# Downlink Pareto Optimal Beamforming with Limited Cooperation

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# Multicell Downlink Beamforming



- Problem: Design beamforming vectors at each BS
- Distributed solution with limited exchange of information

#### MISO Interference Channel Model



Beamforming optimal under Gaussian codebooks + single-user detection Zhang & Cui 2010, Shang, Chen & Poor 2009



- Can be non-convex
- Boundary points to be determined
	- Pareto optimal rate vector: Not possible to improve any component without decreasing at least one other component

#### Finding the beamforming vectors

• Weighted sum rate maximization

$$
\beta_1 \log \left( 1 + \frac{\left| \mathbf{h}_{11}^H \mathbf{w}_1 \right|^2}{\left| \mathbf{h}_{21}^H \mathbf{w}_2 \right|^2 + \sigma_1^2} \right) + \beta_2 \log \left( 1 + \frac{\left| \mathbf{h}_{22}^H \mathbf{w}_2 \right|^2}{\left| \mathbf{h}_{12}^H \mathbf{w}_1 \right|^2 + \sigma_2^2} \right)
$$

• Power constraints

$$
\|\mathbf{w}_1\|^2 \le P_1
$$
  

$$
\|\mathbf{w}_2\|^2 \le P_2
$$

• Centralized solution

# Distributed solution with limited coordination



- There exist interference thresholds corresponding to each boundary point
- Local channel information

Zhang & Cui 2010

# Solution for given interference thresholds

 $\max_{\gamma_1, \delta_1, \theta_1, \phi_1} \gamma_1$  $\gamma_1^2 + \delta_1^2 \leq P_1$ 

 $a \gamma_1^2 + b \delta_1^2 + 2ab \gamma_1 \delta_1 \cos(\theta_1 - \phi_1) \le \Gamma_{12}$ 

• Power along channel direction  $(\gamma_1^2)$  and along orthogonal direction ( $\delta_1^2$ )

M. Vishnu Narayanan, S. Bhashyam, Pareto Optimal Distributed Beamforming for the Multi-band Multi-cell Downlink, Proceedings of IEEE Global Communications Conference (GLOBECOM 2017), Singapore, Dec. 2017.

# Solution for given interference thresholds

• Closed form solution



## Weighted sum rate maximization

- Update interference thresholds using gradient ascent
- Use closed form solution for given thresholds

# Multiple band case

Flat fading model so far



#### Power allocation + Beamforming

$$
\max_{\{\mathbf{w}_{ik}\}} \sum_{i} \beta_i \sum_{k} \log \left( 1 + \frac{\left| \mathbf{h}_{iik}^H \mathbf{w}_{ik} \right|^2}{\left| \mathbf{h}_{jik}^H \mathbf{w}_{jk} \right|^2 + \sigma_{ik}^2} \right)
$$

$$
\sum_{k} \|\mathbf{w}_{ik}\|^2 \le P_i \text{ for all } i
$$

- Sum power constraint over all bands
- Beamforming vector for each band

## Pareto boundary: k-band & 1-band

 $(R_1, R_2)$  is Pareto optimal

implies

 $(R_{1k}, R_{2k})$  is Pareto optimal in each band k.

• For a given power allocation, overall multi-band problem reduces to  $K$  single-band problems, one for each band

## Alternating Maximization



## Alternating Maximization

- Power allocation step
	- Bisection method
	- Ellipsoid method



- Each iteration nondecreasing in objective
- Convergence to local maxima possible
- Try multiple initializations and choose the best

## Simulation Results: 2-band



#### Simulation Results: 2-band



#### Simulation Results: 2-band



#### Simulation Results: 3-band



#### Simulation Results: 10-band



#### Simulation Results: 10-band



# Simulation Results: Frequency selective<br>channel<br>Example of the state o channel



## Summary

- Beamforming for the multicell downlink
	- Single-user detection and Gaussian codebooks
- Distributed solution with limited coordination
	- Single band case:
		- Closed form solution for given interference constraints
		- Gradient ascent for weighted sum rate maximization
	- Multiple band case:
		- Alternating maximization: Power allocation and beamforming
		- Significant gain over equal power allocation, MRT, ZF
- Ongoing: 3-cell coordination closed form solution

https://www.ee.iitm.ac.in/~skrishna/