

# 第一次報告

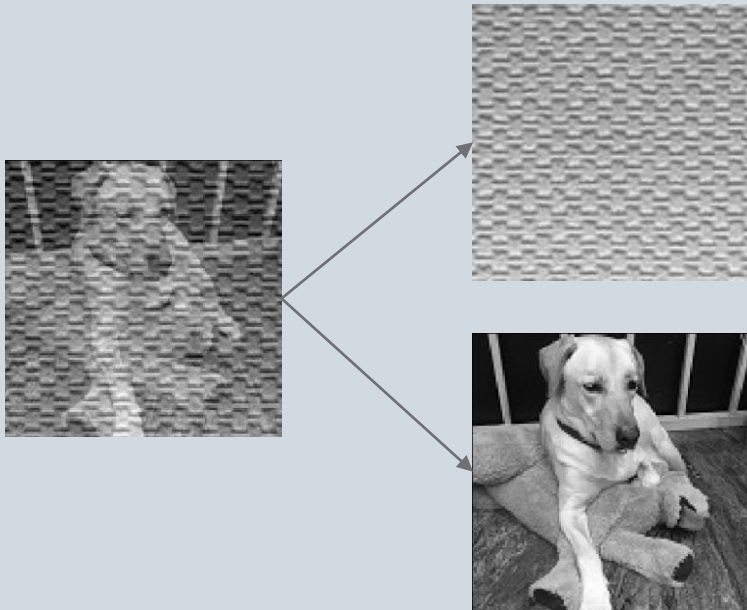
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4105053128 唐永承

# Problem

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$$\|y_1 - D_1 x_1\|_F^2 + \|y_2 - D_2 x_2\|_F^2 + \lambda \|D_1^T D_2\|_F^2 + \Gamma_x(x_1) + \Gamma_x(x_2) + \Gamma_D(D_1) + \Gamma_D(D_2)$$



$y_1$  : picture 1

$y_2$  : picture 2

$D_1$  : dictionary for picture 1

$D_2$  : dictionary for picture 2

$x_1$  : sparse representation of picture 1 for  $D_1$

$x_2$  : sparse representation of picture 2 for  $D_2$

$\lambda$  : regularization parameters

$\Gamma_x$  : constraint for  $x$  (make it sparse)

$\Gamma_D$  : constraint for  $D$  (normalize)

# Proximal Algorithm

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- Proximal operator :  $prox_{\lambda f}(v) = \underset{x}{\operatorname{argmin}}(f(x) + \frac{1}{2\lambda} \|x - v\|^2)$

- Proximal gradient method :

$F(x) = f(x) + g(x)$ ,  $f(x)$  is continuously differentiable and  $g(x)$  is not continuous

(1) gradient step

$$v^t = x^t - \lambda \nabla f(x^t)$$

(2) proximal operator step

$$x^{t+1} = prox_x(v^t)$$

- When  $\nabla f$  is Lipschitz continuous with constant  $L$ ,  $\lambda \in (0, \frac{1}{L}]$

# Solution

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$$\underbrace{\|y_1 - D_1 x_1\|_F^2 + \|y_2 - D_2 x_2\|_F^2 + \lambda \|D_1^T D_2\|_F^2}_{f : \text{differentiable}} + \underbrace{\Gamma_x(x_1) + \Gamma_x(x_2) + \Gamma_D(D_1) + \Gamma_D(D_2)}_{g : \text{nonconvex}}$$

- Let  $f$  be the red line part, and  $g$  be the blue line part
- Solving  $D_1, D_2, x_1, x_2$  via proximal algorithm , respectively
- Re-compute Lipschitz constant each iteration

# lambda = 0, iteration = 1000

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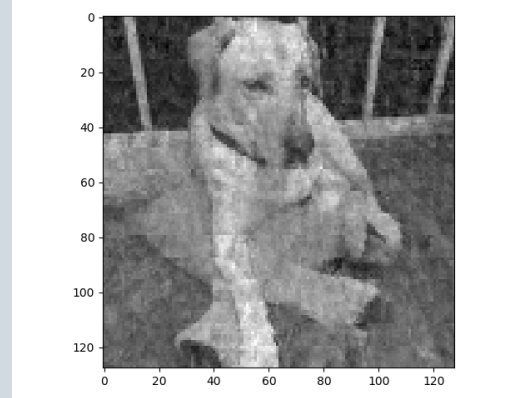
- before dictionary learning

$$\|y_1 - D_1 x_1\|_F = 220.18268975817733$$

$$\|y_2 - D_2 x_2\|_F = 222.28837786521683$$

$$\|D_1^T D_2\|_F = 15.93912746115688$$

$$\|y_1^T y_2\|_F = 4652.819827829139$$



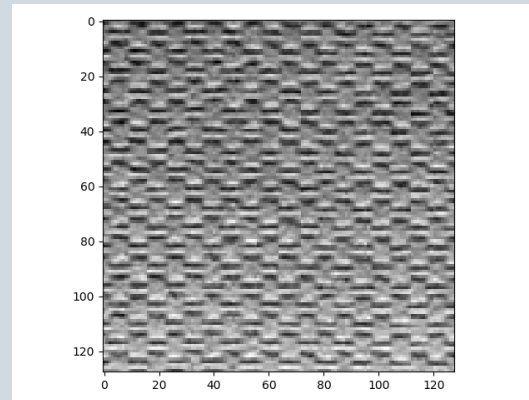
- after dictionary learning

$$\|y_1 - D_1 x_1\|_F = 34.72835875511873$$

$$\|y_2 - D_2 x_2\|_F = 39.37764567597413$$

$$\|D_1^T D_2\|_F = 33.47709294532105$$

$$\|y_1^T y_2\|_F = 1377.193986001195$$



# lambda = 1, iteration = 1000

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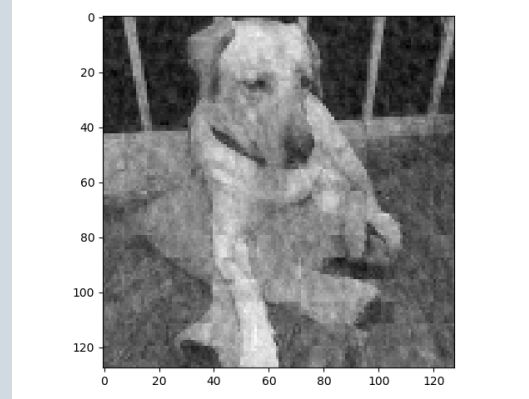
- before dictionary learning

$$\|y_1 - D_1 x_1\|_F = 220.18268975817733$$

$$\|y_2 - D_2 x_2\|_F = 222.28837786521683$$

$$\|D_1^T D_2\|_F = 15.93912746115688$$

$$\|y_1^T y_2\|_F = 4652.819827829139$$



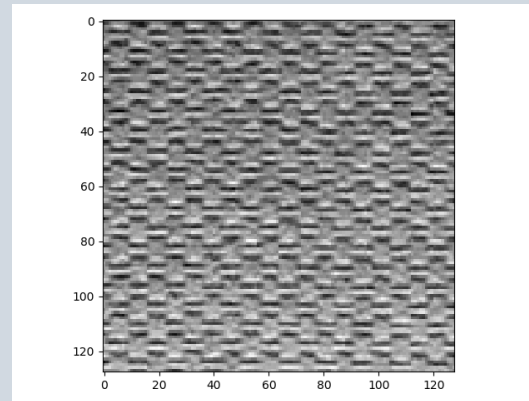
- after dictionary learning

$$\|y_1 - D_1 x_1\|_F = 32.52759512164004$$

$$\|y_2 - D_2 x_2\|_F = 42.42109661711466$$

$$\|D_1^T D_2\|_F = 21.11685321894725$$

$$\|y_1^T y_2\|_F = 1090.59509862585$$



# lambda = 5, iteration = 1000

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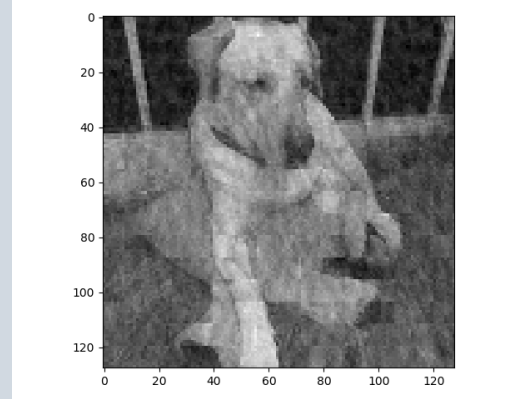
- before dictionary learning

$$\|y_1 - D_1 x_1\|_F = 220.18268975817733$$

$$\|y_2 - D_2 x_2\|_F = 222.28837786521683$$

$$\|D_1^T D_2\|_F = 15.93912746115688$$

$$\|y_1^T y_2\|_F = 4652.819827829139$$



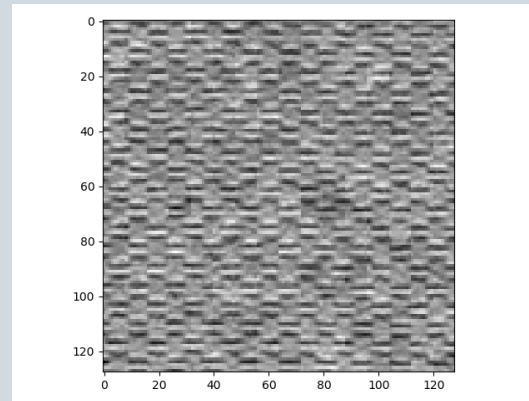
- after dictionary learning

$$\|y_1 - D_1 x_1\|_F = 36.97705376300321$$

$$\|y_2 - D_2 x_2\|_F = 63.10484695717596$$

$$\|D_1^T D_2\|_F = 14.558816422370223$$

$$\|y_1^T y_2\|_F = 829.6839292239839$$



# lambda = 10, iteration = 1000

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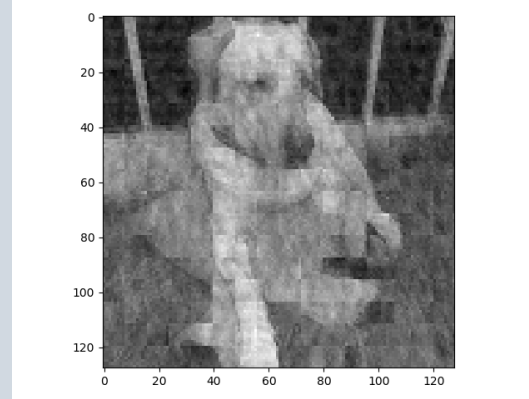
- before dictionary learning

$$\|y_1 - D_1 x_1\|_F = 220.18268975817733$$

$$\|y_2 - D_2 x_2\|_F = 222.28837786521683$$

$$\|D_1^T D_2\|_F = 15.93912746115688$$

$$\|y_1^T y_2\|_F = 4652.819827829139$$



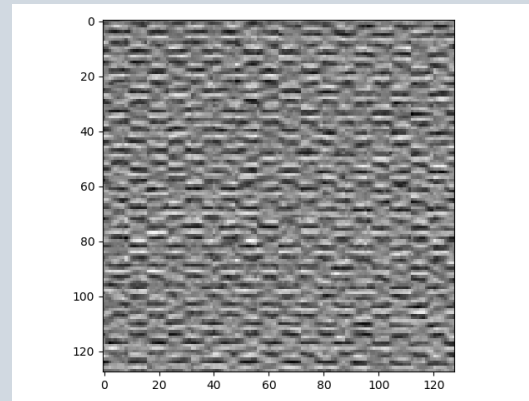
- after dictionary learning

$$\|y_1 - D_1 x_1\|_F = 42.907315307035326$$

$$\|y_2 - D_2 x_2\|_F = 72.9588111422319$$

$$\|D_1^T D_2\|_F = 7.658268715329088$$

$$\|y_1^T y_2\|_F = 388.02419599750397$$





# lambda = 20, iteration = 1000

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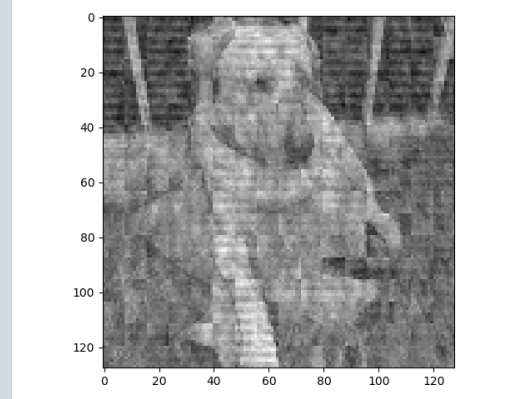
- before dictionary learning

$$\|y_1 - D_1 x_1\|_F = 220.18268975817733$$

$$\|y_2 - D_2 x_2\|_F = 222.28837786521683$$

$$\|D_1^T D_2\|_F = 15.93912746115688$$

$$\|y_1^T y_2\|_F = 4652.819827829139$$



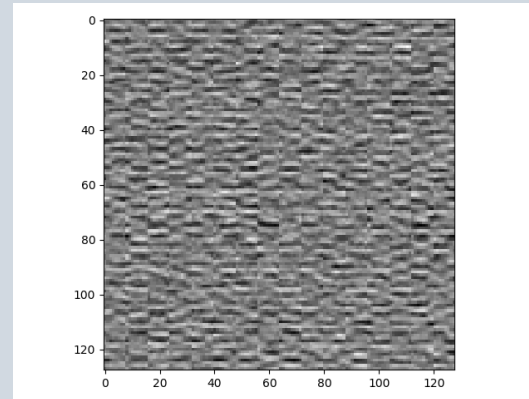
- after dictionary learning

$$\|y_1 - D_1 x_1\|_F = 65.82048708056374$$

$$\|y_2 - D_2 x_2\|_F = 89.64607277704985$$

$$\|D_1^T D_2\|_F = 5.808565750146154$$

$$\|y_1^T y_2\|_F = 343.6802912825157$$



# lambda = 50, iteration = 1000

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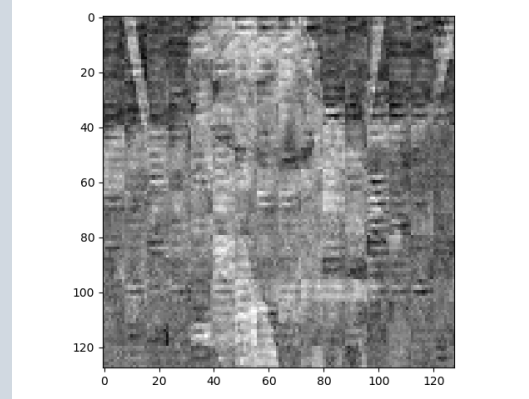
- before dictionary learning

$$\|y_1 - D_1 x_1\|_F = 220.18268975817733$$

$$\|y_2 - D_2 x_2\|_F = 222.28837786521683$$

$$\|D_1^T D_2\|_F = 15.93912746115688$$

$$\|y_1^T y_2\|_F = 4652.819827829139$$



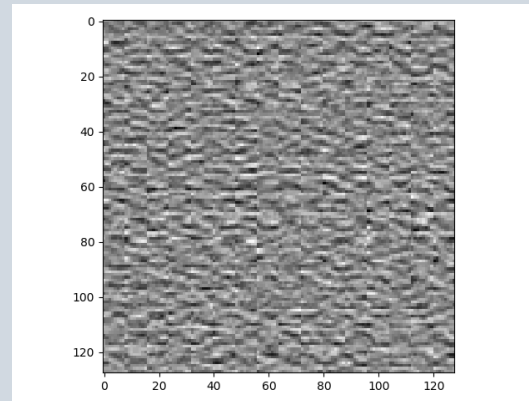
- after dictionary learning

$$\|y_1 - D_1 x_1\|_F = 84.74730986884552$$

$$\|y_2 - D_2 x_2\|_F = 100.01402097663563$$

$$\|D_1^T D_2\|_F = 2.509107459832805$$

$$\|y_1^T y_2\|_F = 354.63651448064314$$



# lambda = 100, iteration = 1000

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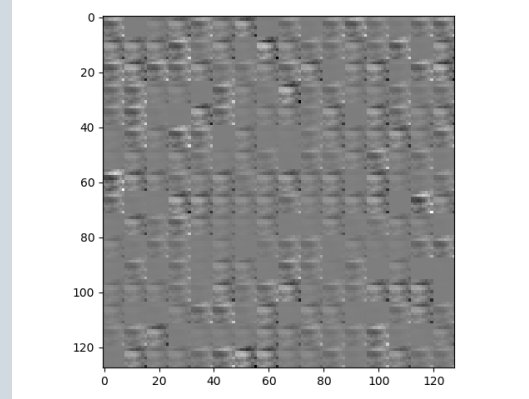
- before dictionary learning

$$\|y_1 - D_1 x_1\|_F = 220.18268975817733$$

$$\|y_2 - D_2 x_2\|_F = 222.28837786521683$$

$$\|D_1^T D_2\|_F = 15.93912746115688$$

$$\|y_1^T y_2\|_F = 4652.819827829139$$



- after dictionary learning

$$\|y_1 - D_1 x_1\|_F = 131.8448164823175$$

$$\|y_2 - D_2 x_2\|_F = 131.53127587105865$$

$$\|D_1^T D_2\|_F = 127.0613438885982$$

$$\|y_1^T y_2\|_F = 203.13003871859212$$

