

Assignment 1, HT2020

Ice on Mars

Assignment in partial fulfilment of the requirements for the course

Optimisation 1TD184



UPPSALA
UNIVERSITET

Department of Information Technology

Marcello Pietro Vendruscolo

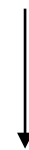
November 20th, 2020

$$\min \|H(x) - H_{obs}(x)\|_2^2$$

Objective Function

Nonlinear relationship
between the thickness and
mass balance function on
the surface

$$a(x) = -\frac{2A}{n+2}(\rho g)^n H(x)^{n+2} \left| \frac{dh}{dx} \right|^{n-1} \frac{dh}{dx} \quad \text{Eq. (I)}$$



$$H(x) = \left(-\frac{a(x)(n+2)}{2A(\rho g)^n \left| \frac{dh}{dx} \right|^{n-1} \frac{dh}{dx}} \right)^{\frac{1}{n+2}} \quad \text{Eq. (II)}$$

```
numerator = a[i]*(n+2)
denominator = 2*A*((rho*g)**n)*dhdx[i]*((abs(dhdx[i]))**(n-1))
h_theoretical[i] = -(numerator/denominator)**(1/(n+2))
delta_h[i] = h_theoretical[i] - h_obs[i]
sum += delta_h[i]**2
```

Python
Implementation

| | | Python | Matlab |
|---------|------------|-------------|----------------------|
| Library | | SciPy.org | Optimisation ToolBox |
| Task 1 | Solver: | minimize | fminunc |
| | Algorithm: | Nelder-Mead | Quasi-Newton (BFGS) |

Nelder-Mead (downhill simplex):

1. Gradient-free optimisation algorithm
2. Simplex (polytope of $n+1$ vertices in n dimensions)
3. Reflecting the worst vertex or shrinking towards the best vertex

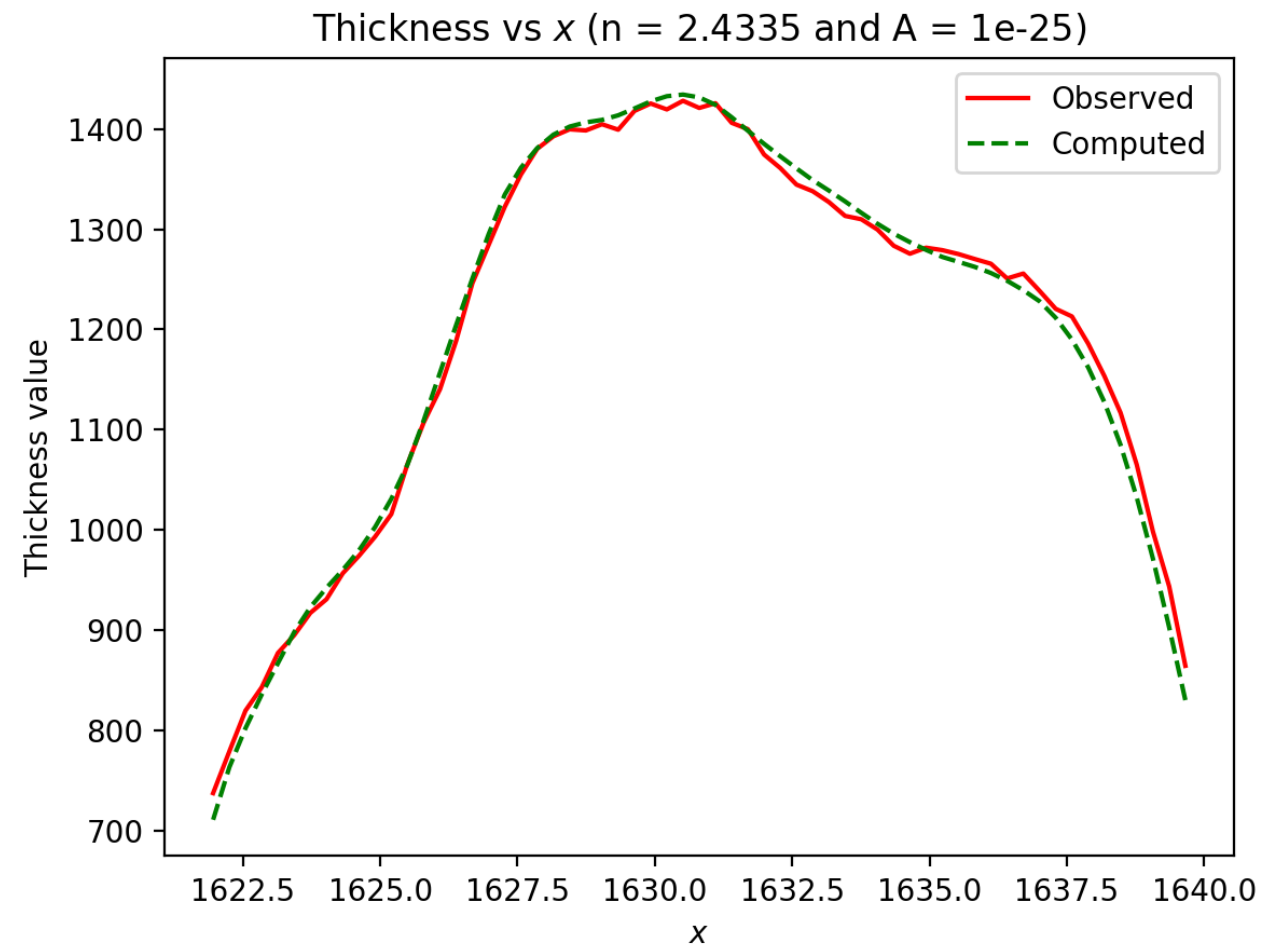
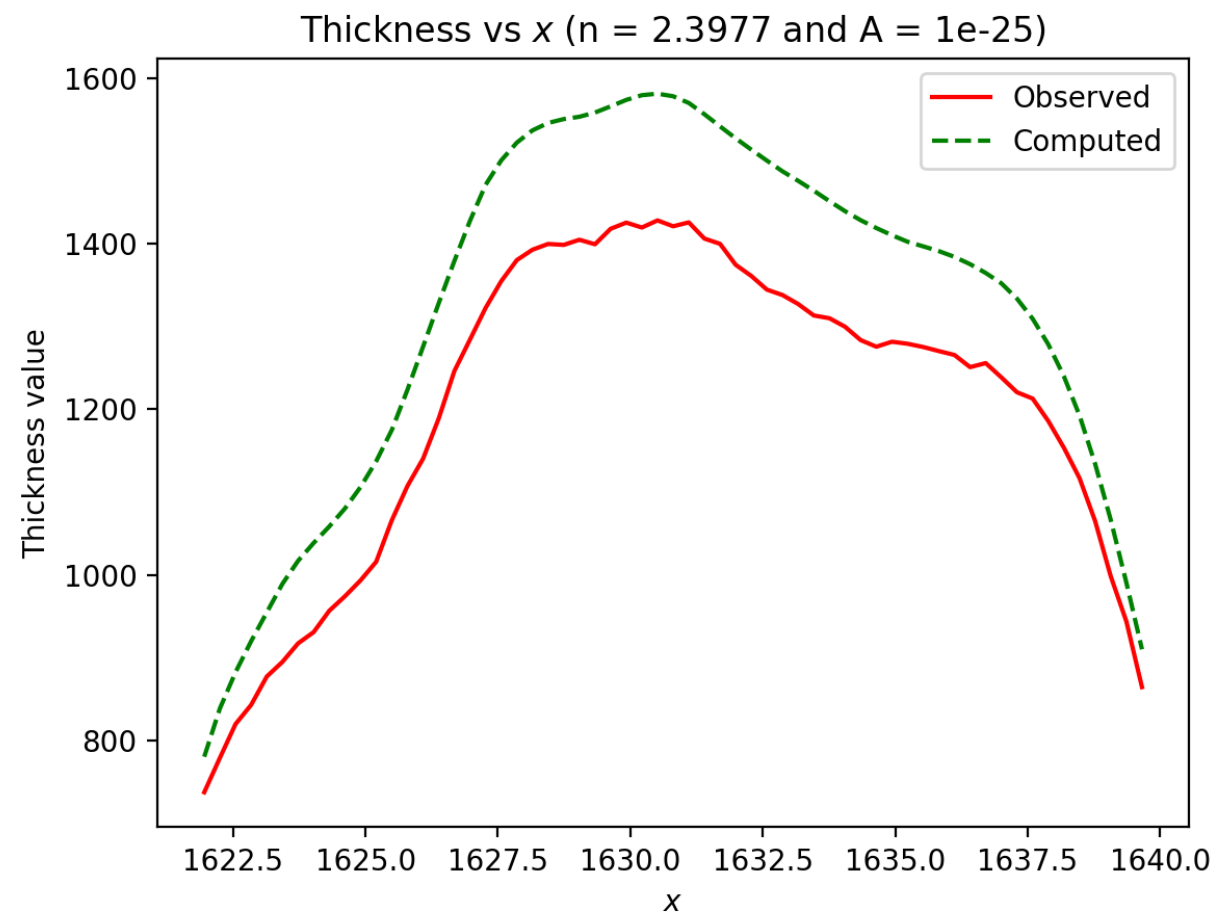
$$A = 1 * 10^{(-25)}$$

| | n = 1 | | Start point n = 2.5 | | n = 4 | |
|----------------------|-------------|--------------|------------------------|-------------|-------------|-------------|
| | Python | Matlab | Python | Matlab | Python | Matlab |
| Iterations | 26 | 7 | 19 | 5 | 24 | 5 |
| Function Evaluations | 52 | 22 | 38 | 18 | 48 | 29 |
| Optimal n | 2.4335 | 2.3977 | 2.4335 | 2.4335 | 2.4335 | 2.4335 |
| Min. Function Value | $13 * 10^3$ | $9.5 * 10^5$ | $13 * 10^3$ | $13 * 10^3$ | $13 * 10^3$ | $13 * 10^3$ |

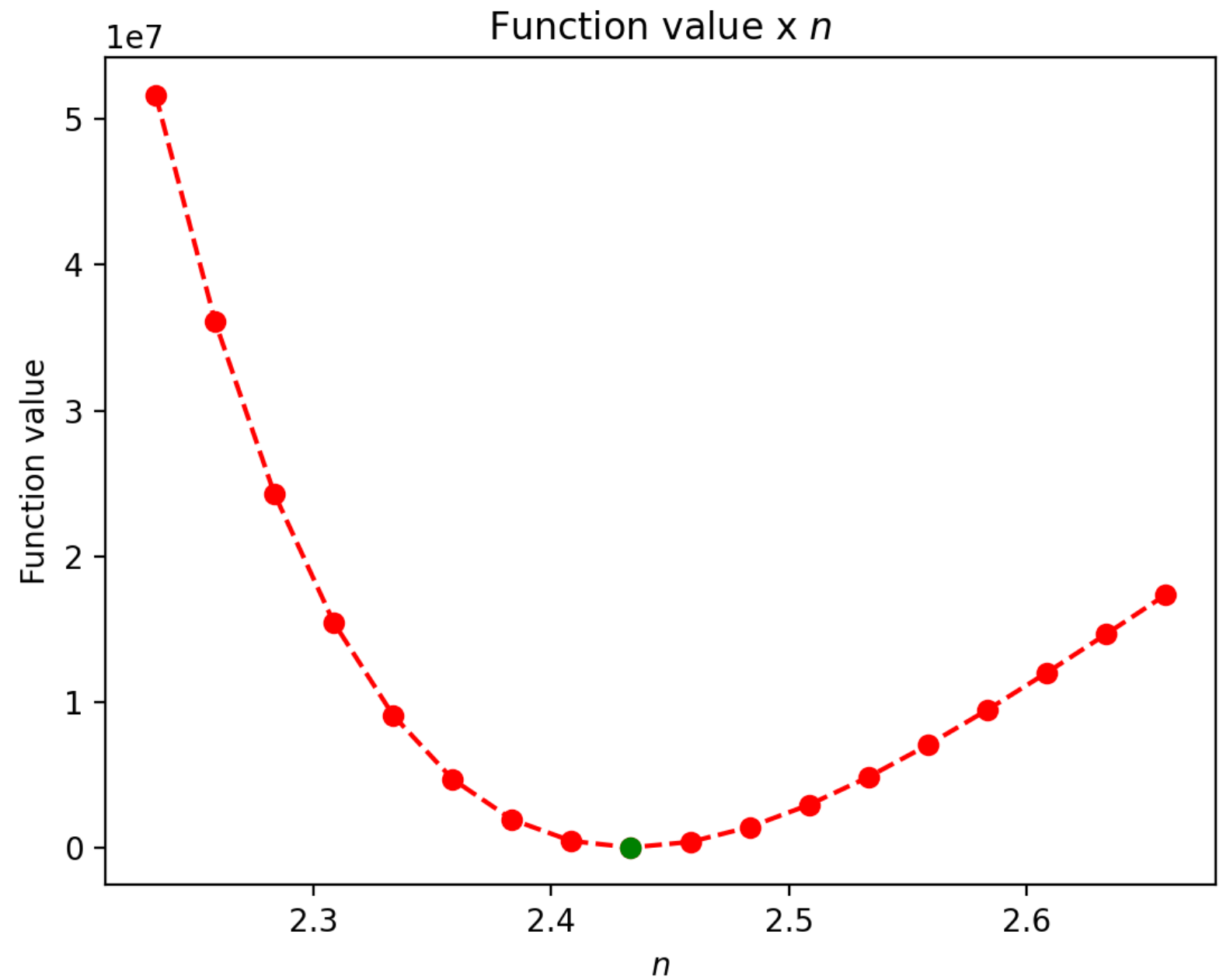
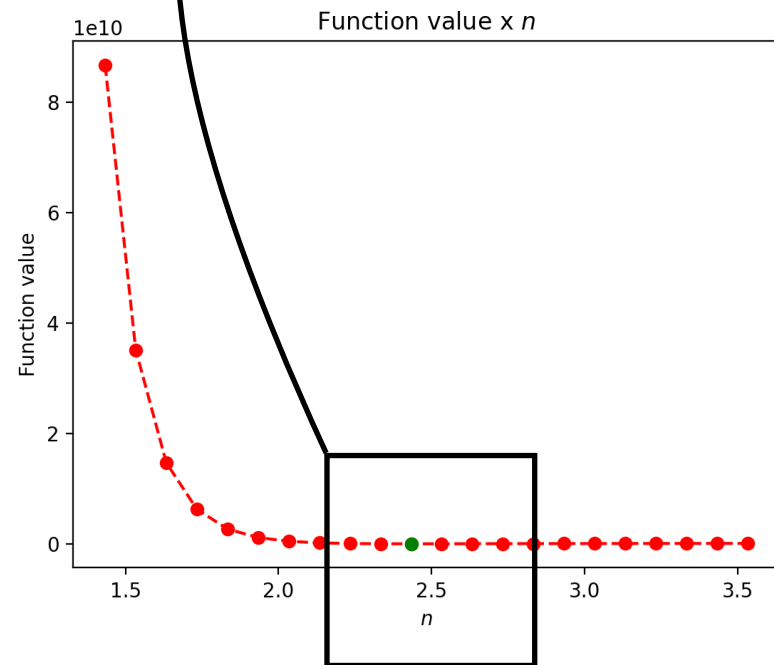
Optimisation converged successfully

Local minimum found: size of gradient < value of optimality tolerance

Task 1



Task 1



| | | Python | Matlab |
|---------|-----------------------|--|--------------------------------------|
| Library | | SciPy.org | Optimisation ToolBox |
| Task 1 | Solver: Algorithm: | minimize Nelder-Mead | fminunc Quasi-Newton (BFGS) |
| Task 2 | Solver: Algorithm: | least-squares Trust Region Reflective | lsqnonlin Trust Region Reflective |

$$A = 1 * 10^{(-25)}$$

| | Start point | | | | | |
|----------------------|-------------|-------------|-------------|-------------|-------------|-------------|
| | n = 1 | | n = 2.5 | | n = 4 | |
| | Python | Matlab | Python | Matlab | Python | Matlab |
| Iterations | 26 | 34 | 11 | 15 | 16 | 20 |
| Function Evaluations | 36 | 70 | 19 | 32 | 25 | 42 |
| Optimal n | 2.4335 | 2.4335 | 2.4335 | 2.4335 | 2.4335 | 2.4335 |
| Min. Function Value | $13 * 10^3$ | $13 * 10^3$ | $13 * 10^3$ | $13 * 10^3$ | $13 * 10^3$ | $13 * 10^3$ |

Optimisation converged successfully

Local minimum found: size of gradient < value of optimality tolerance

1. Most converged to same optimum $n = 2.4335$
2. Most converged to same minimum function value = $13 * 10^3$
3. Differ in number of iterations and function evaluations depending on initial guess and algorithm chosen

Task 1: Quasi-Newton (BFGS) < Nelder-Mead

Convergence of BFGS depends on initial guess & value of optimality tolerance

Task 2: Python implementation < Matlab implementation for same initial guess

Overall: $n = 2.5 < n = 4 < n = 1$

Task 4

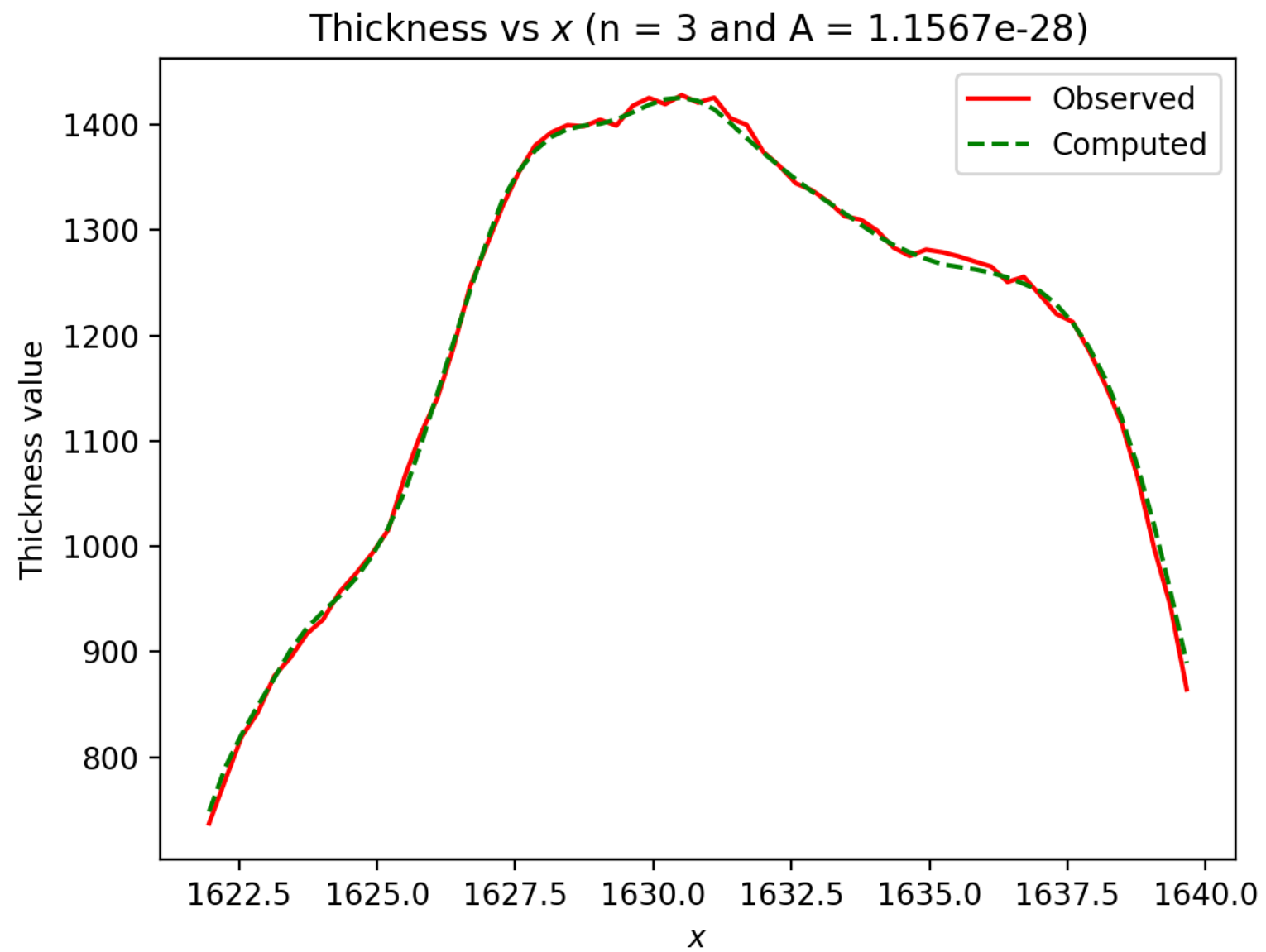
| | | Python | Matlab |
|---------|-----------------------|--|--------------------------------------|
| Library | | SciPy.org | Optimisation ToolBox |
| Task 1 | Solver: Algorithm: | minimize Nelder-Mead | fminunc Quasi-Newton (BFGS) |
| Task 2 | Solver: Algorithm: | least-squares Trust Region Reflective | lsqnonlin Trust Region Reflective |
| Task 4 | Solver: Algorithm: | minimize Nelder-Mead | - |

$$n = 3$$

| | Start point | | |
|----------------------|--------------------------|--------------------------|--------------------------|
| | $A = 1 \cdot 10^{(-25)}$ | $A = 1 \cdot 10^{(-28)}$ | $A = 1 \cdot 10^{(-31)}$ |
| Iterations | 36 | 14 | 31 |
| Function Evaluations | 72 | 28 | 62 |
| Optimal A | $1.16 \cdot 10^{(-28)}$ | $1.16 \cdot 10^{(-28)}$ | $1.16 \cdot 10^{(-28)}$ |
| Min. Function Value | $3.577 \cdot 10^3$ | $3.577 \cdot 10^3$ | $3.577 \cdot 10^3$ |

Optimisation converged successfully

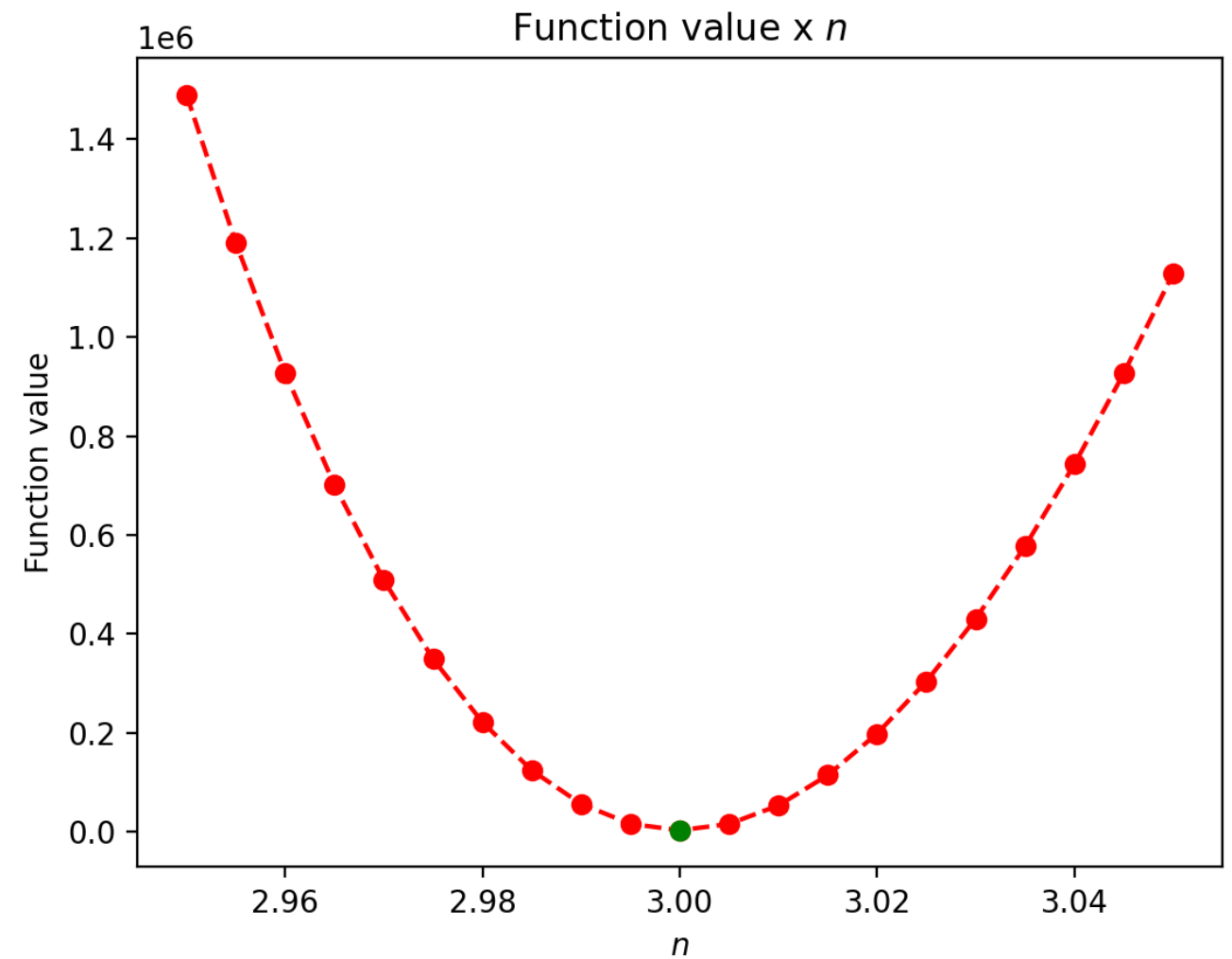
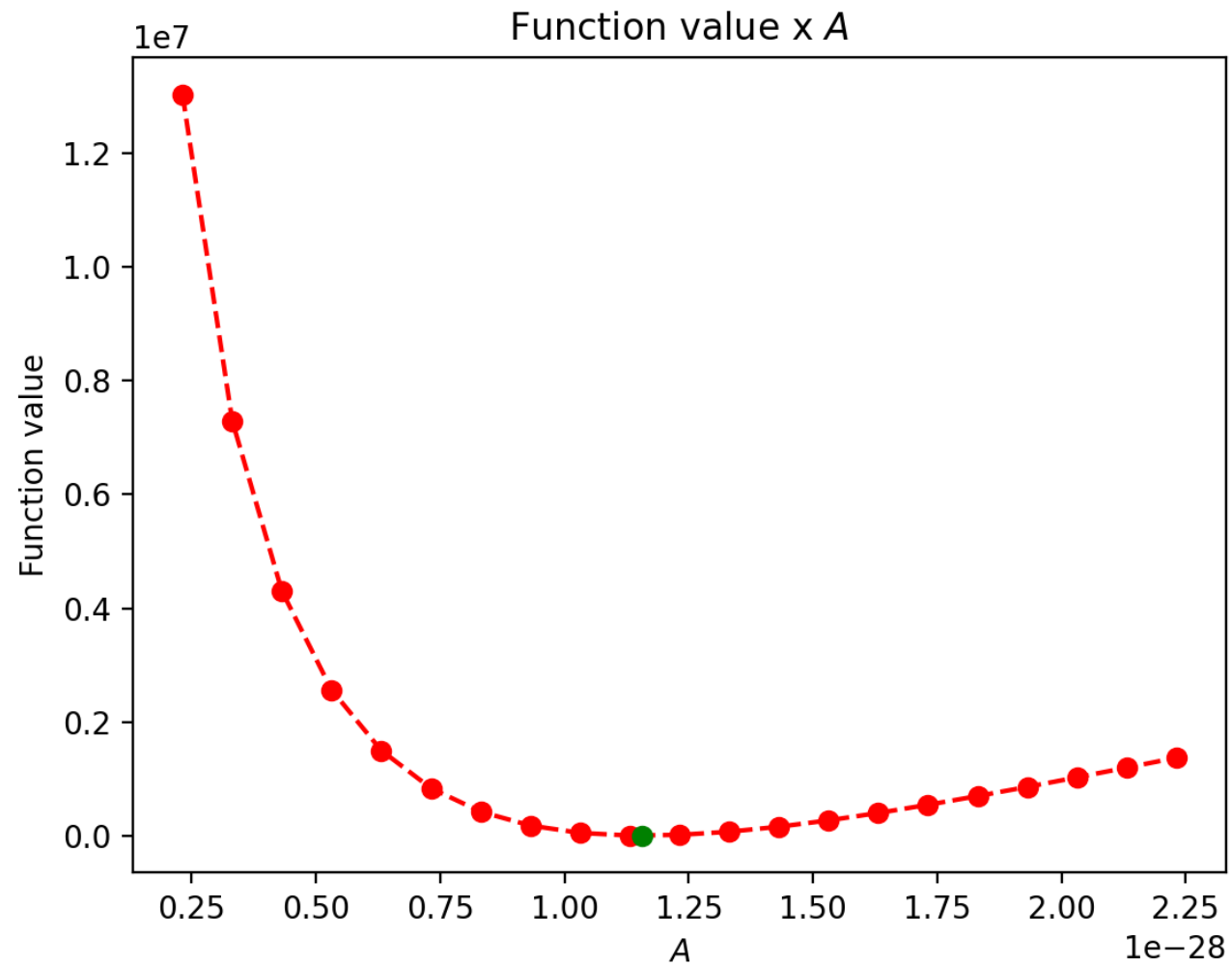
Task 4



Task 4

$$n = 3 \longrightarrow A = 1.16 \cdot 10^{(-28)}$$

$$A = 1.16 \cdot 10^{(-28)} \longrightarrow n = 3$$



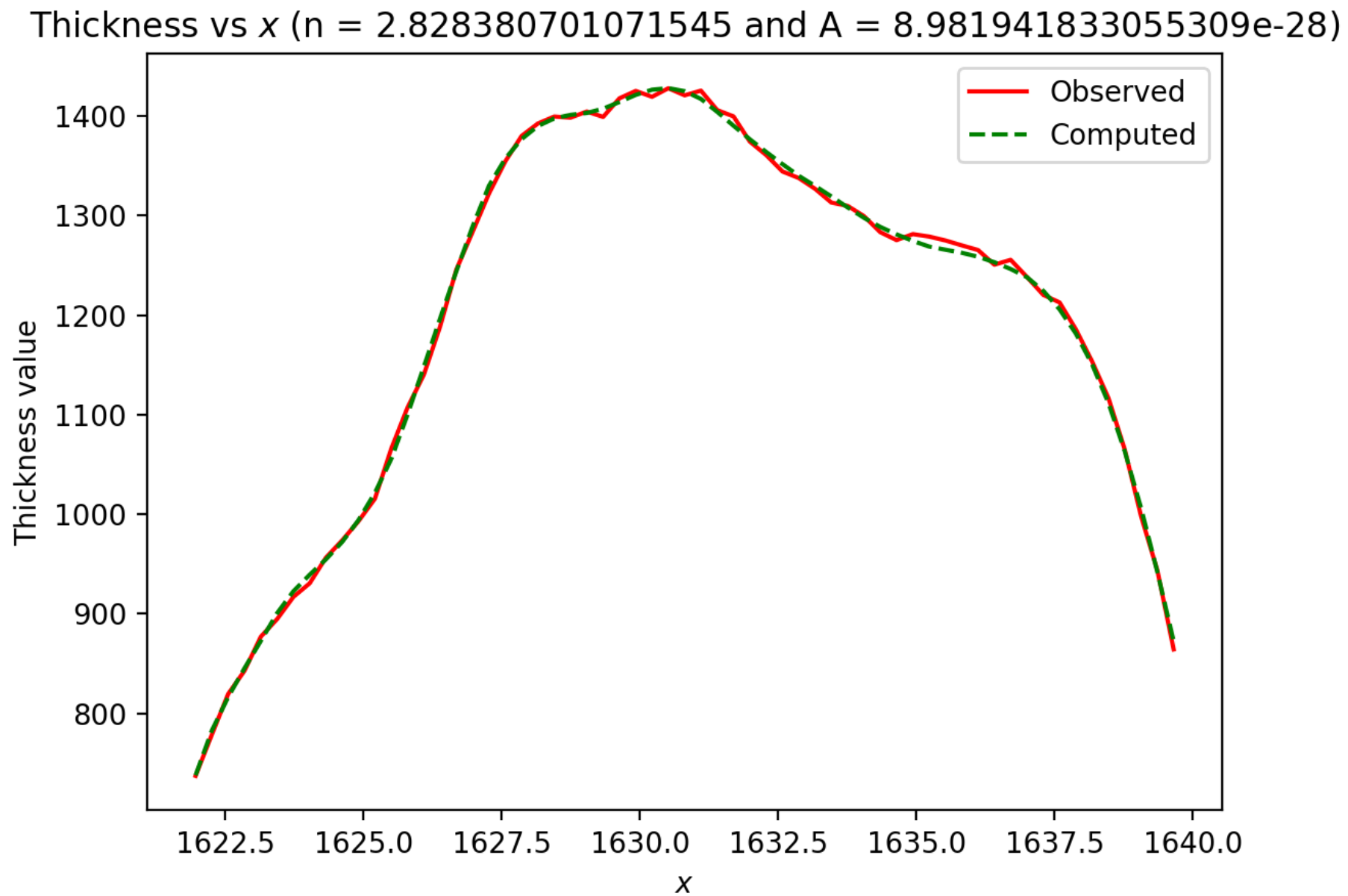
| | | Python | Matlab |
|--------------------|-----------------------|--|--------------------------------------|
| Library | | SciPy.org | Optimisation ToolBox |
| Task 1 | Solver: Algorithm: | minimize Nelder-Mead | fminunc Quasi-Newton (BFGS) |
| Task 2 | Solver: Algorithm: | least-squares Trust Region Reflective | lsqnonlin Trust Region Reflective |
| Task 4 | Solver: Algorithm: | minimize Nelder-Mead | - |
| Task 5 & Task 6 | Solver: Algorithm: | minimize Nelder-Mead | - |

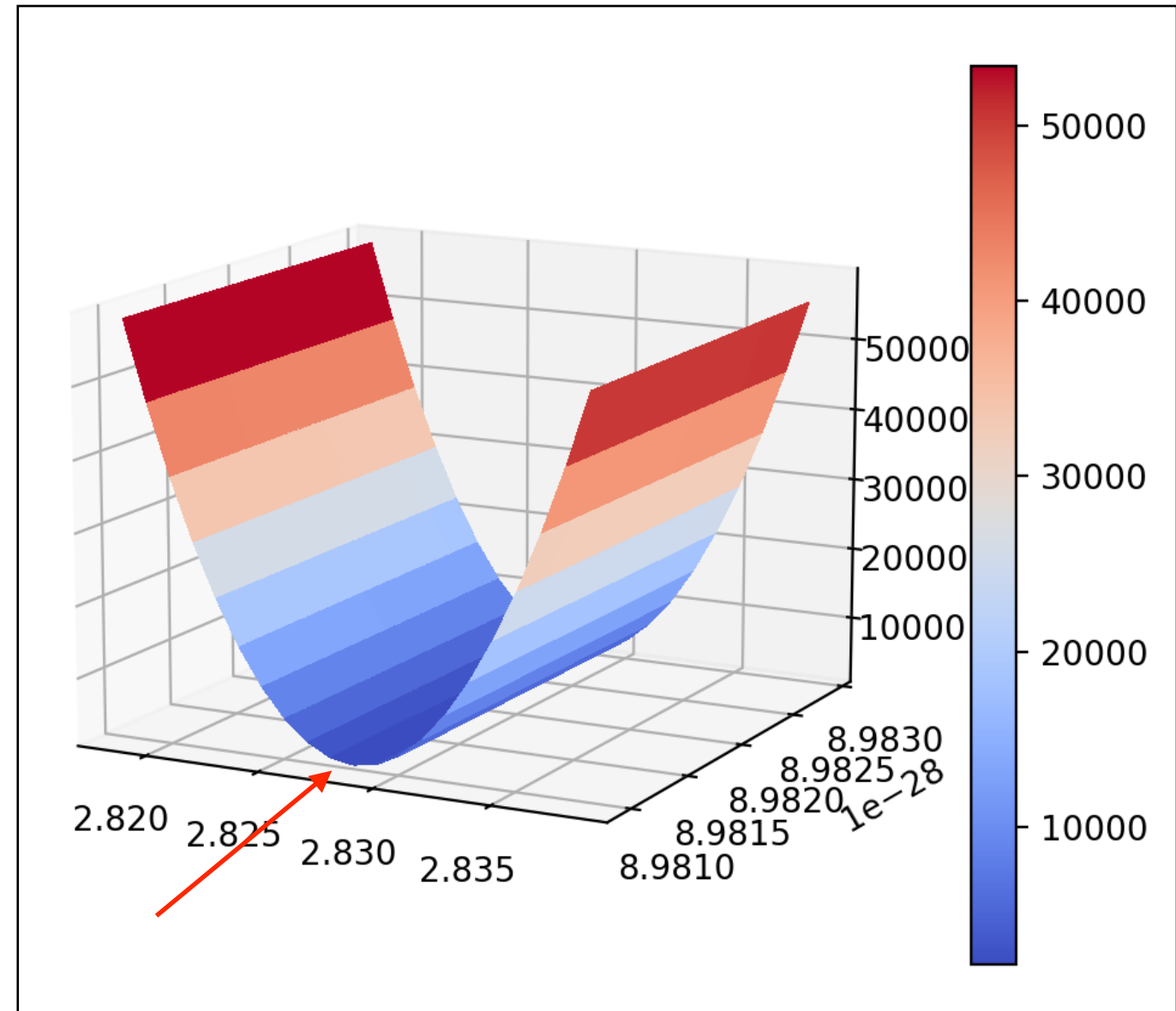
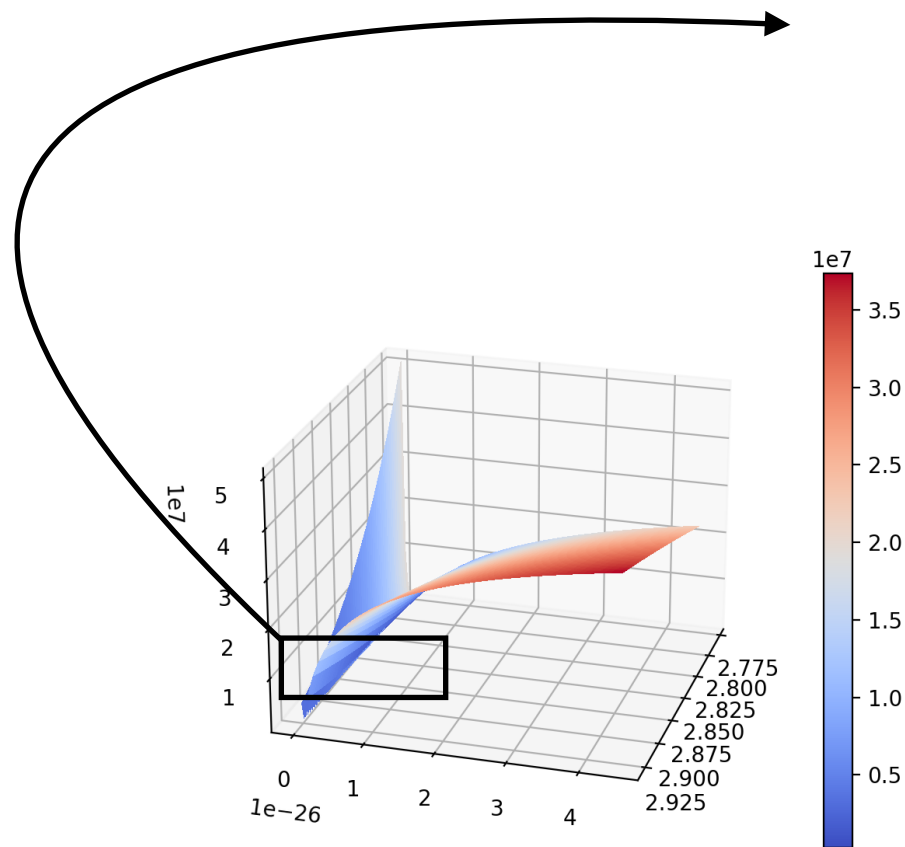
| | | Start point | |
|----------------------|--|-------------------------------------|-------------------------------------|
| | | $A = 1 \cdot 10^{(-25)}$ $n = 1$ | $A = 1 \cdot 10^{(-25)}$ $n = 3$ |
| Iterations | | 200 | 200 |
| Function Evaluations | | 370 | 360 |
| Optimal A | | $5.2261 \cdot 10^{(-27)}$ | $3.9370 \cdot 10^{(-27)}$ |
| Optimal n | | 2.6807 | 2.7045 |
| Min. Function Value | | $3.2959 \cdot 10^3$ | $2.8608 \cdot 10^3$ |

Maximum number of iterations has been exceeded
Success: False

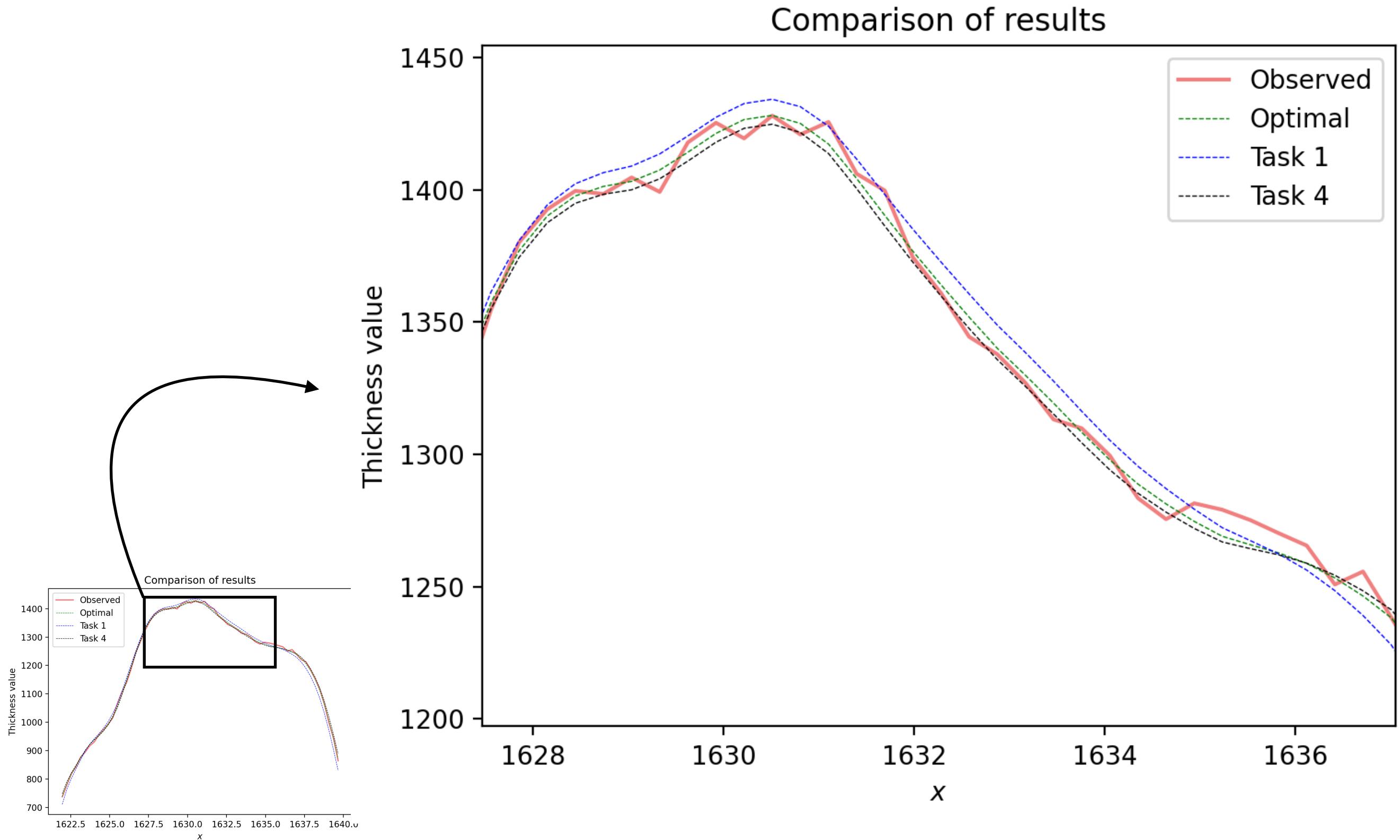
| | Start point | | |
|----------------------|-------------------------------------|-------------------------------------|-------------------------------------|
| | $A = 1 \cdot 10^{(-25)}$ $n = 1$ | $A = 1 \cdot 10^{(-25)}$ $n = 3$ | $A = 1 \cdot 10^{(-28)}$ $n = 3$ |
| Iterations | 408 | 340 | 183 |
| Function Evaluations | 754 | 618 | 338 |
| Optimal A | $8.983 \cdot 10^{(-28)}$ | $8.980 \cdot 10^{(-28)}$ | $8.982 \cdot 10^{(-28)}$ |
| Optimal n | 2.8284 | 2.8284 | 2.8284 |
| Min. Function Value | $1.860 \cdot 10^3$ | $1.860 \cdot 10^3$ | $1.860 \cdot 10^3$ |

Optimisation converged successfully





Local Analysis





Thank you