慶應義塾大学学術情報リポジトリ
Keio Associated Repository of Academic resouces

| Title | Postoptimization of quadratic programming |
| :---: | :--- |
| Sub Title | Tone，Kaoru |
| Author | 疋応義塾大学工学部 |
| Publisher | 1976 |
| Publication year | Keio engineering reports Vol．29，No．1（1976．），p．1－6 |
| Jtitle | JaLC DOI | | Abstract |
| :--- |
| nots paper，we present a postoptimization analysis of convex quadratic programmings，that is，（i） |
| modification of coefficients or constants of the problem，（ii）addition of a constraint or a variable |
| and（iii）parameterization of coefficients or constants．The analysis is done mainly by means of the |
| principal pivoting method of DANTZIG and COTTLE． |

慶應義塾大学学術情報リポジトリ（KOARA）に掲載されているコンテンツの著作権は，それぞれの著作者，学会または出版社／発行者に帰属し，その権利は著作権法によって保護されています。引用にあたつては，著作権法を遵守してご利用ください。

The copyrights of content available on the KeiO Associated Repository of Academic resources（KOARA）belong to the respective authors，academic societies，or publishers／issuers，and these rights are protected by the Japanese Copyright Act．When quoting the content，please follow the Japanese copyright act．

# POSTOPTIMIZATION OF QUADRATIC PROGRAMMING 

Kaore Tone<br>Dept. of Mathematics, Keio University, Yokohama 223, Japan

(Received, Sep. 11, 1975)


#### Abstract

In this paper, we present a postoptimization analysis of convex quadratic programmings, that is, (i) modification of coefficients or constants of the problem, (ii) addition of a constraint or a variable and (iii) parameterization of coefficients or constants. The analysis is done mainly by means of the principal pivoting method of Dantzig and Cottle.


## 1. Introduction

We consider the convex quadratic programming :
Minimize $Q=x^{\prime} D x / 2+c^{\prime} x$, subject to $A x \geq b, x \geq 0$ where the matrix $D$ is of order ( $n, n$ ), positive semi-definite and symmetric and the matrix $A$ is of order ( $m, n$ ) and the symbol ' denotes the transposition of vector or matrix. As is well known, the Kuhn-Tucker conditions for the optimal solution of this quadratic programming are the following linear complementarity problem: To find out $w$ and $z$ which satisfy

$$
\begin{equation*}
w-M z=q, \quad w^{\prime} z=0, \quad w, z \geq 0 \tag{1.1}
\end{equation*}
$$

$$
Z=\left[\begin{array}{l}
x \\
y
\end{array}\right], \quad w=\left[\begin{array}{l}
u \\
v
\end{array}\right], \quad q=\left[\begin{array}{r}
c \\
-b
\end{array}\right], \quad \text { and } \quad M=\left[\begin{array}{cc}
D & -A^{\prime} \\
A & 0
\end{array}\right] .
$$

If we could find $w$ and $z$, then $x$-part of $z$ is an optimal solution of the quadratic program. We can solve this problem by the principal pivoting method (abbreviated to PPM, hereafter) of Dantzig and Cottle (Dantzig and Cottle (1967)).

Suppose we have already had an optimal solution and let the final canonical form of (1.1) be:

$$
\begin{equation*}
\bar{w}-\bar{M} \bar{z}=\bar{q} \tag{1.2}
\end{equation*}
$$

where $\bar{w}, \bar{z}$ are the basic and the nonbasic variables, respectively, and $\bar{M}$ is the principal pivot transform of $M$ at the final step. The optimal solution is $(\bar{w}, \bar{z})=$ $(\bar{q}, 0)$. In the following analysis, the optimal basis $B$ and its inverse $B^{-1}$ are supposed to be known.

## 2. Modification of $b$ and/or $c$

This modification causes the change of the vector $q$ in (1.1) which we denote by $q^{N}$. At the final step, this makes $\bar{q}$ become $B^{-1} q^{N}$. Then, we have:
(i) If $B^{-1} q^{N} \geq 0$, then the present basis is still optimal. And the solution is $(\bar{w}, \bar{z})=\left(B^{-1} q^{N}, 0\right)$.
(ii) Otherwise, apply PPM to the system $\bar{w}-\bar{M} \bar{z}=B^{-1} q^{N}$.
[Validity of PPM in case (ii)]
Dantzig and Cottole (1967) have shown that we can apply PPM to (1.1) to find out the nonnegative complementary solution or to see that (1.1) has no solution, so long as the matrix $M$ is positive semi-definite, regardless of $q$. And the matrix $\bar{M}$ of (1.2) is also positive semi-definite because the principal pivot transform of a positive semi-definite matrix is also positive semi-definite. So, we can apply PPM to solve successfully the system $\bar{w}-\bar{M} \bar{z}=B^{-1} q^{N}, \bar{w}^{\prime} \bar{z}=0$ and $\bar{w}, \bar{z} \geq 0$, or to see the system is infeasible.

## 3. Addition of a constraint

Let the added constraint be

$$
\begin{equation*}
v_{m \mid 1}=a_{m+1}^{\prime} x-b_{m+1} \geq 0, \tag{3.1}
\end{equation*}
$$

and its dual varible be $y_{m+1}$.
If present optimal solution also satisfies this constraint, then the problem is over. Otherwise, let the augumented system of (1.1) be

$$
w-M z+\left[\begin{array}{l}
a_{m+1}  \tag{3.2}\\
0
\end{array}\right]_{m+1}=q
$$

and

$$
\begin{equation*}
v_{m+1}-a_{m+1}^{\prime} x=-b_{m+1} \tag{3.3}
\end{equation*}
$$

By multiplying (3.2) by $B^{-1}$, we have

$$
\bar{w}-\bar{M} \bar{z}+B^{-1}\left[\begin{array}{l}
a_{m+1}  \tag{3.4}\\
0
\end{array}\right] y_{m+1}=\bar{q} .
$$

And by eliminating the basic variables from (3.3) using (3.4) (this can be done by usual pivoting or substitution), we have

$$
\begin{gather*}
v_{m+1}-\bar{a}_{m+1}^{\prime} \bar{z}+\bar{a}_{m+1, m+1} y_{m+1}=-\bar{b}_{m+1},  \tag{3.5}\\
-\bar{b}_{m+1}<0 .
\end{gather*}
$$

That is, the new system is

$$
\begin{align*}
& \quad\left[\begin{array}{l}
w \\
v_{m, 1}
\end{array}\right]-\left[\begin{array}{ll}
M & -a_{m+1}^{N} \\
\bar{a}_{m+1}^{\prime} & \bar{a}_{m+1, m+1}
\end{array}\right]\left[\begin{array}{l}
\bar{z} \\
y_{m+1}
\end{array}\right]=\left[\begin{array}{l}
\bar{q} \\
-\bar{b}_{m+1}
\end{array}\right] \text {, }  \tag{3.6}\\
& \text { where } \quad a_{m+1}^{N}=B^{-1}\left[\begin{array}{l}
a_{m+1} \\
0
\end{array}\right] .
\end{align*}
$$

The augumented matrix of (3.6) is positive semi-definite, because initially the matrix of the system (3.2) and (3.3) is positive semi-definite and we have derived the system (3.6) by some principal pivot transform, keeping $y_{m+1}$ nonbasic and keeping $v_{m+1}$ basic. So, we can apply PPM to the augumented system (3.6).

## 4. Addition of a variable

Let the new variable be $x_{n+1}$, the cofficient vector of $x_{n+1}$ in the constraints be $a_{n+1}$ and the added term in the objective fuction be $\left(d^{\prime} x\right) x_{n+1}+d_{0} x_{n+1}^{2} / 2+c_{n+1} x_{n+1}$.

Then, the augumented system is

$$
\begin{equation*}
w^{a}-M^{a} z^{a}=q^{a}, \tag{4.1}
\end{equation*}
$$

where $\quad w^{a}=\left[\begin{array}{l}u \\ u_{n+1} \\ v\end{array}\right], \quad z^{a}=\left[\begin{array}{l}x \\ x_{n+1} \\ y\end{array}\right], \quad q^{a}=\left[\begin{array}{l}c \\ c_{n+1} \\ -b\end{array}\right], \quad M^{a}=\left[\begin{array}{ccc}D & d & -A^{\prime} \\ d^{\prime} & d_{0} & -a_{n+1}^{\prime} \\ A & a_{n+1} & 0\end{array}\right]$
and $M^{a}$ is assumed to be still positive semi-definite.
Thus, we have

$$
\begin{gather*}
w-M z-\left[\begin{array}{l}
d \\
a_{n+1}
\end{array}\right] x_{n+1}=q  \tag{4.2}\\
u_{n+1}-\left(d^{\prime},-a_{n+1}^{\prime}\right) z-d_{0} x_{n+1}=c_{n+1} . \tag{4.3}
\end{gather*}
$$

Multiplying (4.2) by $B^{-1}$, we have

$$
\bar{w}-\bar{M} \bar{z}-B^{-1}\left[\begin{array}{l}
d  \tag{4.4}\\
a_{n, 1}
\end{array}\right] x_{n+1}=\bar{q} .
$$

After eliminating the basic variables from (4.4), we have

$$
\begin{equation*}
u_{n, 1}-\left(\bar{d}^{\prime},-\bar{a}_{n+1}^{\prime}\right) \bar{z}-\bar{d}_{0} x_{n+1}=\bar{c}_{n+1} . \tag{4.5}
\end{equation*}
$$

Thus,
(i) if $\bar{c}_{n+1} \geq 0$, then $(\bar{w}, \bar{z})=(\bar{q}, 0), x_{n+1}=0$ and $u_{n+1}=\bar{c}_{n+1}$ is optimal, (ii) otherwise, apply PPM to (4.4) and (4.5), where the constants on the right hand side except $\bar{c}_{n+1}$ have nonnegative values.

## 5. Modification of coefficients of a variable

This modification implies changes of coefficients of a variable $x_{k}$ in $A, D$ and $c$ and may cause the changes of the $k$-th row and the $k$-th column of the matrix $M$ and the $k$-th element of the vector $q$. We denote the modified $M$ and $q$ by $M^{N}$ and $q^{N}$, respectively. And consequently, the basis $B$ may become $B^{N}$ which differs from $B$ at most in a certain row and in a certain column. When $B^{N}$ is regular (as can be decided in the course of the following algorithm), we can get $\left(B^{N}\right)^{-1}$ from $B^{-1}$ as follows.

Suppose $B^{N}$ differs from $B$ in the $p$-th row ( $\beta_{p}$ ) and in the $q$-th column ( $(q)$. First, let a row vector $f_{p}$ be

$$
\begin{gather*}
f_{p}=\beta_{p} B^{-1}  \tag{5.1}\\
f_{p}=\left(f_{p 1}, \cdots, f_{p p}, \cdots, f_{p n \mid m}\right) .
\end{gather*}
$$

and
If $f_{p p} \neq 0$, then let the matrix $J_{p}$ be

$$
J_{p}=\left(\begin{array}{c}
e_{1}^{\prime}  \tag{5.2}\\
\dot{e}_{p-1}^{\prime} \\
g_{p} \\
e_{p_{p+1}}^{\prime} \\
\dot{e}_{n+m}^{\prime}
\end{array}\right] \text {, }
$$

where $e_{i}$ is the $i$-th unit vector and

$$
g_{p}=\left(-f_{p 1}\left|f_{p p}, \cdots,-f_{p p-1}\right| f_{p p}, 1 / f_{p p},-f_{p p_{1} 1}\left|f_{p p}, \cdots,-f_{p n, m}\right| f_{p p}\right) .
$$

Then let

$$
\begin{equation*}
\tilde{B}^{-1}=B^{-1} J_{p} \tag{5.3}
\end{equation*}
$$

$\tilde{B}^{-1}$ is the inverse of the matrix $\tilde{B}$ which differs from $B$ by the $p$-th row $\beta_{p}$. Next, let a column vector $h_{q}$ be

$$
\begin{equation*}
h_{q}=\tilde{B}^{-1} \gamma q, \tag{5.4}
\end{equation*}
$$

and

$$
h_{q}^{\prime}=\left(h_{1 q}, \cdots, h_{q-1 q}, h_{q q}, \cdots, h_{n: m q}\right)
$$

If $h_{q q} \neq 0$, then let the matrix $K_{q}$ be

$$
\begin{equation*}
K_{q}=\left(e_{1}, \cdots, e_{q-1}, t_{q}, e_{q-1}, \cdots, e_{n+m}\right), \tag{5.5}
\end{equation*}
$$

where

$$
t_{q}^{\prime}=\left(-h_{1 q} / h_{q q}, \cdots,-h_{q-1 q} / h_{q q}, 1 / h_{q q},-h_{q+1 q} / h_{q q}, \cdots,-h_{n+m q} / h_{q q}\right) .
$$

Then, we have

$$
\begin{equation*}
\left(B^{N}\right)^{-1}=K_{q} \tilde{B}^{-1} . \tag{5.6}
\end{equation*}
$$

The validity of the above inversion algorithm can be seen easily by calculus or see Simonnard (1966).

Two cases may occur. The first, we have $\left(B^{N}\right)^{-1}$, the second, $B^{N}$ is singular and is no longer a basis. In the algorithm, the conditions $f_{p p} \neq 0$ and $h_{q q} \neq 0$ guarantee the first case and if either of them equals to zero, we must go to the second case.
(i) First case: Multiplying the modified system by $\left(B^{N}\right)^{-1}$, we have

$$
\begin{equation*}
\bar{w}-\bar{M}^{N} \bar{z}=\bar{q}^{v} . \tag{5.7}
\end{equation*}
$$

Then, if $\bar{q}^{N} \geq 0$, then the optimal solution is $(\bar{w}, \bar{z})=\left(\bar{q}^{x}, 0\right)$, otherwise apply PPM to the system (5.7).
(ii) Second case: In this case, add to the system a variable $x_{n, 1}$ with the coefficients equal to the modified coefficients of the variable $x_{k}$. And make the $c$-coefficient of $x_{k}$ sufficiently large. That is, an addition of a variable and a modification of the vector $q$ are done.

Thus, we can solve the case by the preceding algorithms. The variable $x_{n}$, takes place of $x_{k}$ which never remains or becomes a basic variable.

## 6. Modification of coefficients and constant of a constraint

This modification may cause changes of $M$ in a certain row and in a certain column and a change of an element of $q$. So, we can solve the modified system by an algorithm quite analogous to the preceding section.

## 7. Parameterization of vector $q$

Instead of making $q$ undergo a discrete variation as in section 2 , we shall here make $q$ vary continuously as a linear function of a parameter $\theta$.

Set $q=q_{0}+\theta \delta$, where $\delta$ and $q_{0}$ are fixed vectors, and let $B$ be the optimal basis for $\theta=0$. The optimal solution is $(\bar{w}, \bar{z})=\left(B^{-1} q_{0}, 0\right)$. Now, we make $\theta$ increase from 0 . Then, basic solution becomes $(\bar{w}, \bar{z})=\left(B^{-1} q_{0}+\theta B^{-1} \delta, 0\right)$, and
(i) if $B^{-1} \delta \geq 0$, then $(\bar{w}, \bar{z})$ remains an optimal program for every value of $\theta(\geq 0)$,
(ii) otherwise, there exists a critical value $\theta_{1}$ of 0 beyond which $(\bar{w}, \bar{z})=$ ( $B^{-1} q_{0}+\theta B^{-1} \delta, 0$ ) ceases to be an optimal solution, at least one element of $\bar{w}$ becoming negative;

$$
0_{1}=-\bar{w}_{k} /\left(B^{-1} \grave{\delta}\right)_{k}=\min _{s}\left[-\bar{w}_{s} /\left(B^{-1} \grave{\delta}\right)_{s}\right] \quad\left(s \varepsilon\left\{s \mid\left(B^{-1} \tilde{\delta}\right)_{s}<0\right\}\right)
$$

where $\left(B^{-1} \delta\right)_{s}$ denotes the $s$-th element of the vector $B^{-1} \delta$. When $\theta$ crosses through the value $\theta_{1}$, one or several of the $\bar{w}$ variables pass through zero from above. Then PPM may be applied. When several of the $\bar{w}$ variables decrease to zero at the same time (degeneracy case), we can make use of the perturbation method or the lexicographical ordering method to avoid cycling phenomena.

## REFERENCES

G. B. Dantzig and R. W. Cottle (1967): Positive (semi-) definite programming, in Nonlinear Programming (J. Abadie, ed.), North-Hoiland, Amsterdam, pp. 55-73.
M. Simonnard (1966) : Linear Programming, Prentice-Hall, Englewood Cliffs, N. J.

