



Improved Predictive Power Control Algorithms to Increase CDMA System Capacity

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Abstract. In this paper capacity of CDMA system is evaluated using an improved algorithm of channel prediction-based power control in Rayleigh fading channel environments. One of the most serious problems which degrades the performance of power control algorithm is the effect of feedback delay. To overcome the effect of feedback delay, power control algorithm relies on channel prediction techniques, which utilize the correlation property of the past channel measurements. In CDMA power control, however, the correlation property of channel measurements is destroyed because the transmit power is continuously updated for each power control interval. In order to restore the correlation property of the channel, the past channel measurements are compensated for by the same factors that were given by power updating for each power control interval. The prediction algorithm in this paper is proposed using the least mean square (LMS) technique. The result shows that the capacity of CDMA systems increase significantly when the improved predictive algorithm is used. Numerical evaluation shows that CDMA capacity increases by more than 40 % for fixed step algorithm and more than 50 % for variable step algorithm when the proposed algorithm is employed.

Keywords: *CDMA; least mean square; power control; prediction; Rayleigh fading.*

1 Introduction

Direct Sequence Code Division Multiple Access (DS-CDMA) system requires a tight power control in order to overcome the near-far problem and to mitigate the effect of multiple access interference among CDMA users in cellular and mobile channel environments. Although the near-far problem can be solved by an open loop power control algorithm, the effect of multiple access interference due to multipath fading requires a closed-loop algorithm when the uplink and downlink frequencies are not the same in a frequency duplexing (FDD) scheme [1]. Fading channel significantly degrades the performance of CDMA systems because communication over fading channels requires higher power levels, and thus producing higher unwanted multiple access interference among CDMA users.

CDMA power control is more important on the uplink direction compared to that on the downlink because uplink signals consist of all users from different locations (different path losses), while the downlink signals originate from the same base station and arrive at mobile stations with the same power level. Our previous study [2] shows that practical power control is imperfect in that it is affected by many factors; such as power updating rates and step size, channel estimation error, feedback transmission error, and feedback delay. This paper also shows that the effect of feedback delay on the performance of power control is the most serious. Therefore, prediction-based algorithms are employed to eliminate the effect of feedback delay. In a prediction-based algorithm, the channel state is predicted either through the measurement of signal strength or the signal-to-interference ratio (SIR) as the control parameter for power control algorithms.

Prediction algorithms utilize the correlation property of the past input samples or past measurements in order to predict the future channel conditions. In CDMA power control, however, the correlation property of the channel measurement is destroyed by power control updating, because the received signal strength or the SIR is continuously updated for each power control interval. Therefore, the conventional prediction-based algorithms may not work satisfactorily. In this paper the author proposes an improved prediction-based power control algorithm in that the past input samples to the predictor are compensated for by the same factors that were given by power updating for each power control interval in order to restore the correlation property of the channel.

The rest of the paper is organized as follows. Section 2 presents the closed loop power control algorithm in CDMA systems and explains the feedback delay problem. This section also briefly describes prediction filtering techniques. Section 3 proposes an improved prediction technique for CDMA predictive closed loop power control algorithms. The computer simulation of the proposed algorithm and the results which show the improved capacity of CDMA systems using the proposed technique are discussed and shown in Section 4. Finally, Section 5 draws the conclusion.

2 CDMA Predictive Power Control

2.1 Power Control Algorithm

CDMA systems exhibit different channel characteristics between the communication link from base station to mobile station (downlink) and the link from mobile station to base station (uplink). In the downlink, the spread signals for all users are transmitted synchronously by the base station because they

originate from the same location (base station). These signals will go into the same multipath fading channel, experience the same propagation path loss, and fade simultaneously.

In the uplink, signals from different mobile users are subject to different propagation mechanisms, resulting in different propagation path losses and independent fading that lead to unequal received power levels at the base station. When non-orthogonal spreading sequence of unequal received power levels arrive at the base station, multiple access interference becomes a serious problem [3].

At the base station, the user recovers the transmitted symbol by correlating the received signal with the user spreading sequence. Due to non-zero cross correlation between spreading sequences of different users, the user will observe multiple access interference from the other users. If the received power levels at the base station are not equal, the correlating receiver may not be able to detect the weak user's signal due to high interference from other users with higher power levels. Clearly, if a user is received with a weak power, it will suffer from the interference generated by stronger users' signals. Therefore power control in the uplink is indispensable to keep the interference acceptable to all users and to obtain a considerable channel-capacity [4]. In this paper power control is considered for the uplink CDMA channel based on SIR measurement as shown in Figure 1.

For uplink power control, the mechanism of predictive power control algorithm proceeds as follows. First, the SIR for each user, $\gamma(i)$ is measured at the base station for the i th time slot. Due to the feedback delay introduced in the power control loop, the SIR for the i th time slot needs to be predicted D step ahead, where D is the total feedback delay introduced in the loop. Here the feedback loop delay is introduced in the power control algorithm due to measurement time, processing and propagation time of the command bits [5]. Therefore in Figure 1, $\gamma(i)$ is predicted using the past SIR measurements to obtain the predicted value of SIR for the i th time slot, $\gamma_{pred}(i)$. We skip at this point the mechanism of SIR predictor to obtain $\gamma_{pred}(i)$ using the past input samples because this part will be explained in more detail in a section that follow. The predicted SIR for the i th time slot $\gamma_{pred}(i)$ is then compared with the target SIR γ_t to produce the error signal $e(i)$. The error signal $e(i)$ is then quantized using a binary representation, so it can be transmitted via the downlink channel to instruct the mobile stations to increase or decrease their transmit power. The quantized form of error signal is called the power control command (PCC) bits, which can be implemented using a pulse code modulation (PCM) realization of

mode q , where q is the number of PCC bits required in each power control interval.

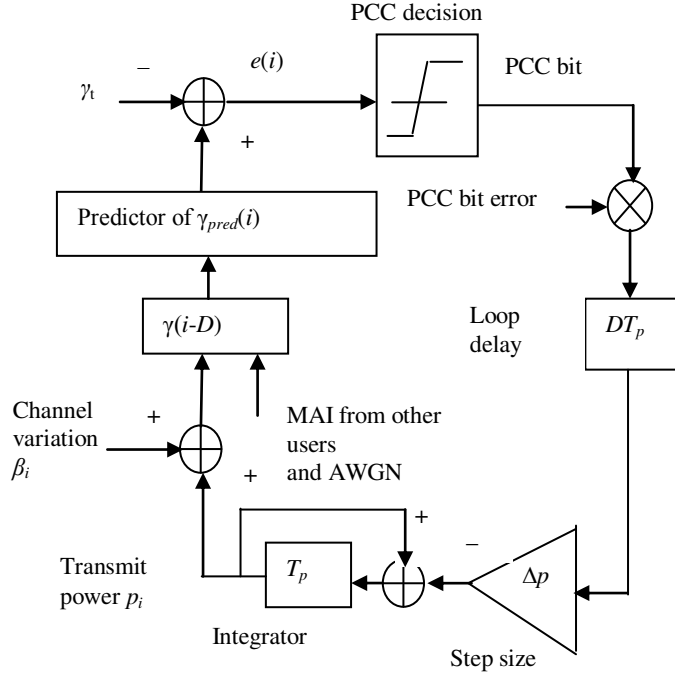


Figure 1 Predictive power control algorithm

The PCC bits for the i th time slot can be expressed as [6].

$$e(i)_q = \begin{cases} 2^{q-1} - 1, & \text{index} < -2^{q-1} + 1/2 \\ 2^{q-1} - 2, & -2^{q-1} + 1/2 \leq \text{index} < -2^{q-1} + 3/2 \\ \vdots & \vdots \\ 0, & -1/2 \leq \text{index} < 1/2 \\ \vdots & \vdots \\ -(2^{q-1} - 2), & 2^{q-1} - 3/2 \leq \text{index} < 2^{q-1} - 1/2 \\ -(2^{q-1} - 1), & \text{index} \geq 2^{q-1} - 1/2 \end{cases} \quad (1)$$

where index is the difference between the predicted SIR (γ_{pred}) and the desired SIR (γ_t).

The PCC bits are also subject to high bit error rates because they are sent in the downlink channel without using error control coding or interleaving in order to minimize the signaling bandwidth of the downlink channel. Therefore, transmission of the PCC bits on the downlink channel suffers from two major impairments: PCC bit errors and feedback delay. The PCC bits error is represented as a multiplicative disturbance on the PCC bits, while feedback delay is represented by a delay operator of DT_p , which represents a multiple integer D of power control interval T_p as shown on the right hand side of Figure 1. After the PCC bits are received by a mobile station, the mobile station computes the required power adjustment, $\Delta p \times \text{PCC}$. The step size Δp is preset at 1 or 2 dB [7], while the PCC is either $\{+1, -1\}$ in a fixed-step algorithm ($q=1$) or any integer between $-q$ and $+q$ in a variable-step algorithm.

The difference between the predicted and the desired SIR after quantization $e(i)_q$ is sent to the mobile to adjust the mobile's transmit power by Δp . $e(i)_q$ dB. Assuming the PCC bits are error free, in the absence of channel predictor, the transmit power at the next interval is

$$p(i+1) = p(i) - \Delta p \cdot e(i-D)_q. \quad (2)$$

For the fixed step algorithm ($q=1$) the PCC bit can be expressed as

$$\text{PCC bit} = \text{sign}[e(i-D)_{q=1}] = \begin{cases} +1 & e(i-D) < 0 \\ -1 & e(i-D) \geq 0 \end{cases}, \quad (3)$$

where $e(i-D)$ is the power control error at the $(i-D)$ th power control interval designating DT_p loop delay from the i th control interval.

2.2 Effect of Feedback Delay

It has been shown in [8] that the performance of power control in an actual system is limited due to non-ideal parameters of the real system, i.e. loop delay, feedback-channel error, and SIR estimation error. In this paper, feedback channel and SIR measurement are assumed to be error free, so the paper will focus on the effect of feedback delay and propose to use the improved predictor to overcome the effect of feedback delay.

Feedback delay is defined as the total time from which the channel is estimated at the receiver until the power control command is received at the transmitter and power adjustment is made. Note that in the uplink power control scheme, the channel condition is measured at the base station. Then the mobile user

adjusts its transmit power according to the power-control command received from the base station to compensate for the channel. Due to the feedback delay, this power adjustment may no longer correspond to the channel condition when measurements were taken because the channel condition can change rapidly, particularly when Doppler frequency increases. Therefore, the power adjustment at the mobile user is outdated and does not compensate for the current channel condition.

The following processes contribute to the loop delay in a SIR-based power control. First, the SIR measurement is performed. It contributes a measurement delay, which is done during a period of one time slot. After the measurement of SIR is completed and then compared with the target SIR to produce the power control command bit, the command bit is inserted into the downlink data stream but may not be transmitted immediately because the downlink and uplink transmissions are not synchronized in an FDD system. This may contribute to another delay. The other delays are the propagation time of the command bit between the base station and mobile station and the corresponding processing time. Therefore, the total delay depends on SIR measurement time, synchronization between uplink and downlink transmission, processing time, and the propagation delay of the command bits transmission. Since the power control interval is standardized, the feedback delay can be expressed in multiples, D , of power control interval, T_p . A feedback delay of $D = 2T_p$ or $D = 3T_p$ is usually assumed to model a real system. Figure 2 illustrates the condition of a real system from which the feedback delay can be determined.

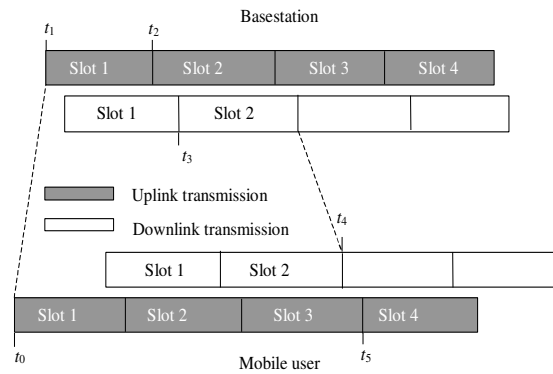


Figure 2 Illustration of feedback delay on uplink power control algorithm

Consider that a mobile begins transmitting data in the time slot 1 at time t_0 . This time slot (slot 1) will arrive at the base station at time t_1 , which takes $(t_1 - t_0)$ for this slot to propagate in the uplink. Then the base station estimates the SIR using data in the slot 1 of uplink transmission. The SIR measurement is

completed at time t_2 . In this case, SIR measurement is performed over one time slot duration. At this time, the base station compares the estimated SIR with the target SIR to produce the command bit.

As we can see from Figure 2, the command bit should wait until time t_3 when the downlink begins transmission the slot 2. After propagating in the downlink, the command bit is received by the mobile user at time t_4 , in which slot 2 of the downlink has been received by the mobile station. This mobile station then adjusts its power at time t_5 (the beginning of slot 4 transmission in the uplink). This situation leads to a total feedback delay $D = 3T_p$.

2.3 Channel Prediction

In a D -step linear prediction of order V , the predicted fading-factor is expressed as a linear combination of the previous samples $\{\beta(i-D), \beta(i-D-1), \dots, \beta(i-D-V+1)\}$ as

$$\beta_{pred}(i) = \sum_{v=0}^{V-1} a_v(i) \beta(i-D-v) \quad (4)$$

where $a_v(i)$, $v = 0, 1, \dots, V-1$ are the linear prediction coefficients for the i^{th} slot, $\beta(i)$ is the channel gain or the received signal strength which represents the fading factor, and D is the prediction range to reflect up to how many step ahead the prediction is conducted. By using the orthogonal principle, the vector $\mathbf{a}(i) = [a_0(i) \ a_1(i) \ \dots \ a_{V-1}(i)]^T$ under the minimum mean square error (MMSE) criterion can be computed as follow

$$\mathbf{a}(i) = \mathbf{R}^{-1}(i) \mathbf{r}(i). \quad (5)$$

Here $\mathbf{R}(i)$ is the $V \times V$ autocorrelation matrix of the input samples, whose elements are $r(i)_{v,u} = E[\beta(i-D-v) \beta^*(i-D-u)]$, $v, u = 0, 1, \dots, V-1$. The vector $\mathbf{r}(i)$ is the cross-correlation between the tap-input samples and the desired response. Elements of vector $\mathbf{r}(i)$ are $r(i)_v = E[\beta(i) \beta^*(i-D-v)]$, $v = 0, 1, \dots, V-1$. $E[\cdot]$ is the expectation operator.

In practice, however, the analytical solution to compute the predictor coefficients $\mathbf{a}(i)$ is not recommended because it is computationally intensive due to the complexity of \mathbf{R} matrix inversion and also numerically sensitive due to the fact that the matrix \mathbf{R} can be ill-conditioned. In addition, the maximum Doppler spread f_D can be time varying during a call duration that is not easy to be estimated. Therefore a recursive algorithm is preferable and in this study a recursive least square (RLS) method is used to update the predictor coefficients.

3 Improved Channel Prediction

In this section an improved power control scheme using a predictive algorithm is described. Predictive algorithm aims at predicting the future sample values using the correlation property of the past sample values. In the predictive power control algorithm, however, the correlation of past sample values is destroyed by power control updating factors.

In this study, the number of CDMA users is assumed to be large and therefore using the central limit theorem the multiple access interference is Gaussian distributed. As a result the SIR measured at the base station corresponds with the received signal strength which reflects the channel gain. However, since the received signal level or SIR has been updated by power control updating, in this paper the past power-controlled fading factor or the past SIR values, $\gamma(i - D - v)$, $v = 0, 1, \dots, V - 1$ need to be compensated for by the same factors that were given by power control updating. The restored SIR values as input samples to the predictor can be expressed as

$$\gamma'(i - D - v) = \prod_{u=1}^v 10^{[e_q(i-D-u)]/10} \gamma(i - D - v) \quad (6)$$

where $\gamma(i - D - v)$ is the power-controlled SIR, $\gamma'(i - D - v)$ is the restored SIR that can be used as the input samples to the channel predictor, and $e_q(i-D-u)$ is the control parameter to increase or decrease the transmit power reflecting the power increment step-size at the mobile station in decibel. The product term in the right-hand side of (6) indicates the total power-control gain accumulated during the v power-control interval. Therefore, the prediction algorithm can utilize the correlation property of the fading channel despite the power control updating factors.

4 Simulation and Results

In the simulation, a single-cell CDMA system with the number of users K is varied to see its effect on BER performance is considered. To reflect a practical situation, all users are considered in motion with different vehicle's speeds and thus have different maximum Doppler spreads. We model this situation by varying the users' vehicle speeds from 10 to 10 k km/h at 10 km/h interval (i.e., the speed of the k^{th} user is $v_k = 10 k$ km/h for $k = 1, 2, \dots, K$). Carrier frequency $f_c = 1.8$ GHz is used, so that the corresponding maximum Doppler spreads, f_D for the users are approximately ranging from 17 to 17 K Hz at 17 Hz interval. The DS-CDMA processing gain is $M = 64$ and the modulation scheme is QPSK with a data rate $R_b = 120$ kbps (symbol rate $R_s = 60$ ksps in QPSK scheme). The power-update rate of 1.5 kHz is considered, which corresponds to the power

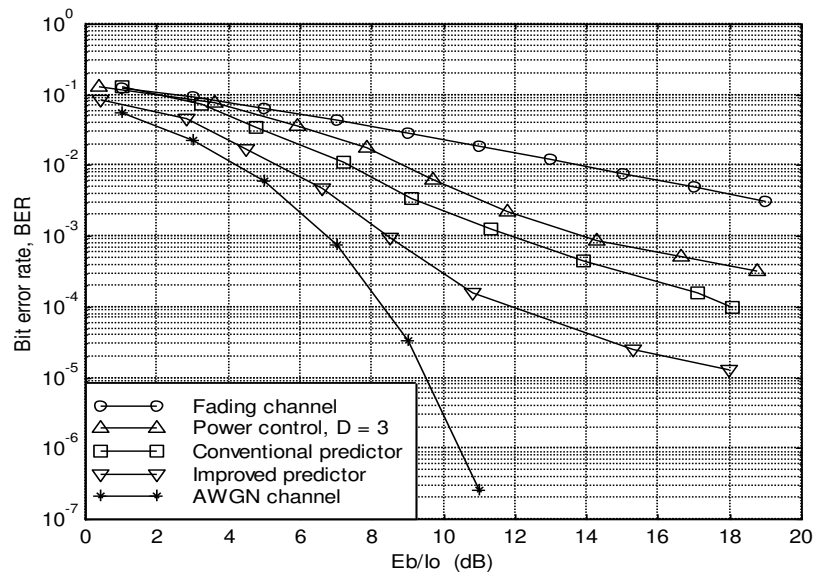
control interval $T_p = 0.667$ ms. SIR measurement is performed during a period of one time slot that corresponds to one power control interval $T_p = 0.667$ ms. The chip rate $R_c = 3.84$ Mcps as given in the 3G specification for uplink data channel [9] is assumed in the simulation, resulting in each time slot to contain 2560 chips. Therefore, 40 binary symbols per time slot are available for SIR measurement. The simulation parameters are summarized in Table 1.

Table 1 Simulation parameters of CDMA BER performance.

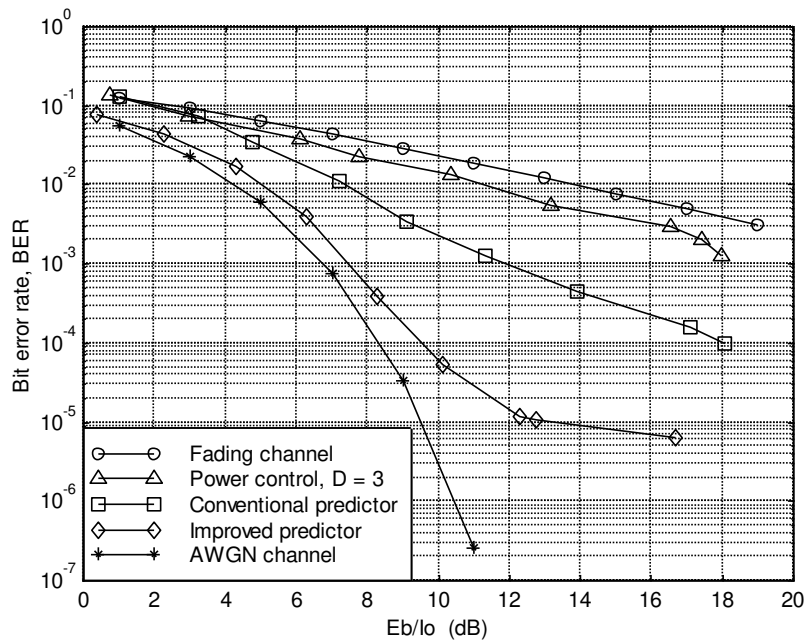
Parameter	Notation and value
Number of users	$K = 10$
Carrier frequency	$f_c = 1.8$ GHz
Vehicle's speed of the k^{th} user	$v_k = 10.k$ km/h, $k = 1, 2, \dots, K$
Maximum Doppler spread of the k^{th} user	$f_{D,k} = 1.67 v_k$ Hz, $k = 1, 2, \dots, K$
Processing gain	$M = 64$
Chip rate	$R_c = 3.84$ Mcps
Power control interval	$T_p = 0.667$ ms
Data rate	$R_b = 120$ kbps
Power update step size	$\Delta p = 1$ dB
Voice activity factor	$f_v = 0.4$

The simulation is conducted for $f_D T_p = 0.01$, and the performance is evaluated in terms of bit error rate (BER) as a function of bit energy-to-interference power density ratio (E_b/I_0). Simulation was conducted to evaluate the performance in terms of bit error rate (BER) performance as a function of E_b/N_o as shown in Figure 3 (a) for fixed step algorithm and (b) for variable step algorithm with quantization level $q=4$.

We can see from Figure 3 (a) and (b) that for both the fixed-step and variable-step algorithms, the performance of channel predictor improves significantly when the input samples to the predictor are compensated using the improved prediction method as outlined in Section 3. This is due to the fact that in the improved prediction method the channel correlation property is restored so the predictor can better predict the actual channel gain. The conventional predictor, on the other hand, uses the actual channel measurements whose correlation property has been altered or destroyed by power control adjustment factors.



a). Fixed-step algorithm ($q = 1$)



(b). Variable-step algorithm ($q = 4$)

Figure 3 Performance of improved prediction-based power control algorithm.

From Figure 3 (a) and (b), we can also see that for feedback delay $D = 3T_p$ the fixed step algorithm has a better performance than the variable-step algorithm. This can be explained that feedback delay causes the power adjustments become obsolete and irrelevant to the actual channel condition, and therefore resulting in large deviations of the SIR from the target SIR level. Since the incremental power step size in variable-step algorithm can be variable, the deviation or power control error can also be larger than that of the fixed-step algorithm. Thus, the performance of variable step algorithm degrades more significantly with feedback delay. However when the channel predictor is used, the variable-step algorithm significantly outperforms the fixed-step algorithm. When channel predictor is used, however, the transmit power adjustments take place at the actual channel measurement time, and therefore become relevant with the current channel condition. Since the variable-step algorithm uses multiple PCC bits to convey various adjustment levels, it can better track the channel variation than that of the fixed step algorithm. Therefore, variable step algorithm outperforms the fixed step algorithm significantly when channel predictor is used. We can see that to achieve $\text{BER} = 10^{-3}$ the improved predictive algorithm has almost 4 dB gain and for variable step algorithm has almost 5 dB gain compared to that for conventional predictive algorithm. This result has been previously shown on [10]. In this paper, further evaluation of predictive power control algorithm is performed to see its effect on the CDMA capacity. To evaluate the effect of the proposed method on CDMA system capacity, simulation was conducted in terms of bit error rate as a function of the number of user. The simulation parameters are shown in Table 2.

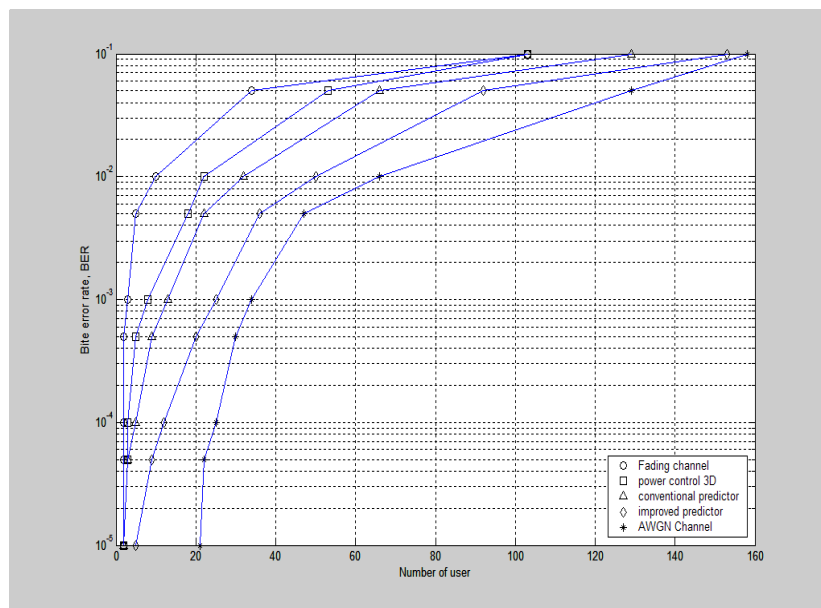
Table 2 Simulation parameters of CDMA capacity performance.

Parameter	Notation and value
Number of users	$K = 2 - 160$
BER	10^{-1} to 10^{-5} (incremented by 5×10^{-1})
Carrier frequency	$f_c = 1.8$ GHz
Vehicle's speed of the k^{th} user	$v_k = 10.k$ km/h, $k = 1, 2, \dots, K$
Maximum Doppler spread of the k^{th} user	$f_{D,k} = 1.67 v_k$ Hz, $k = 1, 2, \dots, K$
Processing gain	$M = 64$
Chip rate	$R_c = 3.84$ Mcps
Power control interval	$T_p = 0.667$ ms
Data rate	$R_b = 120$ kbps
Power update step size	$\Delta p = 1$ dB
Voice activity factor	$f_v = 0.4$

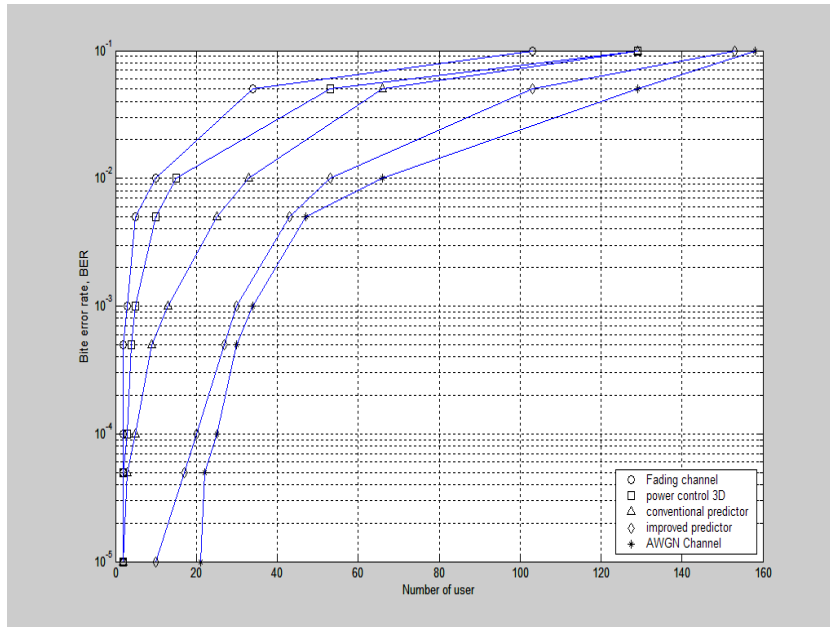
To evaluate the capacity performance, the simulation parameters of the CDMA BER performance shown in Table 1 are kept the same, but this time we increment the number of user from 1 to 160 users and we monitor the resulting number of users associated with any particular value of BER. In fact, when we increase the number of user in our simulation model, we can detect the resulting values of BER.

The results for fixed step algorithm ($q=1$) and for variable step algorithm (with quantization level $q = 4$) are shown in Figure 4 (a) and (b), respectively. We can see from Figure 4 (a) and (b) that for both the fixed-step and variable-step algorithms, the CDMA system capacity increases significantly when the improved prediction method is employed. From Figure 4 (a) and (b), we can also see that for feedback delay $D = 3T_p$ the fixed step algorithm produces a higher capacity than the variable-step algorithm. However when the channel predictor is used, the variable-step algorithm significantly outperforms the fixed-step algorithm.

Numerical results from Figure 4 show that the proposed improved power control algorithm exhibit more than 40 % increase for fixed step algorithm and more than 50 % increase in capacity for variable step algorithm from that of the conventional prediction algorithm. For variable step power control scheme with $q=4$ the proposed algorithm can provide a near-ideal-channel capacity (less than 15 % below AWGN channel capacity).



(a). Fixed-step algorithm ($q = 1$)

(b) Variable step algorithm ($q=4$)**Figure 4** CDMA capacity for various power control algorithms

5 Conclusion

The need of power control to overcome multiple access interference of CDMA systems in fading channel environment has been presented. The performance of power control algorithm degrades significantly with feedback delay. The variable-step algorithm is shown to be more sensitive to feedback delay effect than that of the fixed-step algorithm. The effect of feedback delay in the power control algorithm needs to be overcome by using predictive algorithms. Since power control updating destroys the correlation property of the channel, the prediction algorithm needs to be compensated for by the power control updating factors in order to restore the correlation property of the input samples to the predictor. When the predictor algorithm is improved to restore the correlation property of input samples to the predictor, the results are more accurate and have been shown to provide a better performance. Simulation results show that the CDMA system capacity increases significantly. The proposed improved power control algorithm exhibit more than 40 % capacity increase for fixed step algorithm and more than 50 % for variable step algorithm from that of the conventional prediction algorithm. For variable step power control scheme with

$q=4$ the proposed algorithm can provide a near-ideal-channel capacity (less than 15 % below the capacity of AWGN channel).

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