

# An Efficient Consistency Algorithm for Solving Tighter Solution Space of Temporal Constraint Optimization Problem

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**Abstract-**This paper mainly gives an efficient consistency algorithm for solving tigher solution space of Temporal Constraint Optimization Problem (TCOP), and it is a variation of Path Constraint (PC) that is widely used in the domain of Constraint Satisfaction Problem (CSP). The algorithm can find out the feasible solutions and eliminate some non-feasible solutions, and it can improve the efficiency of solving TCOP. The validity and convergence of the algorithm are both proved by mathematical reasoning.

**Keywords-**Algorithm; Solution Space; Temporal Constraint Optimization Problem

## I. INTRODUCTION

Temporal Constraint Optimization Problem(TCOP) is quite widely used in the problems such as time cooperation based combat projects optimization. So how to improve the effectiveness of TCOP optimizing computing is a significant research task. How to improve the efficiency of TCOP Optimization computing is a problem needed to solve. TCOP problem has two aspects: one is to make sure if TCOP has any feasible solutions, the other is to search the optimization solution of TCOP. This paper is aim to get a feasible solution from knowing any value of a variable, through compressing the solution space of TCOP. Thus this method can efficiently solve the first aspect problem, at the same time, it can quickly get feasible solutions of TCOP, improving the searching efficiency of optimization computing in the second aspect problem.

Temporal Constraint information in TCOP can be equally expressed as Temporal Constraint Satisfaction Problem(TCSP). TCSP is a common theoretic framework dealing with temporal constraint raised by Dechter and others in 1991 [5], and TCOP can be seen as problem expansion of TCSP after introducing aim function. Thereinto the TCSP that only include single temporal constraint is called Simple Temporal Problems (STP), and STP is a kind of TCSP widely studied and applied [6-7]. This paper mostly studies solving TCOP that can be expressed as STP. A classic STP can be described as the duality group below:

$$STP = \langle X, C \rangle$$

$X = \{x_1, x_2, \dots, x_n\}$  means the set of time variable,  $C$  means

the set of all the constraint conditions. Constraint conditions contain unitary constraint and duality constraint. Unitary constraint is defined as  $l_i \leq x_i \leq u_i$ , expressing the value range of time variable; duality constraint is defined as

$l_{ij} \leq x_j - x_i \leq u_{ij}$ , expressing the value range of time delay. Suppose  $x_0 \equiv 0$ ,  $x_0$  is time origin. When introducing time origin, unitary constraint can be equally defined as duality constraint  $l_i \leq x_j - x_0 \leq u_i$ . Thus all the constraint conditions in STP can be expressed as duality constraint.

If there is a group  $T = (\tau_1, \tau_2, \dots, \tau_n)$ , when the values of time variables are  $x_1 = \tau_1, x_2 = \tau_2, \dots, x_n = \tau_n$ , it can satisfy all the constraint conditions in STP, then group  $T$  is called a set of feasible solutions of STP.

So TCOP in this paper can be expressed as  $TCOP = \langle X, C, f \rangle$ , thereinto  $f$  means the optimized target of TCOP.

Sample Temporal Network (STN) is a efficient method to

describe and infer systems with temporal knowledge and temporal constraint, STN puts the idea of solving problems used in Chart Theroy into solving Temporal Constraint Satisfaction Problems, abroad used in checking and clearing up time conflict[8]. The peak of STN means time variable, and the border between the peaks means restriction relation between time variables. In this paper, firstly, we establish STN model of temporal constraint, then based on STN, Path Consistency(PC) in constraint satisfaction problem [9-10], presenting the method of solution space contraction of TCOP, and the validity and convergence of the method are both proved by mathematical reasoning, at last, through a test application, this method is validated that it can efficiently improve the efficiency of optimization computing.

## II. THE DUAL TEMPORAL CONSTRAINT NETWORK EXPRESS OF TEMPORAL CONSTRAINT IN TCOP

Definition 1: Assume that  $a$  and  $b(a \leq b)$  are two real numbers , define set  $A = \{ a \leq t \leq b \wedge t \in R \}$ , completely order set  $(A, \leq)$  is called period of time,experessed as  $I = [a, b]$ ,in which  $a$  and  $b$  separately express  $I$ 's starting time and ending time. When  $a = b$ , period of time degenerate as a time point,obviously  $a \leq t \leq b \Leftrightarrow t \in I = [a, b]$ .

Suppose period of time  $I_1 = [a, b]$  and  $I_2 = [-b, -a]$ , then we call  $I_1$  and  $I_2$  opposite period of time,marked as  $I_2 = I_1^{-1}$  or  $I_1 = I_2^{-1}$  .

Definition 2:Present period of time  $I_x = [ax, bx]$  and  $I_y = [ay, by]$ , define period of time merger operation  $\oplus$

$$[ax, bx] \oplus [ay, by] = [ax+ay, bx+by]$$

Especially for any period of time  $I, I \oplus \emptyset = \emptyset, \emptyset \oplus I = \emptyset$ .Obviously period of time merger operation satisfies

combine law and exchange law.

Define continuum merger operation sign  $\Sigma$

$$\sum_{i=1}^n I_i = \sum_{1 \leq i \leq n} I_i = I_1 \oplus I_2 \dots \oplus I_n$$

Definition 3: Present period of time  $I_x = [ax, bx]$  and  $I_y = [ay, by]$ , define period of time cross operation  $\otimes$

$$[ax, bx] \otimes [ay, by] = [\max(ax, ay), \min(bx, by)]$$

When  $\max(ax, ay) > \min(bx, by)$ ,  $[ax, bx] \otimes [ay, by] = \emptyset$ . Especially for any period of time  $I \otimes \emptyset = \emptyset$ ,  $\emptyset \otimes I = \emptyset$ . Obviously period of time cross operation satisfies combine law and exchange law.

Define continuous cross operation sign  $\Pi$

$$\prod_{i=1}^n I_i = \prod_{1 \leq i \leq n} I_i = I_1 \otimes I_2 \dots \otimes I_n$$

Character 1: Present period of time  $I$ , for  $I_i$ ,

$$i=1, 2, \dots, n, \text{ if } \prod_{i=1}^n I_i \neq \emptyset, \text{ then } (\prod_{i=1}^n I_i) \oplus I = \prod_{i=1}^n (I_i \oplus I).$$

Prove: Let  $I_1 = [a_1, b_1]$ ,  $I_{2,n} = \prod_{i=2}^n I_i = [a_{2,n}, b_{2,n}]$

$\because \prod_{i=1}^n I_i \neq \emptyset$  and cross operation satisfies combine law  
 $\therefore I_1 \otimes I_{2,n} \neq \emptyset$

$$\therefore \max(a_1, a_{2,n}) \leq \min(b_1, b_{2,n})$$

$$\therefore (I_1 \otimes I_{2,n}) \oplus I = [\max(a_1, a_{2,n}) + a, \min(b_1, b_{2,n}) + b]$$

$$(I_1 \oplus I) \otimes (I_{2,n} \oplus I) = [\max(a_1 + a, a_{2,n} + a), \min(b_1 + b, b_{2,n} + b)]$$

$$\therefore \max(a_1, a_{2,n}) + a = \max(a_1 + a, a_{2,n} + a)$$

$$\min(b_1, b_{2,n}) + b = \min(b_1 + b, b_{2,n} + b)$$

$$\therefore (I_1 \otimes I_{2,n}) \oplus I = (I_1 \oplus I) \otimes (I_{2,n} \oplus I) \Leftrightarrow$$

$$(\prod_{i=1}^n I_i) \oplus I = (I_1 \oplus I) \otimes [(\prod_{i=2}^n I_i) \oplus I]$$

Then in turns analyzing we can prove character 1 comes into existence.

Definition 4: For a Temporal Constraint optimization problem  $TCOP = \langle X, C, f \rangle$ , in which Temporal Constraint can be expressed as the weighted direction figure  $DG = \langle V, E, W \rangle$  below.

$V$  is node concourse, any node  $v_i$  one by one maps temporal variable  $x_i$ , especially  $v_0$  maps time origin  $x_0$ ;  $E$  and  $W$  express direction border and weight set, any constraint qualification of STP:  $l_{ij} \leq x_j - x_i \leq u_{ij}$ , corresponding two direction borders  $e_{ij}$  from node  $v_i$  to node  $v_j$  and  $e_{ji}$  from node  $v_j$  to node  $v_i$  in set  $E$ , let period of time  $I_{ij} = [l_{ij}, u_{ij}]$ , then the weight of  $e_{ij}$  and  $e_{ji}$  is respective  $I_{ij}$  and  $I_{ji} = I_{ij}^{-1}$ .

$DG$  is called Dual Temporal Constraint Network (DTCN), by all appearances for any feasible solution of  $TCOP T = (\tau_1, \tau_2, \dots, \tau_n)$ , and any direction border of DTCN  $e_{ij}, t_j - t_i = I_{ij}$ .

Definition 5: Suppose that in  $DTCN = \langle V, E, W \rangle$  one of the gateways from node  $vs$  to node  $ve$  is  $pse = vsv1 \dots vkve$ , one of the gateways from node  $ve$  to node  $vs$  is  $pes = vevk \dots v1vs$ , then we call  $pse$  and  $pes$  are opposite gateways about node  $vs$  and node  $ve$ . According to Definition 4, opposite gateways cannot but exist in pairs.

Definition 6: Suppose that in  $DTCN = \langle V, E, W \rangle$  one of the gateways from node  $vs$  to node  $ve$  is

$pse = vsv1 \dots vkve$ , suppose the weight of direction border  $es_1$  is  $Is_1$ , the weight of  $eke$  is  $Ike$ , the weight of  $e_{ij+1}$  is  $I_{ij+1}, i=1, 2, \dots, k-1$ . Period of time  $Ise = Is_1 \oplus I_{12} \oplus \dots \oplus I_{k-1}$  is called the distance of period of time of gateway  $pse$ . When node  $vs = ve$ ,  $Ise$  is called the distance of period of time of loop  $pse$ .

Definition 7: Suppose that in  $DTCN = \langle V, E, W \rangle$  there are  $m$  basic gateways from node  $vs$  to node  $ve$ , suppose that the distance of period of time in the  $i$ th basic access is  $Ise_i$ , period of time  $Id, se = Ise_1 \otimes Ise_2 \otimes \dots \otimes Ise_m$  is called the shortest distance of period of time from node  $vs$  to node  $ve$ .

### III. METHOD OF COMPRESSING SOLUTION SPACE OF TCOP

For Temporal Constraint optimization problem  $TCOP = \langle X, C, f \rangle$  compressing solution space, in fact it is to obtain a weighted direction figure  $DG = \langle V, E, W \rangle$  which can satisfy the following two qualifications:

Firstly, for any feasible solution of  $TCOP T = (\tau_1, \tau_2, \dots, \tau_n)$ , and any direction border  $e_{ij}$  of  $DG$ , satisfying  $t_j - t_i \in I_{ij}$ , then period of time  $I_{ij}$  is the weight of  $e_{ij}$ ;

Secondly, for any weight  $I_{ij}$  of  $DG$ , if  $t_j - t_i \in I_{ij}$ , then there must exist a group of feasible solutions of  $TCOP: T = (\tau_1, \tau_2, \dots, \tau_n)$ , satisfying  $t_j - t_i = \tau$ .

Weighted direction figure  $DG$  is called smallest temporal constraint network of  $TCOP$ , noted as  $minNet$ . Apparently  $minNet$  is a constrictive expressing model of feasible solution space in  $TCOP$ , deflate the value area of any weight in  $minNet$ , and it will necessarily lead the loss of feasible solutions of  $TCOP$ .

Theorem 1: In  $DTCN = \langle V, E, W \rangle$  which is according to  $TCOP = \langle X, C, f \rangle$ , if there is a shortest distance of period of time from node  $vs$  to node  $ve$  that is  $Id, se = \emptyset$ , then  $TCOP$  don't have feasible solutions.

Prove: Suppose that  $TCOP$  has a feasible solution  $T = (\tau_1, \tau_2, \dots, \tau_n)$ . Suppose that there are  $m$  basic gateways from node  $vs$  to node  $ve$  in  $DTCN$ , the  $i$ th basic gateway is  $pse, i = vsv1v2 \dots vikve$ .

Suppose that  $xs = ts, xe = te, xij = tij$  are feasible solutions segments according to nodes in  $pse, i$ ; The weight according to  $es, i1$  is  $Is, i1$ , the weight according to  $eik, e$  is  $Iik, e$ , and the weight according to  $eij, ji+1$  is  $Iji, ji+1, j=1, 2, \dots, k-1$ .

Based on the definition of feasible solution, we can get:  $ts - ts = Is, i1, te - tik = Iik, e, tij+1 - tij = Iij, ij+1$ . Suppose that the distance of period of time according to  $pes, i$  is  $Ise, i = Is, i1 \oplus I_{12} \oplus \dots \oplus Iik, e$ , apparently  $te - ts \in Ise, i$ .

For  $Id, se = Ise_1 \otimes Ise_2 \otimes \dots \otimes Ise_m, te - ts \in Id, se$ , it is contrary to  $Id, se = \emptyset$ , then supposed qualification is not true, the original proposition is true.

Deduction 1: In  $DTCN = \langle V, E, W \rangle$  which is according to  $TCOP = \langle X, C, f \rangle$ , if there is a basic loop whose distance of period of time  $I$  that don't contain 0, i.e.  $0 \notin I$ , then  $TCOP$  don't have feasible solutions.

Prove: Suppose any one basic gateway in  $DTCN$  is  $vs \dots vi \dots ve \dots vj \dots vs$ , accordingly, its distance of period of time is  $I$ , thereinto the distance of period of time of basic gateway  $vs \dots vi \dots ve$  is  $Ii = [li, ui]$ , the distance of period of time of basic gateway  $ve \dots vj \dots vs$  is  $Ij = [lj, uj]$ , according to definition 6,  $I = Ii \oplus Ij = [li + lj, ui + uj]$ .

For  $0 \notin I, li + lj > 0$  or  $ui + uj < 0$ .

When  $li + lj > 0$ , according to definition 5, the distance of

period of time of the gateway opposite to  $ve...vj...vs$  is  $I_j^{-1} = [-u_j, -l_j]$

For  $ui \geq li > lj$ ,  $\min(ui, -lj) = -lj < li$ ; For  $uj \geq lj > li$ ,  $\max(li, -uj) = li$ , and  $\max(li, -uj) > \min(ui, -lj)$ , then  $I_i \oplus I_j^{-1} = \emptyset$ . According to definition 7, the shortest distance of period of time from node  $vs$  to node  $ve$  is  $\emptyset$ , so according to theorem 1, TCOP don't have feasible solutions.

When  $ui + uj < 0$ , in the same method we can prove that TCOP don't have feasible solutions.

Deduction 2: In DTCN =  $\langle V, E, W \rangle$  which is according to TCOP =  $\langle X, C, f \rangle$ , any three different nodes  $va$ ,  $vb$  and  $vc$ , thereinto the shortest distance of period of time from  $va$  to node  $vc$ , from node  $vc$  to node  $vb$  and from node  $va$  to node  $vb$  are respectively  $I_{d,ac}$ ,  $I_{d,cb}$  and  $I_{d,ab}$ , if TCOP has feasible solutions, then  $I_{d,ab} \subseteq I_{d,ac} \oplus I_{d,cb}$ .

Prove: Suppose concourse  $Pac$  is made up of basic gateways from node  $va$  to node  $vc$  without node  $vb$ , and there are  $m$  elements. Suppose that the distance of period of time of the  $i$ th basic gateway is  $I_{ac,i}$ ; Concourse  $Pcb$  is made up of basic gateways from node  $vc$  to node  $vb$  without node  $va$ , and there are  $n$  elements, the distance of period of time of the  $j$ th basic gateway is  $I_{cb,j}$ ; Concourse  $Pab$  is made up of basic gateways from node  $va$  to node  $vb$  without node  $vc$ , and there are  $l$  elements, the distance of period of time of the  $k$ th basic gateway is  $I_{ab,k}$ .

The definition of Descartes Product of concourse  $Pac$  and  $Pcb$ :

$$Pac \times cb = \{va...vi...vc...vj...vb | va...vi...vc \in Pac \wedge vc...vj...vb \in Pcb\}$$

Cross operation result of distance of period of time of All the gateways in Concourse  $Pac \times cb$  is:

$$I_{ac \times cb} = \prod_{i=1}^m \prod_{j=1}^n (I_{ac,i} \oplus I_{cb,j})$$

Suppose concourse  $Pacb$  is made up of basic gateways from node  $va$  to  $vb$  containing node  $vc$ , for any  $va...vi...vc...vj...vb \in Pacb$ , we can get one and only breaking up to two parts:  $va...vi...vc$  and  $vc...vj...vb$ . Apparently  $va...vi...vc \in Pac$ ,  $vc...vj...vb \in Pcb$ , so  $va...vi...vc...vj...vb \in Pac \times cb$ , and then  $Pacb \subseteq Pac \times cb$ . Suppose the continuous cross operation result of all the distance of period of time in concourse is  $Pacb$ , apparently  $I_{ac \times cb} \subseteq I_{acb}$ .

The shortest distance of period of time from node  $va$  to

$$I_{d,ab} = \prod_{k=1}^l I_{ab,k} \otimes I_{acb}$$

node  $vb$  is :

$$I_{z,ab} = \prod_{k=1}^l I_{ab,k} \otimes I_{ac \times cb}$$

Let period of time  $I_{z,ab}$ , they apparently satisfy inclusion relation:  $I_{z,ab} \subseteq I_{d,ab}$ .

On the other hand, for any  $\tau \in I_{d,ab}$ , if  $\tau \in I_{z,ab}$ , then apparently iff  $\tau \in I_{ij,acb}$ ,  $I_{ij,acb}$  is the distance of period of time of any nonbasic gateway  $Pij,acb = va...vi...vc...vj...vb$  in  $Pacb$ .

For  $va...vi...vc$  and  $vc...vj...vb$  are both basic gateways, there are at least a pair of same nodes  $vt$  on both sides of node  $vc$ , so as to  $Pij,acb = va...vi...vc...vj...vb$ , and  $vt...vc...vt$  is a basic

loop. Let the distance of period of time of  $va...vt$  be  $I_{at}$ , the distance of period of time of  $vt...vc...vt$  be  $I_{tt}$ , the distance of period of time of  $vt...vb$  be  $I_{tb}$ , then the distance of period of time of  $va...vt...vb$  is  $I_{atb} = I_{at} \oplus I_{tb}$ . Thus  $I_{ij,acb} = I_{at} \oplus I_{tt} \oplus I_{tb} = I_{atb} \oplus I_{tt}$ .

For TCOP has feasible solutions, based on deduction 1,  $0 \in I_{tt}$ , any  $\tau \in I_{atb}$ ,  $\tau = \tau + 0 \in I_{atb} \oplus I_{tt} = I_{ij,acb}$ .  $I_{atb} \subseteq I_{ij,acb}$ .

If there is still some basic loops in  $va...vt...vb$ , then pick-up basic loops in turn, until basic gateway, then the basic gateway is apparently the basic gateway from node  $va$  to  $vb$  without node  $vc$ , the worst is the basic gateway  $vavb$ . Suppose this basic gateway is  $pk,ab$ ,  $pk,ab \in Pab$ , and the distance of period of time of  $pk,ab$  is  $I_{k,ab}$ , then apparently  $I_{k,ab} \subseteq I_{ij,acb}$ .

For  $\tau \in I_{d,ab}$ ,  $\tau \in I_{k,ab}$ . For  $I_{k,ab} \subseteq I_{ij,acb}$ ,  $\tau \in I_{ij,acb}$ ,  $I_{d,ab} \subseteq I_{z,ab}$ , and

$$I_{d,ab} = I_{z,ab} = \prod_{k=1}^l I_{ab,k} \otimes (\prod_{i=1}^m \prod_{j=1}^n (I_{ac,i} \oplus I_{cb,j}))$$

$$I_{ac} = \prod_{i=1}^m I_{i,ac}$$

Let period of time  $I_{ac}$ , period of time  $I_{cb} = \prod_{j=1}^n I_{j,cb}$ , period of time  $I_{ab} = \prod_{k=1}^l I_{k,ab}$ , for TCOP has feasible solutions, based on theorem 1,  $I_{ac} \neq \emptyset$ ,  $I_{cb} \neq \emptyset$ ,  $I_{ab} \neq \emptyset$ .

Based on definition 1, we can get:

$$\prod_{i=1}^m \prod_{j=1}^n (I_{ac,i} \oplus I_{cb,j})$$

$$= \prod_{i=1}^m I_{ac,i} \oplus (\prod_{j=1}^n I_{cb,j}) = \prod_{i=1}^m I_{ac,i} \oplus I_{cb} = I_{ac} \oplus I_{cb}$$

$$I_{d,ab} = I_{ab} \otimes (I_{ac} \oplus I_{cb})$$

Thus  $I_{d,ab} = I_{ab} \otimes (I_{ac} \oplus I_{cb})$ . In the same method we can prove that:  $I_{d,ac} = I_{ac} \otimes (I_{ab} \oplus I_{cb}^{-1})$  and  $I_{d,cb} = I_{cb} \otimes (I_{ac}^{-1} \oplus I_{ab})$ .

For any  $\tau \in I_{d,ab}$ , apparently  $\tau \in I_{ab}$  and  $\tau \in I_{ac} \oplus I_{cb}$ , so there is  $\tau_a \in I_{ac}$  and  $\tau_c \in I_{cb}$ , satisfying  $\tau_a + \tau_c = \tau$ .

$$\because -\tau_c \in I_{cb}^{-1} \text{ and } \tau \in I_{ab}, \therefore \tau_a = \tau - \tau_c \in I_{ab} \otimes I_{cb}^{-1},$$

$$\therefore \tau_a \in I_{ac} \otimes (I_{ab} \oplus I_{cb}^{-1}), \text{ i.e. } \tau_a \in I_{d,ac}.$$

$$\because -\tau_a \in I_{ac}^{-1} \text{ and } \tau \in I_{ab}, \therefore \tau_c = -\tau_a + \tau \in I_{ac}^{-1} \oplus I_{ab},$$

$$\therefore \tau_c \in I_{cb} \otimes (I_{ac}^{-1} \oplus I_{ab}), \text{ i.e. } \tau_c \in I_{d,cb},$$

$$\therefore \tau = \tau_a + \tau_c \in I_{d,ac} \oplus I_{d,cb}, \therefore I_{d,ab} \subseteq I_{d,ac} \oplus I_{d,cb}.$$

Theorem 2: Suppose weighted direction figure  $DG = \langle V, E, W \rangle$  is a complete figure, Dual Temporal Constraint Network according to TCOP =  $\langle X, C, f \rangle$  is DTCN =  $\langle V, E, W \rangle$ , thereinto the weight of direction border  $eij$  in DG is the shortest distance of period of time from node  $vi$  to  $vj$  in DTCN, then weighted direction figure DG is the minimum Temporal Constraint Network of TCOP.

Prove: Firstly, we prove that qualification 1 is true.

Suppose the feasible solution of TCOP is  $T = (\tau_1, \tau_2, \dots, \tau_n)$ , considering the weight of any direction border  $eij$  of DG:  $Id,ij$ , and there are  $m$  basic gateways from node  $vi$  to  $vj$  in DTCN, the  $k$ th basic gateway is  $pk = vivk1vk2\dots vklvj$ .

Suppose the feasible solutions segments according to the

nodes in pk are:  $x_i = \tau_i$ ,  $x_j = \tau_j$ ,  $x_k = \tau_{k,t}$ ; The weight according to  $e_{i,k}$  is  $I_{i,k}$ , the weight according to  $e_{k,l}$  is  $I_{k,l}$ , the weight according to  $e_{k,t+1}$  is  $I_{k,t+1}$ ,  $t=1,2,\dots,l-1$ .

Based on the definition of feasible solutions:

$$\tau_{k-1} - \tau_i = I_{i,k}, \tau_j - \tau_{k,t} = I_{k,t}, \tau_{k,t+1} - \tau_{k,t} = I_{k,t+1}$$

The distance of period of time of pk is:  $I_{i,j} = I_{i,k} \oplus I_{k,t} \oplus \dots \oplus I_{t,l}$ , apparently  $\tau_j - \tau_i = I_{i,j}$ . For  $I_{d,i,j} = I_{i,j} \otimes I_{j,m} \otimes \dots \otimes I_{m,n}$ , apparently  $\tau_j - \tau_i = I_{d,i,j}$ , qualification 1 is true.

Secondly, we prove that qualification 2 is true.

Considering the weight of direction border  $e_{12}$  in DG:  $I_{d,12}$ , suppose any  $\tau \in I_{d,12}$ , we prove that there is a group of feasible solutions of TCOP:  $T = (\tau_1, \tau_2, \dots, \tau_n)$ , satisfying  $\tau_2 - \tau_1 = \tau$ .

$$\text{Based on deduction 2, } I_{d,12} \subseteq I_{d,10} \oplus I_{d,02} = I_{d,01}^{-1} \oplus I_{d,02},$$

Thus there is  $\tau_2 - \tau_1 = \tau$  so that  $\tau_1 \in I_{d,01}$  and  $\tau_2 \in I_{d,02}$ . Apparently when  $x_1 = \tau_1$ ,  $x_2 = \tau_2$ , satisfying all the restrictions among the time variables  $x_0, x_1, x_2, x_0 = 0$ .

We expand  $x_1 = \tau_1$ ,  $x_2 = \tau_2$  into a feasible solution through mathematic induction:

When  $k=2$ ,  $x_1 = \tau_1, \dots, x_k = \tau_k$  apparently satisfy  $\tau_j - \tau_i \in I_{d,i,j}$ ,  $0 \leq i < j \leq 2$ . Suppose when  $k=m$ ,  $m \geq 2$ ,  $x_1 = \tau_1, \dots, x_k = \tau_k$  satisfy  $\tau_j - \tau_i \in I_{d,i,j}$ ,  $0 \leq i < j \leq m$ .

When  $k=m+1$ , suppose there is a node  $\tau_v$  satisfying  $\tau_v - \tau_i \in I_{d,i,k}$ ,  $0 \leq i \leq m$ . Let  $I_{d,i,k} = [l_{ik}, u_{ik}]$ , then  $\tau_i + l_{ik} \leq \tau_v \leq \tau_i + u_{ik}$ .

$$\text{Let } \max_{0 \leq i \leq m} (\tau_i + l_{ik}) = \tau_a + l_{ak},$$

$$\min_{0 \leq i \leq m} (\tau_i + u_{ik}) = \tau_b + u_{bk}, \quad 0 \leq a, b \leq m$$

$$\text{If } a = b, \text{ then apparently } \max_{0 \leq i \leq m} (\tau_i + l_{ik}) \leq \min_{0 \leq i \leq m} (\tau_i + u_{ik}).$$

If  $a \neq b$ , then based on qualification we can suppose that  $\tau_b - \tau_a \in I_{d,ab}$ .

Based on deduction 2, we can get:

$$I_{d,ab} \subseteq I_{d,ak} \oplus I_{d,bk} = I_{d,ak} \oplus I_{d,bk}^{-1}$$

$$\therefore \tau_b - \tau_a \in I_{d,ak} \oplus I_{d,bk}^{-1}, \therefore \tau_b - \tau_a \geq l_{ak} - u_{bk}$$

$$\therefore \tau_a + l_{ak} \leq \tau_b + u_{bk}, \therefore \max_{0 \leq i \leq m} (\tau_i + l_{ik}) \leq \min_{0 \leq i \leq m} (\tau_i + u_{ik}).$$

Thus the time node  $\tau_v$  that satisfies  $\tau_v - \tau_i \in I_{d,i,k}$  ( $0 \leq i \leq m$ ) exists, let  $\tau_{m+1} = \tau_v$ , then there are  $x_1 = \tau_1, \dots, x_k = \tau_k$  that satisfy  $\tau_j - \tau_i \in I_{d,i,j}$ ,  $0 \leq i < j \leq m+1$ . So when  $k=n$ ,  $T = (\tau_1, \tau_2, \dots, \tau_n)$  is a feasible solution of TCOP, and qualification 2 is true.

Based on theorem 2, we know that as long as we can figure out the shortest distance of period of time among all the nodes in Dual Temporal Constraint Network: DTCN =  $\langle V, E, W \rangle$ , then we can obtain the minimum Temporal Constraint Network of TCOP. The table I below shows when we already know the value of some variables, the Feasible Solutions Extend Arithmetic of TCOP.

If feasible extend arithmetic has validity and astringency, then we must assure the value of  $x_k$  in the first step is not  $\emptyset$ . Based on the provement of theorem 2, inequation  $\max_{0 \leq i < k} (\tau_i + l_{ik}) \leq \min_{0 \leq i < k} (\tau_i + u_{ik})$  must be true, so feasible extend arithmetic is apparently efficient, and it can efficiently produce the feasible solutions of TCOP.

TABLE I. FEASIBLE SOLUTIONS EXTEND ARITHMETIC DESCRIPTION

Original Qualification	$\min Net = \langle V, E, W \rangle$	$x_i = \tau_i$
	$\tau_0 = 0, k = 2$	
First step	$x_k \in [\max_{0 \leq i < k} (\tau_i + l_{ik}), \min_{0 \leq i < k} (\tau_i + u_{ik})]$	Any thereinto $I_{ik} = [l_{ik}, u_{ik}]$ means the weight of direction border $e_{ik}$ ;
Second step		If $k = n$ arithmetic pauses, otherwise $k = k + 1$ , return to the first step.

#### IV. APPLICATIONS

Consider a TCOP containing 5 time variables as below:

$$\begin{cases} \max f(t_1, t_2, t_3, t_4, t_5) = t_1^2 + t_2^2 + t_3^2 + t_4^2 + t_5^2 \\ \text{s.t.} \begin{cases} 0 \leq t_2 - t_1 \leq 5, 5 \leq t_4 - t_3 \leq 10, 5 \leq t_3 - t_1 \leq 10 \\ 0 \leq t_5 - t_2 \leq 5, 0 \leq t_5 - t_3 \leq 5, 5 \leq t_4 - t_1 \leq 10 \\ 0 \leq t_1 \leq 5, t_2, t_3, t_4, t_5 \geq 0 \end{cases} \end{cases}$$

Using restriction measure-changed method, the optimized solution through 12 times iteration is:  $t_1 = 5$ ,  $t_2 = 10$ ,  $t_3 = 10$ ,  $t_4 = 15$ ,  $t_5 = 15$ .

Dual Temporal Constraint Network of TCOP is shown as below in Figure 1:

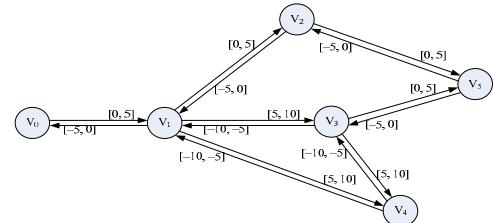


Figure 1. DTCN

As Figure 1 shows, node and time variable are coresponding one by one, thereinto node V0 is coresponding to the time origin.

There are three basic gateways from node V1 to V5: P1=V1V2V5, P2=V1V3V5, P3=V1V4V3V5. The distance of period of time of three basic gateways are  $I_{1,1} = [0,5] \oplus [0,5] = [0,10]$ ,  $I_{1,2} = [5,10] \oplus [0,5] = [5,15]$  and  $I_{1,3} = [5,10] \oplus [-10,-5] \oplus [0,5] = [-5,10]$ , so the least distance of period of time from node V1 to V5 is:  $I_{1,5} = [0,10] \otimes [5,15] \otimes [-5,10] = [5,10]$ .

Through computing the smallest distance of period of time among all the nodes in the Dual Temporal Constraint Network as shown in Figure 1, we can get the smallest temporal constraint network of TCOP, its weight value is shown as Table II.

TABLE II. WEIGHT OF MINIMUM TEMPORAL CONSTRAINT NETWORK

	V0	V1	V2	V3	V4	V5
V0	[0,0]	[0,5]	[0,10]	[5,10]	[10,15]	[5,15]
V1	[-5,0]	[0,0]	[0,5]	[5,5]	[10,10]	[5,10]
V2	[-10,0]	[-5,0]	[0,0]	[0,5]	[5,10]	[0,5]
V3	[-10,-5]	[-5,-5]	[-5,0]	[0,0]	[5,5]	[0,5]

V4	[-15,-10]	[-10,-10]	[-10,-5]	[-5,-5]	[0,0]	[-5,0]
V5	[-15,-5]	[-10,-5]	[-5,0]	[-5,0]	[0,5]	[0,0]

From Table 2 we can find out that  $t_3 = t_1 + 5$ ,  $t_4 = t_1 + 10$ , so TCOP above can predigest as below:

$$\begin{cases} \max f(t_1, t_2, t_5) = 3t_1^2 + t_2^2 + t_5^2 + 30t_1 + 125 \\ s.t. \begin{cases} 0 \leq t_2 - t_1 \leq 5, 0 \leq t_5 - t_2 \leq 5, 5 \leq t_5 - t_1 \leq 10 \\ 0 \leq t_1 \leq 5, 0 \leq t_2 \leq 10, 5 \leq t_5 \leq 15 \end{cases} \end{cases}$$

When  $t_1=0$ , based on Feasible Solutions Extend Arithmetic, we can extend a original feasible solution:

$$t_1=0, t_2=5, t_3=5, t_4=10, t_5=10$$

Then using restriction measure-changed method, the optimized solution through 5 times iteration is:

$$t_1=5, t_2=10, t_3=10, t_4=15, t_5=15.$$

Apparently through the solution space contraction method of TCOP, we can efficiently predigest the searching range of feasible solution space when we optimizedly solve TCOP, therefore improving the efficiency of TCOP solving.

If we add two temporal constraints in the TCOP above:

$5 \leq t_3 - t_2 \leq 10, 0 \leq t_5 - t_4 \leq 5$ , then the according Dual Temporal Constraint Network is shown as Figure 2:

From Figure 2 we can find that the period of time distance of basic loop  $P=V2V3V4V5V2$  is  $I=[5,10] \oplus [5,10] \oplus [0,5] \oplus [-5,0]=[5,20]$ . Obviously  $0 \notin I$ , thus based deduction 1, TCOP added restriction has no feasible solutions.

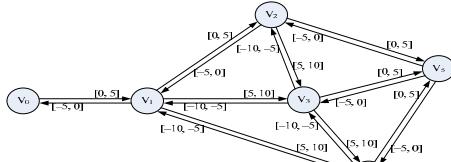


Figure2. DTCN added restriction

## V. CONCLUSIONS

This paper proposes a method of compressing space of TCOP based on the method of Path Restriction Consistency

resolving in restriction optimization problems resolving. The validity and convergence of the method are both strictly proved by mathematical reasoning. And the applications prove that this method can efficiently improve the efficiency of optimized computing.

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