

# A Singular Value Decomposition Model for MIMO Channels at 2.6GHz

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**Abstract-** A novel MIMO model based on singular value decomposition of matrix is proposed in this paper. A corridor to stair MIMO measurement at 2.6GHz is conducted in order to evaluate the performance of the novel model. The joint DoA-DoD-delay power spectrum and the channel capacity of the model are compared with those obtained from the measured channels. The results show clearly that the joint DoA-DoD-delay power spectrum and the channel capacity of the novel model provides a better fit to the measured data than other models.

## I. INTRODUCTION

LTE(Long Term Evolution), as one of the key technologies for 4G wireless communication systems, has been put forward to support high rates and large capacity gains. For LTE system, the use of MIMO(Multiple-Input Multiple-Output) combined with OFDM(orthogonal-frequency multiple access) is the most promising strategy[1]. In China, the allocation spectra for indoor LTE wireless communication system is from 2.5 GHz to 2.69 GHz. Accurate MIMO channel model is an important tool to enhance the performance of LTE wireless communication system. In the past years, several MIMO channel models have been proposed. They can be classified into physical models and analytical models [2,3]. Physical models describing electromagnetic wave propagation environment are independent of the antenna configuration. Saleh-Valenzuela model [4,5], Zwick model [6], geometry-based stochastic model(GSCM) [7] are three typical physical models. On the other hand, analytical models considering antenna array configuration are often used to describe the channel impulse response(CIR) matrix.

Among all the analytical models, Kronecker model [8], Weichselberger model [9] and virtual channel representation model [10] are the most typical models. Kronecker model based on the assumption that the spatial correlation coefficient at the transmitter (receiver) is independent of receiver (transmitter). That is to say the one-sided spatial correlation matrix of transmitter (receiver) is independent of receiver (transmitter). It is confirmed that this assumption is in general too strict for channel by realistic channel measurements. Different with Kronecker model, Weichselberger model is based on the assumption that the eigenbases of one-sided spatial correlation matrix at the transmitter (receiver) depend on the environment, i.e., number of antennas, positions, and scatterers. However, it is shown that this assumption holds only approximately and the eigenbases are also influenced by

the spatial structure of transmit signals in [11]. In [10], Sayeed develops a virtual channel representation model that the eigenbases at the transmitter and receiver in Weichselberger model are replaced by the steering matrices into the virtual angles at the transmitter and receiver respectively. The virtual channel representation model is only available for uniform linear arrays (ULAs) and spatial resolution of the model depends on the antenna array size.

In this paper ,a novel MIMO channel model is presented based on the singular value decomposition (SVD) of matrix. Measurement setup and environment are described in Part II. In Part III, a novel MIMO model based on the singular value decomposition of matrix is established. In Part IV, measured results and model results are shown to evaluate the performance of the novel model.

Throughout the paper, we will use the  $\text{vec}(\cdot)$  operator that stacks the columns of a matrix into one vector. The superscripts  $[\cdot]^H$ ,  $[\cdot]^T$ ,  $[\cdot]^*$  stands for complex conjugate matrix transpose operator, matrix transpose operator, and complex conjugate operator, respectively. The symbol  $\otimes$  stands for the Kronecker product of two matrices. Finally,  $E(\cdot)$  denotes the expectation operator.

## II. MEASUREMENT SETUP

### A. Measurement System

Fig.1 shows a  $2 \times 2$  MIMO measurement system conducted by Agilent 8753ES vector network analyzer (VNA). The VNA generates a 20MHz swept signal at a center frequency of 2.6GHz. The transmitted power is 10 dBm. The transmit and

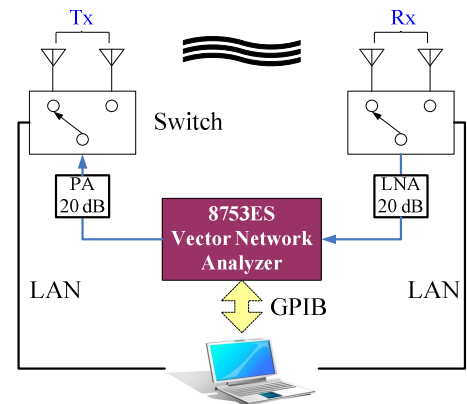


Figure 1: block diagram of MIMO measurement system.

receive antennas are the same omnidirectional monopoles with a gain of 3 dBi. Transmit and receive antennas are connected to Agilent 34980A switch matrix respectively. The transmit signal is amplified by a 20dB power amplifier. The receive signal is amplified by a 20dB low noise power amplifier and conducted to the VNA via 20 meters coaxial cable. A lap top is used to sample the measured data through GPIB interface and control the switch matrix via LAN. The measurement is carried out without moving persons to make sure of the time-invariant channel behavior during one snapshot, which is about 20 seconds. We conduct measurement according to the transmit antenna spacing and receive antenna spacing as  $0.5\lambda$ ,  $1\lambda$ ,  $2\lambda$  respectively, where  $\lambda$  is wavelength.

### B. Environment

As shown in Fig.2, the measurement environment is in an office building that contains a 15m corridor to a stair through a corner. This paper discusses not line of sight(NLOS) case that the transmitter(Tx) is located on the corridor while the receiver(Rx) is moved along the corner and stair. The floor is marble and the ceiling is plaster at a height of 3.2 m. The stair step is made of reinforced concrete with width of 133 cm, length of 26 cm, and height of 16.5 cm. In order to obtain the transfer function of each link( $H_{11}$ ,  $H_{12}$ ,  $H_{21}$ ,  $H_{22}$ ), Rx is moved on the prepared six locations(Rx6-Rx11) in the corner and stair as shown in Fig.2.

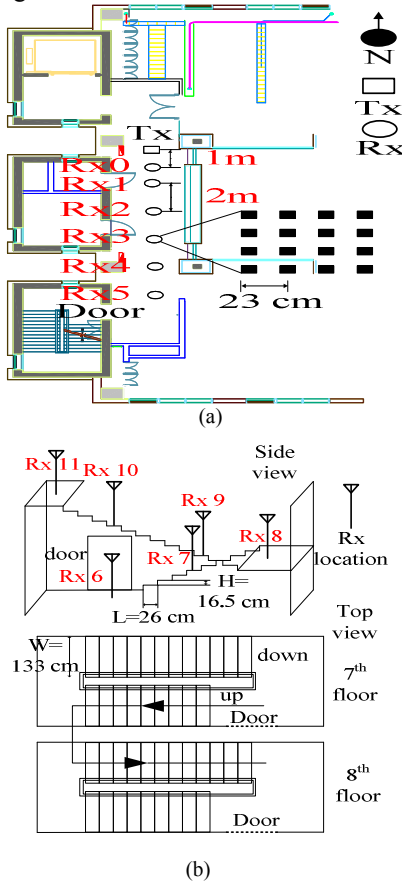


Figure 2: Layout of measurement environment: a) corridor, b) stairwell.

## III. A SINGULAR VALUE DECOMPOSITION MIMO CHANNEL MODEL

### A. The MIMO Channel Impulse Response Matrix

For a MIMO system with two transmit antennas and two receive antennas, the relationship between transmitted and received signals can be expressed as

$$y = Hx + n \quad (1)$$

where  $y$  is the  $2 \times 1$  received signal,  $x$  is  $2 \times 1$  the transmitted signal and  $n$  is the noise.  $H$  is the  $2 \times 2$  CIR matrix whose entry  $h_{mn}$  is the scalar valued frequency response between the  $n$ th transmit antenna and the  $m$ th receive antenna[12].

$$H = \begin{pmatrix} h_{11} & h_{12} \\ h_{21} & h_{22} \end{pmatrix} \quad (2)$$

For a Rician fading channel, the CIR matrix is given by

$$H = \sqrt{\frac{K}{K+1}} H_{LOS} + \sqrt{\frac{1}{K+1}} H_{res} \quad (3)$$

where  $H_{LOS}$  reflects the contribution of line of sight(LOS) component and  $H_{res}$  reflects the residue stochastic part of CIR matrix.  $K$  is the Rician factor. This paper discusses the NLOS case only(Rx6-Rx11), then  $K=0$ . That is to say  $H=H_{res}$  and corresponds to a Rayleigh fading case[12].

### B. Singular Value Decomposition Model

Based on the singular value decomposition, a novel model is discussed in this part. According to singular value decomposition of matrix, the  $2 \times 2$  CIR matrix  $H$  can be expressed as

$$H = U \Sigma V^H \quad (4)$$

$$\Sigma = \begin{pmatrix} \sigma_1 & 0 \\ 0 & \sigma_2 \end{pmatrix} \quad (5)$$

where  $\sigma_1, \sigma_2 (\sigma_1 \geq \sigma_2 \geq 0)$  are the singular values of  $H$ , both  $U$  and  $V$  are unitary matrices.

We proposed that the unitary matrix  $U(V)$  can be divided into the determined part  $U_d(V_d)$  and the stochastic part  $U_s(V_s)$ . That is to say,  $U, V$  can be expressed as

$$U = U_d \times U_s \quad (6)$$

$$V = V_d \times V_s \quad (7)$$

respectively. We define that  $U_d(V_d)$  is the eigen-matrix of receiver(transmitter) and  $U_d(V_d)$  depends on the environment.

Equation (6) and (7) are substituted into (4) and then  $H$  can be modeled as

$$H = U_d U_s \begin{pmatrix} \sigma_1 & 0 \\ 0 & \sigma_2 \end{pmatrix} (V_d V_s)^H \quad (8)$$

### C. Extractions of Model Parameters

In order to simplified model, we assume that  $U_s, V_s$  are any stochastic two dimension unitary matrices.

For any stochastic two dimension unitary,  $U_s$ , can be expressed as

$$U_s = \begin{pmatrix} a e^{j\omega_1} & \sqrt{1-a^2} e^{j\omega_2} \\ \sqrt{1-a^2} e^{j\omega_3} & a e^{j(\omega_2+\omega_3-\omega_1+\pi)} \end{pmatrix} \quad (9)$$

where  $a$ ,  $\omega_1$ ,  $\omega_2$ ,  $\omega_3$  are real valued and  $j$  is the complex unit. We assume that  $a$  is uniform distributed at interval  $[0,1]$  and  $\omega_1$ ,  $\omega_2$ ,  $\omega_3$  are uniform distributed at interval  $[0, 2\pi]$ . The stochastic two dimension unitary  $V_s$  can be assumed as same as  $U_s$ .

Futhermore, from (8), we can get

$$E_H(HH^H) = U_d \times \Lambda_1 \times U_d^H \quad (10)$$

$$E_H(H^H H) = V_d \times \Lambda_2 \times V_d^H \quad (11)$$

where  $\Lambda_1$ ,  $\Lambda_2$  are two diagonal matrices. Through eigen decomposition of matrix  $E_H(HH^H)$ , the eigen-matrix of receiver  $U_d$  can be extracted. The eigen-matrix of transmitter  $V_d$  can also be extracted as same as  $U_d$ .

As we know, the singular values  $\sigma_1$ ,  $\sigma_2$  are square root of eigenvalues. In [13,14], Wonsop Kim has discovered that eigenvalues of  $H$  follow Gamma distribution and developed the model of eigenvalues about the correlation coefficient. From the model in [13,14], we can easily get the expectation and variance of eigenvalues and then determine the distribution of eigenvalues. That is to say, the singular values  $\sigma_1$ ,  $\sigma_2$  can be determined easily.

#### IV. MODEL VALIDATION

In order to evaluate the performance of the novel model presented in this paper, two metrics, the joint DoA-DoD-delay power spectrum and the channel capacity of the model are compared with those obtained from the measured channels.

##### A. Joint DoA-DoD Power Spectrum

The Joint DoA-DoD Power Spectrum can be expressed using the Bartlett beamformer[12,15]

$$P_{Bart} = (a_{Tx}(\theta_{Tx}) \otimes a_{Rx}(\theta_{Rx}))^H \times R_{WB} \times (a_{Tx}(\theta_{Tx}) \otimes a_{Rx}(\theta_{Rx})) \quad (12)$$

$$R_{WB} = E_H(\text{vec}(H)\text{vec}(H)^H) \quad (13)$$

where  $R_{WB}$  is the full-correlation matrix,  $a_{Tx}(\theta_{Tx})$ , and  $a_{Rx}(\theta_{Rx})$  are normalized steering vectors at  $\theta_{Tx}$ ,  $\theta_{Rx}$  respectively.

The computed DoA-DoD Power Spectrum can reflect the spatial and delay characteristics of the radio channel. In order to quantify the power spectrum differences, we use the Kullback-Leibler divergence(KLD) to describe the differences[16]. The KLD is defined as follows:

$$\gamma = \iint_{x,y} \bar{P}_1(x,y) \log \frac{\bar{P}_1(x,y)}{\bar{P}_2(x,y)} dx dy \quad (14)$$

$$\bar{P}_i(x,y) = P_i(x,y) / \iint_{x,y} P_i(x,y) dx dy \quad (15)$$

where  $P_i(x,y)$  is the DoA-DoD Power Spectrum.

The KLDs from novel modeled APS to the measured APS can be calculated and the results are shown in Table I. In this table, it can be seen that the KLDs between the measured APS and the novel model are very small.

##### B. Capacity

The ergodic capacity of MIMO channel with equally allocated transmit power  $\bar{C}$  can be determined as[17]

$$C = \log_2 \det(I_2 + \frac{SNR}{2} HH^H) \quad (16)$$

$$\bar{C} = E_H(C) \quad (17)$$

where  $C$  is the channel capacity,  $I_2$  is an  $2 \times 2$  identify matrix,

TABLE I  
THE KLDs BETWEEN MODELED AND MEASURED JOINT DOA-DOD  
ANGULAR POWER SPECTRUMS

Loc.	KLD		
	0.5λ Spa.	1λ Spa.	2λ Spa.
Rx6	0.195	0.154	0.08
Rx7	0.01	0.01	0.019
Rx8	0.04	0.11	0.026
Rx9	0.007	0.017	0.013
Rx10	0.02	0.022	0.025
Rx11	0.01	0.014	0.011

SNR is the receive signal power to noise power ratio.

The 10% outage capacity of MIMO channel  $C_{out}$  can be calculated as[17]

$$P(C \leq C_{out}) = 10\% \quad (18)$$

The capacity error from models to measurement is defined as

$$Error(\%) = \frac{C_{model} - C_{mea}}{C_{mea}} \quad (19)$$

where  $C_{model}$  is the modeled capacity and  $C_{mea}$  is the measured capacity.

The evaluation SNR is selected as 10 dB.

The ergodic capacity and the 10% outage capacity obtained from the measured channels and the novel model are shown in Fig.3 and Fig.4. For comparison, the ergodic capacity and the 10% outage capacity of Kronecker model and Weichselberger model are also shown in Fig.3 and Fig.4. The ergodic capacity errors and the outage capacity errors from each model to measurement are shown in Table II and Table III. The averaging ergodic capacity errors from novel model, Weichselberger model and Kronecker model to measurement are 0.39%, 5.77%, and 4.15% respectively. The averaging outage capacity errors from novel model, Weichselberger model and Kronecker model to measurement are 2.92%, 12.38%, and 15.07% respectively. From the results, two conclusions can be obtained. First, the capacity error from kronecker model to measurement in this paper is smaller than other paper (i.e, in[18]) because the rank of  $2 \times 2$  channel matrix is very small. Finally, the most important conclusion is that analyzing the results, the novel model presented in this paper matches better to the measured data than other models.

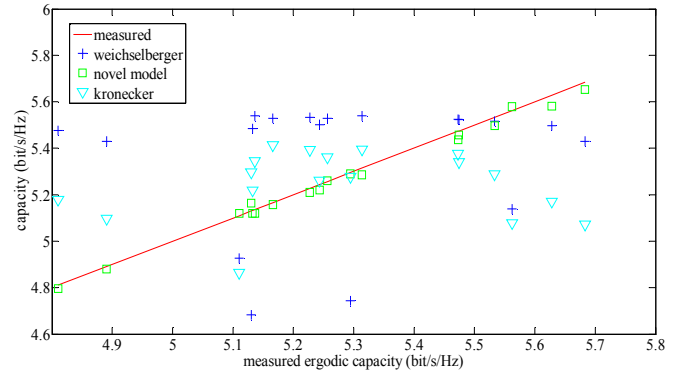


Figure 3: Ergodic capacity of every model and measured channels.

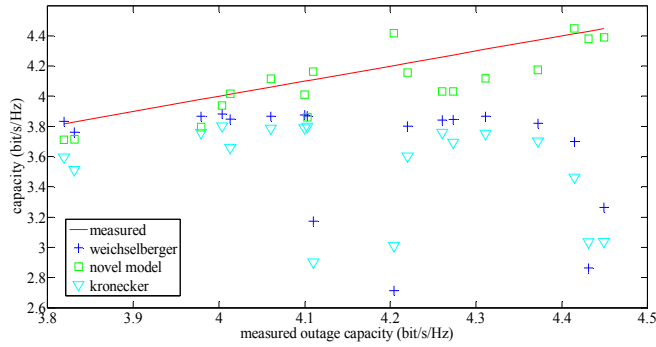


Figure 4: Outage capacity of every model and measured channels.

TABLE II

THE ERGODIC CAPACITY ERRORS FROM EACH MODEL TO MEASUREMENT

Loc. Spa.	Error(%)			Loc. Spa.	Error(%)		
	novel	web	kron		novel	web	kron
Rx6,0.5λ	0.1	10.4	0.3	Rx9,1λ	0.3	5.9	3.1
Rx7,0.5λ	0.7	1.0	1.8	Rx10,1λ	0.2	11.0	4.2
Rx8,0.5λ	0.5	4.5	10.8	Rx11,1λ	0.6	4.2	1.5
Rx9,0.5λ	0.1	5.2	2.0	Rx6,2λ	0.2	3.6	4.8
Rx10,0.5λ	0.3	13.8	7.6	Rx7,2λ	0.7	0.3	4.5
Rx11,0.5λ	0.3	7.8	4.0	Rx8,2λ	0.8	2.3	8.1
Rx6,1λ	0.7	8.7	3.2	Rx9,2λ	0.5	4.9	0.3
Rx7,1λ	0.3	1.0	2.4	Rx10,2λ	0.2	6.9	1.7
Rx8,1λ	0.3	7.63	8.7	Rx11,2λ	0.2	7.0	4.8

TABLE III

THE OUTAGE CAPACITY ERRORS FROM EACH MODEL TO MEASUREMENT

Loc. Spa.	Error(%)			Loc. Spa.	Error(%)		
	novel	web	kron		novel	web	kron
Rx6,0.5λ	5.1	35.5	28.5	Rx9,1λ	1.6	3.0	5.0
Rx7,0.5λ	1.4	4.7	6.8	Rx10,1λ	3.0	1.8	8.3
Rx8,0.5λ	0.8	16.2	21.5	Rx11,1λ	2.1	5.5	7.6
Rx9,0.5λ	5.4	9.8	11.8	Rx6,2λ	1.3	22.8	29.4
Rx10,0.5λ	2.8	0.4	5.8	Rx7,2λ	4.5	12.6	15.3
Rx11,0.5λ	4.6	2.8	5.5	Rx8,2λ	1.5	9.9	14.6
Rx6,1λ	1.1	35.4	31.6	Rx9,2λ	5.6	10.0	13.5
Rx7,1λ	4.4	10.3	13.0	Rx10,2λ	0.1	4.1	8.8
Rx8,1λ	1.3	26.6	31.7	Rx11,2λ	5.9	5.7	7.4

## V. CONCLUSION

In this paper, a corridor to stair MIMO measurement at 2.6GHz is carried out. A novel MIMO model based on singular value decomposition of matrix is proposed in this paper. The joint DoA-DoD-delay power spectrum and the channel capacity are selected as two metrics to evaluate the performance of the novel model. The results show that the novel model provides a better fit to the measured data than Kronecker model and Weichselberger model. However, the frequency selectivity of channel are not considered in this

novel model. Wider frequency bands are needed to achieve higher throughput in future wireless communication systems. An extension of the novel model adapted to wideband cases may be an important work in the next period.

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