

# Direct Torque Control System for Coal Mine Equipment Based on Improved Genetic Algorithms

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**Abstract**—The belt conveyor is the main transport equipments in coal field, and its controllable drive system directly impacts on the running safety reliability and cost in coal production. Starting speed is unsmoothed in the traditional electrical drive system, which causes the belt off tracking or split and even safety accident. Therefore it is theory and practical significant to introduce a novel direct torque control (DTC) system of AC machine to the belt conveyor for solving the problem in coal mine. In allusion to the optimization of PID parameters in the speed regulators of the belt conveyor, the paper presents the improved genetic algorithm based on genetic algorithms and tabu search for the design of variable parameters of PID controller, and its ability of stronger climbing and faster finding the global optimum results are verified through the De Jong function. Compared with the traditional means, the rise time of the suggested system is faster, overshoot and regulating time is shorter, anti-disturbance is stronger, robust is better. So the optimization performance of control system is improved greatly.

**Index Terms**—Belt Conveyor; Direct Torque Control (DTC); Genetic Algorithms; Tabu Search

## I. INTRODUCTION

The belt conveyor is a big Inertia load and a main transport vehicle in the coal mine safety production[1]. Because in the early the belt conveyor power was small and the transport distance was short, and the speed was low[2]. Its application was certainly limited. Along with electric power electronic technology and variable frequency modulation technology development, the belt conveyor technology had has been developed greatly, and it gradually becomes the most reliable and the most economical equipment in transportation bulk[3]. But there are still have some problems because the adhesive tape belongs to the flexible belt body. It requests the low and steady speed to start and it can not have the impact. Otherwise it is easy to break[4]. Moreover, it is easy to happen the phenomenon which the material rolls from the

adhesive tape, so the belt conveyor's start acceleration generally must be controlled within  $0.3m/s^2$ .

Drive motor power of the belt conveyor is usually bigger, there are big impact current when the motor is started. This will spark the voltage sharply descend of electrical power system, it may spark failure to start, it can cause been burn to motor. Even it will effect the normal run - time of other electricity equipments.

The improved heredity taboo algorithm is proposed in the direct torque control's foundation in this paper, which solves speed regulator PID parameter optimization in the mineral belt conveyor[5]. Because of intersecting calculate the likeness of the chromosome and the dimension of the variation probability in inherit algorithm, "Precocious" phenomenon and climbing a mountain of algorithm capability that easily builds to run in the family algorithm are weak, it make its incapability to search overall situation's superior solution. But this second inspire type hunting technique as the variation that inherits algorithm to calculate son is leaded into taboo to search. This problem was useful to work out. At the same time to PID controller, punishment function is adopted in order to avoid super adjust. This algorithm has "climb the mountain" and seeks for the globally optimal solution quickly ability. The control system optimization performance is greatly enhanced by using this algorithm[6].

## II SIMULINK FIGURE OF DIRECT TORQUE DIRECT TORQUE CONTROL SYSTEM

### A: Asynchronous motor mathematical model

In order to mathematical model of induction motor make more general in two-phase coordinate, Here we consider mathematical model of asynchronous motor in arbitrary rotate  $d, q$  reference frame,  $d, q$  reference frame rotate relative to  $\alpha, \beta$  reference frame



INVERTER EIGHT KINDS OF SWITCH COMBINATION STATE

state	0	1	2	3	4	5	6	7
$S_a$	0	1	1	0	0	0	1	1
$S_b$	0	0	1	1	1	0	0	1
$S_c$	0	0	0	0	1	1	1	1

Inverter six working state get six different direction voltage space vector, they appear periodically order between adjacent two vector are 60 and voltage space vector amplitude is changeless, are equal to  $\sqrt{\frac{4}{3}}E$  ( $E = \frac{1}{2}u_d$ ). So six voltage vector vertex may constitute a hexagonal six vertex, can be used as a three-phase inverter with various state output voltage. Direct torque is according to the flux and the torque requirements, from 8 voltage space vector a selection of optimal control vector, make the motor running in a particular state.

#### E: Asynchronous motor magnetic chain model

In direct torque control system, according to different combinations, we can get different flux estimation method, model of the  $u-i$  and  $i-n$  are adopted. The stator flux linkage of asynchronous motor stator can be used to determine by the stator voltage and current.

$$\Psi_{s\alpha} = \int (u_{s\alpha} - R_s i_{s\alpha}) dt$$

$$\Psi_{s\beta} = \int (u_{s\beta} - R_s i_{s\beta}) dt$$

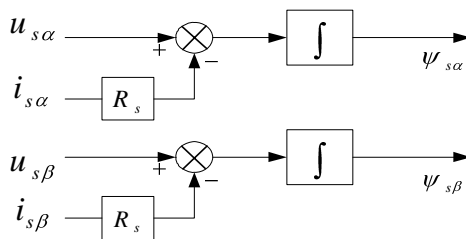


Figure 3. Stator flux voltage model

$i-n$  Model and say current flux model, with stator current calculation magnetic chain, its computation formula is as type, structure shown Figure 4.

$$\begin{cases} \dot{\Psi}_{r\alpha} = \frac{L_m}{\tau_r} i_{r\alpha} - \omega \Psi_{r\beta} - \frac{1}{\tau_r} \Psi_{r\alpha} \\ \dot{\Psi}_{r\beta} = \frac{L_m}{\tau_r} i_{r\beta} + \omega \Psi_{r\alpha} - \frac{1}{\tau_r} \Psi_{r\beta} \\ \Psi_{s\alpha} = \frac{L_m}{L_r} \Psi_{r\alpha} + \sigma L_s i_{s\alpha} \\ \Psi_{s\beta} = \frac{L_m}{L_r} \Psi_{r\beta} + \sigma L_s i_{s\beta} \end{cases}$$

where  $\tau_r = \frac{L_r}{R_r}$   $L_\sigma = (L_r L_s - L_m^2) / L_m$

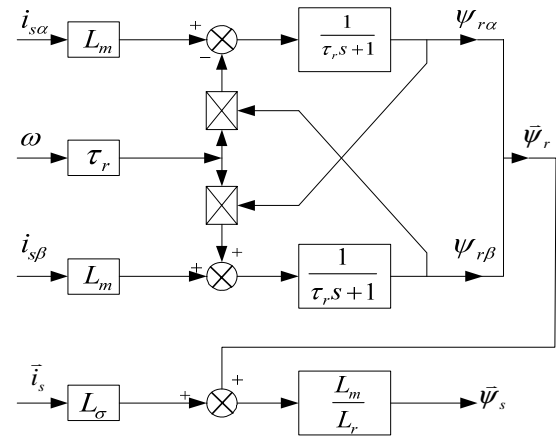


Figure 4. current model of the stator flux linkage

The current model in low-speed than voltage model by motor parameters accurately, but the influence of rotor time constant, especially in high speed, as voltage model is accurate.

#### F: Simulink figure of direct torque direct torque control system

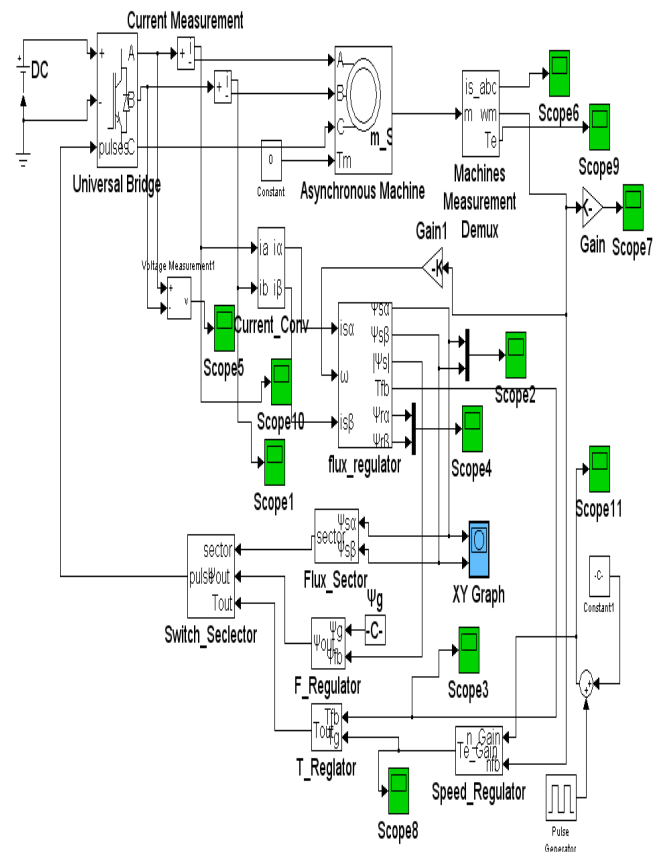


Figure 5. System simulation diagram

### III. IMPROVED GENETIC ALGORITHM FOR PID MODULATOR'S DIRECT TORQUE CONTROL

Improved genetic algorithm for PID modulator's direct torque control system diagram is shown in following figure6.

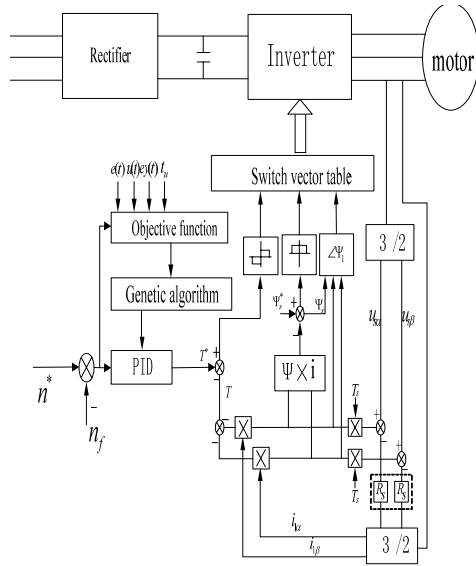


Figure 6. Improved genetic algorithm diagram for PID modulator's direct torque control system

Improved genetic algorithm PID is used in the speed regulator[7]. According to the demand which the belt conveyor is requested synchronous to electrical motor and response curve, the rising time will forecast electrical machinery's rotational speed target, and controller's output and the speed error are added the objective function of the PID speed regulator, and the improved objective function is to gain the satisfactory transient process dynamic characteristic, thus system's control performance is improved.

#### IV. INSTALLATION STEPS OF IMPROVED HEREDITY TABOO ALGORITHM TO OPTIMIZE NONLINEAR PID SPEED REGULATOR PARAMETERS

The installation steps which speed regulator parameter based on heredity taboo's nonlinear PID is as follows:

##### A. Codes

Determinating that the number of optimization variables integer is 3, and using the series binary system mapping coding method, each parameter is expressed with 10 non-mark binary code, and the individual length =3 was \*10 position. Supposes the parameter value scope

is from for  $P_{\max,j}$  to  $P_{\min,j}$ , then the actual parameter value's relations between the parameter string expression values is:

$$P_j = P_{\min,j} + \frac{(P_{\max,j} - P_{\min,j})R}{2^i - 1} = P_{\min,j} + \frac{(P_{\max,j} - P_{\min,j})R}{2^2 - 1}$$

In the formula i is the parameter number. In this paper regulator's parameter number is 3, the value scope of  $k_p$  is [0, 20], and the value scope of  $k_i$  and  $k_d$  are [0, 1].

##### B. Adaptive Function

To obtain the satisfactory dynamic characteristics, the erroneous absolute value time integral performance is used as the smallest item of the sign function. In order to

prevent the control output being oversize, a square item is added in the objective function of the control input. Selecting the equation below to take the parameter selection the most superior target:

$$J = \int_0^\infty w_1 |e(t)| + w_2 u^2(t) dt + w_3 \cdot t_u$$

where  $e(t)$  is the system error, and  $u(t)$  is outputs of the controller, and  $t_u$  is the rising time,

and  $w_1, w_2, w_3$  is the weight.

In order to avoid the over-shoot, the penalty function has been used, that means it has the over-shoot and over-shoot most superior target's one item, this time the most superior target is:

if

$$e(t) < 0$$

$$J = \int_0^\infty (w_1 |e(t)| + w_2 u^2(t) + w_4 |ey(t)|) dt + w_3 \cdot t_u$$

where  $w_4$  is a weight, and  $w_4 \gg w_1$ ,

$ey(t) = e(t) - e(t-1)$ . Taking  $w_1 = 0.999$ ,

$$w_2 = 0.011, w_3 = 1.96, w_4 = 148.$$

##### C. Population Size

When using genetic algorithm, what needed to solve firstly is to determine the population size. If the size can not guarantee the population individual variety and the optimization space is small, the convergence comes ahead of the time. Otherwise, if it is too big, then the computation burden is increased and the genetic algorithm efficiency is decreased[8]. The choice of the large number of initial population may produce more solutions simultaneously in general, and it is easy to find the globally optimal solution. But its shortcoming is the time-increasing for the each iteration[9]. Generally the population size takes the twice of the code length, namely  $n=2 \times l=60$ .

##### D. Overlapping Operator

The choice of overlapping operator  $P_c$  can affect the behavior and performance of the genetic algorithm.  $P_c$  changes automatically along with the sufficiency[10].  $P_c$  is calculated according to the equation below.

$$P_c = \begin{cases} P_{c1} \frac{(p_{c1} - p_{c2})(f' - f_{avg})}{f_{\max} - f_{avg}} & f' \geq f_{avg} \\ P_{c1} & f' < f_{avg} \end{cases}$$

where the value scope is  $P_{c1}=0.9, P_{c2}=0.6$ ;  $f_{\max}$  is the biggest sufficiency in community;  $f_{avg}$  is the average sufficiency in each generation of community;  $f'$  is the bigger sufficiency of the 2 overlapping individuals;  $f$  is the variant individual sufficiency.

##### E. Taboo Variation Operator

$$p_m = \begin{cases} p_{m1} - \frac{(p_{m1} - p_{m2})(f_{\max} - f)}{f_{\max} - f_{\text{avg}}} & f \geq f_{\text{avg}} \\ p_{m1} & f' < f_{\text{avg}} \end{cases}$$

where the value scope is  $p_{m1} = 0.1$ ,  $p_{m2} = 0.001$ .

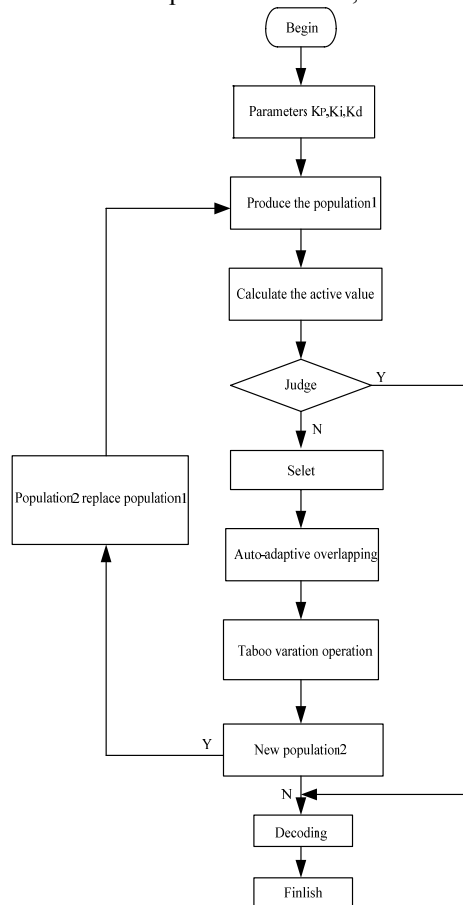


Figure 7. Improved Genetic Algorithm Flow Chart

## V. MATLAB SIMULATION RESULT

Giving an improved genetic algorithm, the population size is 60 ; the chromosome length is 30; the number of evolution generation is 80; the auto-adapted overlapping probability is respectively:  $P_{c1} = 0.9$ ,  $P_{c2} = 0.6$ ; the scope of parameter  $k_p$  is  $[0, 20]$ , the value scopes of  $k_i$  and  $k_d$ 's are  $[0, 1]$ . After 100 generation of evolutions, the optimized parameter are obtained  $k_p = 19.5156$ ,  $k_i = 0.2463$ ,  $k_d = 0.0$ .

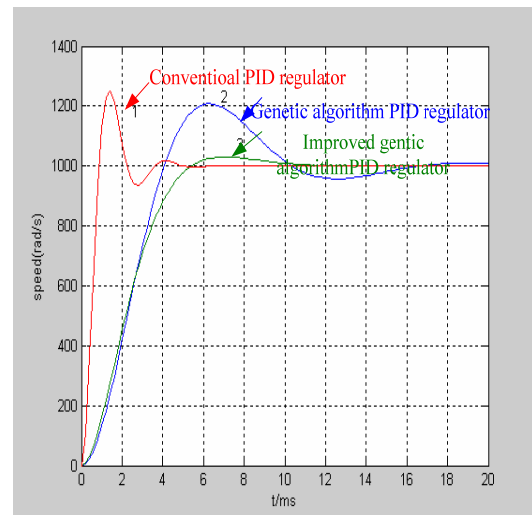


Figure 8. Simulation Wave of Speed Response

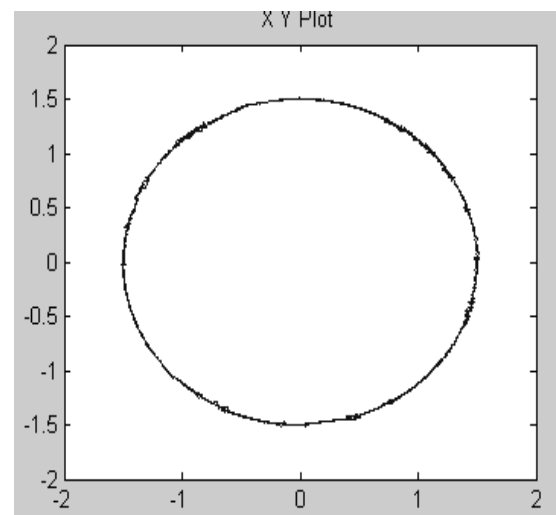


Figure 9. DTC movement Flux Linkage Circle Diagram

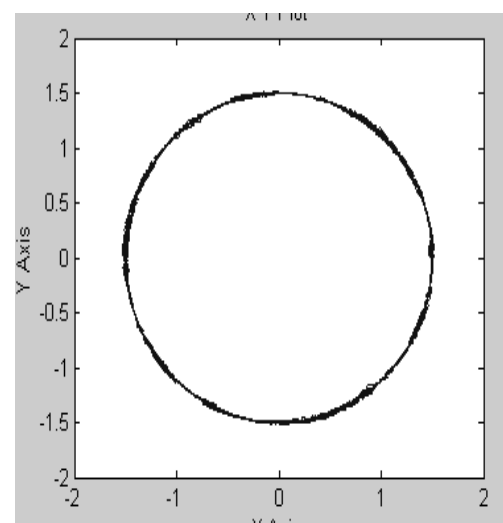


Figure10. GATS DTC Movement Flux Linkage Circle Diagram

According to Figure 9 And Figure10 the improved genetic algorithm is used in the direct torque control

movement, then flux linkage circle diagram of the direct torque control is more closer circle than the tradition flux linkage circle diagram.

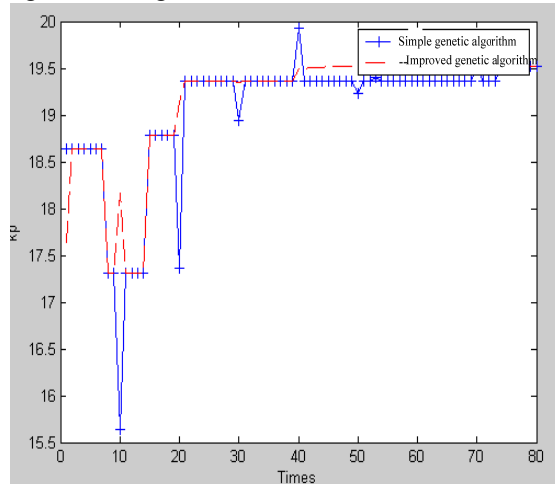


Figure 11. Two kinds of kp conditioning that inherit algorithm

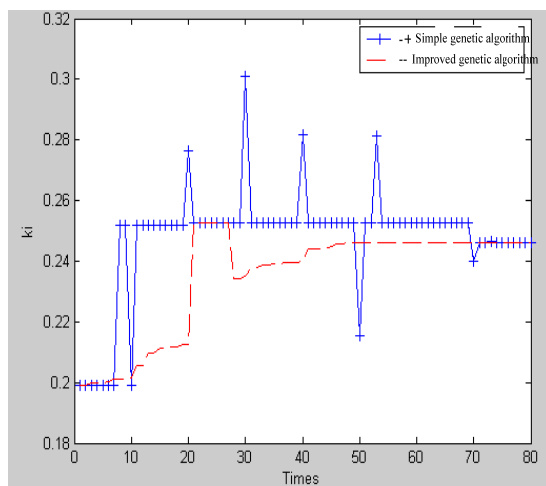


Figure 12. Two kinds of ki conditioning that inherit algorithm

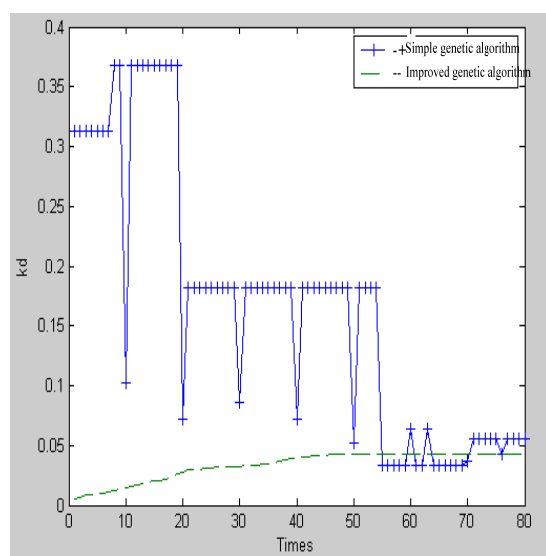


Figure 13. Two kinds of kd conditioning that inherit algorithm

From the figure 8, we can draw a conclusion that rise time of curve 1 is the quickest, but the super - adjusts quantity of curve 1 is maximum, there is about 30%. Rise time of curve 2 and 3 is not change, but super - adjusts quantity of curve 2 is high than curve 3. the super - adjusts quantity of curve 3 is about 5%.

From the figure 11, figure 12 and figure 13, we can draw a conclusion that Convergence velocity is quicker of Improved genetic algorithm than simple genetic algorithm, And optimal values is earlier looked. optimal value have already looked for at 50 in improved genetic algorithm.

TABLE 2  
VELOCITY COMPARATION OF TWO KINDS OF HEREDITY ALGORITHMS

Evolve generation	Simple genetic algorithm			Improved genetic algorithm		
	kp	ki	kd	kp	ki	kd
10	15.6367	0.1991	0.1023	18.1658	0.2013	0.0141
20	17.8589	0.2763	0.0721	19.1425	0.2125	0.0274
30	18.9471	0.3011	0.0863	19.3524	0.2349	0.0325
40	19.9331	0.2816	0.0725	19.4995	0.2400	0.0396
50	19.2368	0.2153	0.0519	19.5156	0.2463	0.0427
63	19.3994	0.2813	0.0635	19.5156	0.2463	0.0427
70	19.5086	0.2398	0.0867	19.5156	0.2463	0.0427
76	19.5156	0.2463	0.0427	19.5156	0.2463	0.0427

From the table 2, We can discover that Convergence velocity is quicker of Improved genetic algorithm than simple heredity algorithm.

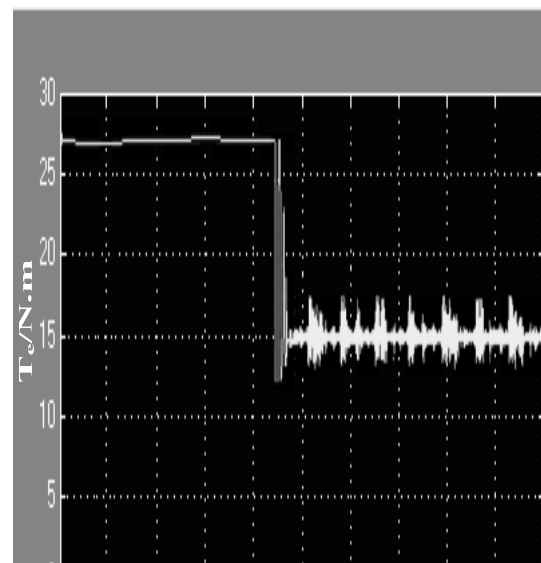


Figure 14. The torque waveform with 5 s in start

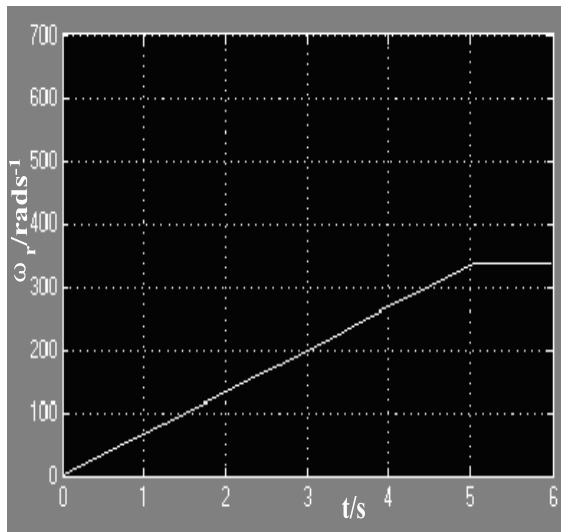


Figure 15. Revolving speed waveform of with 5 s in start

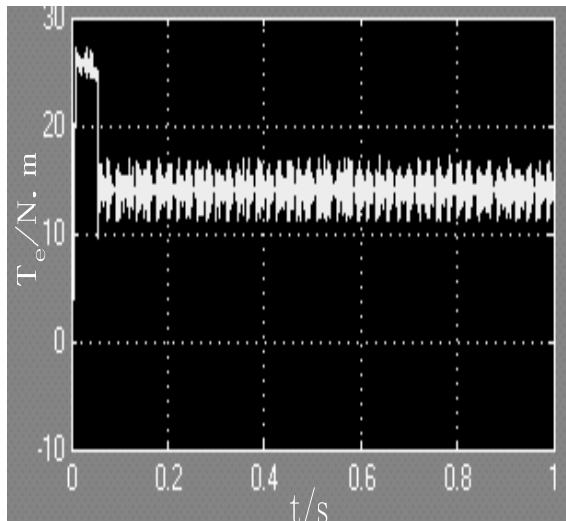


Figure 16 . The torque watches waveform with 0.5s in start

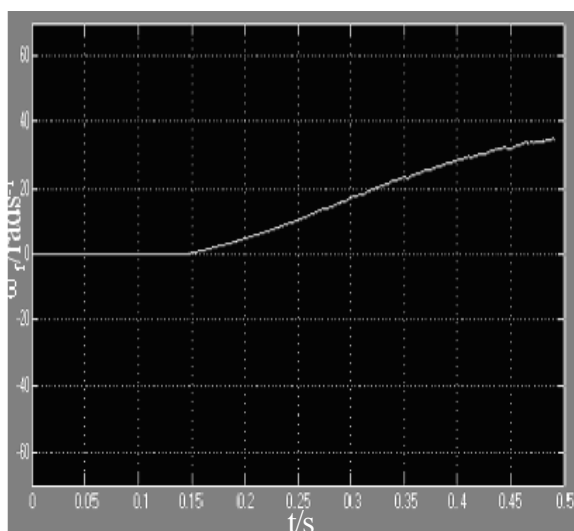


Figure 17. Revolving speed watched waveform with 0.5s in start

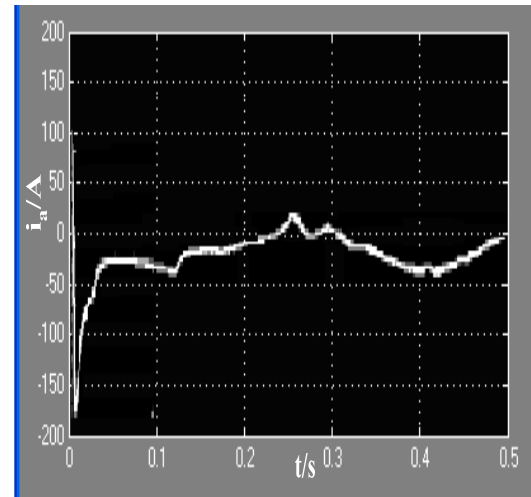


Figure 18. current waveform with 0.5 s in start

From the figure 14 and figure 15, we can draw a conclusion that the torque pulsation is smaller with 6 s in start, and the revolving speed waveform is steady to up. From the figure 18, the current impact takes place at 40ms, Its maximum value is 5 times that of steady - state current. From the figure 15, figure 16 and figure 17, we can draw a conclusion that torque response is very quick to start, it hit the biggest amplitude limiting torque value at start cutty time, When the revolving speed starts uping, Start torque holds stabilization, Hard acceleration is happened to the belt conveyor. After the start had ended, the electromagnetism torque and the load torque maintain balanced, the belt conveyor enters to the stable state run phase.

## VI. CONCLUSION

This paper applies the PID the speed regulator with an improved genetic algorithm to in the belt type conveyor direct torque control system in mineral production. It solved the problem of electrical motor synchronization and gentle acceleration by adjusting and the improving objective function. The simulation result indicated that the direct torque control is applied in the belt type conveyor electric drive system in the mineral production and it can solve problem of the leather belt wander and even the leather belt splitting[11]. Simultaneously the starting control of the belt conveyor becomes succinct and the starting torque responds is quicker.

## REFERENCE

- [1] Randall S.Sexton, Bahram Alidaee, Robert E.Dorsey, and John D.Johnso Global. Optimization for Artificial Neural Networks: A Tabu Application, European Journal of Operational Research, 1998, 106, pp: 570~584
- [2] Sexton R S, Alidaee B, Dorsey R E etc. Global optimization for artificial neural networks: A tabusearch application[J], European Journal Operational Research, 1998.106: 570~584.
- [3] Glover F., Tabu Search: part I, ORSA Journal on Computing, 1989, 1: 190~206.
- [4] Glover F., Tabu Search: part II, ORSA Journal on Computing, 1990, 2: 4~32.

- [5] Glover F. and Laguna M. Tabu Search. Boston, Kluwer Academic Publishers, 1997
- [6] Faigle U., and Kem W., Some convergence results for probabilistic tabu search. ORSA J on Computing, 1992, 4(1): 32~37
- [7] Glover F. and Hanafi S. Tabu search and finite convergence, Discrete Applied Mathematics, 119 (2002): 3~36.
- [8] Glover F. and Kochenberger G., Adaptive Memory Tabu Search for Binary Quadratic Programs, Management Science, 1998.44(3): 336~345.
- [9] Huang Yuqiang. Asynchronous machine direct torque control system. Northwestern Polytechnical University. 2005.3
- [10] Ceng Yu Jin. High-performance ac servo system and its hybrid control strategy research. [Ph.D. Thesis], Zhejiang university, 2004.6
- [11] Ko long, zhang shiying, Taboo - hierarchical genetic algorithms. Control and decision making. 2001, vol.16, No.4, 484~483.