# **Model Predictive Optimization Control Strategy for Three-level AFE Converter**

# **Xiaoyan Shi\*, Longji Zhu, Shuijuan Yu**

Department of automation, Collgege of Electrical and Information Engineering, Anhui University of Science and Technology, Huainan 232001, Anhui, China \*Corresponding author, e-mail: shixiaoyan1980@163.com

# *Abstract*

*In view of the fact of traditional MPC prediction for three-level AFE converter with numerous switching vectors, time-cost computation and complex control, a simplified model predictive control algorithm is proposed in this paper. The multiple current prediction is transformed into a single virtual reference voltage vector prediction according to the inverse procedure of the model current prediction, and vector distribution method is adopted which can screens out the optimal vector. In the process of rolling optimization, multi-objective control is carried out by adding neutral point potential balance and reducing switching losses and other constraints to the cost function. Also the control delay of the algorithm is compensated. Finally, simulation experiments of three-level AFE converter under steady-state and dynamic conditions are provided. The results have verified correctness and practicability of the strategy.* 

*Keywords: Three-level AFE converter, Model predictive control, Virtual reference voltage, Vector sector*

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## **1. Introduction**

With the advantages of low voltage harmonic, high power factor and bidirectional energy flow, multi-level active front end (AFE) converter has been widely used in active power filter, reactive power compensation, and new energy grid generation and so on [1]. The control targets of the multi-level converter are not only to adjust the current of the AC side rapidly, suppress the harmonics, and adjust power factor, but also the problems of neutral point potential fluctuation and power device loss should be considered. For above purposes, domestic and foreign scholars have conducted in-depth research on its control strategy, which mainly include voltage oriented control (VOC) and direct power control (DPC) [2]. However, due to the time-variability and nonlinearity, it is difficult to achieve the best control effect. In recent years, with the rapid development of digital processors, some complex and new control strategies, such as adaptive control, sliding mode control, fuzzy control, predictive control etc, are well implemented [7, 8].

For easy to understand, flexible control, good dynamic performance and strong robustness, finite control set model predictive control (FCS-MPC) has been widely used in power electronics and power transmission applications, and also it can be easily and effectively integrated into a variety of constraints which can achieve multi-objectives optimization control [3]. Different from the traditional linear control strategy, FCS-MPC algorithm is based on accurate mathematical model of object system to predict the future state. At the same time, with taking into multi-control objectives, the optimal switching state can be determined by the cost function for global rolling optimization. However, numerous switching vectors, time-cost computation and complex cost functions which limit the application of FCS-MPC. In [13] a simplified model predictive algorithm is presented which can effectively reduce the operation time and improve the efficiency. But part of the control performance is affected. In [9] a satisfactory predictive control strategy is used to realize the multiple target satisfaction control among the NPC three-evel rectifier, neutral point potential balance, current tracking and low switching frequency operation through fuzzy decision. In [12] multiple virtual voltage vectors are constructed that borrowed from discrete voltage space vector modulation (DSVM) idea. Although the effect of tracking control is improved obviously, but the number of MPC rolling optimization is increased, which has brought a very serious challenge to the actual digital system implementation [4-6].

 $\overline{a}$ 

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To simplify the prediction process and reduce the computation time, the paper discusses the voltage prediction control model of the neutral point clamped (NPC) AFE converter based on FCS-MPC. First, according to the inverse procedure of the model current prediction the single virtual reference voltage vector is obtained. Then the cost function of the output voltage is expressed by the equivalent transformation and some constraint conditions are introduced to the cost function to realize multi-object control. Finally, the optimal switching state is determined and taken as the output of the controller. For the control delay of algorithm, the compensation scheme is also presented. In order to verify the correctness and feasibility of the algorithm, the three-level AFE converter simulation experimental platform is built based on Matlab/simulink. The results indicate that the proposed strategy has a good static and dynamic performance.

# **2. Traditional Current Model Predictive Control of Three-level AFE Converter**

For improving the voltage level, reducing the volume of the whole system effectively, suppressing the harmonic pollution, the NPC multi-level AFE converter can meet the development requirements of smart grid in the future. The traditional model predictive control strategy used discrete mathematics model to calculate current predictive value under the different states of the switch and make the switch condition selected through cost function when the current predictive value and the command current value is closest [10, 11]. Therefore, a key part of the model predictive control strategy is to establish discrete mathematics model of the system and evaluate the switch state control behavior by the cost function.

# **2.1. Mathematics Model of Three-level AFE Converter**

The NPC three-level AFE converter topology structure is shown in Figure 1.



Figure 1. The three-level AFE converter circuit topology

 $e_a, e_b, e_c$  are power grid voltage,  $i_a, i_b, i_c$  are AC side current,  $i_{dc}$  is DC side current; *L* and *R* are AC side inductance and equivalent resistance;  $C_1, C_2$  are the two capacitor capacitance value corresponding to the DC side. Assuming symmetry of the three-phase AC voltage and ignoring the asymmetry of the grid side resistance and the filter inductance, the mathematical model of three-level AFE converter in the  $\alpha\beta$  coordinate can be described as following:

$$
L\frac{di_{\alpha,\beta}}{dt} = e_{\alpha,\beta} - u_{\alpha,\beta} - Ri_{\alpha,\beta}
$$
 (1)

Where  $e_{\alpha,\beta}, i_{\alpha,\beta}, u_{\alpha,\beta}$  are the voltage, current and AC side voltage of three-level AFE converter. Assuming control system sampling period  $T<sub>s</sub>$  is small enough, Equation (1) can be approximated as following by the forward difference principle.

$$
\frac{di_{\alpha,\beta}}{dt} \approx \frac{i_{\alpha,\beta}(k+1) - i_{\alpha,\beta}(k)}{T_s} \tag{2}
$$

According to (1), (2), the discrete prediction model of the converter is obtained.

$$
i_{\alpha,\beta}(k+1) = \frac{T_s}{L} [e_{\alpha,\beta}(k) - u_{\alpha,\beta}(k)] + (1 - \frac{RT_s}{L}) i_{\alpha,\beta}(k)
$$
\n(3)

The switching function of converter circuit  $S_i$   $(j = a, b, c)$  is used to represent the four switching state of each phase. Taking a phase as an example, When  $S_{a1}$  and  $S_{a2}$  are simultaneously conducting,  $S_a = 1$ , a point to o point level is  $\frac{U_{dc}}{2}$ ; When  $S_{a2}$  and  $S_{a3}$  are simultaneously conducting,  $S_a = 0$ , a point to o point level is 0. When  $S_{a3}$  and  $S_{a4}$  are simultaneously conducting,  $S_a = -1$ , a point to o point level is  $-\frac{U_{dc}}{2}$ . There are three levels in the DC side. Therefore, the three-level AFE converter AC side has  $3^3 = 27$  kinds of voltage state combination. The AC side voltage vector  $u_{\alpha}$ ,  $u_{\alpha}$  can be get from the DC bus voltage of the threelevel AFE converter and the switching state  $S_a, S_b, S_c$ .

$$
u_{\alpha} = \frac{U_{dc}}{6} (2S_{a} - S_{b} - S_{c})
$$
  

$$
u_{\beta} = \frac{\sqrt{3}U_{dc}}{6} (S_{b} - S_{c})
$$
 (4)

#### **2.2. Determination of Cost Function**

Current model predictive control strategy by using the finiteness of power device on-off state and according to the discrete mathematical model of the controlled object predict the future value of the input current in different switching states. However, in order to ensure good control performance and enhance the reliability of the whole system, the fluctuation of neutral point potential is a problem that can not be ignored.For three-level AFE converter system, based on the prediction of the future state of the 27 switch one by one, the optimal switching state is determined by using the cost function to achieve current tracking and maintain the balance of neutral point potential. Considering the existence of midpoint potential fluctuating problem of three-level topology, the predicted value  $\Delta U_{\mu}(k+1)$  of the neutral point potential deviation at  $(k+1)T$  is expressed as following:

$$
\Delta U_{dc}(k+1) = \frac{T_s}{C} [S_a^2(k) S_b^2(k) S_c^2(k)] \begin{bmatrix} i_a(k) \\ i_b(k) \\ i_c(k) \end{bmatrix} + \Delta U_{dc}(k)
$$
\n
$$
\Delta U_{dc}(k) = \Delta U_{dc2}(k) - \Delta U_{dc1}(k)
$$
\n(5)

Nowadays the AFE converters control systems are generally based on the technique of PWM modulation. Shorten the period of the modulation algorithm would increase the output voltage of the fundamental wave content and reduce the harmonic distortion of the AC side current. However, the periodic modulation of the relationship means to increase the switching frequency of power devices, which will directly affect the efficiency and temperature of converter. Therefore, that is needed to weigh main control objectives and switching frequency. So the cost function determination contains multiple factors.

$$
J = \lambda_1 \left| i_{\alpha,\beta}^*(k+1) - i_{\alpha,\beta}(k+1) \right|^2 + \lambda_2 \left| \Delta U_{dc}(k+1) \right| + \lambda_3 \left| f_s(k+1) \right| \tag{6}
$$

Given current value  $i^*_{\alpha,\beta}(k+1)$  can be obtained by two order trend extrapolation.

$$
i_{\alpha,\beta}^*(k+1) = 3i_{\alpha,\beta}^*(k) - 3i_{\alpha,\beta}^*(k-1) + i_{\alpha,\beta}^*(k-2)
$$
\n(7)

 $f<sub>s</sub>(k+1)$  is the average number of circuit switches at the  $(k+1)T$ . The switching loss is relevant to switching voltage and current. It is not a simple linear relationship with switching frequency. In general, the average switching frequency is smaller, lower switching losses, so algorithm selection average switching frequency is used as one of the optimization index.

$$
f_s(k+1) = \sum_{a,b,c} \left| \frac{S_i(k+1) - S_i(k)}{12} \right| \tag{8}
$$

In the cost funtion  $\lambda_1, \lambda_2, \lambda_3$  denote respectively current error, the midpoint unbalance voltage and average switching frequency weights. By weighting coefficients to adjust the value of the function can flexibly and conveniently optimize the overall performance of the AFE converter, which it is very difficult for the conventional control methods to do this.

## **3. Three-level AFE Converter Voltage Predictive Control**

Model predictive control algorithm loops once in each control cycle. The running time of the algorithm should be short enough to obtain a higher sampling frequency, so the complexity of the algorithm needs to be reduced. In order to select the optimal switching state from the 27 switching states and make the current value of the future  $i_{r,q}(k+1)$  as close as possible to the current reference value  $i_{\alpha,\beta}^*(k)$ , a simplified predictive control algorithm is proposed by inverse thinking. According to the mathematical model of the AFE converter, assumpting the existence of voltage vector  $u^*_{\alpha,\beta}(k)$  which can make  $i_{\alpha,\beta}(k)$  equal to  $i^*_{\alpha,\beta}(k)$ , then  $u^*_{\alpha,\beta}(k)$  is calculated by Equation (9).

$$
u_{\alpha,\beta}^{*}(k) = e_{\alpha,\beta}(k) - Ri_{\alpha,\beta}(k) - L \frac{i_{\alpha,\beta}^{*}(k) - i_{\alpha,\beta}(k)}{T_{L}}
$$
\n(9)

Where  $u_{\alpha,\beta}^*(k)$  is called 'virtual reference voltage vector'. For the FCS-MPC algorithm, only outputing a voltage vector each control period, the nearest voltage vector to  $u_{\alpha,\beta}^*(k)$  is optimal voltage vector  $u_{\text{OPT}}$ . The final cost function *J* is selected as following:

$$
J = \lambda_1 \left| u_{\alpha,\beta}^*(k+1) - u_{\alpha,\beta}(k+1) \right|^2 + \lambda_2 \left| \Delta U_{dc}(k+1) \right| + \lambda_3 \left| f_s(k+1) \right| \tag{10}
$$

In the presented algorithm, the 26 times current prediction process is simplified as a single virtual reference voltage vector prediction, then the calculation is greatly reduced. Based on the FCS-MPC single prediction method, using the vector distribution method can determine the optimal switching state. The space voltage vectors of all the switching states of the threelevel AFE converter are shown in Figure 2. The three-phase bridge arm switch state '1', '0' and '- 1' respectively are expressed by the symbol '+', '0', '-'. The three level space vectors are divided into 6 large sectors, which the switch state of each vector is adjacent.

For example, when  $u_{\alpha,\beta}^*(k)$  in the third sector III, compared to other voltage vectors,  $u_0, u_1, u_2, u_5, u_6, u_{16}, u_{17}, u_{18}$  are more close to  $u_{\alpha,\beta}^*(k)$ , then the current constraints are relatively small. In order to compare the value of the neutral point potential of each voltage vector, a voltage vector is taken as the reference vector and compared to the sectors which have the same midpoint potential constraint value. If the vector in the current constraint value is greater than the reference vector, then these vectors would be excluded from the scope of the candidate vector. Candidate vectors corresponding to each sector are list on Table 1. With the decrease of the candidate vectors, the hexagon shadow region is formed a candidate vector region. In sector III, if  $\Delta U_{\mu}(k) i_{\mu}(k) < 0$ ,  $\Delta U_{\mu}(k) i_{\mu}(k) > 0$ ,  $\Delta U_{\mu}(k) i_{\mu}(k) < 0$ , the number of candidate vectors is reduced to 7.





Figure 2. Voltage vectors distribution

Table 1. Selection of candidate vectors for each sector

Sector			Ш	IV	V	VI
$\Delta U_{dc}(k)i_{a}(k) < 0$	$u_{3}$	$u_{\rm o}$	$u_{\lambda}$	$u_{\rm o}$	$u_{3}$	$u_{\rm o}$
$\Delta U_{\mu}(k) i_{a}(k) > 0$	$u_{\rm A}$	$u_{10}$	$u_4$	$u_{10}$	$u_4$	$u_{10}$
$\Delta U_{dc}(k)i_h(k) < 0$	$u_{13}$	$u_{\tau}$	$u_{\tau}$	$u_{13}$	$u_{13}$	$u_{\tau}$
$\Delta U_{dc}(k)i_h(k) > 0$	$u_{14}$	$u_{\rm s}$	$u_{\rm s}$	$u_{14}$	$u_{14}$	$u_{8}$
$\Delta U_{dc}(k)i_{c}(k) < 0$	$u_{\varsigma}$	$u_{\zeta}$	$u_{\zeta}$	$u_{11}$	$u_{11}$	$u_{11}$
$\Delta U_{dc}(k)i_{c}(k) > 0$	$u_{\epsilon}$	$u_{\kappa}$	$u_{\kappa}$	$u_{12}$	$u_{12}$	$u_{12}$



Figure 3. The flow chart of FCS-MPC algorithm

Searching the discrete voltage vector near  $u_{\text{opt}}$  can determine the final MPC system optimal switching state. The flow chart of FCS-MPC algorithm is shown in Figure 3.  $\hat{i}$  is defined as the loop variable,  $J_{op}$  is the value of the optimal cost function.  $S(i_{op})$  is output optimal switching signal. The algorithm is put in the timing interrupt routines. When the timer interrupt is triggered, the switching signals for the first cycle begin to affect the actual hardware circuit, and voltage and current sampling start up.

Before the rolling optimization the optimal voltage vector  $u_{\rho p\tau}$  of the system is obtained by the Equation (9). The determined discrete voltage vector is put in  $S[N]$ . *N* is the number of FCS-MPC rolling optimization. Taking into account voltage space vector distribution characteristics of the three-level topology, the value of *N* can be 4, 5, and 7. Then rolling optimization only needs to be carried out 7 times, which greatly enhance the system online searching efficiency.

# **4. Control Delay and Compensation Scheme**

Ideally, AD sampling, algorithm calculation, control signal action of MPC control system should be completed at the same time. But actual digital processing system has consumed certain program execution time, so the control signal is bound to delay a period of time after output. In the design process of the AFE converter controller, control delay effect is an issue that should not be ignored.



Figure 4(a), (b) illustrate the current prediction process for the ideal situation and the actual situation based on MPC. The control delay compensation strategy operates as shown in Figure 4(c). The grid side current  $i_{n,k}(k+1)$  is predicted from Equation (4). Then the current is used as the starting current of the system, and the model prediction process is projected forward.

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$$
i_{\alpha,\beta}^*(k+2) = (1 - \frac{RT_s}{L})i_{\alpha,\beta}^*(k+1) + \frac{T_s}{L}[e_{\alpha,\beta}(k+1) - u_{\alpha,\beta}(k+1)]
$$
\n(11)

The treatment of neutral point potential is consistent with the grid side current. According to the Equation (7) the midpoint potential  $\Delta u_x (k+2)T$  is obtained.

$$
\Delta U_{dc}(k+2) = \frac{T_s}{C} \left[S_a^2(k) S_b^2(k) S_c^2(k)\right] \begin{bmatrix} i_a(k) \\ i_b(k) \\ i_c(k) \end{bmatrix} + \Delta U_{dc}(k+1)
$$
\n(12)

The optimal switching state of the rolling optimization moment is determined by the state of the  $(k+2)T$ , and is kept to the  $(k+1)T$ . In essence the delay compensation belongs to multi-step prediction. Based on discrete predict model of system in a sampling period  $T_s$ , multistep prediction are carried out to compensate and correct the influence of the control delay caused by the optimal switching state.

To sum up, the structure of the control system based on FCS-MPC algorithm is shown in Figure 5. The DC bus voltage is adjusted by the PI controller, and the current reference value is generated. According to the model predictive control theory, the voltage  $u_{a}(\kappa)$  is predicted which is needed to track the reference current in the  $\alpha\beta$  coordinate. Then optimal voltage vector is taken as the output of the controller determined by the sector of the voltage  $u_{\alpha,\beta}(k)$ location.



Figure 5. The structure of the control system based on FCS-MPC

### **5. Simulation and Analysis**

In order to verify the correctness of the proposed FCS-MPC control algorithm, Simulation study of control system in Figure 5 is presented based on Matlab/Simulink. System simulation parameters are listed in Table 2.



Figure 6 and Figure 7 are the steady-state current simulation waveform and a phase current spectrum analysis respectively of three-level AFE converter based on the FCS-MPC.

i/A







The result in Figure 6 indicates input current of the system is stable. Waveform is almost sinusoidal and the unit power factor can be realized. The current spectrum analysis shows that the total harmonic content of A phase current is 2.96% in Figure 7. The current harmonic content is lower, and the control effect is good.

To further analysis the validity of the FCS-MPC proposed in this paper, dynamic current changed process is conducted. When reference current value is rised from 10 A to 12A at 0.03s, the output current are demonstrated in Figure 8(a). Reference current value is decreased from 10 A to 8A in Figure 8(b). The current step time is about 0.2ms. Then it can be found that the response speed is relatively fast.



Figure 8. Dynamic simulation results with reference current changed

The sampling period  $T<sub>s</sub>$  is 100 $\mu s$ , AD sampling time of digital processing system is about  $5\mu s$ , predictive control rolling optimization time is about  $40\mu s$ , the total control delay is about  $t_a = 45 \mu s$ . Considering the large proportion of  $t_a$  in sampling period  $T_s$ , the delay compensation strategy is needed to overcome the problem that the AD sampling point is not matched with the switching state action time. In Figure 9 the steady-state waveform with and without control delay compensation are illustrated. As finding in the figure, the output current ripple is smaller with time delay compensation of MPC system under the same sampling frequency and given current situation, whch has more excellent current tracking accuracy.



Figure 9. Simulation results for FCS-MPC without and with delay compensation

#### **6. Conclusion**

As an advanced converter control technology, FCS-MPC control strategy is applied to the control of three-level AFE converter in this paper. For the problems existing in the traditional model current prediction, a simplified model voltage prediction control algorithm is proposed. The virtual voltage prediction and voltage vector division method is introduced to select the optimal voltage vector. It has overcomed effectively the defects of low efficiency of traditional MPC algorithm. Finally, the simulation results show that the proposed strategy have a good static and dynamic performance, which has provided a simplified method for the design of multilevel converter MPC system.

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