

Millimeter Wave MIMO Precoding/Combining: **Challenges and Potential Solutions**

Joint work with Ahmed Alkhateeb, Jianhua Mo, and Nuria González-Prelcic





Robert W. Heath Jr., Ph.D., P.E.

Wireless Networking and Communications Group **Department of Electrical and Computer Engineering** The University of Texas at Austin

Cockrell School of Engineering



Heath Group in the WNCG @ UT Austin



mmWave for infrastructure-to-car

WHAT STARTS HERE CHANGES THE WORLD (c) 2014 Robert W Heath Jr.







II PhD students

mmWave communication and radar for car-to-car

> mmWave licensed shared access for 5G

next generation mmWave LAN

mmWave 5G performance



MIMO precoding



Precoding is a staple of modern MIMO cuisine

Widely used in commercial wireless systems especially WLAN and cellular

MIMO is a key feature of mmWave systems

Shu Sun, T. Rappapport, R. W. Heath, Jr., A. Nix, and S. Rangan, `` MIMO for Millimeter Wave Wireless Communications: Beamforming, Spatial Multiplexing, or Both?," IEEE Communications Magazine, December 2014.

How will MIMO precoding work in mmWave 5G?



mmWave Precoding is Different



Different hardware constraints



- Cost, power, and complexity limit the # of RF chains (high-resolution ADCs)
 - Precoding and combining can not be done entirely in the baseband
- * Analog beamforming usually uses a network of phase shifters
 - Additional constraints: Constant gain and quantized angles

Precoding and channel estimation algorithms should account for these constraints

WHAT STARTS HERE CHANGES THE WORLD (c) 2014 Robert W Heath Jr.



Different antenna scales

Base station

- Large antenna arrays result in 菾
 - Large-dimensional precoding/combining matrices
 - High channel estimation, training, and feedback overheads

Need to design low-complexity precoding and channel estimation algorithms

Tx and Rx



Mobile Stations



Different channel characteristics

	microwave Wifi or Cellular	mmWave Wifi	mmWave 5G (???)
bandwidth	I.4 MHz to I60 MHz	2.16 GHz	100 MHz to 2 GHz
# antennas @ BS or AP	l to 8	16 to 32	64 to 256
# antennas at MS	l or 2	16 to 32	4 to 32
delay spread	100 ns to 10 us	5 to 47 ns	12 to 40 ns
angle spread	l° to 60°	60° to 100°	up to 50°
# clusters	4 to 9	< 4	< 4
orientation sensitivity	low	medium	high
small-scale fading	Rayleigh	Nakagami	non-fading or Nakagami
large-scale fading	distant dependent + shadowing	distant dependent + shadowing	distant dependent + blockage
path loss exponent	2-4	2 LOS, 2.5 to 5 NLOS	2 LOS, 3.5 to 4.5 NLOS
penetration loss	some	varies	possibly high
channel sparsity	less	more	more
spatial correlation	less	more	more

Some channel characteristics can be leveraged in the precoding design



Different sensitivity to blockages



WHAT STARTS HERE CHANGES THE WORLD (c) 2014 Robert W Heath Jr.





blockage due to people



self-body blocking

Need models for these forms of blockage



Different communication channel bandwidth



Need new algorithms and architectures for mmWave broadband communication



mmWave Suitable Precoding/Combining



Analog beamforming



Motivated by ADCs power consumption and implementation complexity Suitable for single-stream trans. (complicated for multi-stream or multi-user) Joint search for optimal beamforming/combining vectors with codebooks

* J.Wang, Z. Lan, C. Pyo, T. Baykas, C. Sum, M. Rahman, J. Gao, R. Funada, F. Kojima, H. Harada et al., "Beam codebook based beamforming protocol for multi-Gbps millimeterwave WPAN systems," IEEE Journal on Selected Areas in Communications, vol. 27, no. 8, pp. 1390–1399, 2009. ** S. Hur, T. Kim, D. Love, J. Krogmeier, T. Thomas, and A. Ghosh, "Millimeter wave beamforming for wireless backhaul and access in small cell networks," IEEE Transactions on Communications, vol. 61, no. 10, pp. 4391–4403, 2013.

WHAT STARTS HERE CHANGES THE WORLD (c) 2014 Robert W Heath Jr.



Hybrid analog-digital precoding/combining



Makes compromise between hardware complexity and system performance Hybrid precoding enables multi-stream^{*} and multi-user^{**} transmissions

- Digital can correct for analog limitations

Approaches the performance of unconstrained digital solutions

* O. El Ayach, S. Rajagopal, S. Abu-Surra, Z. Pi, and R. W. Heath Jr., "Spatially sparse precoding in millimeter wave mimo systems," IEEE Transactions on Wireless Communications, vol. 13, no. 3, pp. 1499–1513, March 2014.

** A.Alkhateeb, G. Leus, and R.W. Heath Jr, "Limited feedback hybrid precoding for multi-user millimeter wave systems," arXiv:1409.5162, 2014.



Design challenges: low-complexity precoding schemes



 $\mathbf{y} = \mathbf{W}_{BB}^* \mathbf{W}_{RF}^* \mathbf{H} \mathbf{F}_{RF} \mathbf{F}_{BB} \mathbf{s} + \mathbf{W}_{BB}^* \mathbf{W}_{RF}^* \mathbf{n}$

- Sparse precoding solutions *
 - Joint analog/digital precoder design w/ matching pursuit^{*}
 - Approaches performance of unconstrained solutions
 - Leverage lens antenna array structure**

Extension to multiuser interference channels ***

13, no. 3, pp. 1499–1513, March 2014.

* O. El Ayach, S. Rajagopal, S. Abu-Surra, Z. Pi, and R.W. Heath Jr., "Spatially sparse precoding in millimeter wave mimo systems," IEEE Transactions on Wireless Communications, vol. ** J. Brady, N. Behdad, and A. Sayeed, "Beamspace MIMO for millimeter-wave communications: System architecture, modeling, analysis, and measurements," IEEE Trans. on Ant. and Propag., vol. 61, no. 7, pp. 3814–3827, July 2013. *** M. Kim and Y.H. Lee, "MSE-based Hybrid RF/Baseband Processing for Millimeter Wave Communication Systems in MIMO Interference Channels", IEEE TVT, to appear.

- Hybrid precoding design is non-trivial
 - Coupled analog and digital precoding matrices
 - RF phase shifters have constant modulus,
 - quant. angles
 - Non-convex feasibility constraints



THE UNIVERSITY OF

Design challenges: channel estimation with hybrid precoding



* A. Alkhateeb, O. E. Ayach, G. Leus, and R. W. Heath Jr, "Channel estimation and hybrid precoding for millimeter wave cellular systems." IEEE J. Selected Topics in Signal Processing (JSTSP), vol. 8, no. 5, May 2014, pp. 831-846

- mmWave channel estimation is challenging
 - Large channel matrices -> training/feedback overhead
 - Low SNR before beamforming design
 - In hybrid architecture, channel is seen through RF BF lens

Adaptive compressed sensing solution*

Sparse nature of mmWave channel can be leveraged mmWave Channel estimation -> parameter estimation Low training overhead with compressed sensing (CS) tools Adaptive CS estimation of multi-path mmWave channels CS and hybrid precoders lead to efficient training codebooks THE UNIVERSITY OF



Limitation: Capacity is bounded by 2 N_r bps/Hz (important at high SNR)

* J. Mo and R.W. Heath, Jr., "Capacity Analysis of One-Bit Quantized MIMO Systems with Transmitter Channel State Information" arxiv 1410.7353 See also extensive work by research groups led by U. Madhow, J. Nossek, G. Fettweis, G. Kramer, and O. Dabeer and others

WHAT STARTS HERE CHANGES THE WORLD (c) 2014 Robert W Heath Jr.



Design challenges: capacity analysis with I-bit ADCs



*J. Singh, O. Dabeer, and U. Madhow, "On the limits of communication with low-precision analog-to-digital conversion at the receiver," TCOM 2009 **J. Mo and R.W. Heath, Jr., "Capacity Analysis of One-Bit Quantized MIMO Systems with Transmitter Channel State Information" arxiv 1410.7353 ***J. Huang and S. Meyn, "Characterization and computation of optimal distributions for channel coding," TIT 2005

- Finding the exact capacity is challenging
 - Quantization is a nonlinear operation
 - Optimal input has discrete distribution
 - Special case: Rotated QPSK (optimal for SISO channel)*

MISO optimal strategy is MRT + QPSK signaling Derived high SNR capacity for SIMO and MIMO Use numerical methods to find optimal inputs^{***} Assumption: Known CSI at transmitter

THE UNIVERSITY OF

Design challenges: channel estimation with I-bit ADCs



- *
 - Amplitude information is lost in the quantization
 - Conventional sparse reconstruction algorithms like LASSO do not work with I-bit quantization
 - Stochastic resonance appears when using GAMP: estimation error may increase w/ SNR

Possible approaches 業

training sequence

- Expectation-maximization algorithm^{*}
- Dithered quantization: Quantization threshold is adaptive^{**}
 - Exploit sparse nature of mmWave channels with GAMP ***

*A. Mezghani, F. Antreich, and J. Nossek, "Multiple parameter estimation with quantized channel output," ITG 2010 **O. Dabeer and U. Madhow, "Channel estimation with low precision ADC", ICC, 2010 ***J. Mo, P. Schniter, N. G. Prelcic and R. W. Heath, Jr. "Channel Estimation in Millimeter Wave MIMO Systems with One-Bit Quantization", Asilomar 2014

Channel estimation is hard with I-bit ADCs





Design challenges: broadband channels with I-bit ADCs



OFDM receiver with analog DFT

- mmWave has broadband channels 米
 - 10-40 ns delay spread in 2.16GHz BW in 11ad
 - Equalization after quantization is challenging

*S. Suh, A. Basu, C. Schlottmann, P. Hasler, and J. Barry, "Low-power discrete Fourier transform for OFDM: A programmable analog approach," IEEE Transactions on Circuits and Systems I: Regular Papers, 58.2, 2011

Analog DFT *

- Orthogonalization: No inter-carrier interference
- Lower PAPR: Low-resolution ADCs
- Possibly lower power vs digital DFT



Future Research Directions



Future research directions (1/4)

Beams are assigned for each user, while multi-user interference is handled in the baseband *





Multi-user mmWave systems with hybrid precoding

- Enables different beams to be assigned to different users
- Better interference management capability in digital domain
- Initial work proposes two-stage hybrid precoding algorithm^{*}

* A. Alkhateeb, G. Leus, and R. W. Heath Jr., "Limited Feedback Hybrid Precoding for Multi-User Millimeter Wave Systems," submitted to IEEE Trans. Wireless Commun., arXiv preprint arXiv:1409.5162, 2014.

** Ahmed Alkhateeb, Geert Leus, and Rober W. Heath Jr, "Multi-Layer Precoding for Full-Dimensional Massive MIMO Systems," in Proc. of Asilomar Conference on Signals, 20 Systems and Computers, Pacific Grove, CA, November 2014.

WHAT STARTS HERE CHANGES THE WORLD (c) 2014 Robert W Heath Jr.

Considering out-of-cell interference is also interesting (extension to multi-layer precoding^{**})



Future research directions (2/4)

Compressed sensing tools leverage the sparse nature of mmWave channels in the angular domain

 $\theta_1 \quad \phi_2 = \theta_2$



- CS can leverage mmWave channel sparsity for efficient channel training/estimation
- Designing CS-based pilot signals^{*} for mmWave systems is an interesting open problem
- Challenges are mainly due to the different hardware constraints (e.g., w/ hybrid precoding)
- Body, hand and self-body blockages
 - Consider blockage model into the channel matrix
 - Precoding and channel estimation with array diversity^{**} on the handset

WHAT STARTS HERE CHANGES THE WORLD (c) 2014 Robert W Heath Ir.





^{*} D. Ramasamy, S. Venkateswaran, and U. Madhow, "Compressive adaptation of large steerable arrays," in Proc. of 2012 Information Theory and Applications Workshop (ITA), СА, 2012, рр. 234–239.

^{**} W. Roh et al., "Millimeter-Wave Beamforming as an Enabling Technology for 5G Cellular Communications: Theoretical Feasibility and Prototype Results", IEEE Communications Magazine, Feb. 2014



Future research directions (3/4)

***** MIMO with limited feedback

- Feedback help establishing forward link
- Feedback has to be limited due to large channel dimensions and low rate during initial access Need to design efficient precoding codebooks^{*} (for hybrid architectures, I-bit ADCs, ...)
- Channel sparsity may be leveraged for low-complexity solutions**
- Initial hybrid beamforming codebooks based on adaptive refining***

MIMO over broadband channels

- Narrowband analog and broadband digital equalization
- Exploiting channel sparsity, analog beams can be designed per cluster
- Adjusting analog / beam switching in OFDM, SC-FDMA****





^{*} J. Singh, and R. Sudhir, "On the feasibility of beamforming in millimeter wave communication systems with multiple antenna arrays." arXiv preprint arXiv:1410.5509, 2014. ** A. Alkhateeb, G. Leus, and R.W. Heath Jr., "Limited Feedback Hybrid Precoding for Multi-User Millimeter Wave Systems," submitted to IEEE TWC, arXiv preprint arXiv: 1409.5162, 2014. *** A. Alkhateeb, O. E. Ayach, G. Leus, and R.W. Heath Jr, "Channel estimation and hybrid precoding for millimeter wave cellular systems." IEEE JSTSP, vol. 8, no. 5, May 2014, pp. 831-846 **** A. Ghosh et. al. "Millimeter-wave Enhanced Local Area Systems: A high-data-rate approach for future wireless networks", IEEE JSAC vol. 32, no. 6, pp. 1152-1163, June 2014.



Future research directions (4/4)



*J. Singh, O. Dabeer, and U. Madhow, "On the limits of communication with low-precision analog-to-digital conversion at the receiver," TCOM 2009 **Q. Bai, J. A. Nossek, "Energy efficiency maximization for 5G multi-antenna receivers", ETT 2014

- Training signal design for systems with I-bit ADCs
 - Discrete input discrete output
 - Need not to estimate the exact channel state
 - Estimate the channel response to certain training symbols

% Performance analysis with >I-bit ADCs

Tradeoff between achievable rate and power consumption Achievable rates of quant. MIMO channels are unknown** Uniform quantization is near-optimal**

Other channel state assumptions

Connections with non-coherent MIMO techniques

Conclusions

- mmWave precoding/combining is different than traditional UHF solutions * Different hardware constraints, antenna scales, channel characteristics, channel bandwidth



- Promising solutions: Hybrid precoding/combining and combining with low-resolution ADCs Design challenges with these solutions need to be addressed
- New transceiver architectures, precoding/combining solutions are needed
 - Many research directions (multi-user extensions, new architectures,)

Submit your work to the forthcoming IEEE JSTSP special issue on Millimeter Wave Communication - Manuscripts are due May 15

Ahmed Alkhateeb, Jianhua Mo, Nuria González Prelcic and Robert W. Heath, Jr., ``MIMO Precoding and Combining Solutions for Millimeter Wave Systems," IEEE Communications Magazine, December 2014.

http://www.profheath.org/research/millimeter-wave-cellular-systems/









Questions?

Robert W. Heath Jr. The University of Texas at Austin THE UNIVERSITY OF TEXAS

Cockrell School of Engineering