Dynamic Resource Allocation for Efficient Wireless Packet Data Communcations

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March 17, 2006

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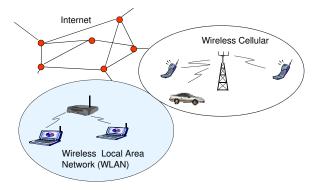
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OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

Broadband Wireless



- Demand for mobile wireless internet access
- Need support for multimedia data transfer

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Introduction

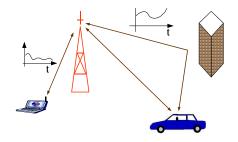
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OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

Broadband Wireless: Challenges



- ► High data rates and limited/expensive spectrum ⇒ need high spectral efficiency
- Shared resources and multiple access
- Multipath fading channel
- Bursty traffic characteristics

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B. Srikrishna

Introduction

Problen

OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

References

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Broadband Wireless: Some Proposals

Code-Division Multiple Access (CDMA)-based

- 1xEV-DO (HDR)
- HSDPA
- 1xEV-DV
- Orthogonal Frequency Division Multiplexing (OFDM)-based:
 - FlashOFDM
 - IEEE 802.16e
 - ▶ IEEE 802.20

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Introduction

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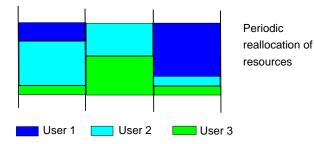
CDMA Resource Allocation Results

Summary

References

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Key Techniques



Adaptation to channel and traffic conditions

- Dynamic resource allocation
 - Reallocation period of the order of a few milliseconds

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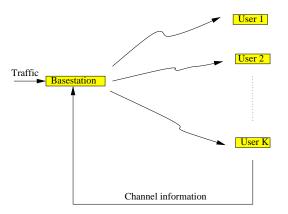
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OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

Downlink Resource Allocation Problem



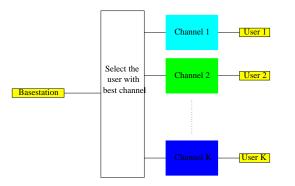
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Dynamic Resource

- Physical resources: power and bandwidth
- Maximize system throughput
- Total transmit power constraint
- ► Fairness or Quality of Service (QoS) constraints

Maximizing Capacity



All power and bandwidth resources to one user

User with best achievable rate chosen:

$$i = \arg \max_k R_k,$$

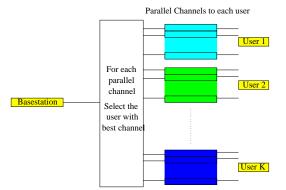
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where R_k is the rate that can be supported by user k.

No fairness or QoS constraint

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Maximizing Capacity: Parallel Channels



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Introduction

Problem

OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

References

- Bandwidth resources split to achieve parallel channels
- ► For each channel *n*, user with best channel conditions chosen:

$$i_n = \arg \max_k R_{k,n}.$$

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- Water-filling power allocation
- No fairness or QoS constraint

Fairness and Quality of Service (QoS)

- Various notions of fairness or QoS
- Round-Robin
- Proportional Fairness [Tse02]

$$i = \arg \max_{k} \frac{R_k}{R_{k,av}}$$

where $R_{k,av}$ is the average rate that can be supported by user k.

 Modified-Largest Weighted Delay First (M-LWDF) [Andrews00]

 $i = \arg\max_k \gamma_k W_k R_k,$

where W_k is the Head-Of-Line (HOL) packet delay for user k, and $\gamma_k = \frac{C_k}{R_{k,av}}$.

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B. Srikrishna

Introduction

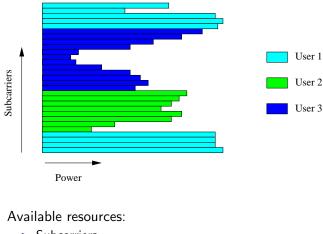
Problem

OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

Resource Allocation in OFDM



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OFDM Resource Allocation

CDMA Resource

- Available resources:
 - Subcarriers
 - Transmit power
- Channel is frequency-selective \Rightarrow subcarriers not identical.

OFDM Resource Allocation Algorithms

- Channel Aware Only (CAO) Scheduling
 - Proportionally Fair (PF) subcarrier allocation [Rhee00]
 - PF subcarrier allocation + power optimization [Shen05]
 - Max utility subcarrier allocation + power optimization [Song05]
- Channel Aware Queue Aware (CAQA) Scheduling
 - MLWDF for OFDM-TDMA [Andrews00]
 - MLWDF at subcarrier level [Parag05]
- Our Work
 - Joint Subcarrier and Power Allocation (JSPA) approach
 - Optimize power allocation after each subcarrier is allocated

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Introduction

Problem

OFDM Resource Allocation

Our Algorithm Results

CDMA Resource Allocation Results

Summary

MLWDF for OFDM-TDMA

- All subcarriers allocated to a single user in each slot
- Select user i as:
 - $i = \arg \max_{k} \gamma_k W_k R_k$
 - W_k : Head-Of-Line (HOL) packet delay for user k
 - R_k : Rate achievable for user k (water-filling)

$$\gamma_k = \frac{1}{R_{k,av}}$$

- $C_k = \frac{-\log \delta_k}{D_k}$ to achieve $P[\text{delay} > D_k] < \delta_k$
- Throughput optimal single-user scheduling rule
 - Maximum stability: achieves stable queues if any algorithm can achieve it
- Single-user scheduling in each time slot not optimal

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Introduction

Problem

OFDM Resource Allocation

Our Algorithm Results

CDMA Resource Allocation Results

Summary

Subcarrier-wise Allocation

Approach 1: MLWDF at the subcarrier level [Parag05]

- For each subcarrier *n*:
 - $i_n = \arg \max_k \gamma_k W_k R_{k,n}$
 - W_k : Head-Of-Line (HOL) packet delay for user k
 - *R_{k,n}*: Rate achievable for user *k* on subcarrier *n*
 - Power allocation needed to allocate subcarriers
 - Uniform/fixed power allocation assumption
- Approach 2: [Song04]
 - Mean packet waiting time instead of Head-Of-Line (HOL) packet delay
 - Other utility functions based on mean packet waiting time

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Introduction

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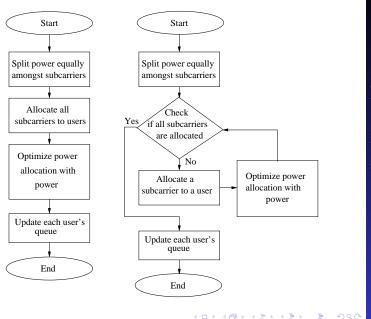
OFDM Resource Allocation

Our Algorithm Results

CDMA Resource Allocation Results

Summary

Joint Subcarrier and Power Allocation



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Introduction

Probler

OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

Joint Subcarrier and Power Allocation (JSPA)

- Optimal JSPA too complex
- Sub-optimal JSPA
 - Power optimization after each subcarrier is allocated leads to better allocation of the remaining suncarriers
 - Power allocation to each user proportional to the number of subcarriers allocated
 - HOL delay is estimated after each subcarrier is allocated

- Some practical constraints included
 - Discrete-rate constraint: Integer bit M-QAM constellations
 - Extension to band-wise allocation: reduced signaling/feedback

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Introduction

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CDMA Resource Allocation Results

Summary

Simulation Setup

- 128 subcarrier OFDM system
- 12 users, Bernoulli packet arrival, 100 slot buffer
- 6-tap multipath channel, average channel conditions are different for each user
- QPSK to 64-QAM

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Introduction

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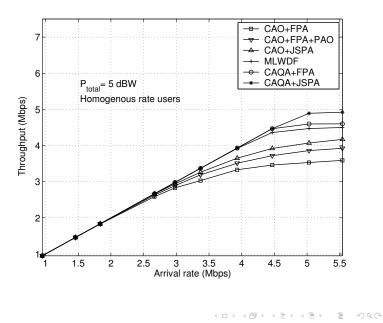
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Summary

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Results: Throughput vs. Arrival Rate



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Introduction

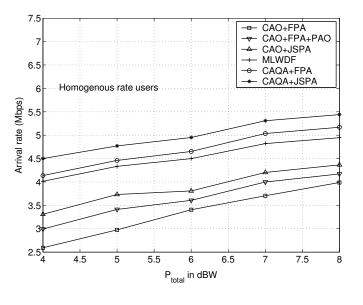
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CDMA Resource Allocation Results

Summary

Results: Max. Arrival Rate vs. Transmit Power



► Max. arrival rate for less than 0.5% packets dropped

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Introduction

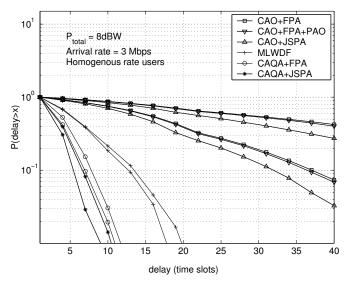
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CDMA Resource Allocation Results

Summary

Results: Delay Performance



► Best and worst delay performance among users plotted

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Introduction

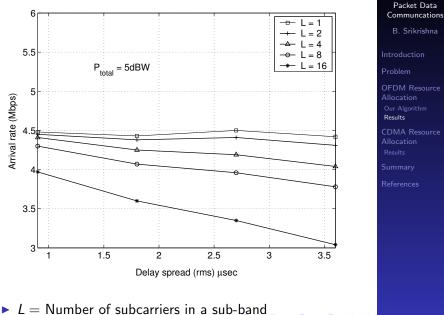
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OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

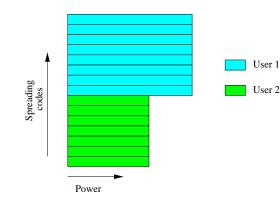
Results: Band-wise Allocation



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Resource Allocation in CDMA



- Available resources:
 - Spreading codes
 - Transmit power
- For any given user, all spreading codes are similar (in terms of channel conditions).

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Multiuser Scheduling

- Most algorithms are single-user scheduling algorithms
 - Proportionally Fair [Tse02]
 - MLWDF [Andrews00]
- Recent results on multi-user scheduling algorithms
 - Greedy and pairwise greedy allocation [Kumaran05]

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Gradient-based scheduling [Agrawal04]

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Introduction

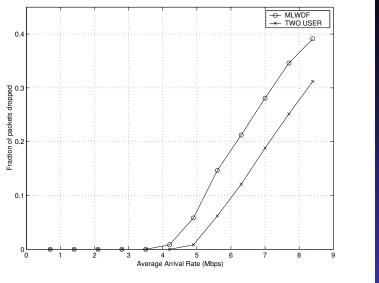
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OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

Results: Maximum Supportable Traffic



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B. Srikrishna

Introduction

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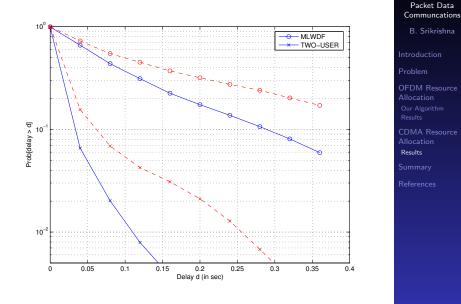
CDMA Resource Allocation Results

Summary

References

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Results: Delay Performance



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Dynamic Resource

Allocation for Efficient Wireless

Summary

- Dynamic resource allocation is essential to achieve high spectral efficiency
- Adaptation based on both channel and traffic information
- Some new results for OFDM and CDMA systems
 - Joint subcarrier and power allocation in OFDM
 - Multiuser scheduling in CDMA
- Several open problems:
 - Optimality
 - Quantifying the signaling/feedback overhead

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B. Srikrishna

Introduction

Problen

OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

References

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Dynamic Resource Allocation for Efficient Wireless Packet Data Communcations

B. Srikrishna

Introduction

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OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

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Dynamic Resource Allocation for Efficient Wireless Packet Data Communcations

B. Srikrishna

Introduction

Problem

OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary

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Dynamic Resource Allocation for Efficient Wireless Packet Data Communcations

B. Srikrishna

Introduction

Probler

OFDM Resource Allocation Our Algorithm Results

CDMA Resource Allocation Results

Summary