# Improving Millimeter-Wave Channel Models for Suburban Environments with Site-Specific Geometric Features

# Yaguang Zhang<sup>1</sup>, Soumya Jyoti<sup>2</sup>, Christopher R. Anderson<sup>3</sup>, Nicolo Michelusi<sup>1</sup>, David J. Love<sup>1</sup>, Alex Sprintson<sup>2</sup>, and James V. Krogmeier<sup>1</sup>

<sup>1</sup> School of Electrical and Computer Engineering Purdue University, West Lafayette, IN 47907, USA {ygzhang, michelus, djlove, jvk}@purdue.edu

<sup>2</sup> Department of Electrical and Computer Engineering Texas A&M University, College Station, TX 77843, USA {soumyajyoti.jh, spalex}@tamu.edu

<sup>3</sup>Department of Electrical and Computer Engineering United States Naval Academy, Annapolis, MD 21402, USA canderso@usna.edu

*Abstract* — This paper proposes simple procedures to improve traditional statistical millimeter-wave channel models for suburban environments with site-specific geometric features. Blockages by buildings and vegetation were considered and existing models were verified with measurement data for an emulated microcell deployment. The results indicate that a holistic, network-level approach for channel modeling will help deal with the high dependence of millimeter waves on site-specific features.

*Index Terms* — Channel modeling, millimeter wave, site-specific geometric features, suburban environments.

# I. INTRODUCTION

Millimeter wave (mm-wave) bands have become the most promising candidate for enlarging the usable radio spectrum in future wireless networks such as 5G [1]. Since frequent and location-specific blockages are expected at mm-waves, the challenge is understanding the propagation characteristics of mm-wave signals and accordingly predicting the channel state information as needed, so that the high mobility requirements of these wireless networks can be addressed in real-time.

The majority of current research has focused on urban areas with high population densities [1]–[3]. Very few measurement campaigns have been performed in suburban and rural environments. Moreover, statistical models for point-to-point links have received significant attention, but this approach ignores all or most of site-specific geometric features, which mm-waves are sensitive to due to blockages. In this paper, we explore this research gap by focusing on suburban environments and improving standard 5G channel models with site-specific geometric features.

# II. MM-WAVE PROPAGATION MEASUREMENTS FOR SUBURBAN ENVIRONMENTS

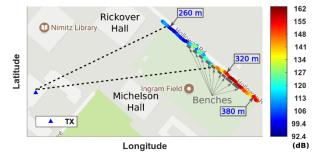
An outdoor propagation measurement campaign was carried out at the United States Naval Academy (USNA) in Annapolis, Maryland. The transmitter (TX) was temporarily installed on the Mahan Hall clock tower to emulate a typical 5G suburban microcell deployment. A custom-designed broadband sliding correlator channel sounder was used as the receiver (RX) and moved around the campus to obtain path loss measurements. More details for the measurement setup can be found in [4].

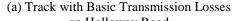
# **III. BUILDING BLOCKAGE ANALYSIS**

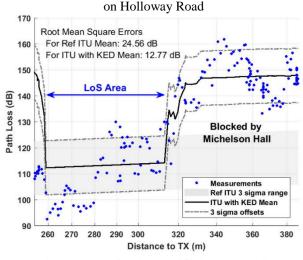
One approximately 200-m-long straight track was chosen for a continuous signal recording, to investigate the shadowing effect of buildings on a moving user. The resulting basic transmission losses are shown in Fig. 1 (a). The dotted lines illustrate the boundaries between the line-of-sight (LoS) area and the non-line-of-sight (NLoS) area due to blockages. As we can see, the most significant blockage was from Michelson Hall, which obstructed the southern half of the track. Rickover Hall partially blocked the track at the north end.

To estimate the path loss caused by building blockages, the knife-edge diffraction (KDE) model [3] was utilized. In our case, the Universal Transverse Mercator (UTM) coordinate system was extended with height to form a 3-dimensional (3D) space for computing the effective height of the obstructing screen, as well as the distances between the TX, the RX, and the screen. Note that the path obstruction may occur either on a horizontal roof edge or a vertical side edge of the building. Finally, the screen height was computed as the distance between the obstruction point and the direct Euclidean path between the TX and the RX. The resulting diffraction losses were used to shift the large-scale path loss predictions from the International Telecommunication Union (ITU) site-general model for propagations over rooftops [5]:

 $PL(d, f) = 10 \cdot \alpha \cdot \log_{10}(d) + \beta + 10 \cdot \gamma \cdot \log_{10}(f) + N(0, \sigma)$ , where *d* is the 3D direct distance between the TX and the RX in meters and *f* is the operating frequency in GHz. In our case, f = 28 GHz. The parameter values  $\alpha = 2.29$ ,  $\beta$ = 28.6,  $\gamma = 1.96$ , and  $\sigma = 3.48$ , were chosen for the LoS propagation in a suburban environment [5], which are recommended by ITU for distances from 55 m to 1200 m at 2.2–73 GHz frequency.







(b) Path Loss for the Modified ITU Model

Fig. 1. Considering building blockages to improve a statistical channel model. (a) Path losses on Holloway road illustrate the shadowing effect of buildings. The numbers in the boxes are distances to the TX. (b) After being shifted by diffraction losses, the ITU model closely follows the measurement results.

Figure 1 (b) shows the final results. The ITU model provides path loss predictions in the form of Gaussian variables. Accordingly, 3-sigma ranges for both the original and shifted ITU models are shown and root mean square errors (RMSEs) are computed separately according to the mean of each model. As we can see, the modified ITU predictions follow the measurement data much better than the original ones, providing a RMSE improvement of 11.79 dB. Another observation is, for distances below 280 m, the original ITU model overestimated the path loss by around 20 dB. This may be caused by some strong reflection path(s). Also, the KED model overestimated the attenuation caused by Rickover Hall. This was probably because the blockage happened at the southern vertical edge of the building, which corresponds to a very short obstructing screen, whereas the KED model applies for a screen with infinite height. Still, the KED model helped identify the path loss peak below 260 m.

### **IV. FOLIAGE ANALYSIS**

The effect of foliage for modeling mm-wave channel is a vital consideration for suburban environments as scattering and absorption at these frequencies can significantly attenuate 0 2 4 6 8 10 12 14 16 18 Vegetation Depth (m) -20 -10 0 10 20 30 40 50 Attenuation (dB) Specific Attenuation: Slope of Fitted line = 0.0662 dB/m Measurements Fitted Weissberger ITU-R FITU-R COST235 Fig. 2. Comparison of computed and measured path loss at 28 GHz. the signal. In our measurement campaign, eleven sites had partial or total obstruction of the LoS signal from foliage, ranging from a single tree to a small grove of trees. Our measurement results were compared against four well known empirical models [6] that are valid in this frequency range: COST235, Weissberger, ITU-R and FITU-R models.

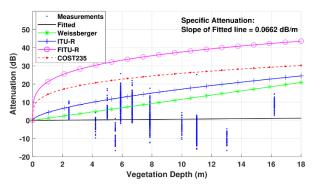


Fig. 2. Comparison of computed and measured path loss at 28 GHz.

Figure 2 illustrates our measured excess vegetation attenuation versus vegetation depth as well as existing model predictions. We can see that the mean measured value of foliage attenuation (0.07 dB/m) is significantly less than those of model-predicted values. In fact, our

measurements demonstrate a significant amount of multipath energy arriving at the receiver, likely being scattered from other objects in the environment. As a result, we recorded a greater signal strength than what would be predicted by these simple single-path attenuation models.

### V. CONCLUSION

In this paper, we illustrate two measurement- and geometry-based techniques for improving existing statistical mm-wave channel models. Our approach is suitable for a holistic, network-level model that utilizes side information and the results could be updated in real-time. Our techniques demonstrate a modest, but significant, overall improvement in propagation modeling accuracy.

### ACKNOWLEDGMENT

Sponsorship for this work was provided by NSF under Grant CNS-1642982.

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Yaguang Zhang received the B.Eng. degree in Telecommunications from Tianjin University, China, in 2013, and the M.S. degree in Electrical and Computer Engineering in 2015 from Purdue University. He is currently pursuing a Ph.D. degree in Electrical and Computer at Purdue

University. His research focuses on GPS signal processing in agricultural applications and millimeter-wave channel modeling.



**Soumya Jyoti** received his B.Tech. degree in Electronics & Communication Engineering from National Institute of Technology (NIT), Rourkela, India. He is currently pursuing a Master's degree in Computer Engineering from Texas A&M University, College Station,

Texas. His research interests include communication, networking and distributed systems.



Christopher R. Anderson received the B.S., M.S., and Ph.D. degrees in Electrical Engineering from Virginia Tech, Blacksburg, VA, USA, in 1999, 2002, and 2006, respectively. He joined the United States Naval Academy (USNA), Annapolis, MD, USA, as an Assistant Professor in

2007. In 2013, he was promoted to Associate Professor of Electrical Engineering. He is the Founder and Director of the USNA Wireless Measurements Group, a focused research group that specializes in spectrum, propagation, and field strength measurements in diverse environments and at frequencies ranging from 300 MHz to 60 GHz. From 2016-2018, he was a Visiting Researcher with the Institute for Telecommunication Sciences, a U.S. Government lab focused on advanced research to inform spectrum policy and solve emerging telecommunication issues. His research has produced 60 peer-reviewed conference and journal publications, several of which have been cited in current and upcoming wireless standards. He has been active in the ongoing 1755-1780 MHz Advanced Wireless Service 3 and 3.5 GHz Citizens Broadband Radio Service, both of which allow sharing of DoD spectrum with commercial wireless systems. His research interests include propagation measurements and modeling, millimeter-wave communications, and software-defined radio. He has served as an Editor of the IEEE Transactions on Wireless Communications.



Nicolò Michelusi received the B.Sc. (Hons.), M.Sc. (Hons.), and Ph.D. degrees from the University of Padova, Italy, in 2006, 2009, and 2013, respectively, and the M.Sc. degree in Telecommunications Engineering from the Technical University of Denmark in 2009, as a

part of the T.I.M.E. double degree program. From 2013 to 2015, he was a Post-Doctoral Research Fellow at the Ming-Hsieh Department of Electrical Engineering, University of Southern California, CA, USA. He is currently an Assistant Professor with the School of Electrical and Computer Engineering, Purdue University, West Lafayette, IN, USA. His research interests lie in the areas of 5G wireless networks, millimeter-wave communications, stochastic optimization, and distributed optimization.



**David J. Love** received the B.S. (Hons.), M.S.E., and Ph.D. degrees in Electrical Engineering from the University of Texas at Austin in 2000, 2002, and 2004, respectively. Since 2004, he has been with Purdue University, where he is currently the Reilly Professor of Electrical and

Computer Engineering. His research interests include the design and analysis of broadband wireless communication systems, 5G wireless systems, multiple-input multiple-output (MIMO) communications, millimeter-wave wireless, software-defined radios and wireless networks, coding theory, and MIMO array processing.



Alex Sprintson received the B.S. (summa cum laude), M.S., and Ph.D. degrees in Electrical Engineering from the Technion, Haifa, Israel, in 1995, 2001, and 2003, respectively. From 2003 to 2005, he was a Postdoctoral Research Fellow at the California Institute of Technology,

Pasadena, CA, USA. He is currently a Full Professor with the Department of Electrical and Computer Engineering, Texas A&M University, College Station, TX, USA. His research interests include communication networks with a focus on wireless network coding, distributed storage, and software defined networks.



James V. Krogmeier received the B.S.E.E. degree from the University of Colorado at Boulder in 1981 and the M.S. and Ph.D. degrees from the University of Illinois at Urbana-Champaign in 1983 and 1990, respectively. In 1990, he joined the Faculty of Purdue University, West

Lafayette, IN, USA, where he is currently a Professor and an Associate Head with the School of Electrical and Computer Engineering. His research interests include the application of signal processing in wireless communications, adaptive filtering, channel equalization, synchronization, precision agriculture, and intelligent transportation systems.