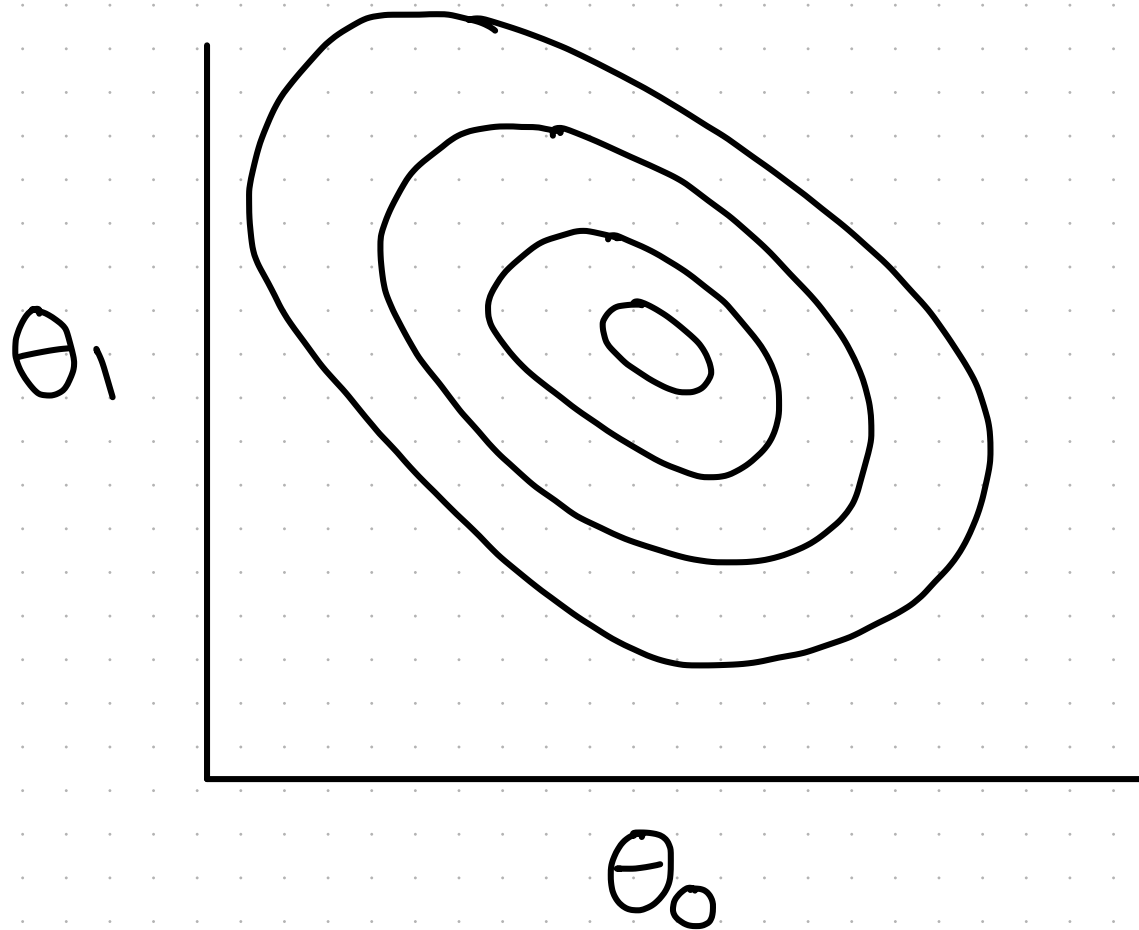
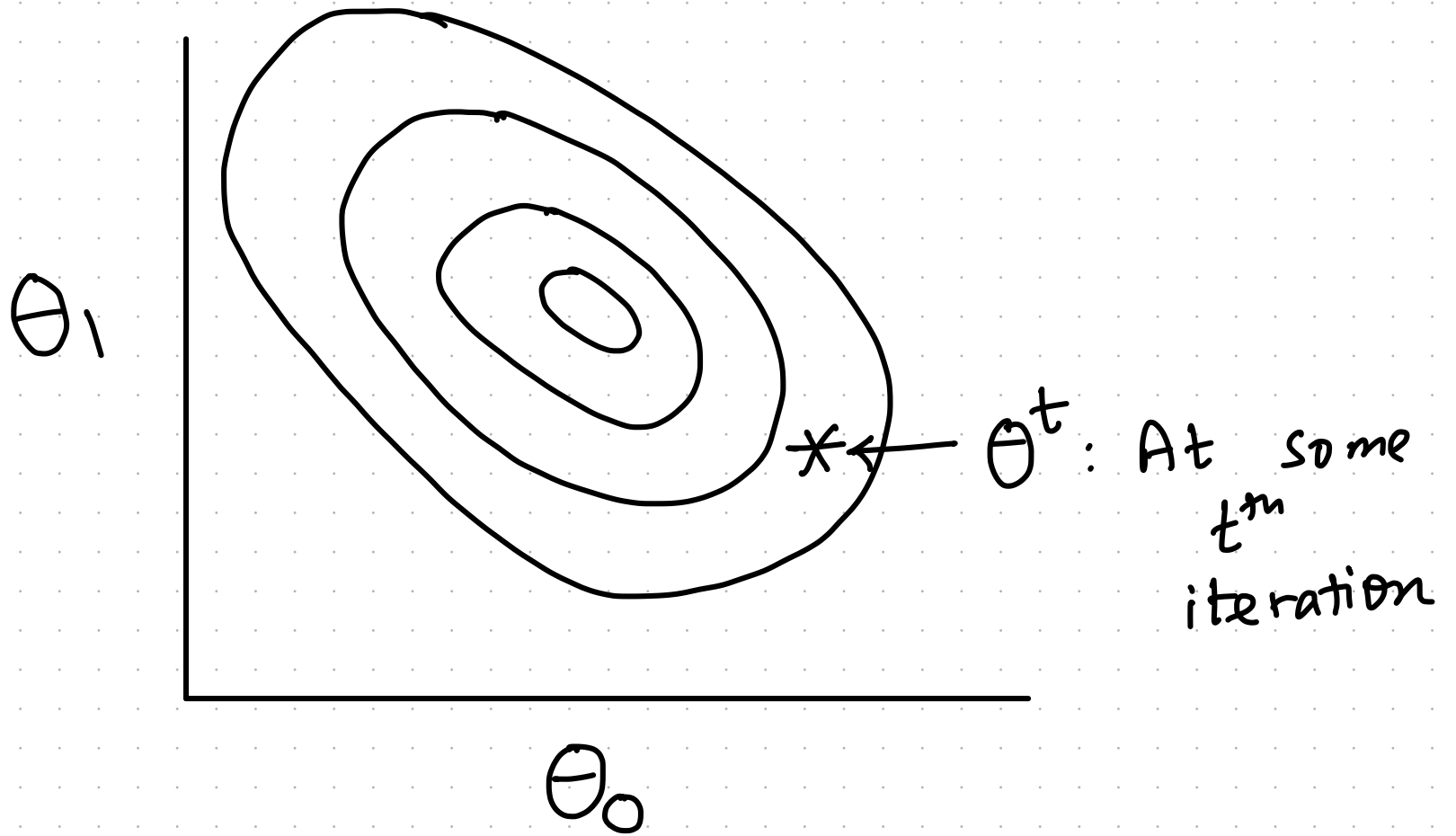


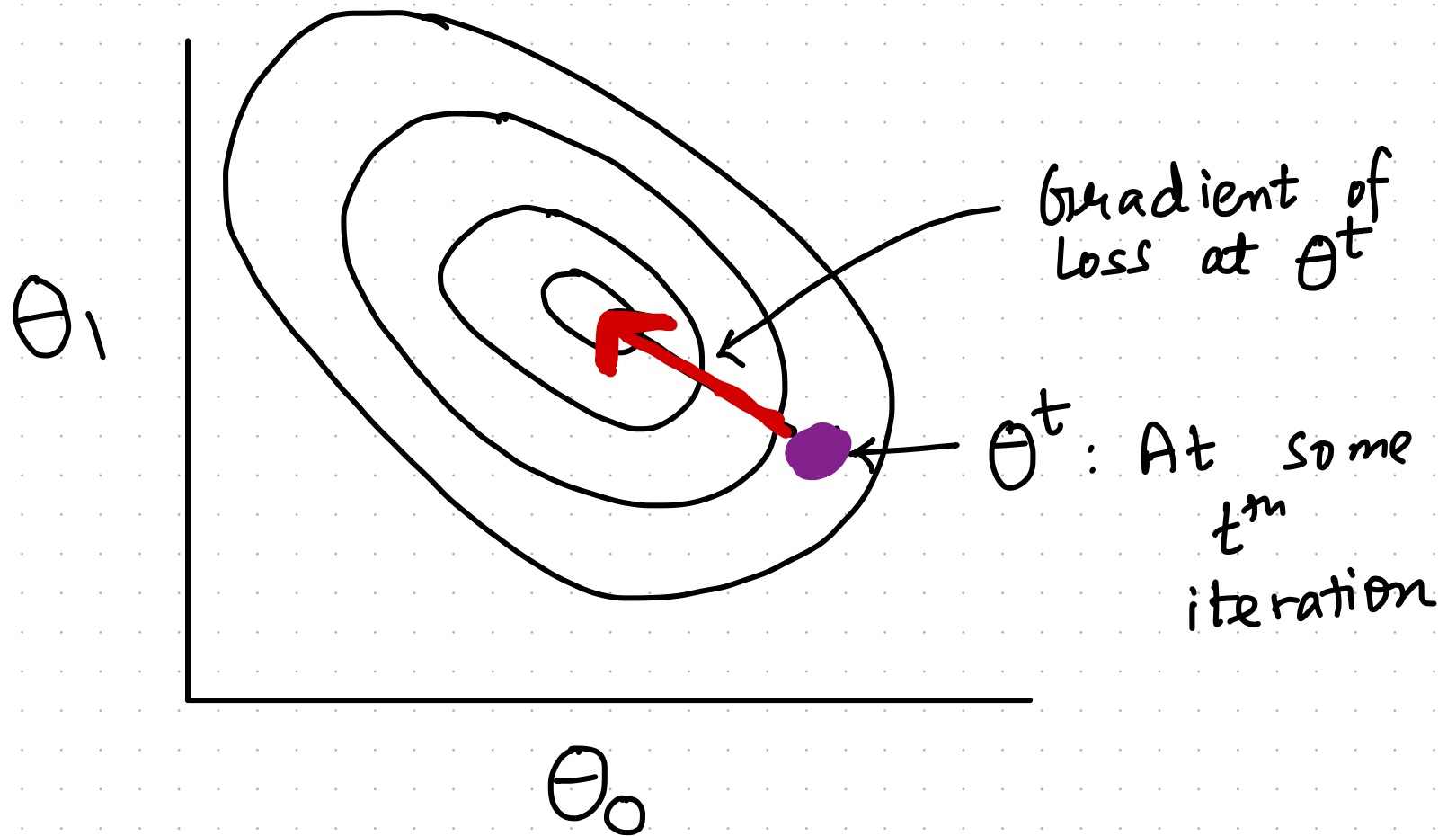
X	y	$\hat{y} = f(x, \theta)$
x_1^T \vdots x_N^T	y_1 \vdots y_N	\hat{y}_1 \vdots \hat{y}_N



LOSS SURFACE OVER
 $6N^2$ EXAMPLES



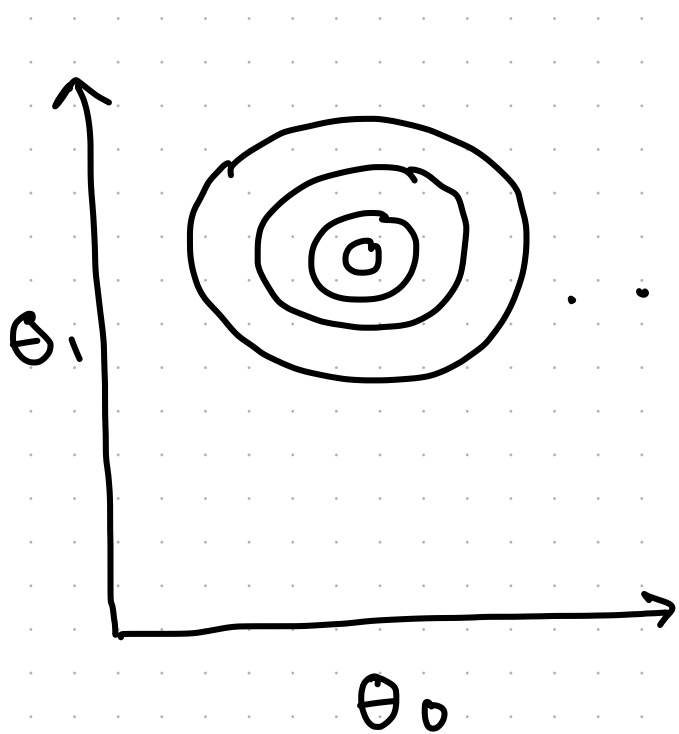
LOSS SURFACE OVER
 $6N^{\text{th}}$ EXAMPLES



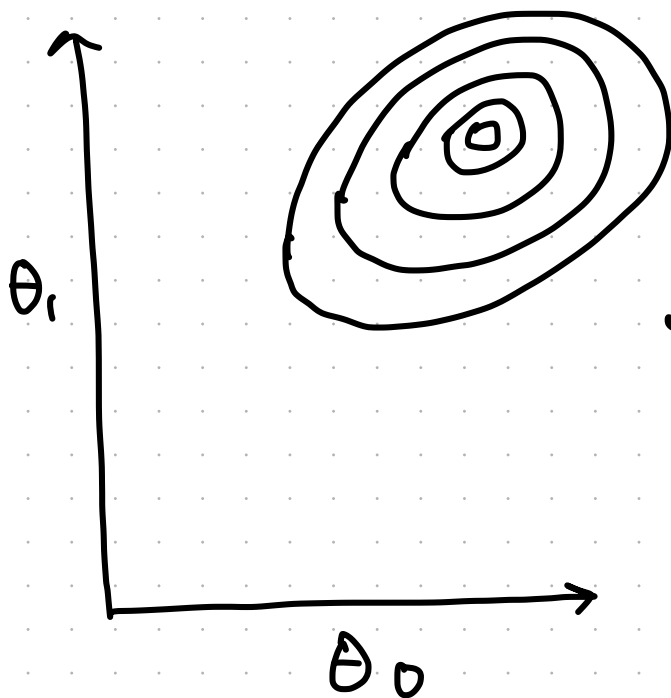
LOSS SURFACE OVER
 $6N^{\text{th}}$ EXAMPLES

X	y	$\hat{y} = f(x, \theta)$
x_1^T	y_1	\hat{y}_1
\vdots		\vdots
\vdots		\vdots
x_N^T	y_N	\hat{y}_N

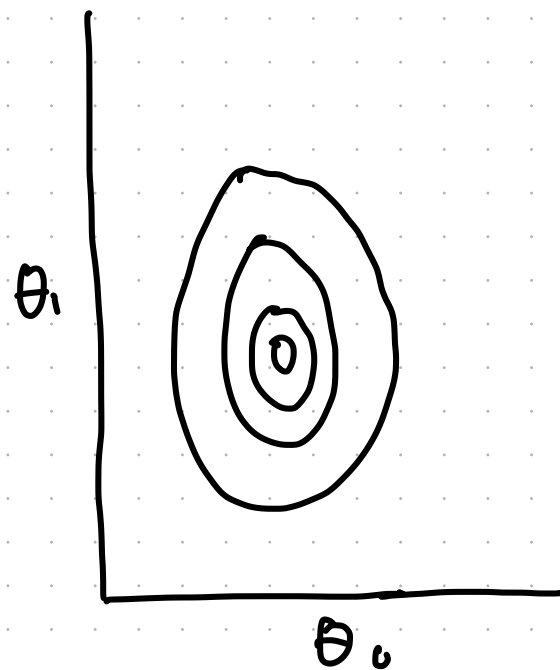
CONSIDER
Individual
data points
to compute
loss



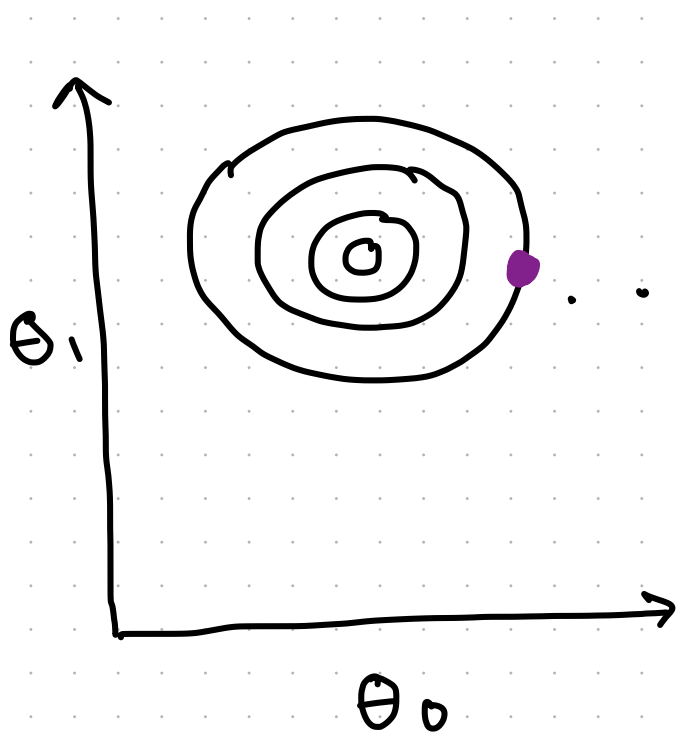
$$\text{loss}(y_i, \hat{y}_i)$$



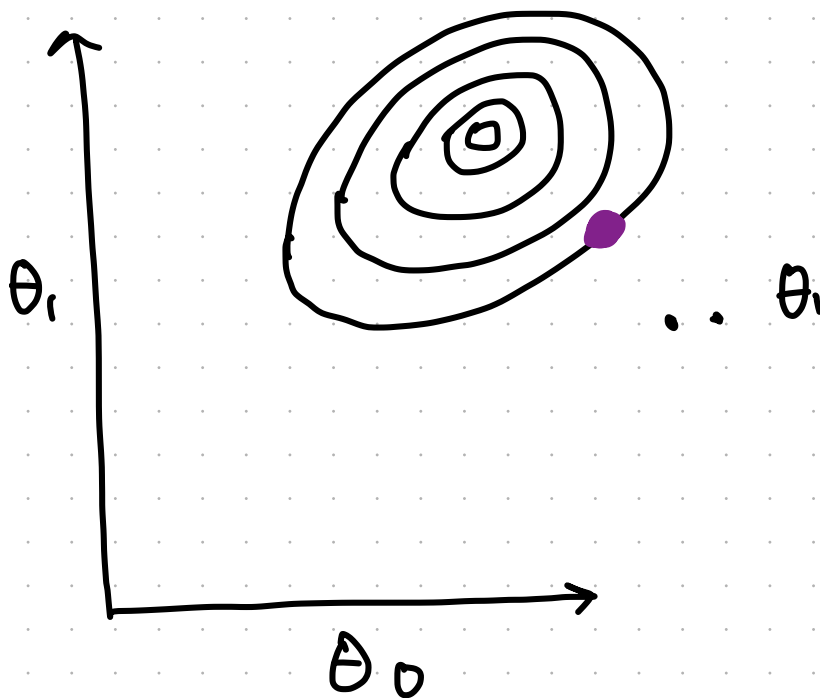
$$\text{loss}(y_i, \hat{y}_i)$$



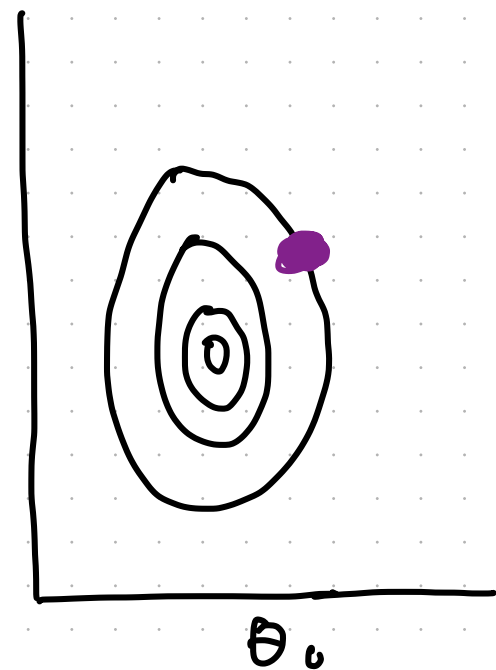
$$\text{loss}(y_N, \hat{y}_N)$$



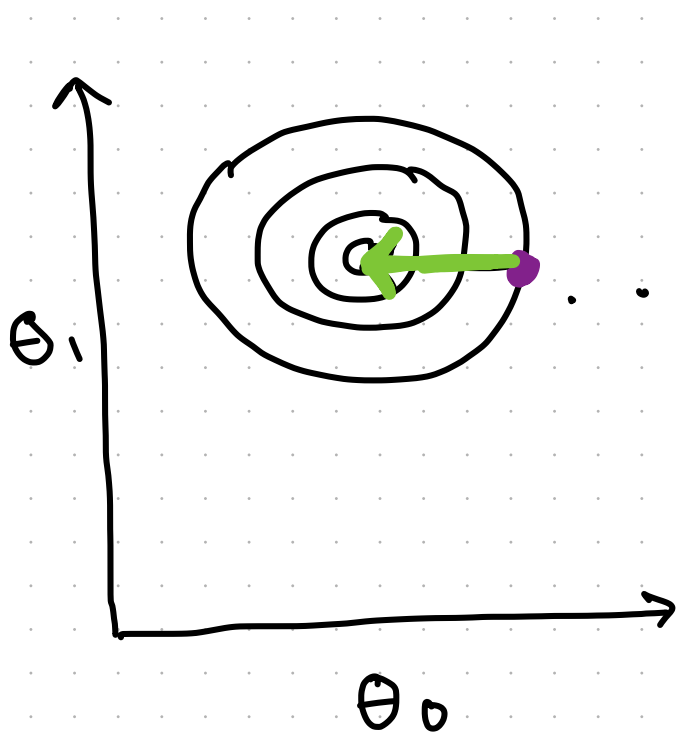
$$\text{loss}(y_i, \hat{y}_i)$$



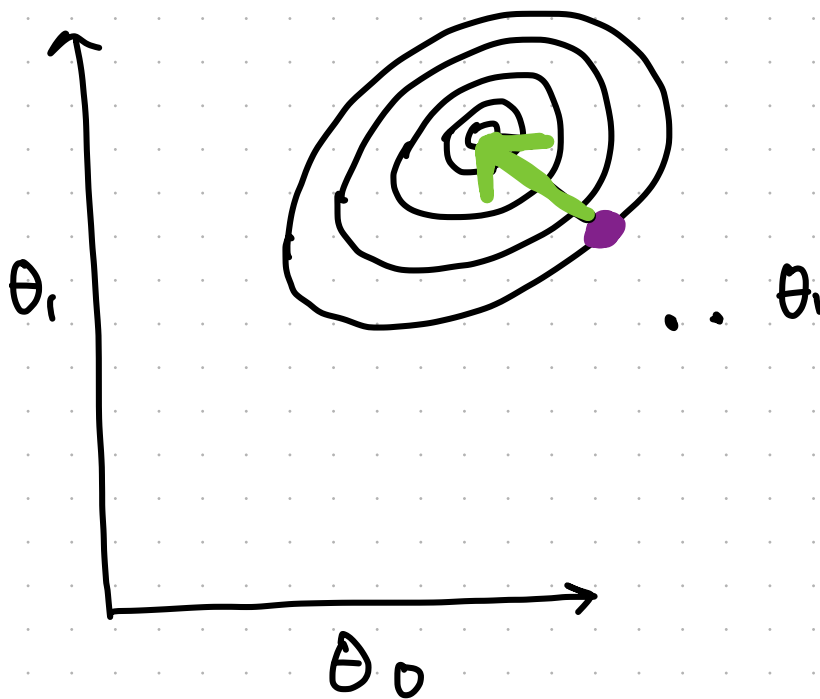
$$\text{loss}(y_i, \hat{y}_i)$$



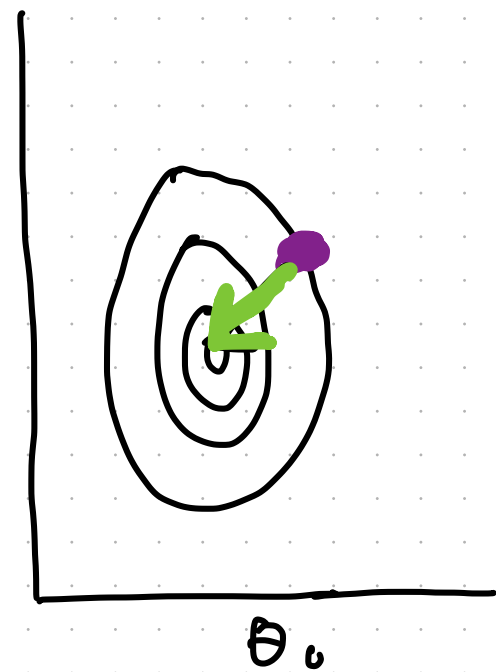
$$\text{loss}(y_N, \hat{y}_N)$$



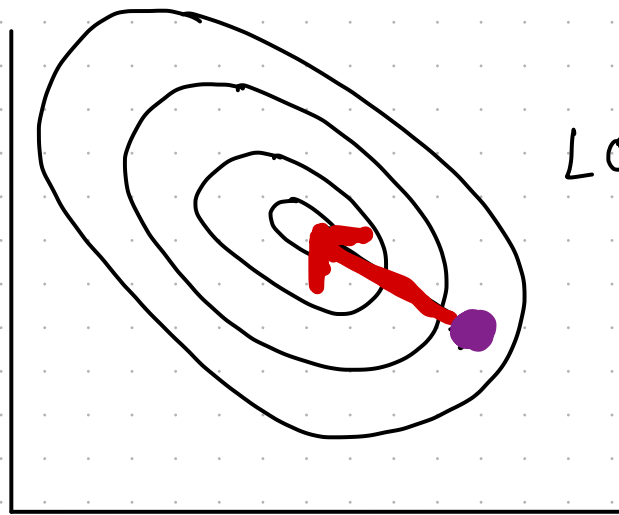
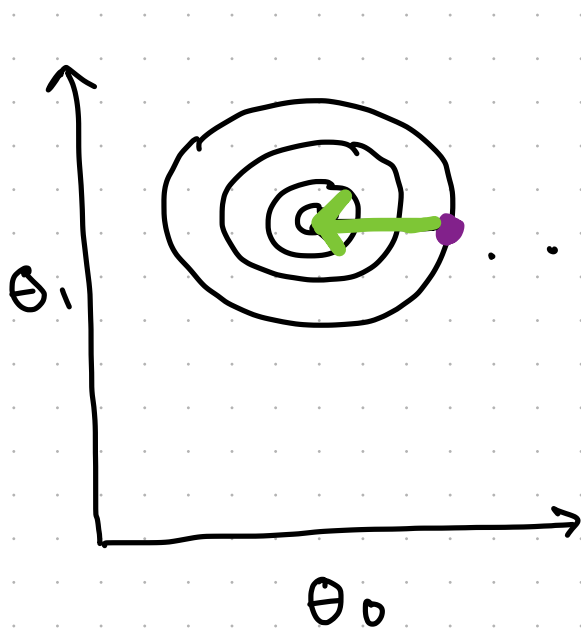
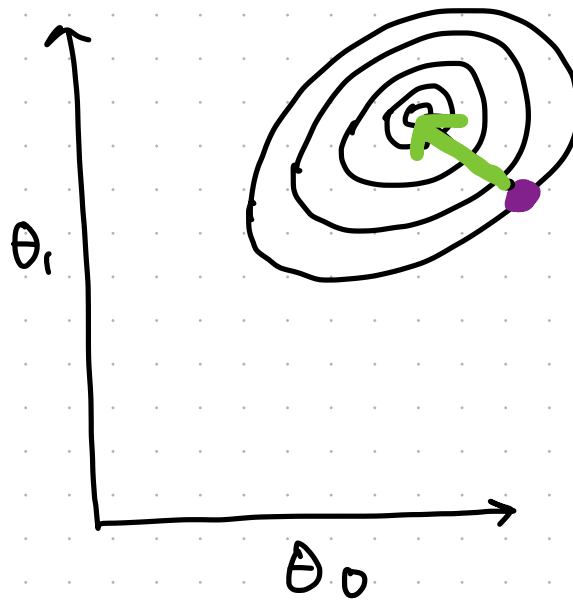
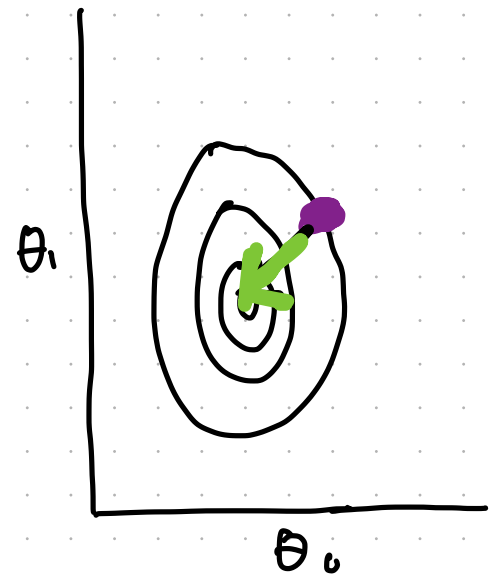
$$\text{loss}(y_1, \hat{y}_1)$$



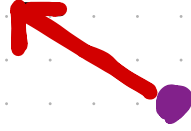
$$\text{loss}(y_i, \hat{y}_i)$$



$$\text{loss}(y_N, \hat{y}_N)$$

θ_1 LOSS SURFACE OVER
 $6N$ EXAMPLES θ_0  $\text{loss}(y_1, \hat{y}_1)$  $\text{loss}(y_i, \hat{y}_i)$  $\text{loss}(y_N, \hat{y}_N)$

∇L



∇l_1



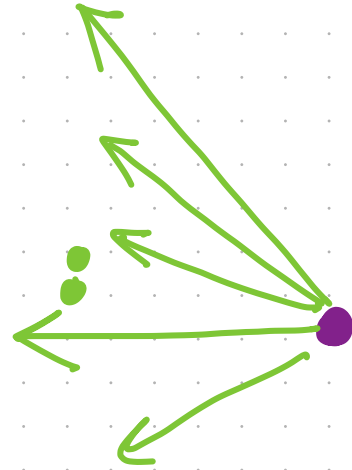
∇l_i

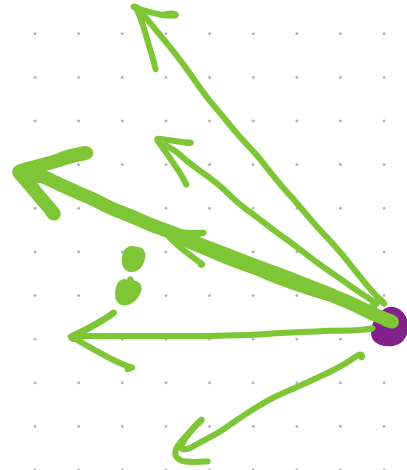


∇l_n



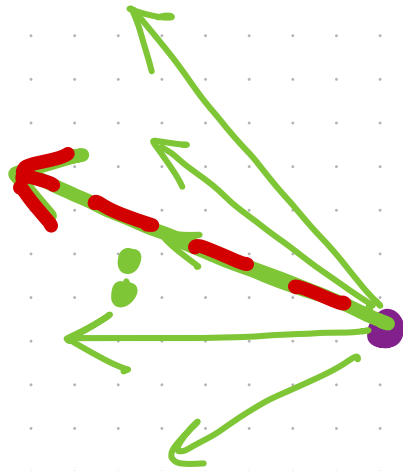
— Gradients for
losses w.r.t
different
points





— Gradients for losses w.r.t different points

— Expectation over individual gradients



— Gradients for losses wrt different points

— Expectation over individual gradients

— Gradient wrt. whole data