

Week 2 Optimisation for Machine Learning

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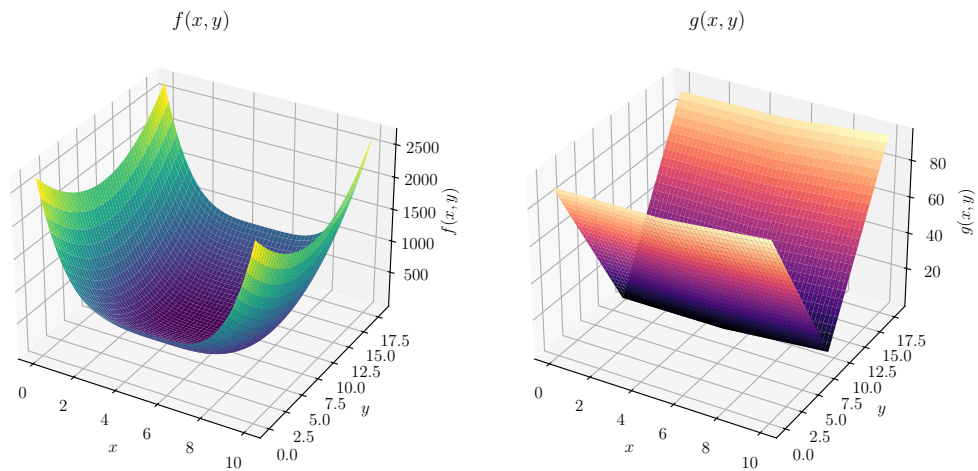


Figure 1

Let

$$f(x, y) = 3(x - 5)^4 + 10(y - 9)^2 \quad (1)$$

and

$$g(x, y) = \max(x - 5, 0) + 10|y - 9| \quad (2)$$

Clearly, the minimum of both $f(x, y)$ and $g(x, y)$ is 0 and they both minimized by $x = 5, y = 9$.

The Polyak step size is

$$\alpha_{\text{Polyak}} = \frac{f(x) - f^*}{\nabla f(x)^T \nabla f(x)} \quad (3)$$

where x is the parameter vector, $f(x)$ is the function to optimise, and $f^* \approx \min_x f(x)$.

Listing 1: A python function to calculate the Polyak step size on a sympy function.

```
src/polyak_step_size.py    Wed Feb 07 16:44:22 2024    1
1: import numpy as np
2:
3:
4: def polyak_step_size(sp_func, sp_x, x, f_star):
5:     assert len(sp_x) == len(x)
6:     subs = {sp_xi: xi for sp_xi, xi in zip(sp_x, x)}
7:     fx = sp_func.subs(subs)
8:     grad = [sp_func.diff(sp_xi).subs(subs) for sp_xi in sp_x]
9:     grad = np.array(grad)
10:    denominator = sum(grad * grad)
11:    numerator = fx - f_star
12:    return numerator / denominator
```