 42
- Final iterate  $\bar{x} \approx [1.0000002499766405, 1.0000005022142877]$
- $\nabla f(\bar{x}) \approx [2.066543628209518e-06, -7.80724018767387e-07]$
- $\|\nabla f(\bar{x})\| \approx 2.209102206955047e-06$
- Distance  $\|\bar{x} - x^*\| \approx 5.609879781037809e-07$

###### (b) Starting point [-1.2, 1.]:

- Number of iterations: 43
- Final iterate  $\bar{x} \approx [1.0000010805700774, 1.0000021656249312]$
- $\nabla f(\bar{x}) \approx [-9.219940274208115e-06, 5.665549629441102e-06]$
- $\|\nabla f(\bar{x})\| \approx 1.082154107618804e-05$
- Distance  $\|\bar{x} - x^*\| \approx 2.420240284490937e-06$

###### (c) Starting point [0.2, 0.8]:

- Number of iterations: 48
- Final iterate  $\bar{x} \approx [1.0000002161220691, 1.0000004332591392]$
- $\nabla f(\bar{x}) \approx [6.703775802508991e-06, -3.148942440134306e-06]$
- $\|\nabla f(\bar{x})\| \approx 7.406513923674488e-06$
- Distance  $\|\bar{x} - x^*\| \approx 0.0009903520314283058$

##### 2. Quadratic Function:

###### (a) Starting point [-0.2, 1.2]:

- Number of iterations: 8
- Final iterate  $\bar{x} \approx [0.009337441078452807, 0.806294333149626]$
- $\nabla f(\bar{x}) \approx [3.4669618112563794, -0.7441177288828611]$
- $\|\nabla f(\bar{x})\| \approx 3.5459181314784893$
- Distance  $\|\bar{x} - x^*\| \approx 0.1939305885512692$

###### (b) Starting point [3.8, 0.1]:

- Number of iterations: 22
- Final iterate  $\bar{x} \approx [3.7939040327469202, 8.130189902116892e-05]$
- $\nabla f(\bar{x}) \approx [-0.05142764329362186, 0.1452999740081748]$
- $\|\nabla f(\bar{x})\| \approx 0.15413268615550785$

- Distance  $\|\bar{x} - x^*\| \approx 0.20609598328929488$
- (c) **Starting point [1.9, 0.6]:**
- Number of iterations: 9
  - Final iterate  $\bar{x} \approx [1.4904943812377376, 0.006396595283162027]$
  - $\nabla f(\bar{x}) \approx [-0.5843883829102441, 1.7792327347216323]$
  - $\|\nabla f(\bar{x})\| \approx 1.8727463539907023$
  - Distance  $\|\bar{x} - x^*\| \approx 2.509513771038243$
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### 3.1.2 Approximated Solutions

All the runs are located in file "3.1.2 approx\_cg\_nonlinear\_fr.txt"

#### 1. Rosenbrock Function:

- (a) **Starting point [1.2, 1.2]:**
- Number of iterations: 51
  - Final iterate  $\bar{x} \approx [0.9999996309579877, 0.9999992592423275]$
  - $\nabla f(\bar{x}) \approx [-1.7275594154366476e-06, 4.921685725775551e-07]$
  - $\|\nabla f(\bar{x})\| \approx 1.7962993730714375e-06$
  - Distance  $\|\bar{x} - x^*\| \approx 8.275952732156662e-07$
- (b) **Starting point [-1.2, 1.]:**
- Number of iterations: 52
  - Final iterate  $\bar{x} \approx [0.9999995610283555, 0.9999991221303434]$
  - $\nabla f(\bar{x}) \approx [1.0209245293784626e-05, -5.512538214643864e-06]$
  - $\|\nabla f(\bar{x})\| \approx 1.1602446597014463e-05$
  - Distance  $\|\bar{x} - x^*\| \approx 9.81504579050044e-07$
- (c) **Starting point [0.2, 0.8]:**
- Number of iterations: 45
  - Final iterate  $\bar{x} \approx [1.0000006596417301, 1.0000013234346878]$
  - $\nabla f(\bar{x}) \approx [3.787732271796431e-06, -1.2310122697964804e-06]$
  - $\|\nabla f(\bar{x})\| \approx 3.982751181180872e-06$
  - Distance  $\|\bar{x} - x^*\| \approx 1.4787178855686127e-06$

#### 2. Quadratic Function:

- (a) **Starting point [-0.2, 1.2]:**
- Number of iterations: 29
  - Final iterate  $\bar{x} \approx [1.8182928549841966e-09, 0.9999999917470224]$
  - $\nabla f(\bar{x}) \approx [-3.8109549169690315e-06, -6.679081684910364e-08]$

- $\|\nabla f(\bar{x})\| \approx 3.811540160143378e - 06$
  - Distance  $\|\bar{x} - x^*\| \approx 8.450906977604731e - 09$
- (b) **Starting point [3.8, 0.1]:**
- Number of iterations: 129
  - Final iterate  $\bar{x} \approx [3.9999999852107178, -1.2162441527703464e - 10]$
  - $\nabla f(\bar{x}) \approx [-6.666551434344903e - 09, 2.458469843069588e - 06]$
  - $\|\nabla f(\bar{x})\| \approx 2.4584788817865876e - 06$
  - Distance  $\|\bar{x} - x^*\| \approx 1.4789782343576279e - 08$
- (c) **Starting point [1.9, 0.6]:**
- Number of iterations: 107
  - Final iterate  $\bar{x} \approx [4.000000224426159, -2.365522071938385e - 10]$
  - $\nabla f(\bar{x}) \approx [1.1291264469076883e - 07, 1.0933820377977017e - 06]$
  - $\|\nabla f(\bar{x})\| \approx 1.0991967730619112e - 06$
  - Distance  $\|\bar{x} - x^*\| \approx 2.2442628410087405e - 07$
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## 3.2 Polak-Ribiere Method

### 3.2.1 Exact Solutions

All the runs are located in file "3.2.1 exact\_cg\_nonlinear\_pr.txt"

#### 1. Rosenbrock Function:

- (a) **Starting point [1.2, 1.2]:**
- Number of iterations: 62
  - Final iterate  $\bar{x} \approx [1.000000146435967, 1.0000002947949158]$
  - $\nabla f(\bar{x}) \approx [-4.7631236183420384e - 07, 3.8459209150687457e - 07]$
  - $\|\nabla f(\bar{x})\| \approx 6.121964904225682e - 07$
  - Distance  $\|\bar{x} - x^*\| \approx 3.29161867160577e - 07$
- (b) **Starting point [-1.2, 1.]:**
- Number of iterations: 56
  - Final iterate  $\bar{x} \approx [1.00000026139386, 1.0000005244568229]$
  - $\nabla f(\bar{x}) \approx [-1.4482633002275743e - 07, 3.338069376468411e - 07]$
  - $\|\nabla f(\bar{x})\| \approx 3.638704954912155e - 07$
  - Distance  $\|\bar{x} - x^*\| \approx 5.859878062143473e - 07$
- (c) **Starting point [0.2, 0.8]:**
- Number of iterations: 77

- Final iterate  $\bar{x} \approx [1.000000639402956, 1.0000012824849385]$
- $\nabla f(\bar{x}) \approx [-1.9264217092665674e-07, 7.357235709548604e-07]$
- $\|\nabla f(\bar{x})\| \approx 7.605262512746728e-07$
- Distance  $\|\bar{x} - x^*\| \approx 1.433040040415721e-06$

## 2. Quadratic Function:

### (a) Starting point [-0.2, 1.2]:

- Number of iterations: 46
- Final iterate  $\bar{x} \approx [4.773710630206499e-10, 1.000000021534833]$
- $\nabla f(\bar{x}) \approx [3.0807682593432987e-07, 8.66167032116146e-08]$
- $\|\nabla f(\bar{x})\| \approx 3.200215367018606e-07$
- Distance  $\|\bar{x} - x^*\| \approx 2.1540123413572898e-08$

### (b) Starting point [3.8, 0.1]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [3.7947821569126825, 9.462483837924252e-05]$
- $\nabla f(\bar{x}) \approx [-0.05118944916446478, 0.20395050736448816]$
- $\|\nabla f(\bar{x})\| \approx 0.21027641132564887$
- Distance  $\|\bar{x} - x^*\| \approx 0.20521786490281713$

### (c) Starting point [1.9, 0.6]:

- Number of iterations: 9
- Final iterate  $\bar{x} \approx [1.371954568102016, 0.009184729550996003]$
- $\nabla f(\bar{x}) \approx [-0.5783843876835827, 2.5951063726842376]$
- $\|\nabla f(\bar{x})\| \approx 2.658778965138406$
- Distance  $\|\bar{x} - x^*\| \approx 2.628061481658446$

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### 3.2.2 Approximated Solutions

All the runs are located in file "3.2.2 approx\_cg\_nonlinear\_pr.txt"

#### 1. Rosenbrock Function:

##### (a) Starting point [1.2, 1.2]:

- Number of iterations: 57
- Final iterate  $\bar{x} \approx [0.9999997437575463, 0.9999994866576619]$
- $\nabla f(\bar{x}) \approx [-1.6908650808487344e-07, -1.7149925924324796e-07]$
- $\|\nabla f(\bar{x})\| \approx 2.4083654859119443e-07$
- Distance  $\|\bar{x} - x^*\| \approx 5.737425826499231e-07$

##### (b) Starting point [-1.2, 1.]:

- Number of iterations: 68
- Final iterate  $\bar{x} \approx [0.9999995120152905, 0.9999990233419435]$
- $\nabla f(\bar{x}) \approx [-7.00019335575671e-07, -1.3777512464625737e-07]$
- $\|\nabla f(\bar{x})\| \approx 7.134487053398413e-07$
- Distance  $\|\bar{x} - x^*\| \approx 1.0917829620113772e-06$

(c) **Starting point [0.2, 0.8]:**

- Number of iterations: 77
- Final iterate  $\bar{x} \approx [0.9999999805321218, 0.9999999627067655]$
- $\nabla f(\bar{x}) \approx [-6.955444000490959e-07, 3.285043015300706e-07]$
- $\|\nabla f(\bar{x})\| \approx 7.692184920836318e-07$
- Distance  $\|\bar{x} - x^*\| \approx 4.206879628725704e-08$

2. **Quadratic Function:**

(a) **Starting point [-0.2, 1.2]:**

- Number of iterations: 103
- Final iterate  $\bar{x} \approx [4.000000167769102, -1.2373089474566375e-10]$
- $\nabla f(\bar{x}) \approx [8.363708919190659e-08, -2.593599884595895e-07]$
- $\|\nabla f(\bar{x})\| \approx 2.725119562555987e-07$
- Distance  $\|\bar{x} - x^*\| \approx 1.6776914734831218e-07$

(b) **Starting point [3.8, 0.1]:**

- Number of iterations: 75
- Final iterate  $\bar{x} \approx [4.000000770649915, -1.4195117037264182e-10]$
- $\nabla f(\bar{x}) \approx [3.8504105556198156e-07, 8.587983411144745e-07]$
- $\|\nabla f(\bar{x})\| \approx 9.411648129680892e-07$
- Distance  $\|\bar{x} - x^*\| \approx 7.706499285115392e-07$

(c) **Starting point [1.9, 0.6]:**

- Number of iterations: 45
- Final iterate  $\bar{x} \approx [-3.2292471658668086e-09, 1.000000009971095]$
- $\nabla f(\bar{x}) \approx [-9.504466025014588e-07, 7.331026898433423e-08]$
- $\|\nabla f(\bar{x})\| \approx 9.53269709864486e-07$
- Distance  $\|\bar{x} - x^*\| \approx 1.0480971995405012e-08$

## 4 Quasi-Newton Method

### 4.1 BFGS Method

#### 4.1.1 Exact Solutions

All the runs are located in file "4.1.1 exact\_qn.bfgs.txt"

##### 1. Rosenbrock Function:

###### (a) Starting point [1.2, 1.2]:

- Number of iterations: 13
- Final iterate  $\bar{x} \approx [0.9999999934373244, 0.9999999884322573]$
- $\nabla f(\bar{x}) \approx [-6.361687862245309e-07, 3.1152171953152674e-07]$
- $\|\nabla f(\bar{x})\| \approx 7.083477297953824e-07$
- Distance  $\|\bar{x} - x^*\| \approx 1.329967598999978e-08$

###### (b) Starting point [-1.2, 1.]:

- Number of iterations: 33
- Final iterate  $\bar{x} \approx [0.9999996791119133, 0.9999993575683815]$
- $\nabla f(\bar{x}) \approx [-3.7955703334679935e-07, -1.311096120559796e-07]$
- $\|\nabla f(\bar{x})\| \approx 4.01563534121928e-07$
- Distance  $\|\bar{x} - x^*\| \approx 7.181138827191322e-07$

###### (c) Starting point [0.2, 0.8]:

- Number of iterations: 23
- Final iterate  $\bar{x} \approx [0.999999990750245, 0.9999999981212548]$
- $\nabla f(\bar{x}) \approx [9.667680201279789e-09, -5.758815646572657e-09]$
- $\|\nabla f(\bar{x})\| \approx 1.1252910651268288e-08$
- Distance  $\|\bar{x} - x^*\| \approx 2.0941019853046453e-09$

##### 2. Quadratic Function:

###### (a) Starting point [-0.2, 1.2]:

- Number of iterations: 16 -j diverges at 13
- Final iterate  $\bar{x} \approx [-0.05346227141439418, 1.2291276627394798]$
- $\nabla f(\bar{x}) \approx [-48.2452681628738, 1.9169815189568309]$
- $\|\nabla f(\bar{x})\| \approx 48.28333789467777$
- Distance  $\|\bar{x} - x^*\| \approx 0.23528217165191917$
- rho  $\|\bar{x} - x^*\| \approx 9.354952124946182e+30$

###### (b) Starting point [3.8, 0.1]:

- Number of iterations: 13

- Final iterate  $\bar{x} \approx [3.999999999858759, -3.862899813854707e - 12]$
  - $\nabla f(\bar{x}) \approx [-3.917310916506123e - 11, -1.8698611541996652e - 08]$
  - $\|\nabla f(\bar{x})\| \approx 1.8698652575278575e - 08$
  - Distance  $\|\bar{x} - x^*\| \approx 1.4129361162427862e - 10$
- (c) **Starting point [1.9, 0.6]:**
- Number of iterations: 19
  - Final iterate  $\bar{x} \approx [4.000000000544454, 2.6029506363324995e - 12]$
  - $\nabla f(\bar{x}) \approx [1.387165937834461e - 10, 1.3049029432865988e - 08]$
  - $\|\nabla f(\bar{x})\| \approx 1.3049766719493253e - 08$
  - Distance  $\|\bar{x} - x^*\| \approx 5.444604815689273e - 10$
- 

#### 4.1.2 Approximated Solutions

All the runs are located in file "4.1.2 approx\_qn\_bfgs.txt"

##### 1. Rosenbrock Function:

- (a) **Starting point [1.2, 1.2]:**
- Number of iterations: 13
  - Final iterate  $\bar{x} \approx [0.9999999932373403, 0.9999999880322893]$
  - $\nabla f(\bar{x}) \approx [-6.361687408350495e - 07, 3.1152171954048724e - 07]$
  - $\|\nabla f(\bar{x})\| \approx 7.083476890349218e - 07$
  - Distance  $\|\bar{x} - x^*\| \approx 1.3746260046734159e - 08$
- (b) **Starting point [-1.2, 1.]:**
- Number of iterations: 33
  - Final iterate  $\bar{x} \approx [0.9999996844444438, 0.9999993688326836]$
  - $\nabla f(\bar{x}) \approx [-6.081896994143403e - 07, -1.1260714582718505e - 08]$
  - $\|\nabla f(\bar{x})\| \approx 6.082939373087809e - 07$
  - Distance  $\|\bar{x} - x^*\| \approx 7.056539452030539e - 07$
- (c) **Starting point [0.2, 0.8]:**
- Number of iterations: 23
  - Final iterate  $\bar{x} \approx [0.9999999988750274, 0.9999999977212608]$
  - $\nabla f(\bar{x}) \approx [9.667610587120734e - 09, -5.758826748652036e - 09]$
  - $\|\nabla f(\bar{x})\| \approx 1.1252856525576031e - 08$
  - Distance  $\|\bar{x} - x^*\| \approx 2.5413019476684327e - 09$

##### 2. Quadratic Function:

- (a) **Starting point [-0.2, 1.2]:**
- Number of iterations: 10
  - Final iterate  $\bar{x} \approx [-2.558477348502419e-11, 1.0000000001109866]$
  - $\nabla f(\bar{x}) \approx [[-7.466251263393606e-09, 8.367222472184019e-10]$
  - $\|\nabla f(\bar{x})\| \approx 7.51298955457259e-09$
  - Distance  $\|\bar{x} - x^*\| \approx 1.1389730305632127e-10$
- (b) **Starting point [3.8, 0.1]:**
- Number of iterations: 11
  - Final iterate  $\bar{x} \approx [3.9999999956597296, 1.1825078675977688e-10]$
  - $\nabla f(\bar{x}) \approx [-1.9336336810942954e-09, 5.598692413123059e-07]$
  - $\|\nabla f(\bar{x})\| \approx 5.598725804206075e-07$
  - Distance  $\|\bar{x} - x^*\| \approx 4.341880939495625e-09$
- (c) **Starting point [1.9, 0.6]:**
- Number of iterations: 10 -j diverges at 9
  - Final iterate  $\bar{x} \approx [1.5831470743104705, -0.024385554687575438]$
  - $\nabla f(\bar{x}) \approx [-0.9747695437489767, -23.3644448690562]$
  - $\|\nabla f(\bar{x})\| \approx 23.384769823596454$
  - Distance  $\|\bar{x} - x^*\| \approx 2.416975945203315$
  - rho =  $\infty$
- 

## 4.2 SR1 Method

### 4.2.1 Exact Solutions

All the runs are located in file "4.2.1 exact\_qn\_sr1.txt"

#### 1. Rosenbrock Function:

- (a) **Starting point [1.2, 1.2]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [0.04206416827900303, 0.0816424551860706]$
  - $\nabla f(\bar{x}) \approx [-4.7631236183420384e-07, 3.8459209150687457e-07]$
  - $\|\nabla f(\bar{x})\| \approx 0.09184162858864073$
  - Distance  $\|\bar{x} - x^*\| \approx 0.26160661852730166$
- (b) **Starting point [-1.2, 1.]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [1.5138090727188056, 2.3942457202334397]$
  - $\nabla f(\bar{x}) \approx [-61.11594677243852, 20.525562317533907]$



- $\|\nabla f(\bar{x})\| \approx 64.47059530004749$
- Distance  $\|\bar{x} - x^*\| \approx 1.4859074303594493$

(c) **Starting point [0.2, 0.8]:**

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [0.4526567196822766, 0.2024504247699525]$
- $\nabla f(\bar{x}) \approx [-0.6515028409679398, -0.4895362207133269]$
- $\|\nabla f(\bar{x})\| \approx 0.8149243297261309$
- Distance  $\|\bar{x} - x^*\| \approx 0.967300362585787$

## 2. Quadratic Function:

(a) **Starting point [-0.2, 1.2]:**

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [-0.0011159542151841786, 1.1823939693347825]$
- $\nabla f(\bar{x}) \approx [-0.7539845753333217, 0.7289016727744723]$
- $\|\nabla f(\bar{x})\| \approx 1.0487089150064441$
- Distance  $\|\bar{x} - x^*\| \approx 2.1540123413572898e - 08$

(b) **Starting point [3.8, 0.1]:**

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [3.794720678079162, 8.989096280748178e - 05]$
- $\nabla f(\bar{x}) \approx [-0.05121154183453141, 0.18340664003078994]$
- $\|\nabla f(\bar{x})\| \approx 0.19042220885299518$
- Distance  $\|\bar{x} - x^*\| \approx 0.20527934160227673$

(c) **Starting point [1.9, 0.6]:**

- Number of iterations: 9
- Final iterate  $\bar{x} \approx [1.5284816372318362, 0.00834402035290613]$
- $\nabla f(\bar{x}) \approx [-0.5456853815798153, 3.409988291480307]$
- $\|\nabla f(\bar{x})\| \approx 3.4533741013250636$
- Distance  $\|\bar{x} - x^*\| \approx 2.4715324477287113$

### 4.2.2 Approximated Solutions

All the runs are located in file "4.2.2 approx\_qn\_sr1.txt"

#### 1. Rosenbrock Function:

(a) **Starting point [1.2, 1.2]:**

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [1.111802358357418, 1.2365126963259327]$
- $\nabla f(\bar{x}) \approx [0.042064168322142326, 0.08164245535700887]$

- $\|\nabla f(\bar{x})\| \approx 0.09184162876035414$
  - Distance  $\|\bar{x} - x^*\| \approx 0.26160661852797873$
- (b) **Starting point [-1.2, 1.]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [1.5138090670758741, 2.394245717383411]$
  - $\nabla f(\bar{x}) \approx [-61.11595516744561, 20.525565167295312]$
  - $\|\nabla f(\bar{x})\| \approx 64.4706041655118$
  - Distance  $\|\bar{x} - x^*\| \approx 1.485907425733973$
- (c) **Starting point [0.2, 0.8]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [0.4526567196806503, 0.20245042476877273]$
  - $\nabla f(\bar{x}) \approx [-0.6515028407871881, -0.4895362206436271]$
  - $\|\nabla f(\bar{x})\| \approx 0.8149243295397568$
  - Distance  $\|\bar{x} - x^*\| \approx 0.96730036258768$

## 2. Quadratic Function:

- (a) **Starting point [-0.2, 1.2]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [-0.0006399145594388124, 1.0572846945395347]$
  - $\nabla f(\bar{x}) \approx [-0.100349292951607, 0.4571276116163009]$
  - $\|\nabla f(\bar{x})\| \approx 0.4680124292130617$
  - Distance  $\|\bar{x} - x^*\| \approx 0.05728826859952371$
- (b) **Starting point [3.8, 0.1]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [3.7973602446971038, 9.337090061698302e-05]$
  - $\nabla f(\bar{x}) \approx [-0.10112320410638614, -0.0006115727811326077]$
  - $\|\nabla f(\bar{x})\| \approx 0.10112505342400792$
  - Distance  $\|\bar{x} - x^*\| \approx 0.2026397768142838$
- (c) **Starting point [1.9, 0.6]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [1.7029963707700075, 0.005203128015321194]$
  - $\nabla f(\bar{x}) \approx [-1.124264226715077, -0.0253539197414554]$
  - $\|\nabla f(\bar{x})\| \approx 1.1245500756824955$
  - Distance  $\|\bar{x} - x^*\| \approx 2.2970095222347036$
-

## 4.3 SR1 Method [Trust Region]

### 4.3.1 Exact Solutions

All the runs are located in file "4.3.1 exact\_qn\_sr1\_trust.txt"

#### 1. Rosenbrock Function:

##### (a) Starting point [1.2, 1.2]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [0.9999830425178828, 0.9999660345566617]$
- $\nabla f(\bar{x}) \approx [-1.3608644500628941e - 05, -1.0153332041795693e - 05]$
- $\|\nabla f(\bar{x})\| \approx 1.6978968069215908e - 05$
- Distance  $\|\bar{x} - x^*\| \approx 3.796323933654216e - 05$

##### (b) Starting point [-1.2, 1.]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [0.9979938481937891, 0.9959874909111021]$
- $\nabla f(\bar{x}) \approx [-0.0023236495005287848, -0.0008460243091423791]$
- $\|\nabla f(\bar{x})\| \approx 0.0024728736589173963$
- Distance  $\|\bar{x} - x^*\| \approx 0.004486075596560071$

##### (c) Starting point [0.2, 0.8]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [1.000033418187719, 1.0000671545311057]$
- $\nabla f(\bar{x}) \approx [1.000033418187719, 1.0000671545311057]$
- $\|\nabla f(\bar{x})\| \approx 8.728434551424043e - 05$
- Distance  $\|\bar{x} - x^*\| \approx 7.501004145084355e - 05$

#### 2. Quadratic Function:

##### (a) Starting point [-0.2, 1.2]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [-0.007791940092785499, 1.130474610655278]$
- $\nabla f(\bar{x}) \approx [-5.84620608500771, 0.5346973052376088]$
- $\|\nabla f(\bar{x})\| \approx 5.870607021135849$
- Distance  $\|\bar{x} - x^*\| \approx 0.13070707079594418$

##### (b) Starting point [3.8, 0.1]:

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [3.9945416187071876, 1.3741812311951485e - 06]$
- $\nabla f(\bar{x}) \approx [-0.0013632166160585932, 0.0011251956922249352]$
- $\|\nabla f(\bar{x})\| \approx 0.0017676042792717473$

- Distance  $\|\bar{x} - x^*\| \approx 0.005458381465791705$
- (c) **Starting point [1.9, 0.6]:**
- Number of iterations: 9
  - Final iterate  $\bar{x} \approx [1.5365643821046733, 0.004705379783804337]$
  - $\nabla f(\bar{x}) \approx [-0.5907412512800368, 0.8882488921858505]$
  - $\|\nabla f(\bar{x})\| \approx 1.0667526988169724$
  - Distance  $\|\bar{x} - x^*\| \approx 2.4634401117368854$
- 

### 4.3.2 Approximated Solutions

All the runs are located in file "4.3.2 approx\_qn\_sr1\_trust.txt"

#### 1. Rosenbrock Function:

- (a) **Starting point [1.2, 1.2]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [0.9999830425178828, 0.9999660345566617]$
  - $\nabla f(\bar{x}) \approx [-1.3608644500628941e - 05, -1.0153332041795693e - 05]$
  - $\|\nabla f(\bar{x})\| \approx 1.6978968069215908e - 05$
  - Distance  $\|\bar{x} - x^*\| \approx 3.796323933654216e - 05$
- (b) **Starting point [-1.2, 1.]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [0.9979938481937891, 0.9959874909111021]$
  - $\nabla f(\bar{x}) \approx [-0.0023236495005287848, -0.0008460243091423791]$
  - $\|\nabla f(\bar{x})\| \approx 0.0024728736589173963$
  - Distance  $\|\bar{x} - x^*\| \approx 0.004486075596560071$
- (c) **Starting point [0.2, 0.8]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [1.000033418187719, 1.0000671545311057]$
  - $\nabla f(\bar{x}) \approx [-5.998341940803055e - 05, 6.340777845004197e - 05]$
  - $\|\nabla f(\bar{x})\| \approx 8.728434551424043e - 05$
  - Distance  $\|\bar{x} - x^*\| \approx 7.501004145084355e - 05$

#### 2. Quadratic Function:

- (a) **Starting point [-0.2, 1.2]:**
- Number of iterations: 1000
  - Final iterate  $\bar{x} \approx [-0.007791940092785499, 1.130474610655278]$
  - $\nabla f(\bar{x}) \approx [-5.84620608500771, 0.5346973052376088]$

- $\|\nabla f(\bar{x})\| \approx 5.870607021135849$
- Distance  $\|\bar{x} - x^*\| \approx 0.13070707079594418$

(b) **Starting point [3.8, 0.1]:**

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [3.9945416187071876, 1.3741812311951485e - 06]$
- $\nabla f(\bar{x}) \approx [-0.0013632166160585932, 0.0011251956922249352]$
- $\|\nabla f(\bar{x})\| \approx 0.0017676042792717473$
- Distance  $\|\bar{x} - x^*\| \approx 0.005458381465791705$

(c) **Starting point [1.9, 0.6]:**

- Number of iterations: 1000
- Final iterate  $\bar{x} \approx [1.5365643821046733, 0.004705379783804337]$
- $\nabla f(\bar{x}) \approx [-0.5907412512800368, 0.8882488921858505]$
- $\|\nabla f(\bar{x})\| \approx 1.0667526988169724$
- Distance  $\|\bar{x} - x^*\| \approx 2.4634401117368854$