

Bayesian optimization for polymer translocation



GitHub: https://github.com/Nina-Konovalova/bayes_experiment

Некоторые параметры для аппроксимации (для гаусса)



Aq functions:

- MPI
- EI

Num opt steps

- 70
- 100
- 200

Space

mu: [0; 100]
sigma: (0;400)
Amplitude: (-100;100)

GP

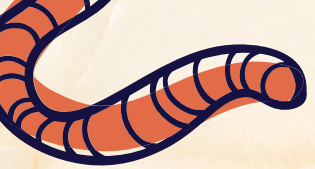
- exact feval: True
- num restarts: 3
- normalize: False

Kernels:

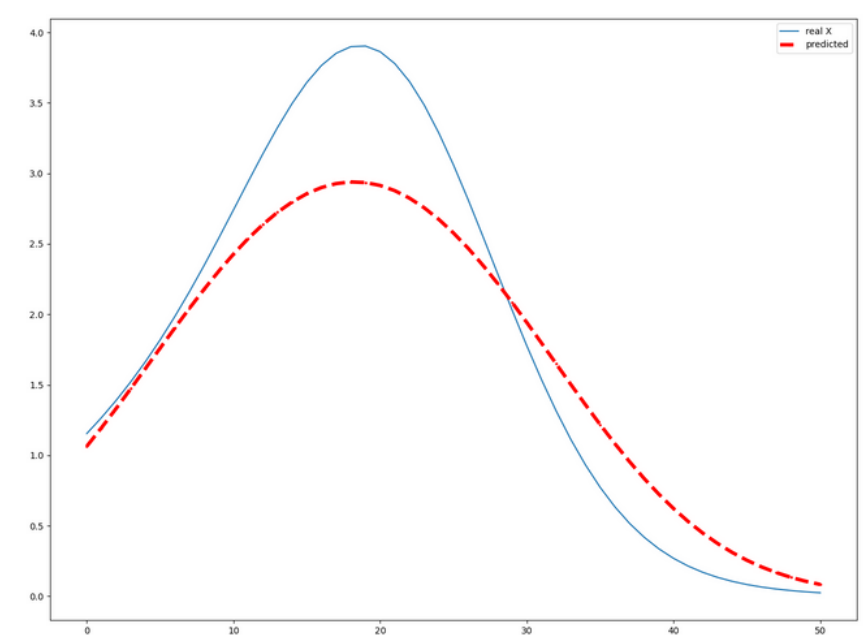
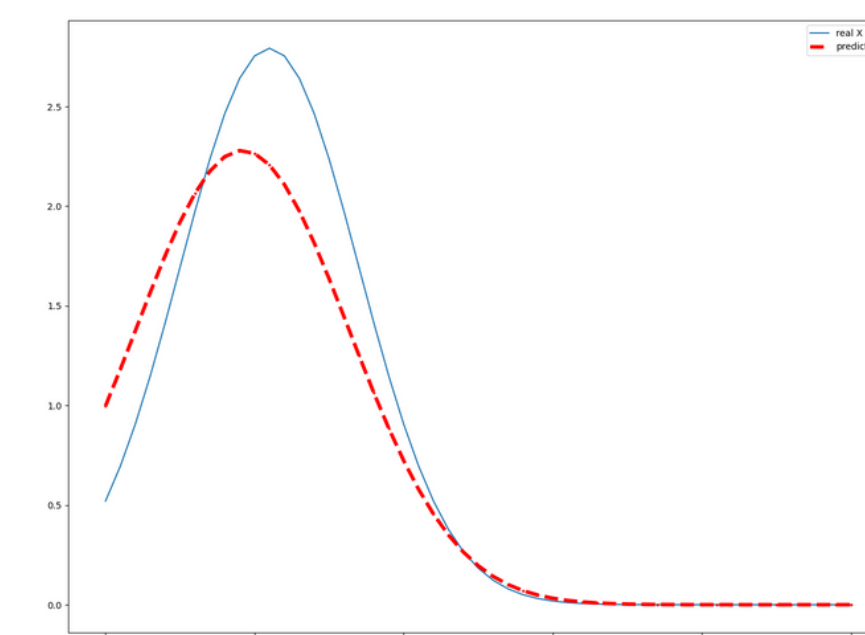
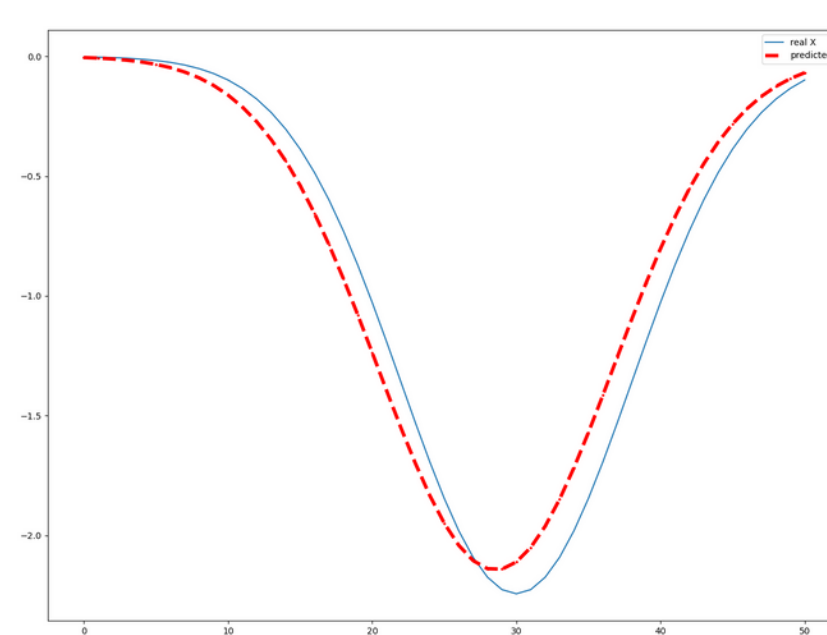
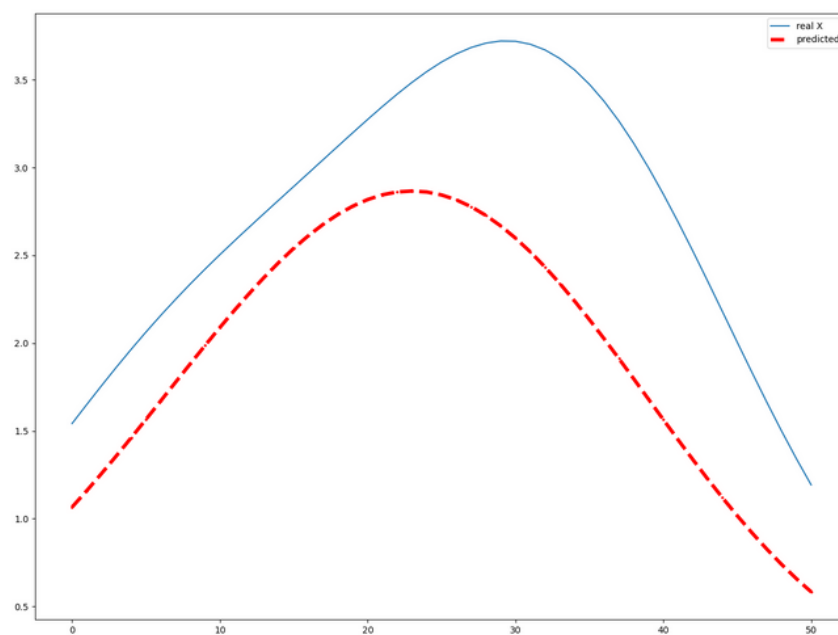
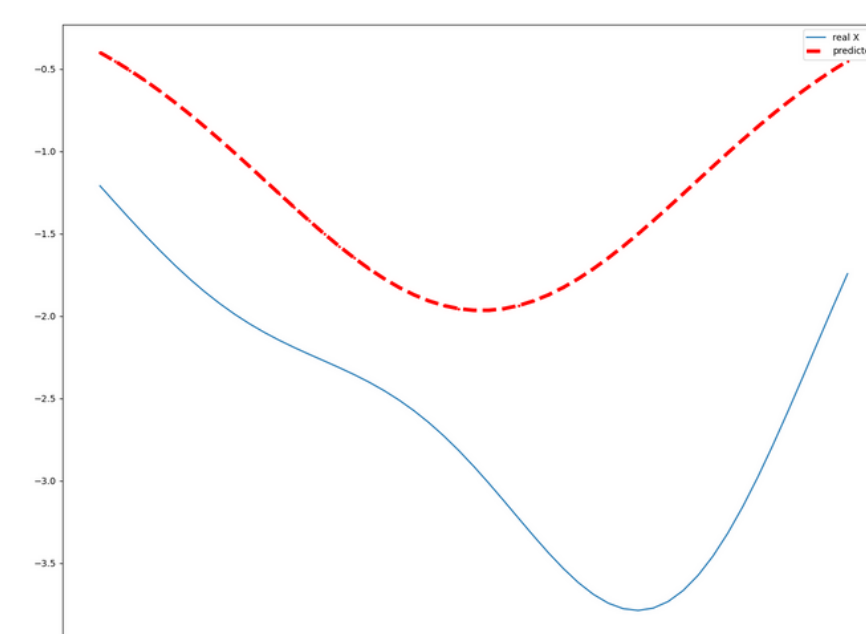
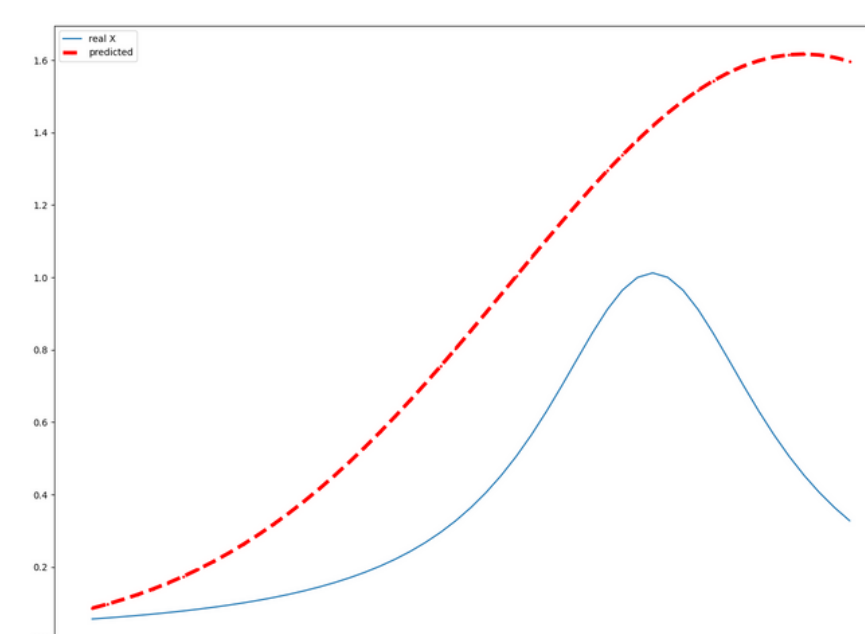
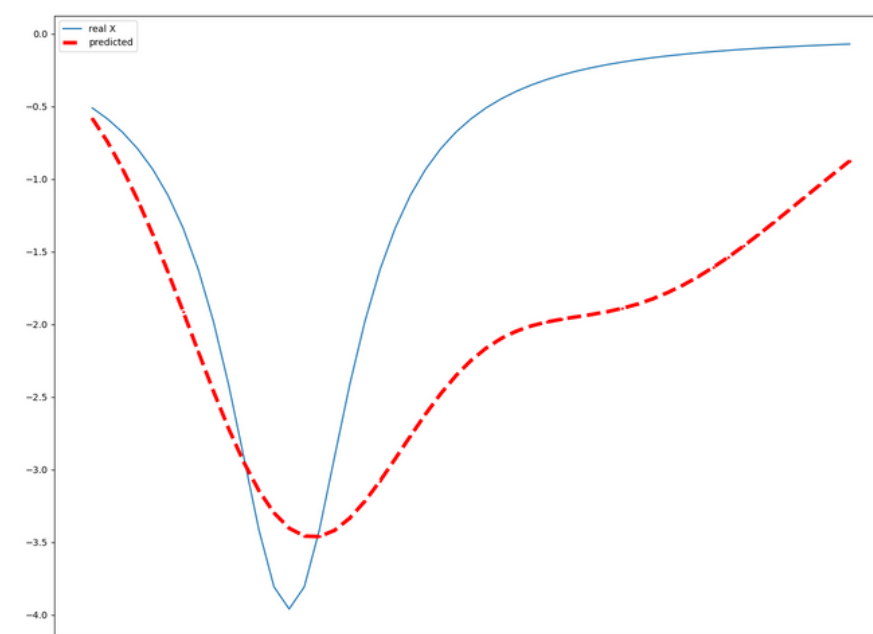
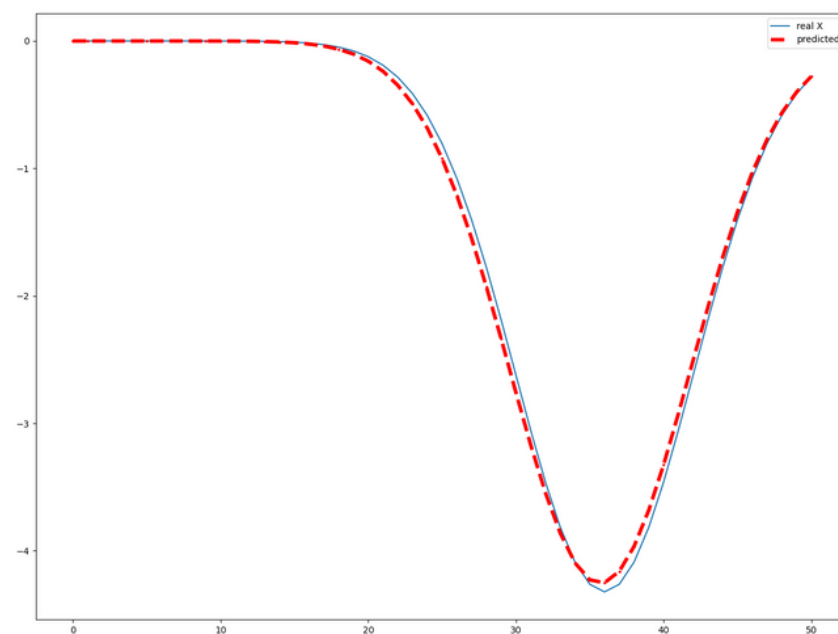
- RBF
- Matern32
- Matern52
- RatQuad

Constraints

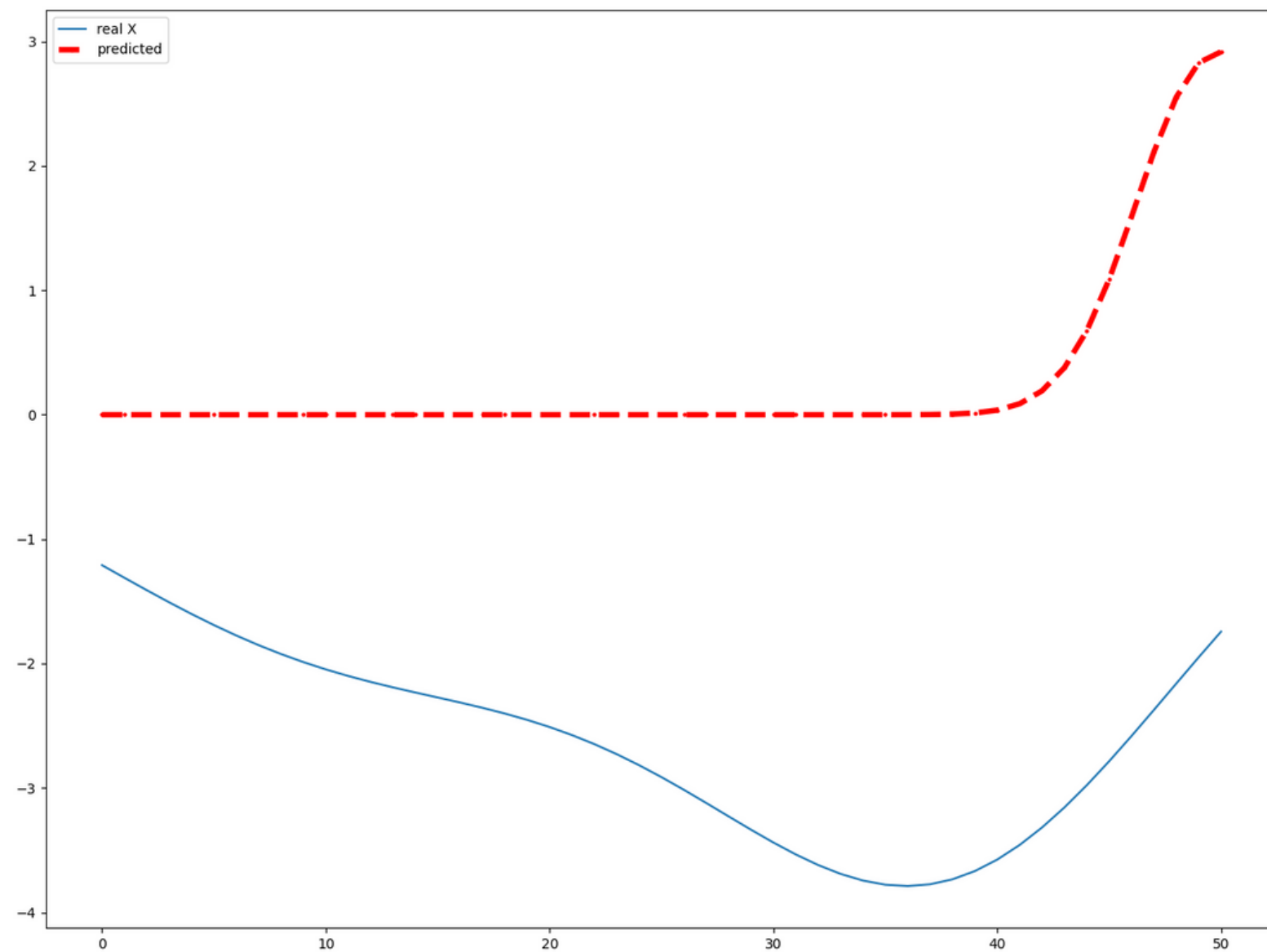
$A - 4\sqrt{2\pi \cdot e} \cdot \sigma \leq 0$



Аппроксимация нефиксированными гауссианами



Проблемы: если делать нормализацию

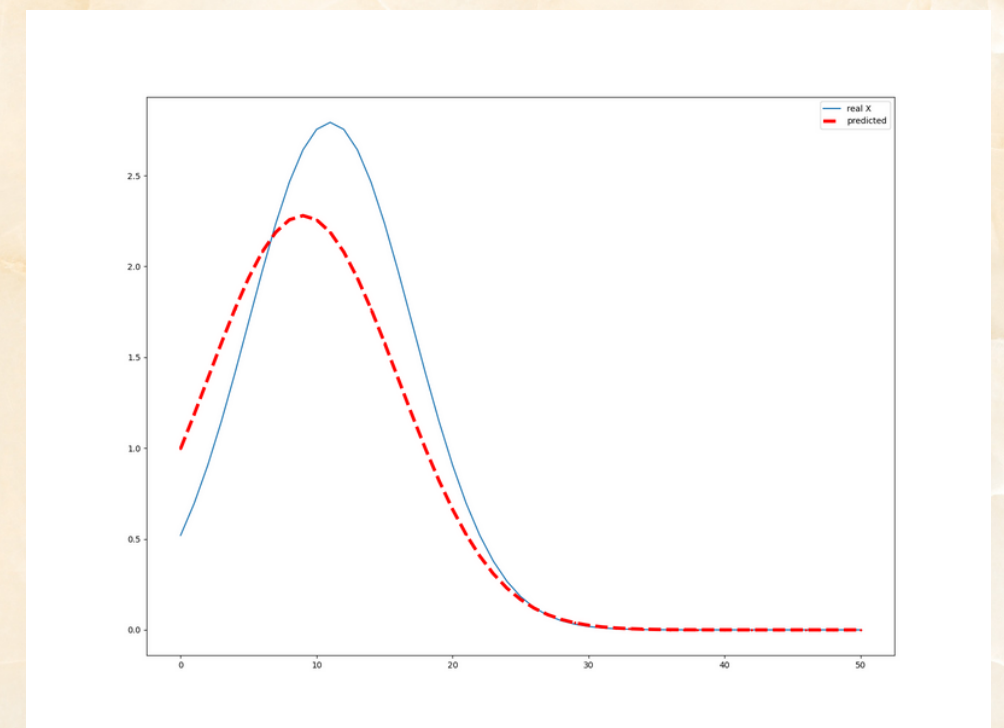
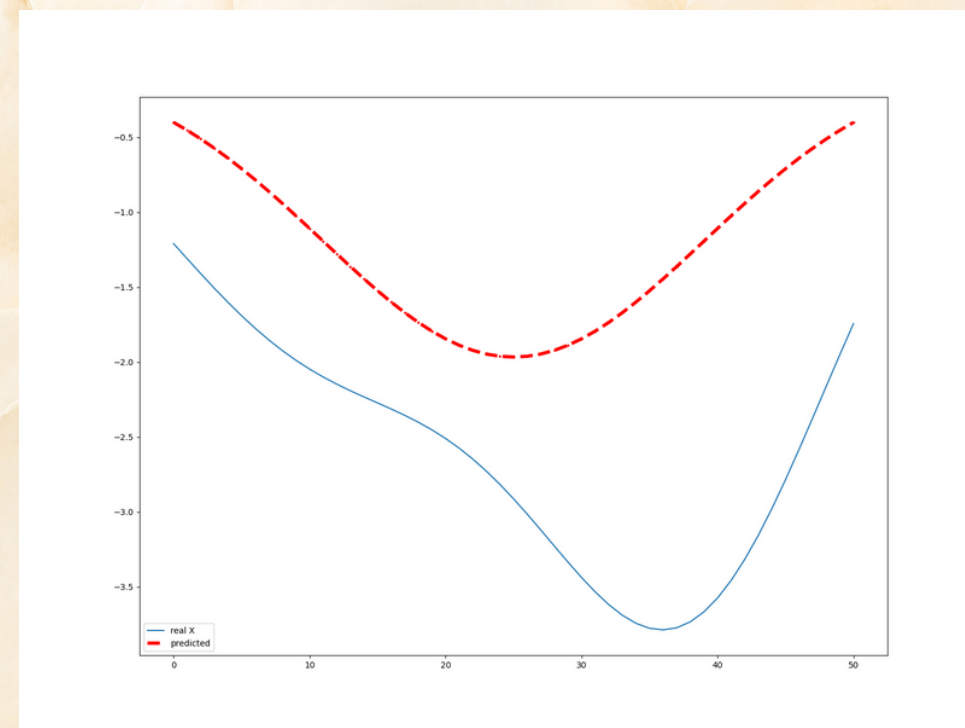
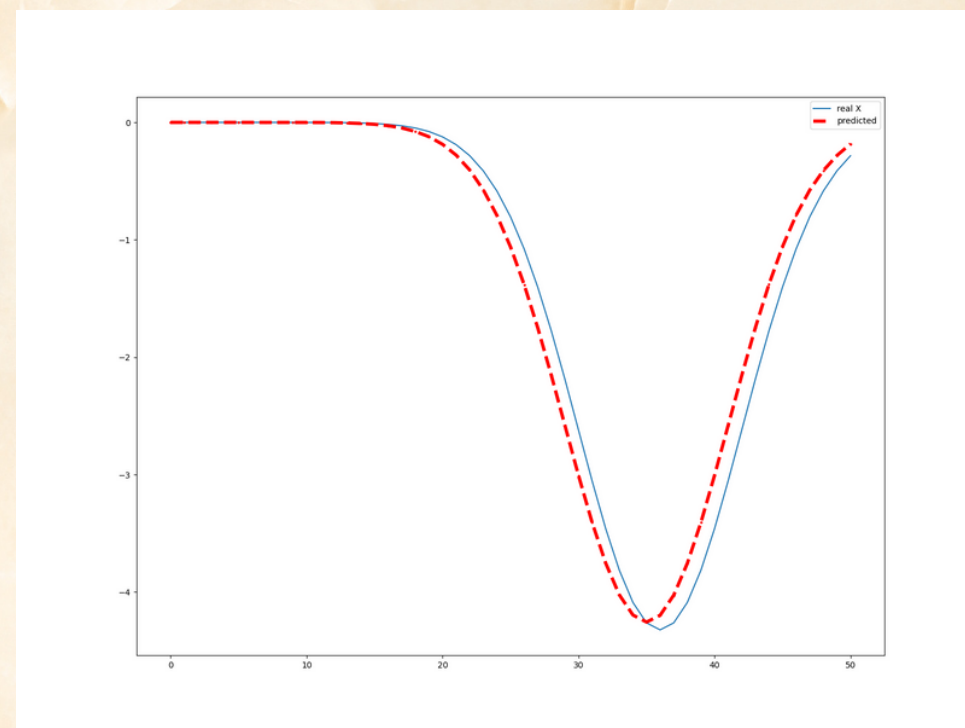
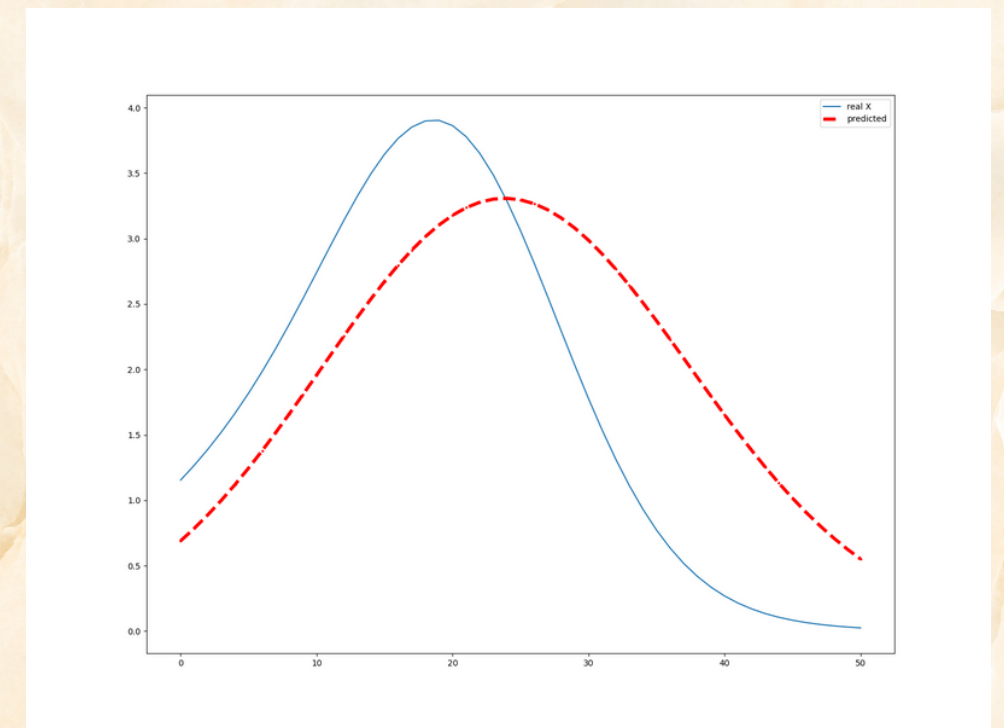
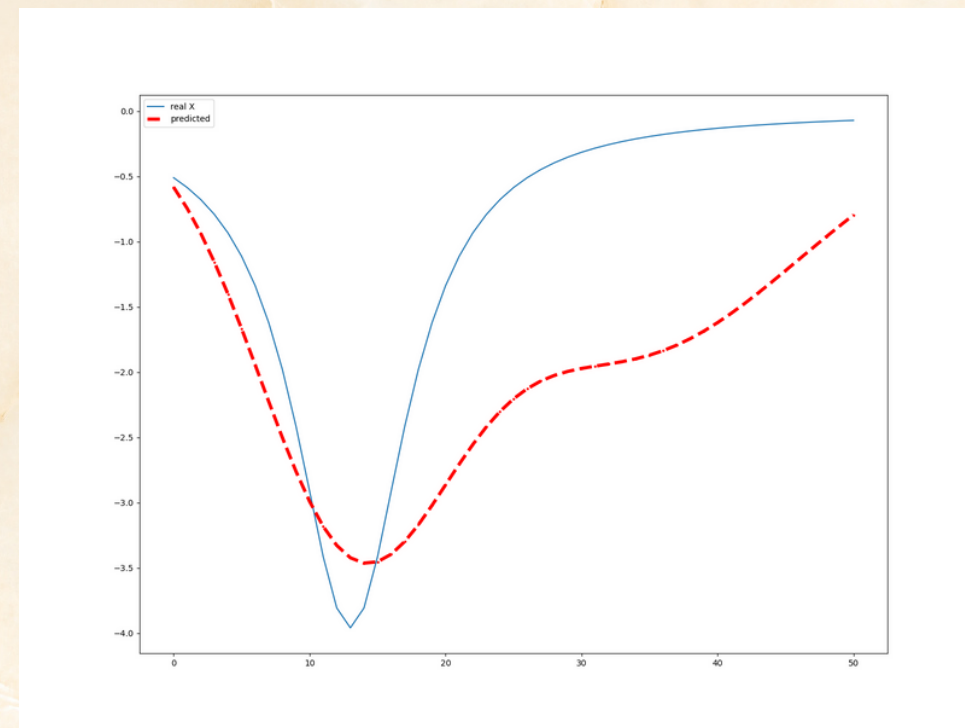
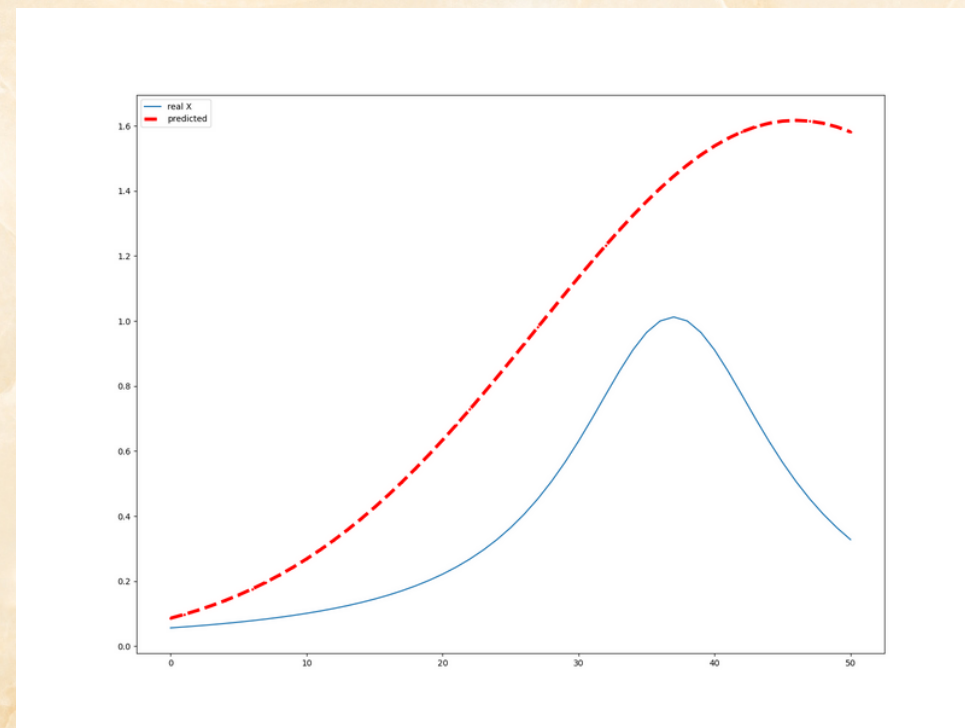


Некоторые выводы

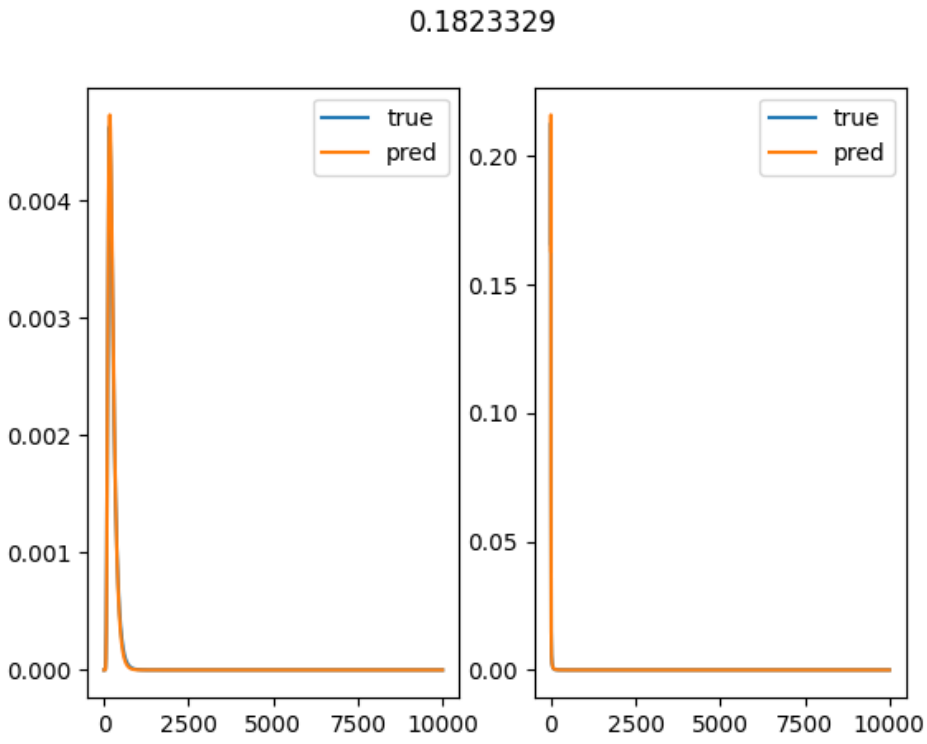
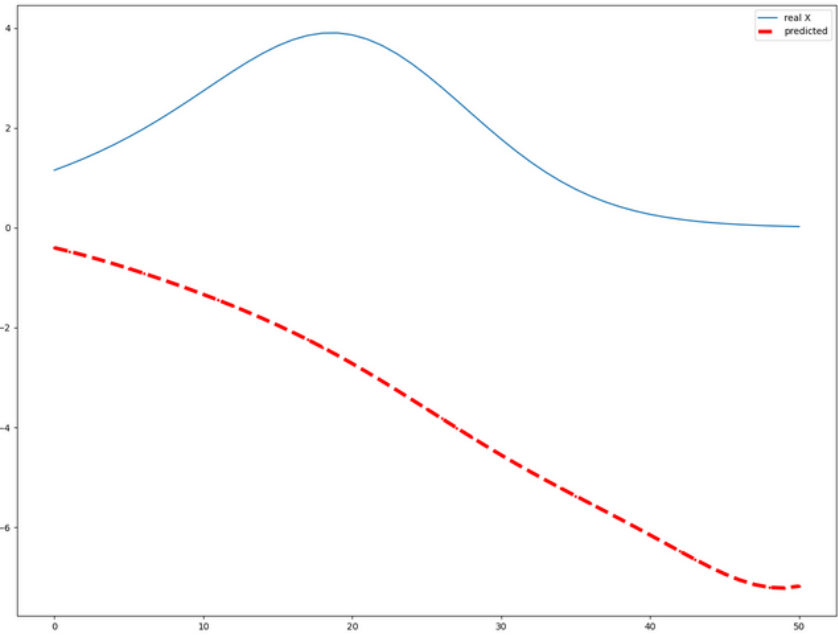
1. Некоторые случаи хорошо аппроксимирует
2. Не зависит от ядра
3. Не замечала сильных изменений при увеличении
числа итераций



Аппроксимация гауссианами с фиксированными mean value



Проблемы

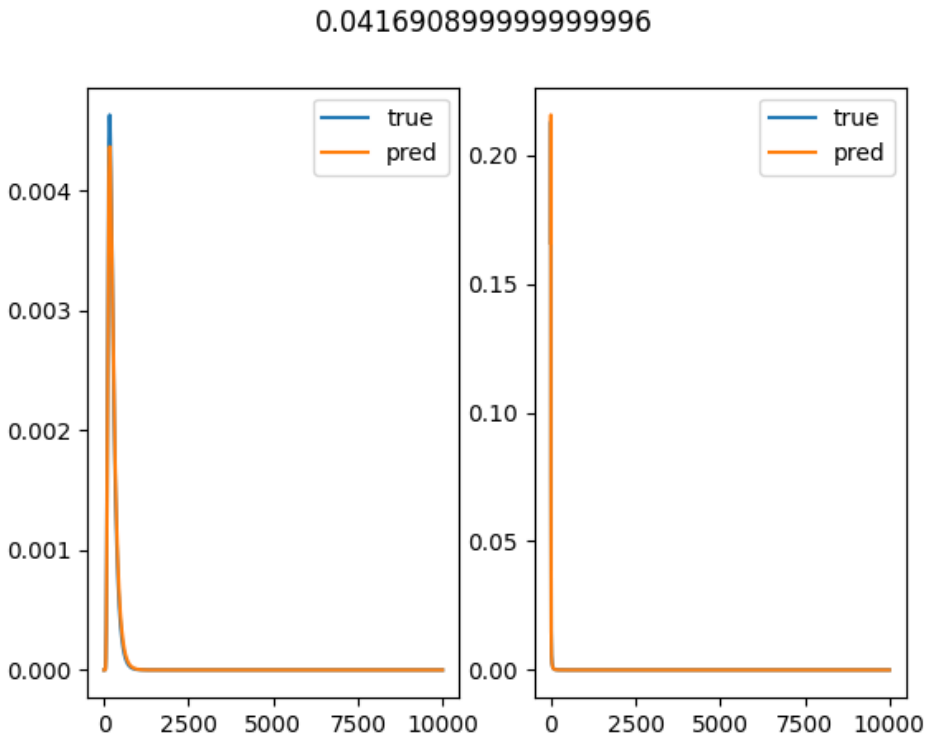
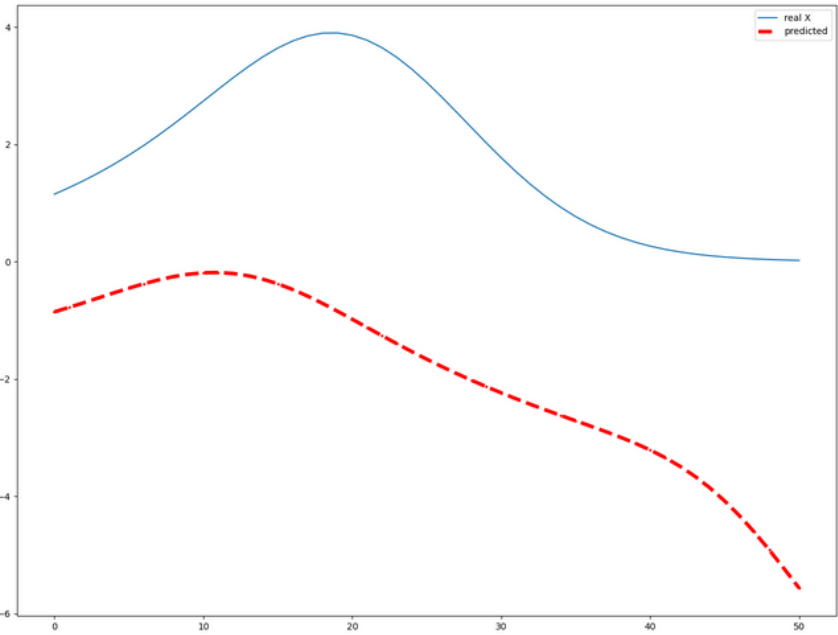


Matern32 10 gauss 200 steps

MSE_pos: 5.61e-10

MSE_neg: 2.18e-09

Difference between rates: 0.01 0.19 0.18



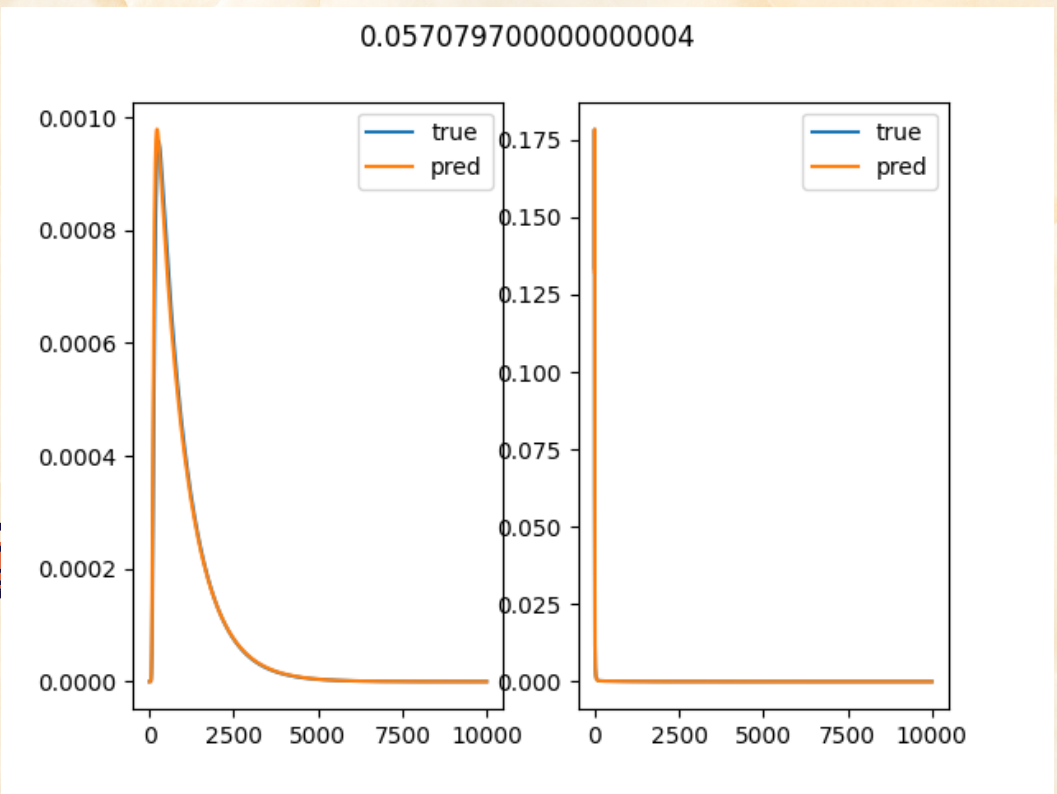
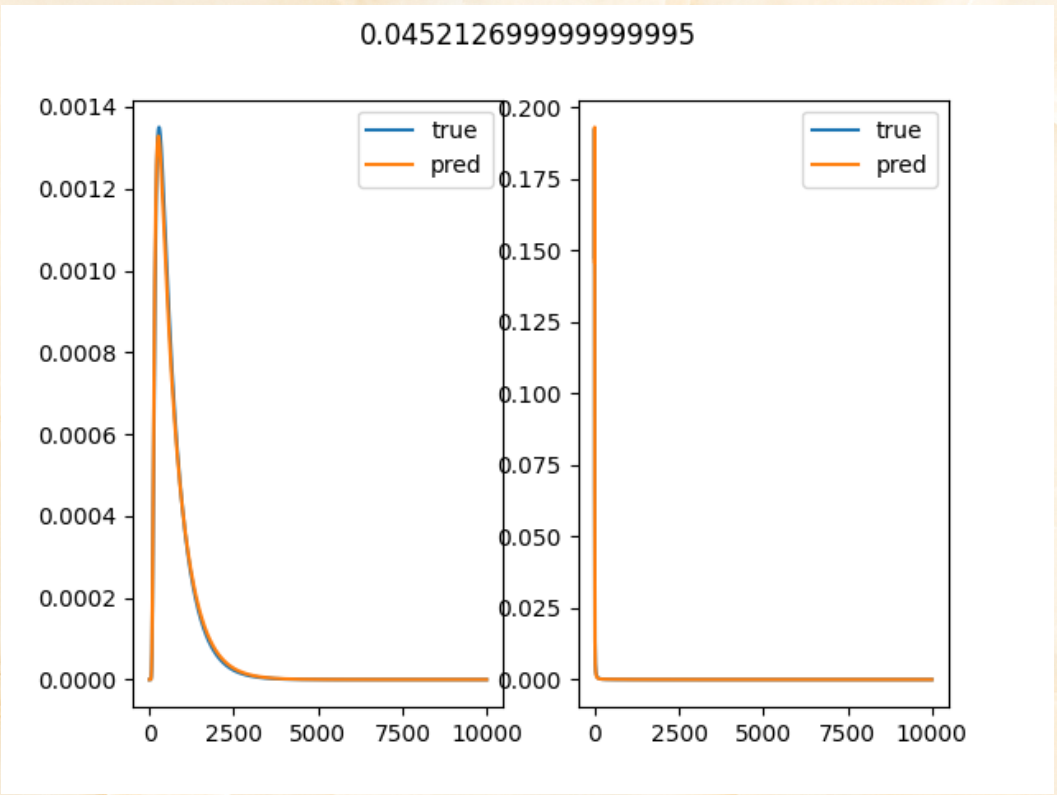
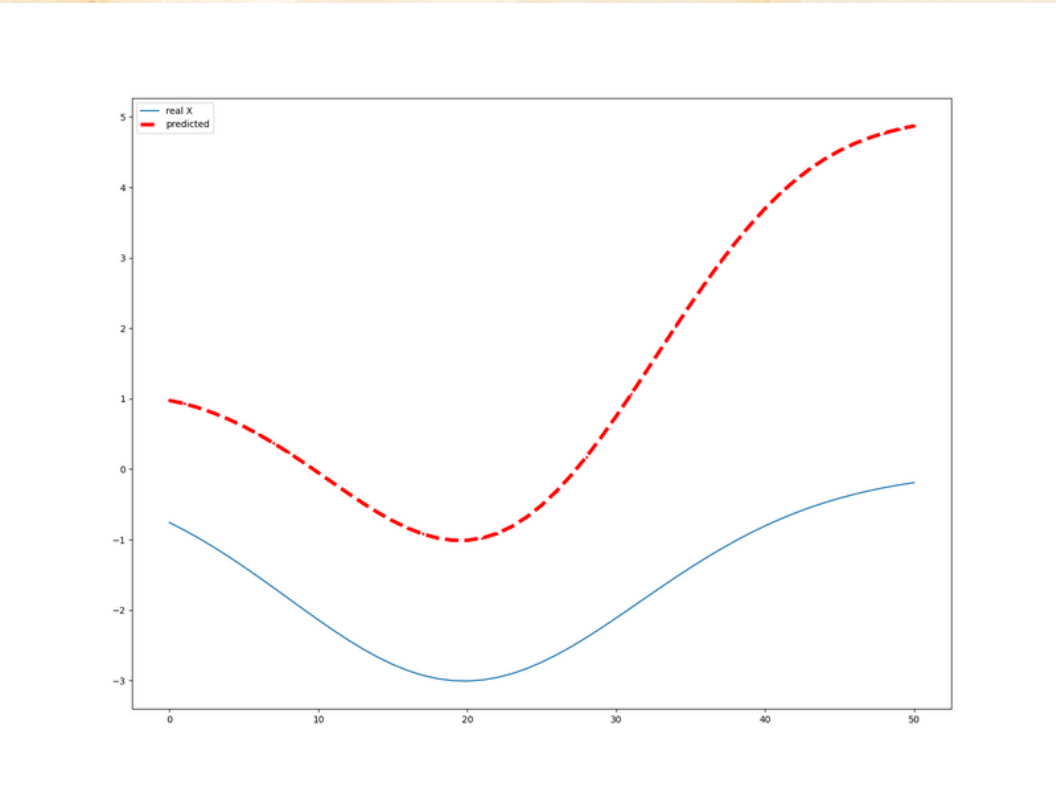
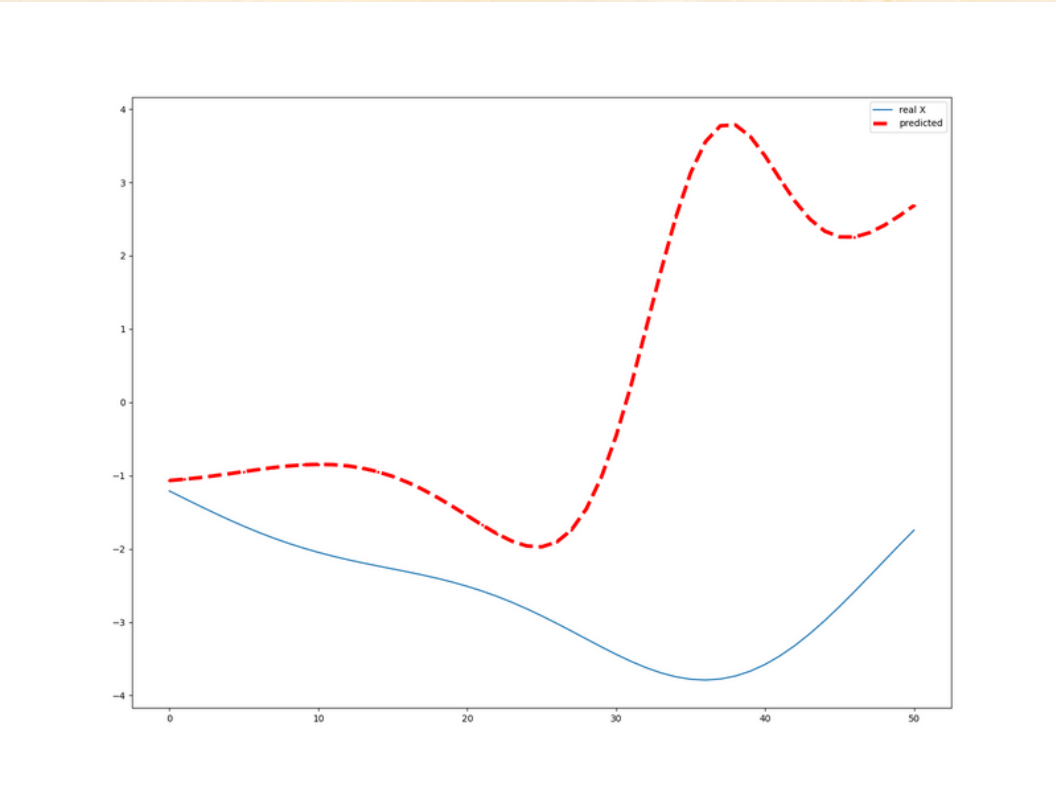
Matern32 15 gauss 200 steps

MSE_pos: 9.39e-10

MSE_neg: 9.69e-09

Difference between rates: 0.01 0.05 0.04

Проблемы



Matern32 20 gauss 200 steps

MSE_pos: 1.4e-10

MSE_neg: 1.13e-09

Difference between rates: 0.125 0.079 0.045

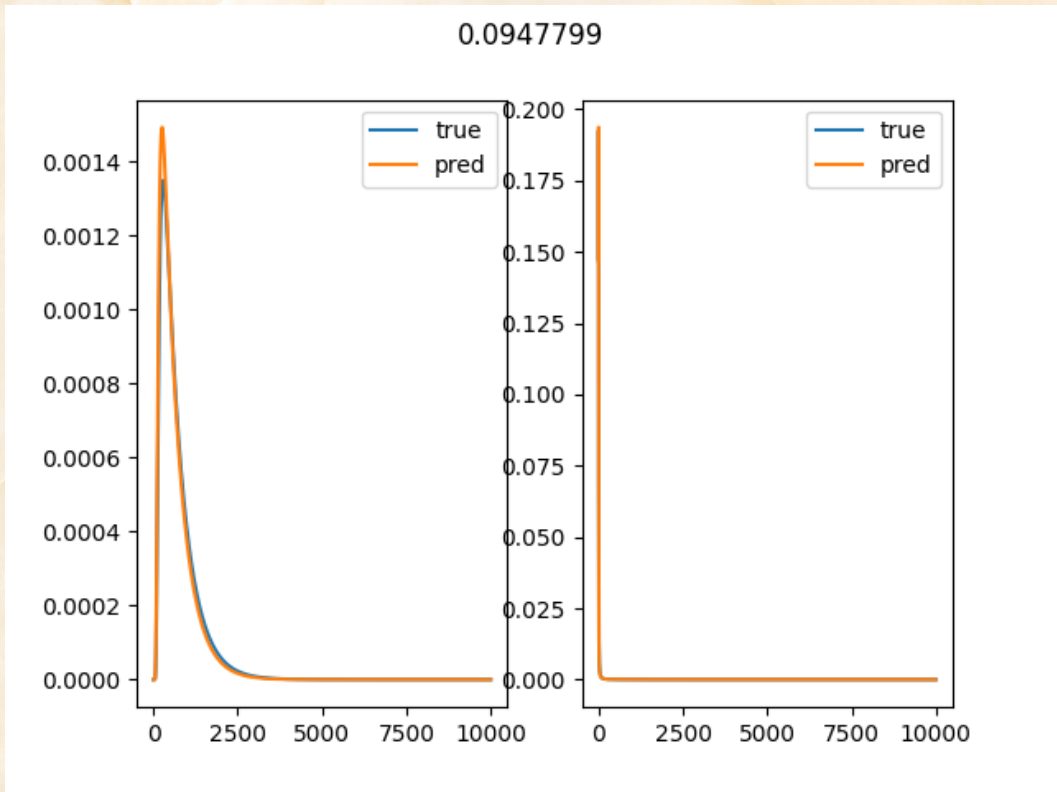
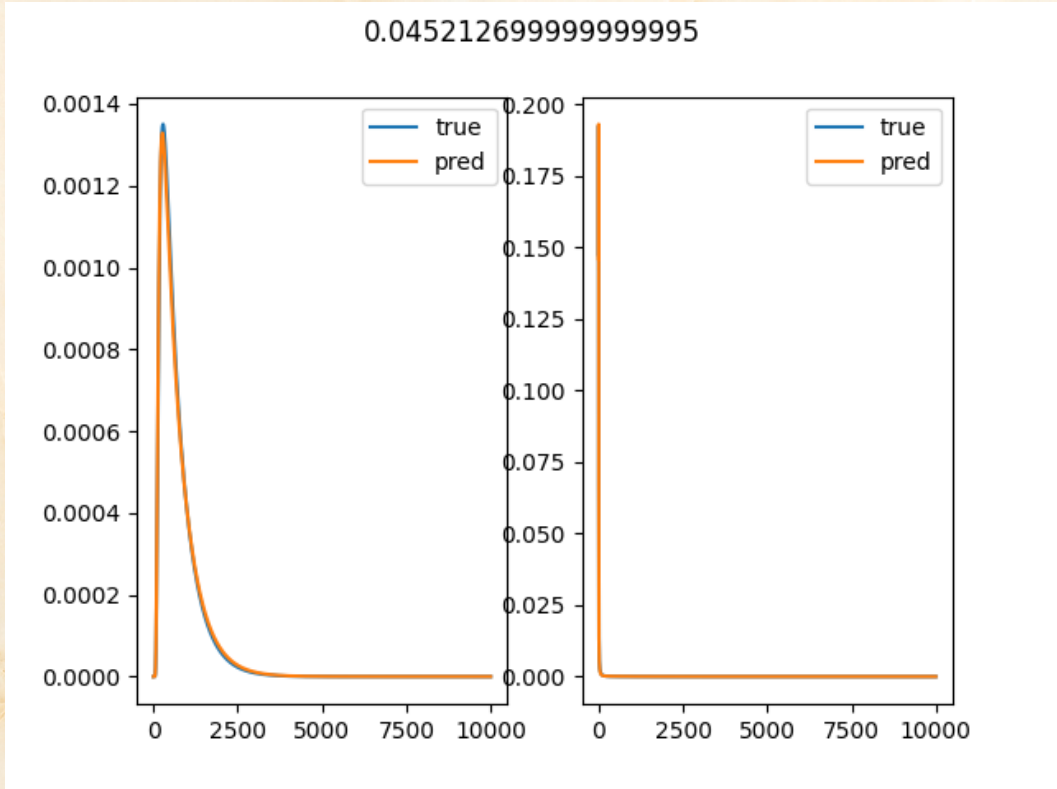
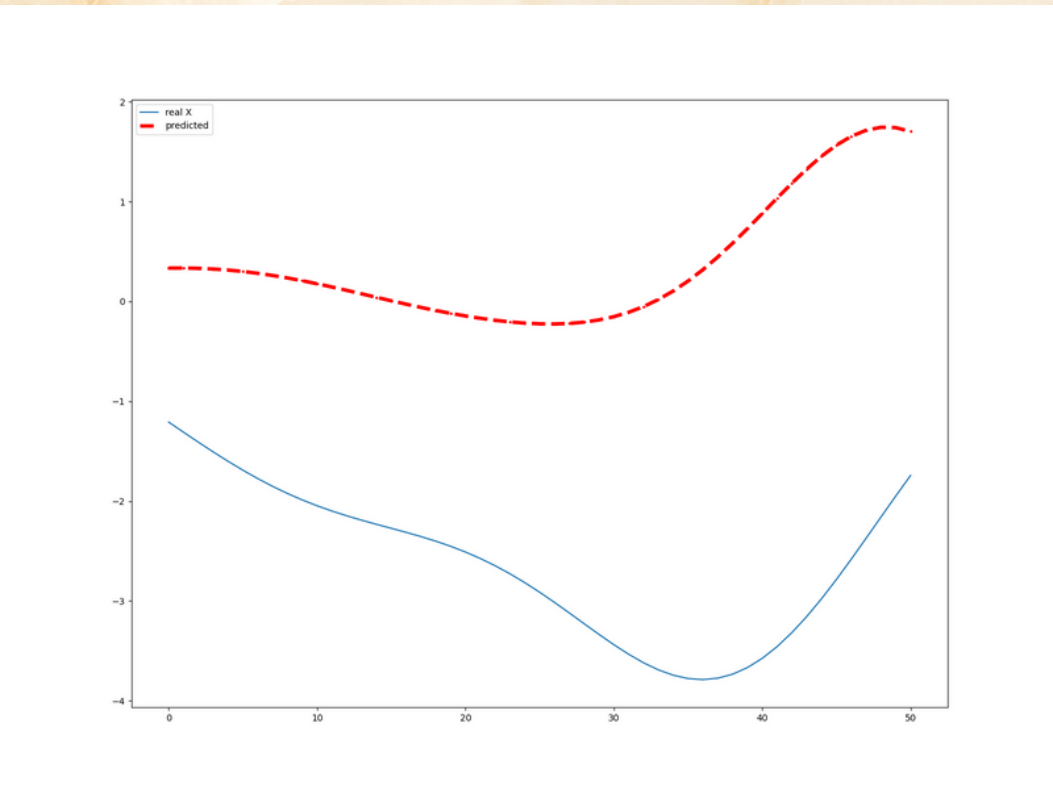
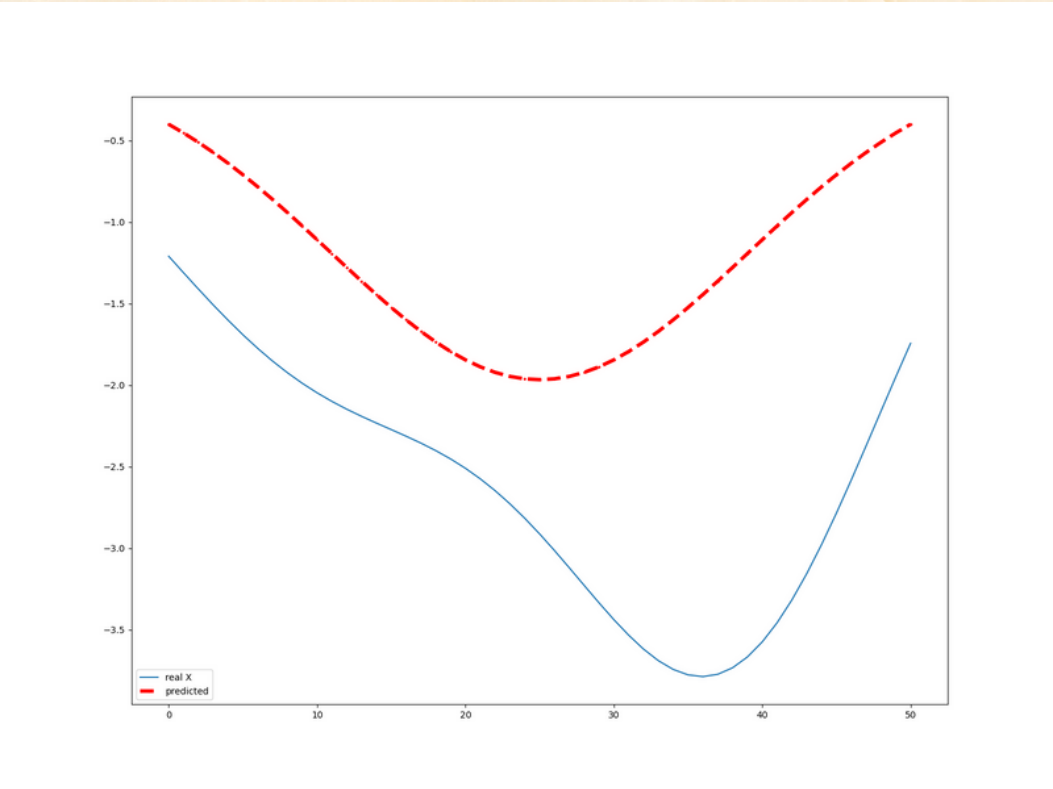
RBF 20 gauss 200 steps

MSE_pos: 3.13e-10

MSE_neg: 2.27e-10

Difference between rates: 0.061 0.0046 0.057

Проблемы



RatQuad 20 gauss 100 steps

MSE_pos: 1.4e-10

MSE_neg: 1.13e-09

Difference between rates: 0.125 0.079 0.045

RatQuad 20 gauss 200 steps

MSE_pos: 8.56e-10

MSE_neg: 5.53e-10

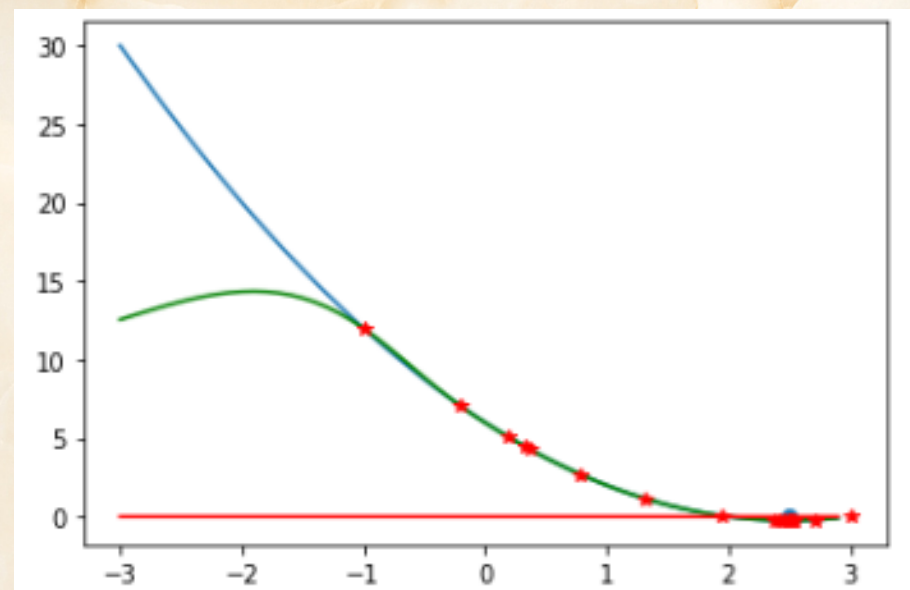
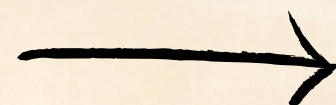
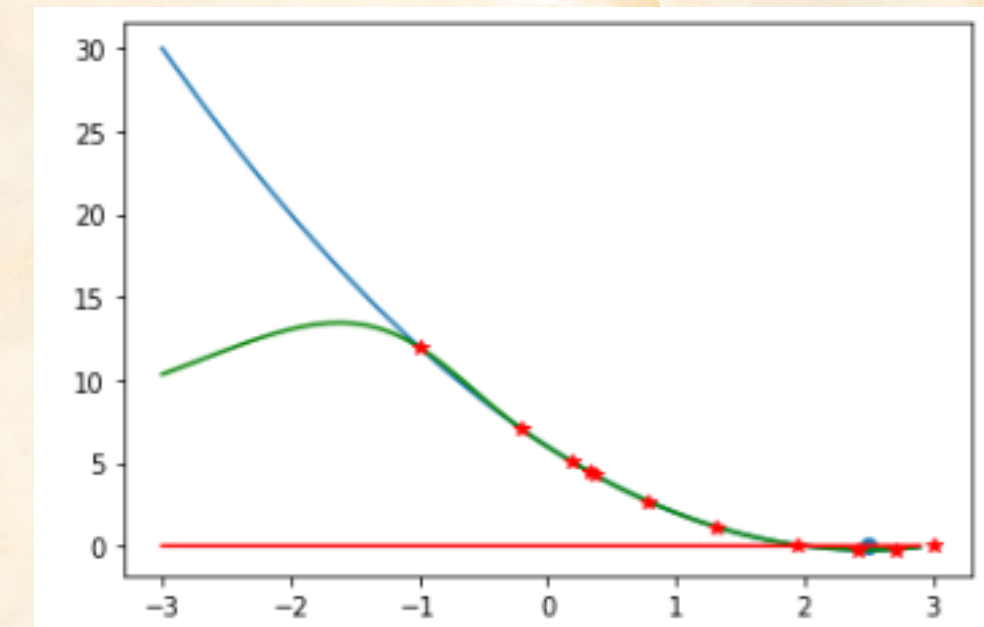
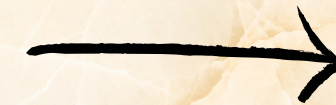
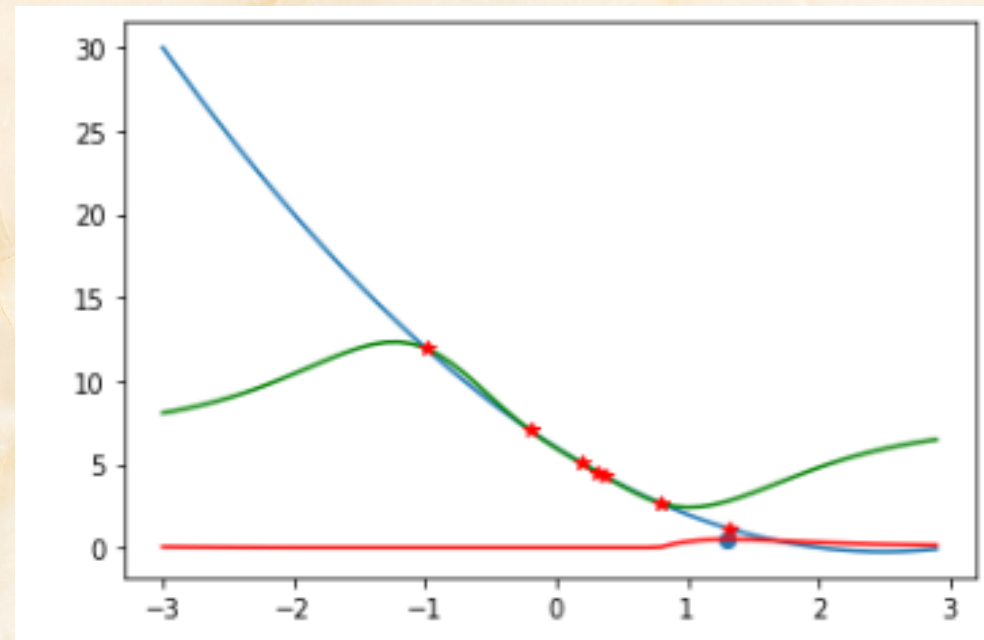
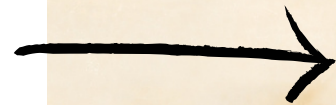
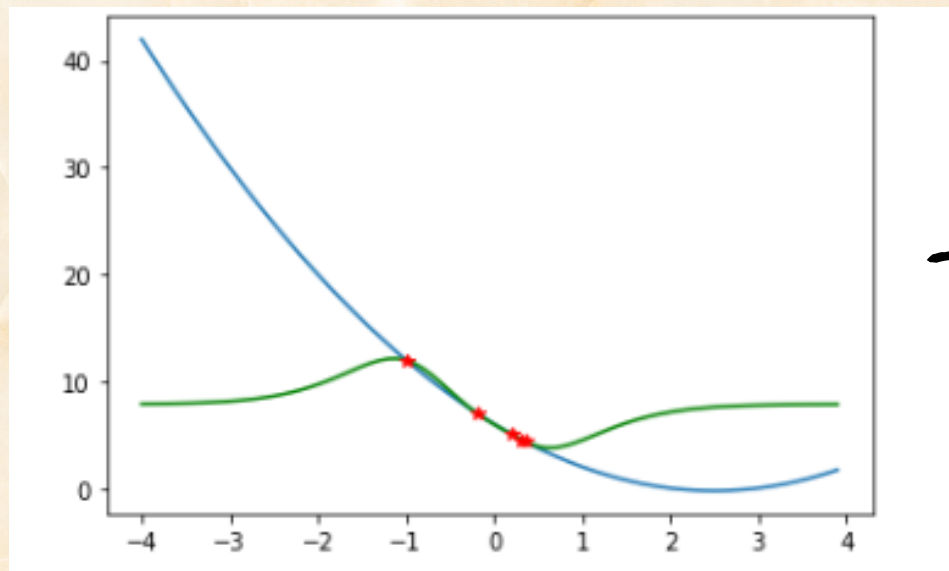
Difference between rates: 0.12 0.03 0.094

Некоторые выводы

1. Не наблюдается улучшений по сравнению с нефиксированными гауссианами
2. Зависит от kernel
3. Не любой профиль фиттится количеством гауссиан меньше 15
(много параметров для оптимизации)
4. При увеличении количества итераций иногда уходит в не те значения (*)

BoTorch

1D



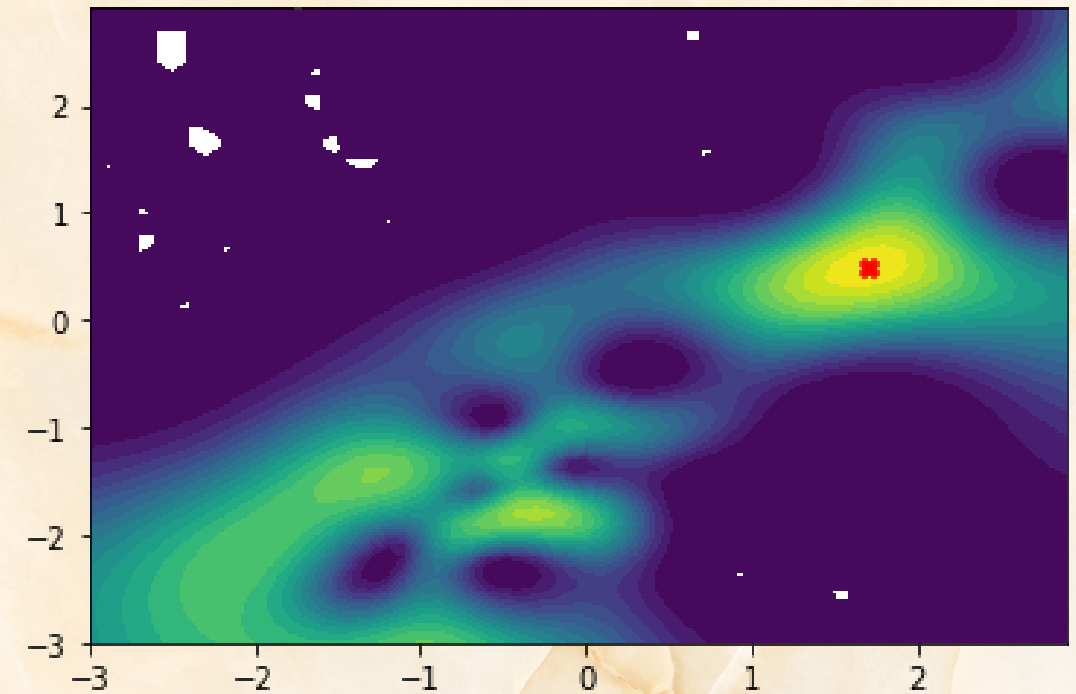
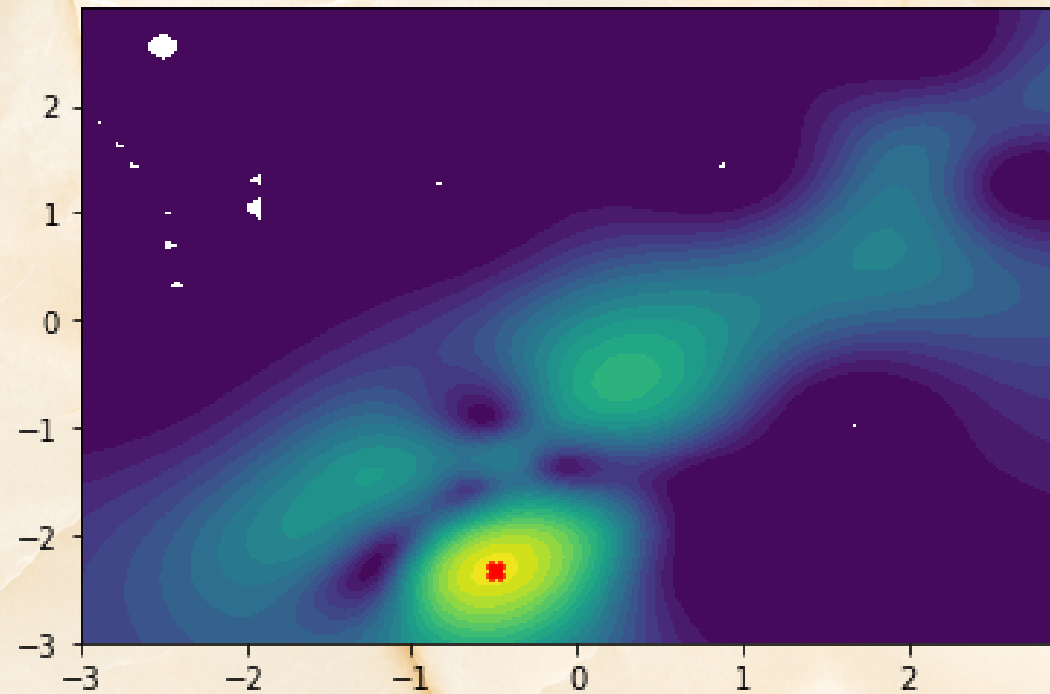
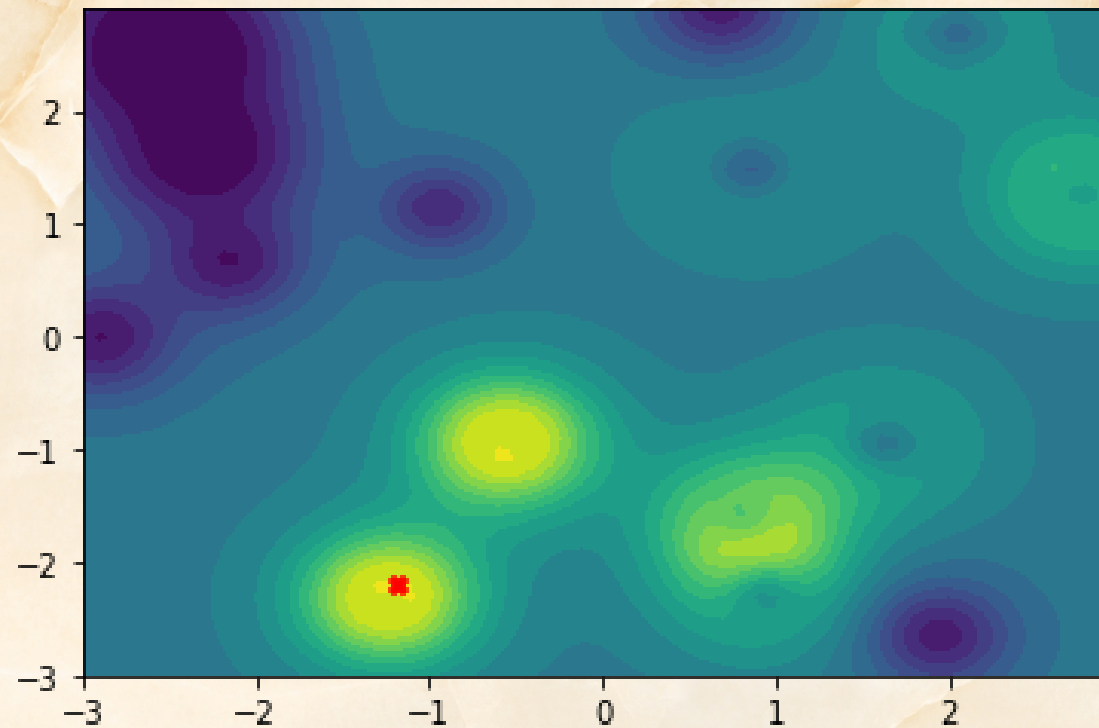
$$x = 2.5007$$

2D

МакКормика

$$f(x, y) = \sin(x + y) + (x - y)^2 - 1.5x + 2.5y + 1$$

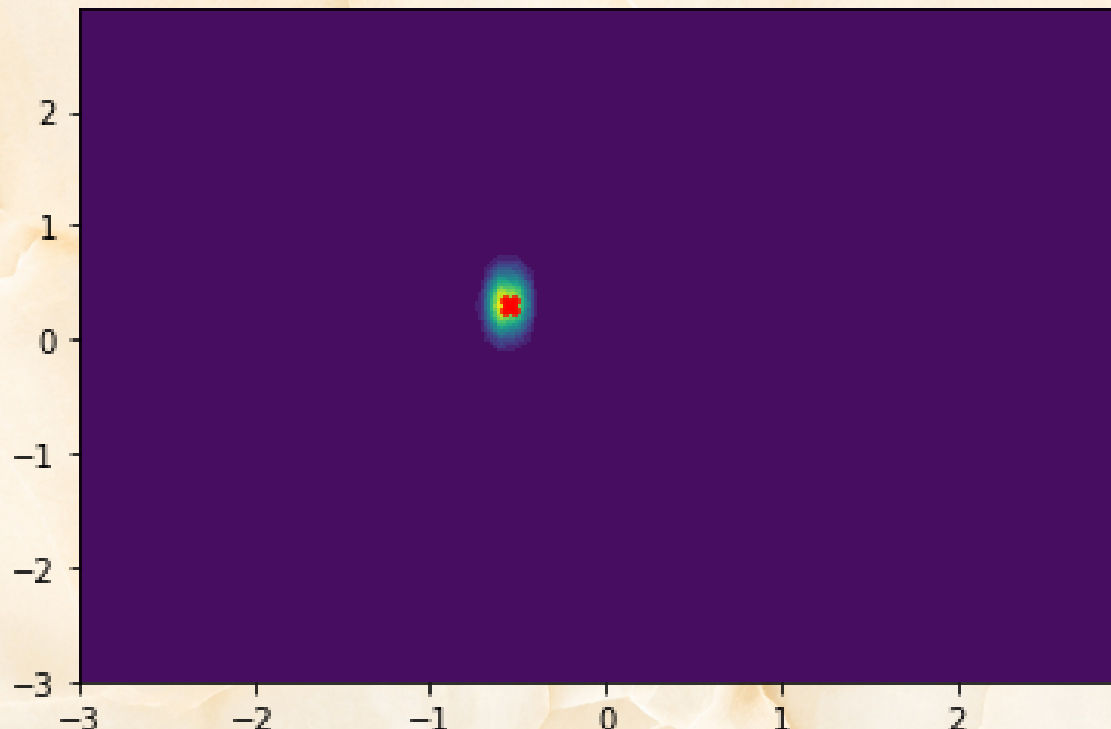
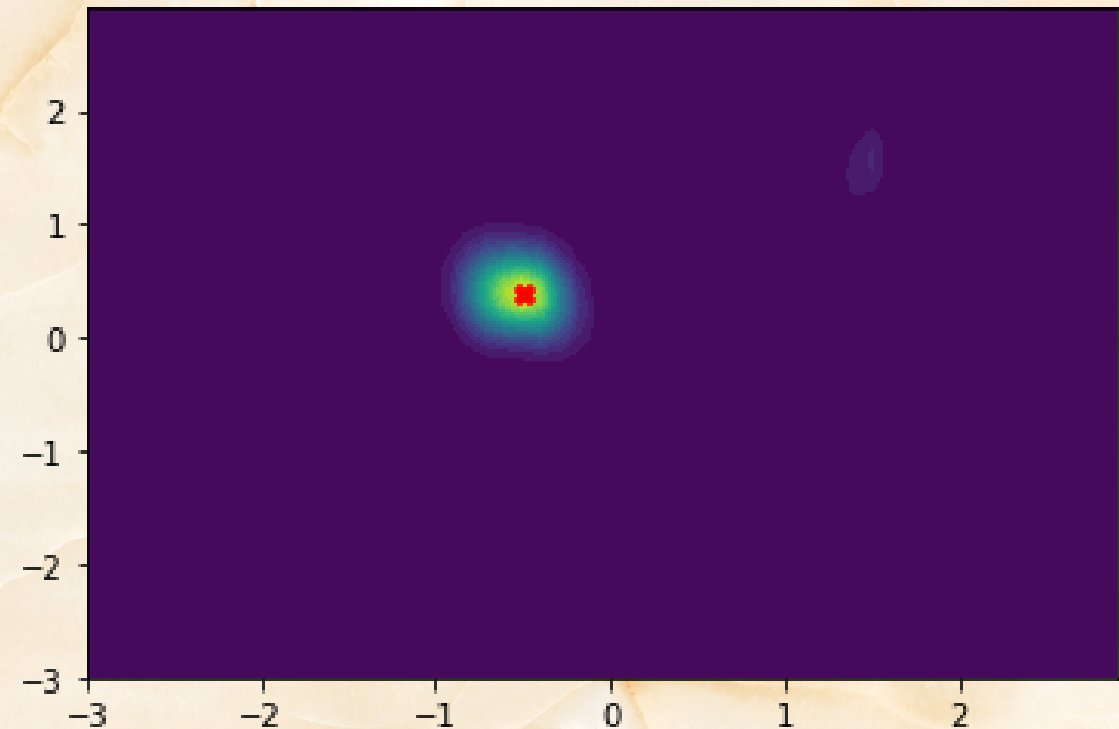
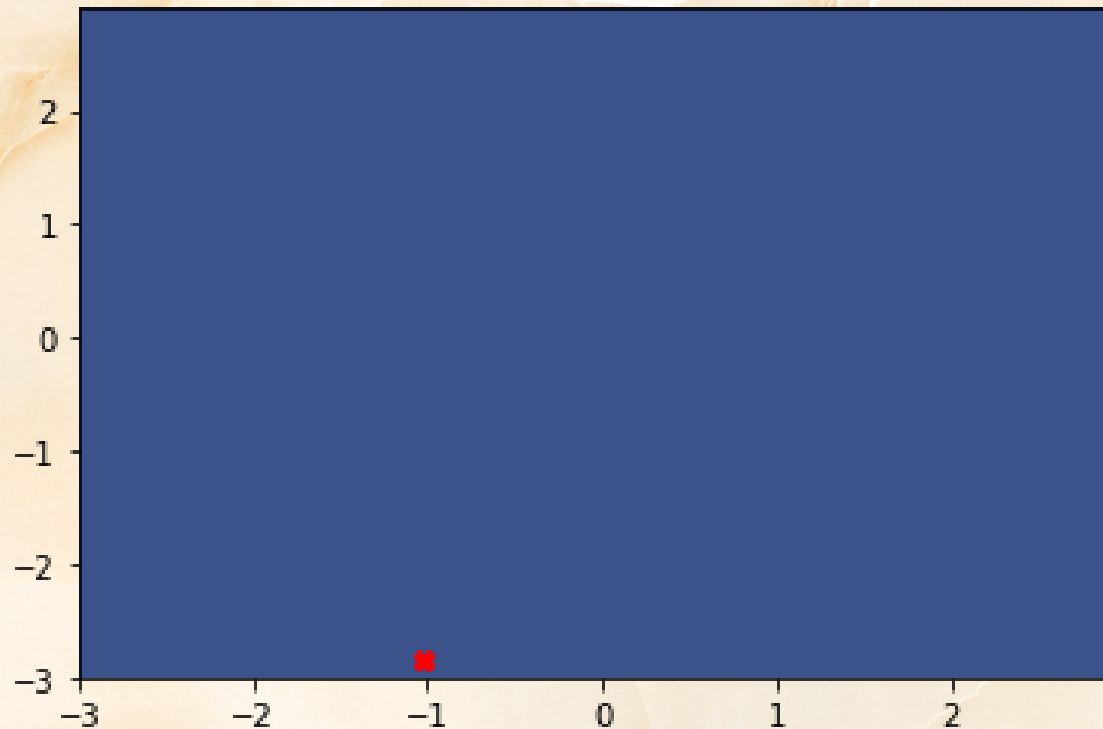
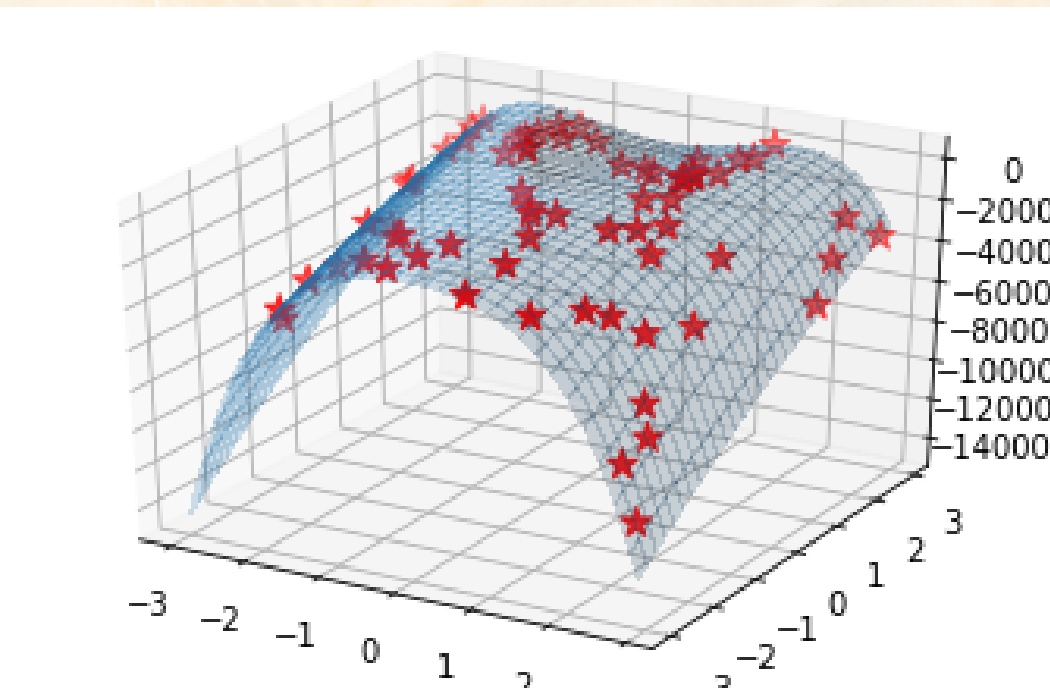
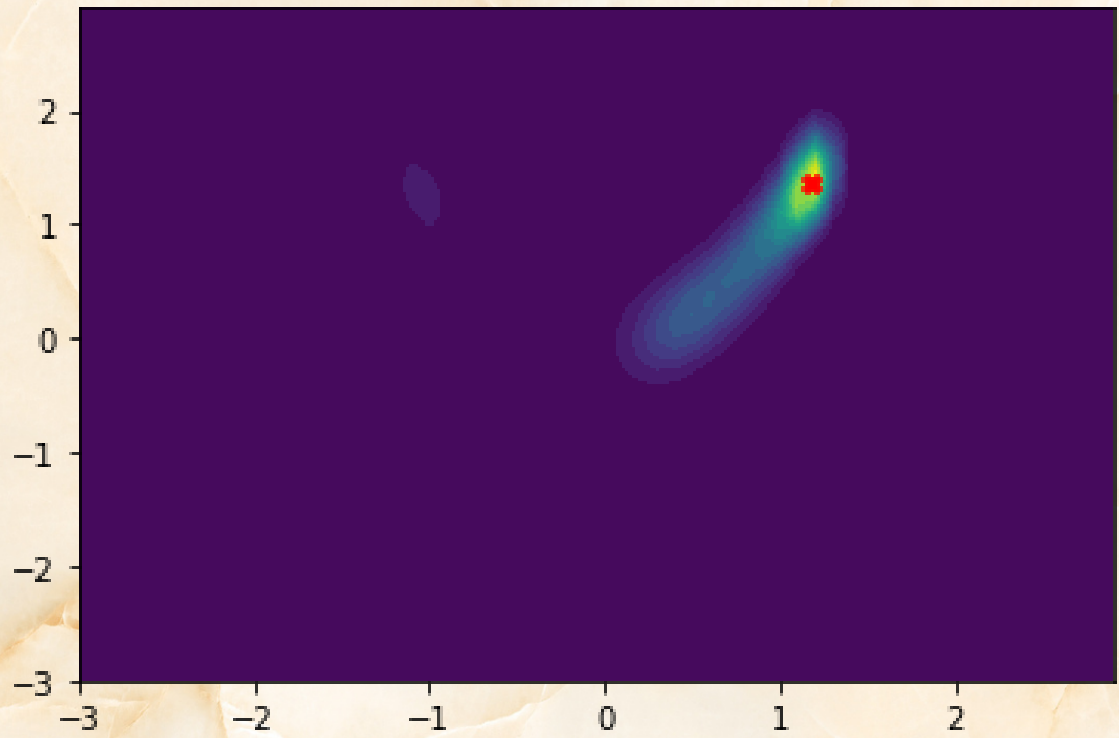
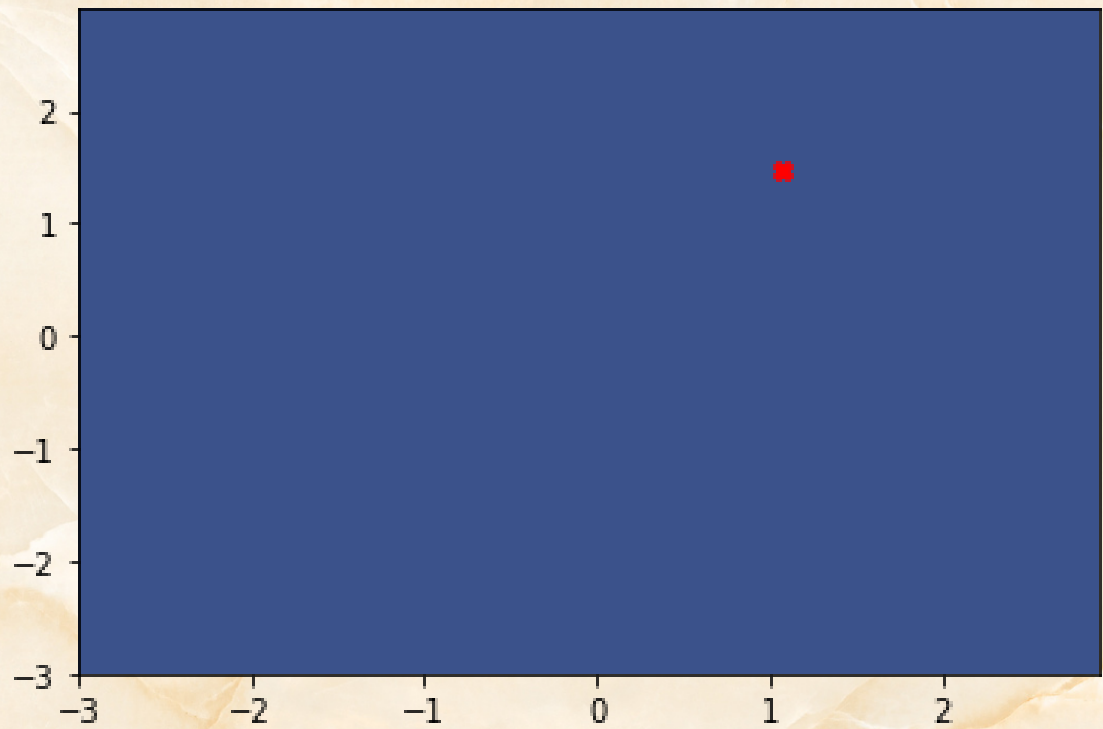
$$f(-0.54719, -1.54719) = -1.9133$$



$$x = (-0.6385, -1.5736) \quad y = -1.90$$

Розенброка

$x = (1.0902, 1.1789)$ $y = -0.0017$
 $x = (1.5234, 2.20)$ $y = -1.6$



Полезная литература

Expected Hypervolume Improvement

Botorch