## Distributed Transmit Power Allocation for Relay-Assisted Cognitive-Radio Systems

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#### Introduction

#### Cognitive-Radio (CR) Systems

- Utilize unused or partially occupied frequency bands in adaptive, unlicensed fashion ⇒ More efficient spectrum utilization
- **Spectrum sensing** ⇒ Dynamically adjust **transmission parameters** (carrier frequency, bandwidth, transmit power, ...)
- CR capabilities will be relevant, e.g., for UWB systems

#### Relay-Assisted CR Systems

- CR systems will naturally operate at **low transmit powers** to limit **interference** experienced by **primary users**
- Example: Transmit power of UWB devices limited by FCC spectral mask

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#### Here:

- Frequency band chosen by CR system not completely unoccupied, but contains one or more licensed narrowband users
- **Distributed** transmit power allocation schemes for CR systems assisted by **cooperating** relays



**Goal:** Optimize performance of CR system while limiting interference level seen by primary user(s)

- System Model and Problem Formulation
- Distributed Transmit Power Allocation Schemes
- Numerical Performance Results
- Conclusions

#### • System Model and Problem Formulation

- Basic Assumptions and Transmission Protocol
- Illustration of the Centralized Optimization Problem
- Distributed Transmit Power Allocation Schemes
- Numerical Performance Results
- Conclusions

#### **Basic Assumptions**

- Wideband or UWB CR system based on CDMA
- Source S and destination D assisted by  $N_r$  perfectly synchronized relays  $R_1, ..., R_{N_r}$  using orthogonal spreading codes
- $\bullet~N_{\rm p}$  primary users  $U_1,...,U_{N_{\rm p}}$  within frequency band of CR system
  - Bandwidth ratio  $ho_j := B_{\mathrm{U}_j}/B_{\mathrm{CR}} < 1 \ (j=1,...,N_{\mathrm{p}})$
  - $\xi_j$ : Maximum sum interference power tolerated by  $\mathrm{U}_j$
- Quasi-static scenario; block fading with channel impulse responses (CIRs)

$$\mathbf{h}_{X,Y} := [h_{X,Y}^{(0)}, \dots, h_{X,Y}^{(L_{X,Y})}]^{\mathrm{T}},$$

 $\mathbf{X}, \mathbf{Y} \! \in \! \{\mathbf{S}, \mathbf{D}, \mathbf{R}_{1}, ..., \mathbf{R}_{N_{\mathrm{r}}}, \mathbf{U}_{1}, ..., \mathbf{U}_{N_{\mathrm{p}}}\}$ 

⇒ Corresponding CIR energies:

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## System Model



#### Further Assumptions (require some network acquisition phase)

- D perfect knowledge of  $\mathbf{h}_{\mathrm{S},\mathrm{D}}$  and  $\mathbf{h}_{\mathrm{R}_i,\mathrm{D}}$   $(i=1,...,N_\mathrm{r})$
- $R_i$   $(i = 1, ..., N_r)$  perfect knowledge of  $h_{S,R_i}$
- S and  $R_i$   $(i = 1, ..., N_r)$  aware of channel power gains  $\alpha_{S,U_j}$  or  $\alpha_{R_i,U_j}$  in direction of  $U_1, ..., U_{N_p}$

- s.

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Transmission protocol consists of two orthogonal time slots:

#### Time Slot I

- $\bullet~S$  broadcasts coded message to  $R_1,...,R_{\mathit{N_r}}$  and D
- $\bullet\,$  Transmit power  $P_{\rm S}$  adjusted such that all interference constraints are met:

$$\rho_j P_{\rm S} \alpha_{{\rm S},{\rm U}_j} \le \xi_j \quad (j = 1, ..., N_{\rm p})$$

Moreover, maximum power constraint  $P_{\rm S} \leq P_{{
m S},{
m max}}$ 

- $R_i$   $(i = 1, ..., N_r)$  performs optimal MRC of signal received from S
- Relays receiving coded message with MRC output SNR  $\geq$  threshold value  $\gamma_{\rm th}$  assumed to decode correctly

Transmission protocol consists of two orthogonal time slots:

#### Time Slot II

- $\bullet~{\rm These}~N_{\rm r}' \leq N_{\rm r}$  relays broadcast short beacon signal to inform other relays and destination
- Participating relays re-encode message and simultaneously retransmit it
- D performs optimal MRC of signals from S and  $R_i$   $(i = 1, ..., N'_r)$
- **Transmit powers** of participating relays shall be chosen such that all interference and power constraints are met
- MRC output SNR  $\gamma_D$  at destination shall be **maximized** to establish quick connection between S and D

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### **Optimization Problem**

• Linear optimization problem:

$$\begin{array}{ll} \text{maximize} & \gamma_{\mathrm{D}} = \frac{1}{\sigma_{\mathrm{n}}^{2}} \left( \sum_{i=1}^{N_{\mathrm{r}}'} P_{\mathrm{R}_{i}} \, \alpha_{\mathrm{R}_{i},\mathrm{D}} + P_{\mathrm{S}} \, \alpha_{\mathrm{S},\mathrm{D}} \right) \\ \text{subject to} & \rho_{j} \sum_{i=1}^{N_{\mathrm{r}}'} P_{\mathrm{R}_{i}} \, \alpha_{\mathrm{R}_{i},\mathrm{U}_{j}} \leq \xi_{j}, \quad j = 1, ..., N_{\mathrm{p}} \\ P_{\mathrm{R}_{i}} \leq P_{\mathrm{R}_{i},\mathrm{max}}, \qquad i = 1, ..., N_{\mathrm{r}}' \end{array}$$

Parameters ρ<sub>j</sub>, ξ<sub>j</sub>, P<sub>R<sub>i</sub>,max</sub> assumed to be known throughout CR network
 Optimal solution can be found using linear programming techniques (e.g. Simplex algorithm)

## Graphical Illustration



 Optimal solution requires central node C with knowledge of all channel power gains α<sub>R<sub>i</sub>,D</sub> and α<sub>R<sub>i</sub>,U<sub>j</sub></sub> (i = 1,...,N<sub>r</sub>', j = 1,...,N<sub>p</sub>)

 Values α<sub>R<sub>i</sub>,D</sub>, α<sub>R<sub>i</sub>,U<sub>j</sub></sub> communicated to C; then C computes optimal transmit powers and feeds solution back to relays

 $\Rightarrow$  Develop **distributed** power allocation schemes to **reduce** signaling overhead

## Graphical Illustration



- Optimal solution requires **central** node C with knowledge of **all** channel power gains  $\alpha_{R_i,D}$  and  $\alpha_{R_i,U_j}$   $(i = 1, ..., N'_r, j = 1, ..., N_p)$
- Values  $\alpha_{R_i,D}$ ,  $\alpha_{R_i,U_j}$  communicated to C; then C computes optimal transmit powers and feeds solution back to relays
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- System Model and Problem Formulation
- Distributed Transmit Power Allocation Schemes
- Numerical Performance Results
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#### • System Model and Problem Formulation

- Distributed Transmit Power Allocation Schemes
  - Fully Decentralized (FD) Transmit Power Allocation
  - Distributed Scheme with Limited Feedback (LF)
  - Distributed Quasi-Optimal (QO) Power Allocation

#### • Numerical Performance Results

Conclusions

- Fully decentralized, i.e., performed solely by relays
- $\bullet\,$  Based on beacon signals  $N_{\rm r}'\,\,{\rm known}$  throughout CR network
- $\mathbf{R}_i \ (i=1,...,N_{\mathbf{r}}')$  adjusts transmit power as

$$P_{\mathbf{R}_{i}} := \min\left\{P_{\mathbf{R}_{i},\max},\min_{j\in\{1,\dots,N_{\mathbf{P}}\}}\left\{\frac{\xi_{j}}{\rho_{j} N_{\mathbf{r}}^{\prime} \alpha_{\mathbf{R}_{i},\mathbf{U}_{j}}}\right\}\right\}$$

 $\Rightarrow$  Sum interference power at  $U_j$  at most  $\xi_j$   $(j=1,...,N_p)$ , without any further interaction between relays

Moreover,  $P_{\mathrm{R}_i} \leq P_{\mathrm{R}_i,\mathrm{max}}$   $(i = 1, ..., N_\mathrm{r}')$  guaranteed

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### Distributed Scheme with Little Feedback (LF)

- Very little feedback from destination to improve FD solution
- Starts with FD scheme, D measures MRC output SNR  $\gamma_{\rm D}$
- D tests if switching to single transmitting relay  $\mathrm{R}_k$  improves  $\gamma_\mathrm{D}~(\gamma_\mathrm{D}' > \gamma_\mathrm{D})$
- 'Best' relay chosen according to largest channel power gain α<sub>Ri,D</sub> (i.e., largest component of g), disregarding interference constraints
- Enhanced little feedback (ELF) scheme: 'Best' relay chosen taking interference constraints into account
- $\gamma_{\rm D}' > \gamma_{\rm D} \; \Rightarrow \; {
  m D}$  sends **beacons** to participating relays

⇒ Relays re-adjust transmit powers as

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$$0 \quad \text{else}$$

•  $\gamma_{\rm D}^\prime \leq \gamma_{\rm D} \; \Rightarrow \;$  FD solution **retained** 

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### Distributed Quasi-Optimal (QO) Power Allocation

- Feedback from the destination (similar to LF scheme)
- Congenerous primary users, i.e.,  $\xi_1/\rho_1 = ... = \xi_{N_{\rm p}}/\rho_{N_{\rm p}} =: \theta$
- Starts with FD scheme, D measures MRC output SNR  $\gamma_{\mathrm{D},i}$  for each relay
- From this D determines applied transmit powers  $P_{\mathrm{R}}$
- $\Rightarrow$  Worst-case estimates for  $\alpha_{R_i,U_j}$   $(j = 1, ..., N_p)$ :

$$\tilde{\alpha}_{\mathbf{R}_i,\mathbf{U}_j} := \frac{\theta}{N_{\mathbf{r}}' P_{\mathbf{R}_i}} \ge \alpha_{\mathbf{R}_i,\mathbf{U}_j}$$

 $\Rightarrow$  Interference constraints (and power constraints) **always** met

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- D computes (quasi-)optimal transmit powers (using values α̃<sub>Ri,Uj</sub>) and feeds solution back to relays (similar to optimal centralized scheme)
- $\Rightarrow$  Interference constraints (and power constraints) **always** met

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- All link lengths normalized w.r.t. S–D link; S and D have fixed positions at (-0.5,0) and (+0.5,0), respectively
- $N_{\rm r} = 20$  relays and  $N_{\rm p} \ge 1$  primary users; random positions within square areas of side length 0.8, center points (0,0) and  $(x_{\rm p},0)$ , respectively
- $\bullet$  Identical maximum transmit powers  ${\it P}_{\rm max}$  for all nodes within CR network
- Quasi-static **Rayleigh** fading, **path-loss** exponent p=2
  - Links associated with primary users: flat fading  $(L_{X,Y}=0)$
  - Links within CR network: frequency-selective fading  $(L_{X,Y}=9)$
- All simulation results **averaged** over 1,000 random locations of relays and primary users; 100 channel realizations per spatial constellation

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# Single Primary User



⇒ Already FD scheme significantly outperforms direct transmission; QO scheme performs very close to optimum centralized solution

# Single Primary User



 $\Rightarrow$  For larger distances of primary users FD, LF, and ELF scheme similar; significantly larger gains over direct transmission than for  $x_p=0$ 

# Single Primary User



 $\Rightarrow$  For low values of  $P_{\rm max}$  all schemes perform very close to optimum; for large values of  $P_{\rm max}$  flat behavior due to interference constraint

## Multiple Primary Users



 $\Rightarrow$  For  $x_p = 0$  notable performance degradation as  $N_p$  grows; still significant improvements over direct transmission

## Multiple Primary Users



 $\Rightarrow$  For larger  $x_p$  performance degrades gracefully with growing  $N_p$ ; LF and ELF scheme similar, QO scheme still close to optimum

- Distributed transmit power allocation schemes for relay-assisted CR systems in the presence of single or multiple primary users
  - ► **FD scheme:** Significant **performance improvements** over direct transmission, without interaction between relays or feedback from destination
  - LF schemes: Further performance gains utilizing little feedback from destination
  - ▶ QO scheme: Performance very close to optimal centralized solution

#### • Future work:

- More sophisticated solutions for multiple non-congenerous primary users?
- Impact of non-perfect channel knowledge and time-varying channel conditions?