

# 1. The “mixed-complementarity problem” (MCP):

Given:  $F : R^N \rightarrow R^N, \quad \ell, u \in R^N \quad (\text{MCP})$

Find:  $z, w, v \in R^N$

s.t.  $F(z) - w + v = 0$

$$\ell \leq z \leq u, \quad w \geq 0, \quad v \geq 0$$

$$w^T(z - \ell) = 0, \quad v^T(u - z) = 0$$

in which  $-\infty \leq \ell \leq u \leq +\infty$ .

**Special case i:** *a linear system of equations*

Given:  $A \in R^{n \times n}$ ,  $b \in R^n$  (LSYS)

Find:  $x \in R^n$

s.t.  $Ax = b$

which is represented as an MCP by letting  $l = -\infty$ ,  $u = +\infty$ ,  
 $z = x$ , and  $F(z) = Az - b$ ;

**Special case ii:** *a nonlinear system of equations*

Given:  $f : \mathbb{R}^n \rightarrow \mathbb{R}^n$ ,  $b \in \mathbb{R}^n$  (NLSYS)

Find:  $x \in \mathbb{R}^n$

s.t.  $f(x) = 0$

which is represented as an MCP by letting  $\ell = -\infty$ ,  $u = +\infty$ ,  
 $z = x$ , and  $F(z) = f(z)$ ;

**Special case iii:** *a linear complementarity problem*

Given:  $M \in R^{n \times n}, \quad q \in R^n$  (LCP)

Find:  $z \in R^n$

s.t.  $q + Mz \geq 0, \quad z \geq 0, \quad z^T(q + Mz) = 0$

which is represented as an MCP by letting  $\ell = 0, \quad u = +\infty$ , and  $F(z) = q + Mz$ ;

**Special case iv:** *a nonlinear complementarity problem*

Given:  $f : R^n \rightarrow R^n$  (NCP)

Find:  $z \in R^n$

s.t.  $f(z) \geq 0, \quad z \geq 0, \quad z^T f(z) = 0$

which is represented as an MCP by setting  $\ell = 0, u = +\infty$ , and  $F(z) = f(z)$ ;

**Special case v:** *a nonlinear program*

Given:  $f : R^n \rightarrow R$ ,  $g : R^n \rightarrow R^m$ ,  $\hat{\ell}, \hat{u} \in R^n$  (NLP)

Find:  $x \in R^n$  to

$$\max f(x)$$

s.t.  $g(x) = 0$

$$\hat{\ell} \leq x \leq \hat{u}$$

which (when  $f()$  is concave and  $g()$  is convex) may be repre-

sented as an MCP by setting  $N = n + m$ , and partitioning

$$z = \begin{pmatrix} x \\ y \end{pmatrix}, \quad \ell = \begin{pmatrix} \hat{\ell} \\ -\infty \end{pmatrix}, \quad u = \begin{pmatrix} \hat{u} \\ +\infty \end{pmatrix}$$

$$F(z) = \begin{cases} \nabla f(x) - \nabla g(x)^T y \\ g(x) \end{cases}$$

**Special case v:** *a finite-dimensional system of variational inequalities*

$$\text{Given:} \quad f : R^n \rightarrow R^n, \quad g : R^n \rightarrow R^m \quad (\text{VIP})$$

$$\text{Find:} \quad x^* \in X \equiv \{\xi \in R^n | g(\xi) \geq 0\}$$

$$\max f(x^*)^T (x - x^*) \geq 0 \quad \forall x \in X$$

which (when  $f(\cdot)$  is convex and  $g(\cdot)$  is concave) may be represented as an MCP by setting  $N = n + m$ , and partitioning:

$$z = \begin{pmatrix} x \\ y \end{pmatrix}, \quad \ell = \begin{pmatrix} -\infty \\ 0 \end{pmatrix}, \quad u = (+\infty), \quad F(z) = \begin{cases} f(x) - \nabla g(x)^T y \\ g(x) \end{cases}$$

## The Hitchcock-Koopmans Transportation Problem

A linear program seeks a transport schedule which minimizes the cost of meeting demands in markets ( $j$ ) from suppliers ( $i$ ):

$$\min \sum_{ij} c_{ij} x_{ij}$$

$$\text{s.t.} \quad \sum_j x_{ij} \leq a_i$$

$$\sum_i x_{ij} \geq b_j$$

$$x \geq 0$$

## GAMS representation:

### SETS

I canning plants / SEATTLE, SAN-DIEGO /  
J markets / NEW-YORK, CHICAGO, TOPEKA / ;

### PARAMETERS

A(I) capacity of plant i in cases  
/ SEATTLE 325  
SAN-DIEGO 575 /,  
B(J) demand at market j in cases  
/ NEW-YORK 325  
CHICAGO 300  
TOPEKA 275 /,  
F freight in dollars per case per thousand miles /90/ ;

TABLE DIST(I,J) distance in thousands of miles

	NEW-YORK	CHICAGO	TOPEKA
SEATTLE	2.5	1.7	1.8
SAN-DIEGO	2.5	1.8	1.4 ;

PARAMETER C(I,J) transport cost in thousands of dollars per case ;

$$C(I,J) = F * DIST(I,J) / 1000 ;$$

VARIABLES            X(I,J)                    SHIPMENT QUANTITY FROM I TO J  
                         COST                    MINIMAND - TOTAL COST OF SHIPMENT

POSITIVE VARIABLE X;

EQUATIONS

SUPPLY(I)            SUPPLY LIMIT  
DEMAND(J)            DEMAND CONSTRAINT (FIXED)  
OBJDEF                DEFINES COST;

SUPPLY(I)..        A(I) =G= SUM(J, X(I,J));

DEMAND(J)..        SUM(I, X(I,J)) =G= B(J);

OBJDEF..            COST =E= SUM((I,J), C(I,J) \* X(I,J));

MODEL MINCOST / SUPPLY, DEMAND, OBJDEF/;

SOLVE MINCOST USING LP MINIMIZING COST;

## Interpretation as a Market Equilibrium Problem

$w_i$  marginal cost in supply market  $i$

$p_j$  market price in demand market  $j$

$$\sum_j x_{ij} \leq a_i, \quad w_i \geq 0, \quad w_i (a_i - \sum_j x_{ij}) = 0 \quad \forall i$$

$$\sum_i x_{ij} \geq b_j, \quad p_j \geq 0, \quad p_j (b_j - \sum_i x_{ij}) = 0 \quad \forall j$$

$$w_i + c_{ij} \geq p_j, \quad x_{ij} \geq 0, \quad x_{ij} (w_i + c_{ij} - p_j) = 0 \quad \forall i, j$$

This is a *linear* complementarity problem.

## GAMS representation:

### POSITIVE VARIABLES

W(I)	SHADOW PRICE AT SUPPLY NODE I,
P(J)	SHADOW PRICE AT DEMAND NODE J,
X(I,J)	SHIPMENT QUANTITIES IN CASES;

### EQUATIONS

SUPPLY(I)	SUPPLY LIMIT AT PLANT I,
DEMAND(J)	FIXED DEMAND AT MARKET J,
PROFIT(I,J)	ZERO PROFIT CONDITIONS;

SUPPLY(I)..     A(I) =G= SUM(J, X(I,J));

DEMAND(J)..     SUM(I, X(I,J)) =G= B(J);

PROFIT(I,J)..   W(I) + C(I,J)    =G= P(J);

MODEL TRNSP / PROFIT.X, SUPPLY.W, DEMAND.P/ ;

SOLVE TRNSP USING MCP;

## Price-Responsive Supply and Demand

$$\text{Demand: } D_j(p_j) = \beta_j p_j^{-\sigma_j}$$

$$\text{Supply: } S_i(w_i) = \alpha_i w_i^{\eta_i}$$

$$\sum_j x_{ij} \leq S_i(w_i), \quad w_i \geq 0, \quad w_i (S_i(w_i) - \sum_j x_{ij}) = 0 \quad \forall i$$

$$\sum_i x_{ij} \geq D_j(p_j), \quad p_j \geq 0, \quad p_j (D_j(p_j) - \sum_i x_{ij}) = 0 \quad \forall j$$

$$w_i + c_{ij} \geq p_j, \quad x_{ij} \geq 0, \quad x_{ij} (w_i + c_{ij} - p_j) = 0 \quad \forall i, j$$

This is a *nonlinear complementarity problem*.

## NLP Formulations

When the nonlinear complementarity problem is *integrable*, the solution corresponds to the first order conditions for one (or two) nonlinear programming problem. In this case, we could solve a *primal* NLP:

$$\max \sum_i \gamma_i y_i^{\epsilon_i^y} + \sum_j \kappa_j d_j^{\epsilon_j^d} - \sum_{ij} c_{ij} x_{ij}$$

$$\text{s.t.} \quad \sum_j x_{ij} \leq y_i$$

$$\sum_i x_{ij} \geq d_j$$

$$x_{ij} \geq 0, \quad d_j \geq 0, \quad y_i \geq 0$$

where:

$$\gamma_i = \frac{\eta_i}{1 + \eta_i} \left( \frac{1}{\alpha_i} \right)^{1/\eta_i},$$

$$\kappa_j = \frac{\sigma_j}{1 + \sigma_j} \beta_j^{1/\sigma_j},$$

$$\epsilon_i^y = \frac{1 + \eta_i}{\eta_i},$$

and

$$\epsilon_j^d = \frac{\sigma_j - 1}{\sigma_j};$$

or we could solve a *dual* NLP model:

$$\min \sum_i \frac{\alpha_i}{1+\eta_i} w_i^{1+\eta_i} - \sum_j \frac{\beta_j}{1-\sigma_j} p_j^{1-\sigma_j}$$

$$\text{s.t.} \quad w_i + c_{ij} \geq p_j$$

**N.B.** Although this example is *integrable*, this is not always true:

*NLP*  $\subset$  *MCP*

Economic equilibrium problems addressing interesting policy questions are typically *not* integrable. Taxes, income effects, spillovers and other externalities interfere with the skew symmetry property which characterizes first order conditions for nonlinear programs.

## 2. General Equilibrium Models

$p$  = a non-negative  $n$ -vector of commodity prices including all final goods, intermediate goods and primary factors of production;

$y$  = a non-negative  $m$ -vector of activity levels for constant returns to scale production sectors in the economy; and

$M$  = an  $h$ -vector of income levels, one for each “household” in the model, including any government entities.

$\Pi_j(p)$  is the unit profit function for sector  $j$ , the difference between unit revenue and unit cost, defined as:

$$C_j(p) \equiv \min \left\{ \sum_i p_i x_i \mid f_j(x) = 1 \right\}$$

and

$$R_j(p) \equiv \max \left\{ \sum_i p_i y_i \mid g_j(y) = 1 \right\}$$

$d_{ih}(p, M_h)$  is a demand function derived from budget-constrained utility maximization:

$$d_{ih}(p, M_h) = \operatorname{argmax} \left\{ U_h(x) \mid \sum_i p_i x_i = M_h \right\}$$

in which  $U_h$  is the utility function for household  $h$ .

## Equilibrium

Market Clearance:

$$\sum_j y_j \frac{\partial \Pi_j(p)}{\partial p_i} + \sum_h \omega_{ih} \geq \sum_h d_{ih}(p, M_h)$$

Zero Profit:

$$-\Pi_j(p) = C_j(p) - R_j(p) \geq 0 \quad \forall j$$

Income Balance:

$$M_h = \sum_i p_i \omega_{ih}$$

## Model Representation: MPSGE

Social accounting data:

	Sectors (S)	Consumers	
		Households(H)	Government
Goods Markets (G):	$A(G,S) - B(G,S)$	$-C(G,H)$	
Factor Markets (F):	$-FD(F,S)$	$E(F,H) - D(F,H)$	
Capital taxes:	$-T("K",S)$		GREV
Transfers:		TRN(H)	-GREV

## MPSGE model:

### \$SECTORS:

AL(S) ! Activity levels

### \$COMMODITIES:

P(G) ! Commodity prices  
W(F) ! Factor return  
PT ! Tax revenue transfer market

### \$CONSUMERS:

RA(H) ! Representative households  
GOVT ! Government

### \$PROD:AL(S) s:0 va:ELAS(S)

O:P(S) Q:A(S)  
I:P(G) Q:B(G,S)  
I:W(F) Q:FD(F,S) P:PF(F,S) A:GOVT T:TF(F,S) va:

### \$DEMAND:RA(H) s:1 gds:ESUB(H)

D:P(G) Q:C(G,H) gds:  
D:W(F) Q:D(F,H)  
E:W(F) Q:E(F,H)  
E:PT Q:TRN(H)

### \$DEMAND:GOVT

D:PT Q:GREV

# Definition of Mixed Complementarity Problem (MCP)

The MCP format: Given:  $F: R^N \rightarrow R^N, \ell, u \in R^N$

Find:  $z, w, v \in R^N$

$$\text{s.t. } F(z) - w + v = 0 \quad (\text{MCP})$$

$$\ell \leq z \leq u, w \geq 0, v \geq 0$$

$$w^T(z - \ell) = 0, v^T(u - z) = 0$$

$$\infty \leq l \leq u \leq \infty$$

(with  $z$ : decision variable;  $v, w$ : slack variables,  $u$ : upper bound,  $l$ : lower bound) encompasses a number of special cases, e.g.:

(i) a nonlinear system of equations:

$$\text{Given: } f: R^n \rightarrow R^n$$

(NLSYS)

$$\text{Find: } x \in R^n \text{ s.t. } f(x) = 0$$

with  $l = -\infty, u = +\infty, z = x$  and  $F(z) = f(z)$ ;

(ii) a nonlinear complementarity problem:

$$\text{Given: } f: R^n \rightarrow R^n$$

$$\text{Find: } z \in R_+^n \text{ s.t. } f(z) \geq 0, z^T f(z) = 0 \quad (\text{NLCP})$$

with  $l = 0, u = +\infty$ , and letting  $F(z) = f(z)$ ;

(iii) a nonlinear program: Given:  $f: R^n \rightarrow R, g: R^n \rightarrow R^m, \hat{\ell}, \hat{u} \in R^n$

Find:  $x \in R_+^n$  to

$$\max f(x)$$

$$\text{s.t. } g(x) = 0$$

(NLP)

$$\hat{\ell} \leq x \leq \hat{u}$$

(when  $f()$  is concave and  $g()$  is convex) with  $N = n+m$ , and partitioning:

$$z = \begin{pmatrix} x \\ y \end{pmatrix}, \ell = \begin{pmatrix} \hat{\ell} \\ -\infty \end{pmatrix}, u = \begin{pmatrix} \hat{u} \\ +\infty \end{pmatrix}, F(z) = \begin{cases} \Delta f(x) - \Delta g(x)^T y \\ g(x) \end{cases};$$