

# An algorithmic solution for an optimal decision making process within emission trading markets

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## Abstract

We present a new algorithmic approach which leads towards a procedure for an international emissions trading system within the so-called Kyoto game. The economic background is described in detail. The Kyoto-game is introduced. An algorithmic solution which results from the player's cost-game is presented. We describe several allocation principles and an suitable auction procedure. The results can be used to support an optimal decision making process.

## 1 Introduction

The conferences of Rio de Janeiro 1992 and Kyoto 1997 demand for new economic instruments which have a focus on environmental protection in the macro and micro economy. An important economic tool being part of the treaty of Kyoto in that area is *Joint-Implementation*. It is a program which intends to strenghten international cooperations between enterprises in order to reduce  $CO_2$ -emissions. A sustainable development can only be guaranteed if the instrument is embedded into an optimal energy management. For that reason, the Technology-Emissions-Means (TEM) model was developed, giving the possibility to simulate such an extraordinary market situation. The realization of Joint-Implementation (JI) is restricted by technical and financial constraints. In a JI Program, the reduced emissions resulting from technical cooperations are recorded at the *Clearing House*. The TEM model integrates the simulation of both the technical and the financial parameters. In Pickl (1999) the TEM model is treated as a time-discrete control problem. Furthermore, the analysis of the feasible set is examined in Pickl (2001). In the following, a short introduction into the TEM model is given. Furthermore, we want to present a new algorithmic approach which leads to a procedure for an international emissions trading procedure within the so-called Kyoto auctioning game.

## 2 The Basic Model

The presented TEM model describes the economic interaction between several players (sometimes we say equivalently actors) which intends to maximize their reduction of emissions ( $E_i$ ) caused by technologies ( $T_i$ ), by expenditures of money or by financial means ( $M_i$ ). The index stands for the  $i$ -th player,  $i \in \{1, \dots, n\}$ . The players are linked by technical cooperations and by the market.

The effectivity measure parameter  $em_{ij}$  describes the effect on the emissions of the  $i$ -th player if the  $j$ -th actor invests money for his technologies. We can say that it expresses how effective technology cooperations are (like an innovation factor), which is the central element of a JI Program. The variable  $\varphi$  can be regarded as a memory parameter of the financial investigations, whereas the value  $\lambda_i$  acts as a growth parameter. For a deeper insight see Pickl (1999). The TEM model is represented by the following two equations:

$$E_i(t+1) = E_i(t) + \sum_{j=1}^n em_{ij}(t)M_j(t), \quad (2.1)$$

$$M_i(t+1) = M_i(t) - \lambda_i M_i(t)[M_i^* - M_i(t)]\{E_i(t) + \varphi_i \Delta E_i(t)\} \quad (2.2)$$

It is a great advantage of the TEM model, that we are able to determine the  $em_{ij}$ -parameter empirically. In the first equation, the level of the reduced emissions at the  $t+1$ -th time-step depends on the previous value plus a *market effect*. This effect is represented by the additive terms which might be negative or positive.

In general,  $E_i > 0$  implies that the actors have yet reached the demanded value  $E_i = 0$  (normalized *Kyoto-level*). A value  $E_i < 0$  expresses that the emissions are less than the requirements of the treaty. In the second equation we see that for such a situation the financial means will increase, whereas  $E_i > 0$  leads to a reduction of  $M_i(t+1)$ :

$$M_i(t+1) = M_i(t) - \lambda_i M_i(t)[M_i^* - M_i(t)]\{E_i(t) + \varphi_i \Delta E_i(t)\}$$

The second equation contains the logistic functional dependence and the memory parameter  $\varphi_i$  which describes the effect of the preceding investment of financial means. The dynamics does not guarantee, that the parameter  $M_i(t)$  lies in the interval, which can be regarded as a budget for the  $i$ -th actor. For that reason we have additionally to impose the following restrictions to the dynamical representation:

$$0 \leq M_i(t) \leq M_i^*, \quad i = 1, \dots, n \quad \text{and} \quad t = 0, \dots, N.$$

These restrictions ensure that the financial investigations can neither be negative nor exceed the budget of each actor. Now, it is easy to show that

$$-\lambda_i M_i(t)[M_i^* - M_i(t)] \leq 0 \quad \text{for} \quad i = 1, \dots, n \quad \text{and} \quad t = 0, \dots, N.$$

We have guaranteed that  $M_i(t + 1)$  increases if  $E_i(t) + \varphi_i \Delta E_i(t) \leq 0$  and it decreases if  $E_i(t) + \varphi_i \Delta E_i(t) \geq 0$ . Applying the memory parameter  $\varphi_i$ , we have developed a reasonable model for the *money expenditure - emission* - interaction, where the influence of the technologies is integrated in the *em*-matrix of the system.

We can use the TEM model as a time-discrete model where we start with a special parameter set and observe the resulting trajectories. Usually, the actors start with a negative value, i.e., they lie under the baseline mentioned in Kyoto Protocol, see Kyoto (1997). They try to reach a positive value of  $E_i$ . By adding control parameters, we enforce this development by an additive financial term. For that reason the control parameters are added only to the second equation of our model:

$$M_i(t + 1) = M_i(t) - \lambda_i M_i(t) [M_i^* - M_i(t)] \{E_i(t) + \varphi_i \Delta E_i(t)\} + u_i(t).$$

The introduction of the control parameter  $u_i(t)$  implies that each actor makes an additional investigation at each time-step. In the sense of environmental protection, the aim is to reach a state, mentioned in the treaty of *Kyoto*, by choosing the control parameters such that the emissions of each player become minimized. The focus is the realization of the necessary optimal control parameters via a played cost game, which is determined by the way of actors cooperation.

### 3 The Cost-Game in the TEM Model

Let us regard the nonlinear time-discrete dynamics of the TEM-model

$$E_i(t + 1) = E_i(t) + \sum_{j=1}^n em_{ij}(t) M_j(t), \quad (3.1)$$

$$M_i(t + 1) = M_i(t) - \lambda_i M_i(t) [M_i^* - M_i(t)] \{E_i(t) + \varphi_i \Delta E_i(t)\}. \quad (3.2)$$

We can replace (3.2) by

$$M_i(t + 1) = M_i(t) - \lambda_i M_i(t) [M_i^* - M_i(t)] \{E_i(t) + \varphi_i \sum_{j=1}^n em_{ij}(t) M_j(t)\}$$

$$\text{taking into account (3.1) and } \Delta E_i(t) = E_i(t + 1) - E_i(t)$$

In order to reach steady states, which are determined in Pickl (1999), an independent institution may coordinate the *trade relations* between the actors (clearing house mechanism). The trade relations are expressed by the *em*-matrix. In practice, the imposing of *taxes* or the giving of *incentives* means that in the

TEM-model the  $em$ -parameters will change.

Now, the principle of JI implies that technical cooperation will be benefitted. If there is a cooperation between player 1 and player 2, we introduce an additional parameter  $\epsilon, \epsilon > 0$ , which implies that the measure of effectivity increases. The cooperation of the grand coalition is expressed by the parameter  $\omega$ :

$$\begin{pmatrix} em_{11} & em_{12} + \epsilon & em_{13} \\ em_{21} + \epsilon & em_{22} & em_{23} \\ em_{31} & em_{32} & em_{33} \end{pmatrix} \quad \begin{pmatrix} em_{11} & em_{12} + \omega & em_{13} + \omega \\ em_{21} + \omega & em_{22} & em_{23} + \omega \\ em_{31} + \omega & em_{32} + \omega & em_{33} \end{pmatrix}$$

Example: Actor 1 and Actor 2 do cooperate

Example: All players do cooperate

This extension of the TEM model results in a cost-saving effect at each time-step, which can be expressed by an cooperative cost-game. According to ( 3.1) and ( 3.2) let us begin with the construction of the cost-game:

$$\begin{aligned} v_t(K) &:= \underbrace{\sum_{j \in K} M_j(t)}_{\text{without cooperation}} - \underbrace{M(K)}_{\text{cooperation}} & (3.3) \\ &= (K_1^*(t) \quad K_2^*(t) \quad K_3^*(t)) \begin{pmatrix} 0 & \epsilon & \delta \\ \epsilon & 0 & \gamma \\ \delta & \gamma & 0 \end{pmatrix}_{Ind(K)} \begin{pmatrix} M_1(t) \\ M_2(t) \\ M_3(t) \end{pmatrix} \end{aligned}$$

where  $K_i^*(t) := \varphi_i \tilde{M}_i(t)$ ,  $\tilde{M}_i(t) := [M_i^* - M_i(t)]$  ( $i = 1, \dots, n$ ) and  $K \in Pot(\mathcal{N})$ ,  $\mathcal{N}$  indicates the great coalition, i.e. the cooperation of all players.

Above, we also we used the notation  $(B)_{Ind(K)}$  denoting the submatrix of  $B = (b_{ij})$  corresponding to the indices  $j, k \in K$ , filled up by zero entries:

$$(B)_{Ind(K)} = A, \quad \text{with} \quad \begin{cases} a_{ij} = b_{ij} & , \text{ if } i \in K \text{ and } j \in K, \\ a_{ij} = 0 & , \text{ otherwise.} \end{cases}$$

For the time-dependent (i.e. at each time-step there might exists another coalition) grand coalition we get:

$$\begin{aligned} v_t(\mathcal{N}) &:= \underbrace{\sum_{j \in \mathcal{N}} M_j(t)}_{\text{without cooperation}} - \underbrace{M(\mathcal{N})}_{\text{cooperation}} \\ &= (K_1^*(t) \quad K_2^*(t) \quad K_3^*(t)) \begin{pmatrix} 0 & \omega & \omega \\ \omega & 0 & \omega \\ \omega & \omega & 0 \end{pmatrix} \begin{pmatrix} M_1(t) \\ M_2(t) \\ M_3(t) \end{pmatrix} \end{aligned}$$

For  $\tilde{M}_i(t)\varphi_i M_i(t) \geq 0$  ( $i \in \{1, \dots, n\}$ ) the difference between the cooperative and the non-cooperative case is always positive.

So we have constructed a reasonable cost-game. This might be the bases for a decision analysis within emission trading markets where tolerances (according to Janowitz 1994)of underlying empirical data play an important role.

## 4 Conclusion

The method is that at each time step, this amount is put into a central fund (according to the clearing house mechanism). The results can be used to optimize and support a decision making process within the establishment of emission trading markets. They can be regarded as an actual example of *Computer Science and Decision Theory*.

## 5 References

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