

# QUADRATIC PROGRAMMING IN MATLAB

## quadprog

$$\min_x \left\{ \frac{1}{2} x' H x + f' x \right\}$$

$$A x \leq b$$

$$A_{eq} x = b_{eq}$$

$$lb \leq x \leq ub$$

Syntax:

`x = quadprog(H,f,A,b)`

`x = quadprog(H,f,A,b,Aeq,beq)`

`x = quadprog(H,f,A,b,Aeq,beq,lb,ub)`

`x = quadprog(H,f,A,b,Aeq,beq,lb,ub,x0)`

`x = quadprog(H,f,A,b,Aeq,beq,lb,ub,x0,options)`

`[x,fval] = quadprog(...)`

`[x,fval,exitflag] = quadprog(...)`

`[x,fval,exitflag,output] = quadprog(...)`

`[x,fval,exitflag,output,lambda] = quadprog(...)`

## Small-scale problem

$$\min_x \left\{ \frac{1}{2} x' H x + d' x \right\},$$

$$Ax \leq b, 0 \leq x$$

$$H = \begin{bmatrix} 1 & -1 \\ -1 & 2 \end{bmatrix}, d = \begin{bmatrix} -2 \\ -6 \end{bmatrix},$$

$$A = \begin{bmatrix} 1 & 1 \\ -1 & 2 \\ 2 & 1 \end{bmatrix}, b = \begin{bmatrix} 2 \\ 2 \\ 3 \end{bmatrix}$$

H = [1 -1; -1 2]

d = [-2; -6]

A = [1 1; -1 2; 2 1]

b = [2; 2; 3]

lb = zeros(2,1)

[x,fval,exitflag,output,lambda] = ...

quadprog(H,d,A,b,[],[],lb)

x = ( 0.6667, 1.3333)

fval = -8.2222

output =

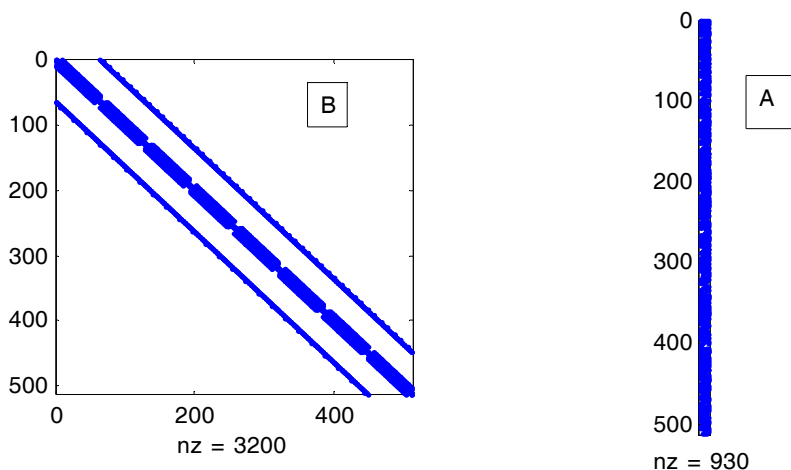
iterations: 3

algorithm: 'medium-scale: active-set'

# LARGE SCALE PROBLEM

Dense, but structured Hessian:

$$H = B + AA'$$



We must avoid forming  $H$ !

Special software for forming  $H*W$ :

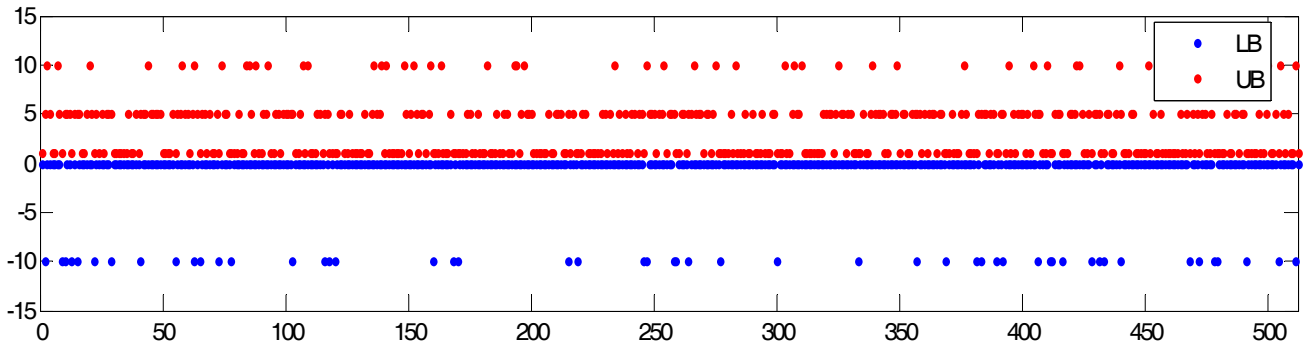
$$W = \text{qbox4mult}(H, Y)$$

(This is simple:  $W = B*Y + A*(A'*Y)$ ; )

Problem entered by

load qbox4.mat

A	512x10	11204	double array (sparse)
B	512x512	40452	double array (sparse)
d	512x1	4096	double array
lb	512x1	4096	double array
ub	512x1	4096	double array
xstart	512x1	4096	double array



Optimization terminated: relative function value changing by less than  $\sqrt{\text{OPTIONS.TolFun}}$ , no negative curvature detected in current trust region model and the rate of progress (change in  $f(x)$ ) is slow.

fval = -1.0538e+003

exitflag = 3

output =

iterations: 18

algorithm: 'large-scale: reflective trust-region'

firstorderopt: 0.0043

cgiterations: 30

X = .....

