



RTOP: OPTIMAL USER GROUPING AND SFN CLUSTERING FOR MULTIPLE EMBMS VIDEO SESSIONS

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WHY LIVE VIDEO?

- Live video is the **fastest growing traffic** over the Internet
 - 20% of all video traffic by 2022. 15-fold increase from 2017

<https://www.cisco.com/c/en/us/solutions/collateral/service-provider/visual-networking-index-vni/white-paper-c11-741490.html>

VIDEO-ON-DEMAND



LIVE STREAMING

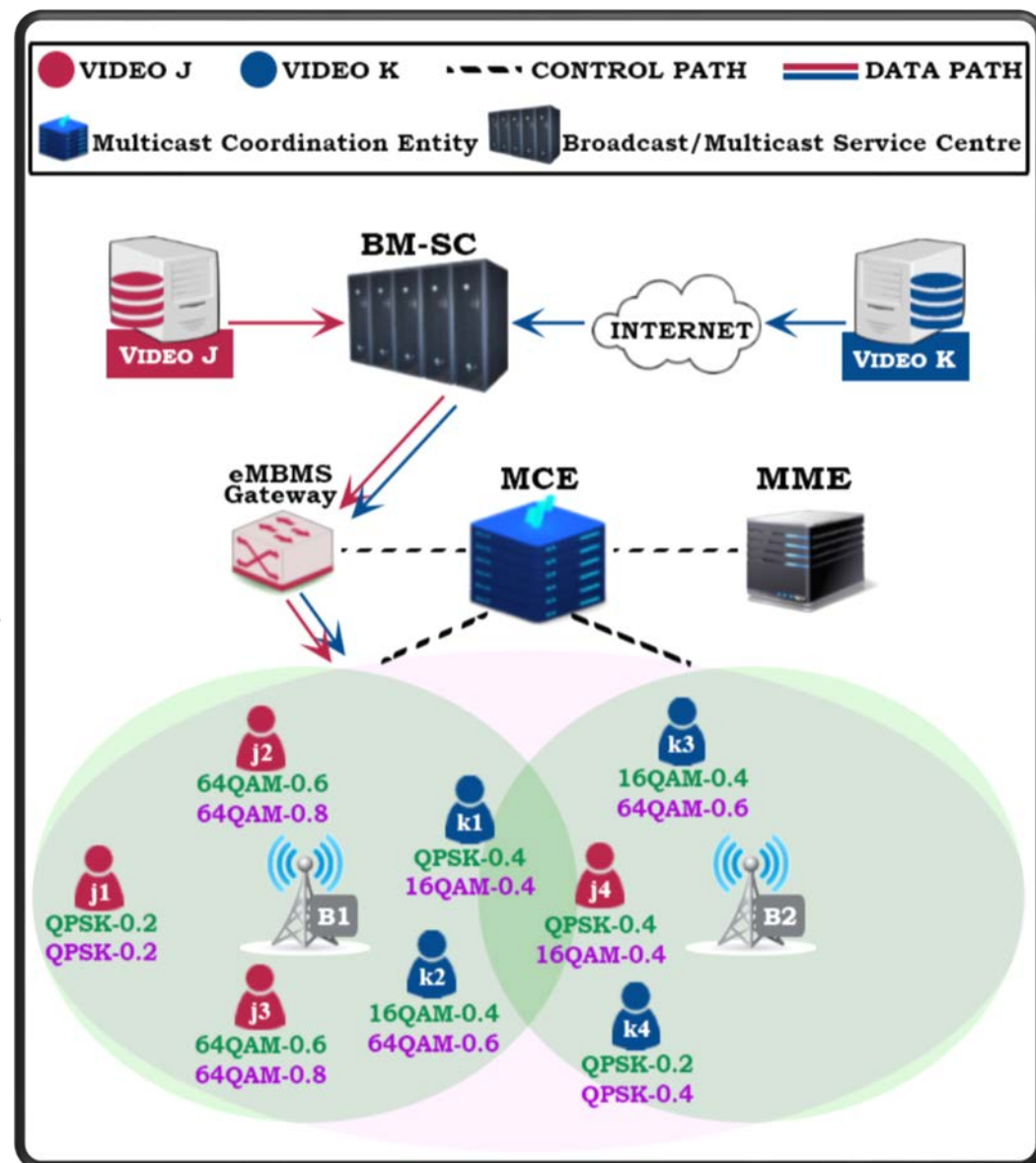


- Flash-crowds and mega-events are challenging to handle
 - Especially for cellular operators, due to the **limited wireless spectrum**

WHAT IS EMBMS?

- Evolved Multimedia **Broadcast Multicast** Service
- A 3GPP standard for: 3G, 4G and **most likely 5G**
- Improves the **utilization** of scarce cellular resources
- Two key features:
 - **User groups**: Based on channel conditions
 - **Single Frequency Network** (SFN)

We propose an **optimization model** and real-time heuristics for eMBMS that makes the best use of the available resources and **maximizes user experience**

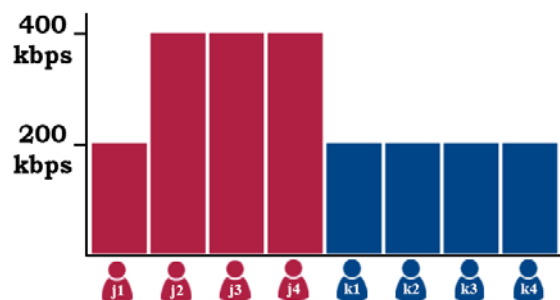
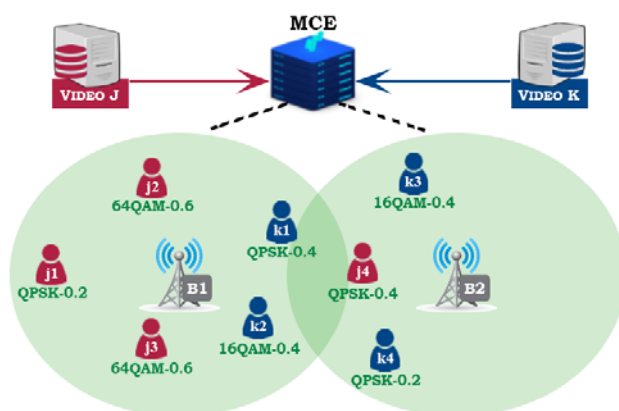




EXAMPLE: UNICAST & STANDARD EMBMS

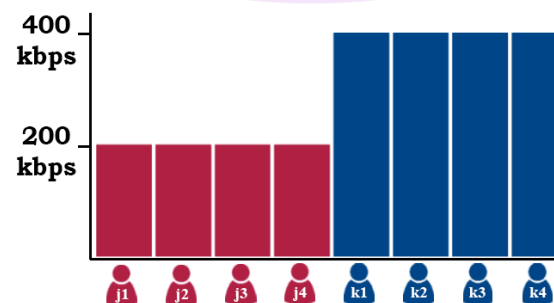
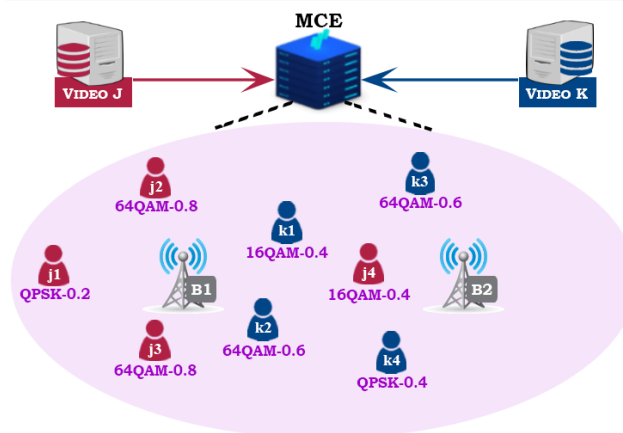
- Two videos each served at two different bitrates: **200 kbps** and **400 kbps**
- 10 resource blocks** available for eMBMS at each base station

CASE A: NO EMBMS



Utility = **44.46** & Avg. Rate = **275**

CASE B: STANDARD EMBMS



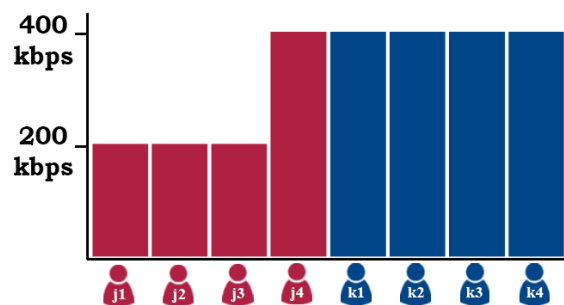
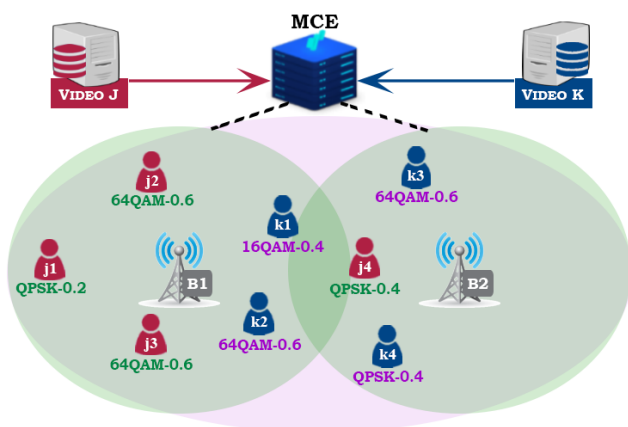
Utility = **45.12** & Avg. Rate = **300**



EXAMPLE: SFN CLUSTERS & USER GROUPS

- Two videos each served at two different bitrates: **200 kbps** and **400 kbps**
- 10 resource blocks** available for eMBMS at each base station

CASE C: SFN CLUSTERS (1)



Utility = **45.84** & Avg. Rate = **325**

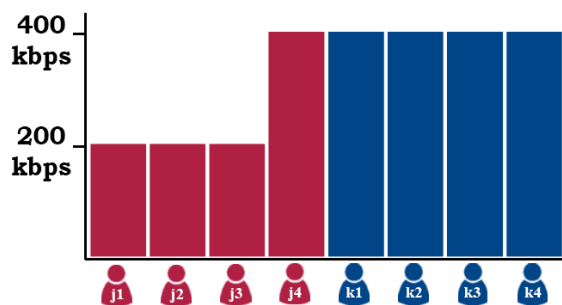
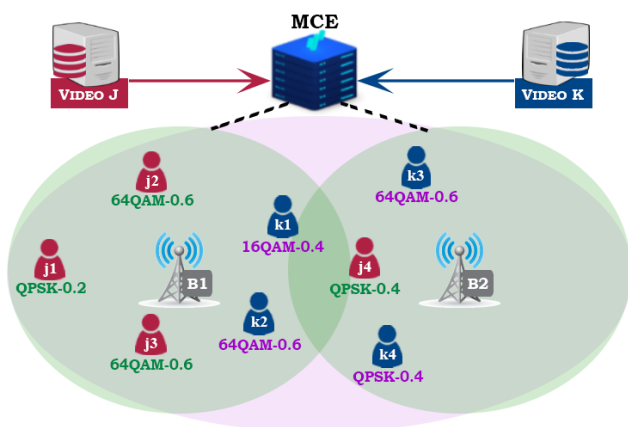
(1): R. Sivaraj et al., "BoLTE: Efficient network-wide LTE broadcasting", ICNP 2017



EXAMPLE: SFN CLUSTERS & USER GROUPS

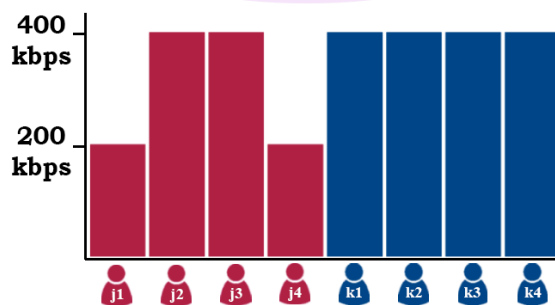
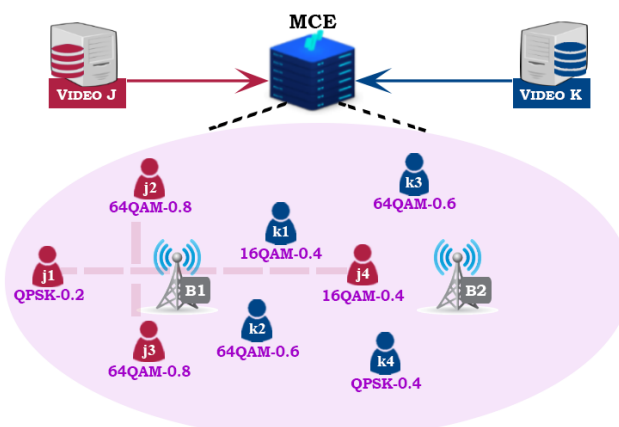
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CASE C: SFN CLUSTERS (1)



Utility = **45.84** & Avg. Rate = **325**

CASE D: USER GROUPS (2)



Utility = **46.54** & Avg. Rate = **350**

(1): R. Sivaraj et al., "BoLTE: Efficient network-wide LTE broadcasting", ICNP 2017

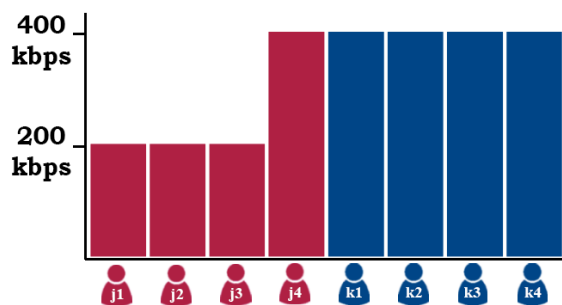
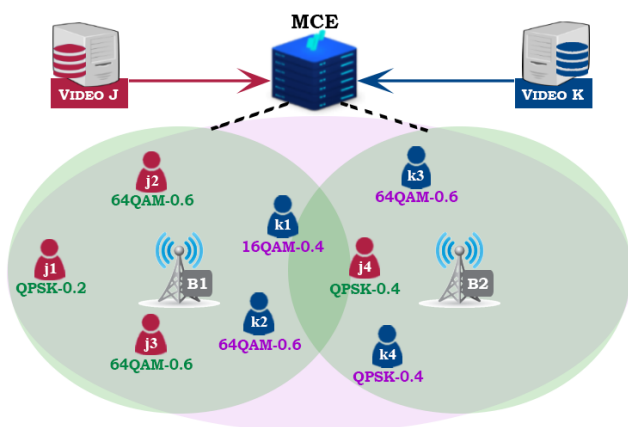
(2): J. Chen et al., "Fair and optimal resource allocation for LTE multicast (eMBMS): Group partitioning and dynamics", INFOCOM 2015



EXAMPLE: SFN CLUSTERS & USER GROUPS

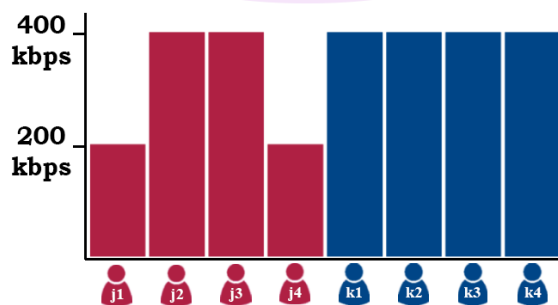
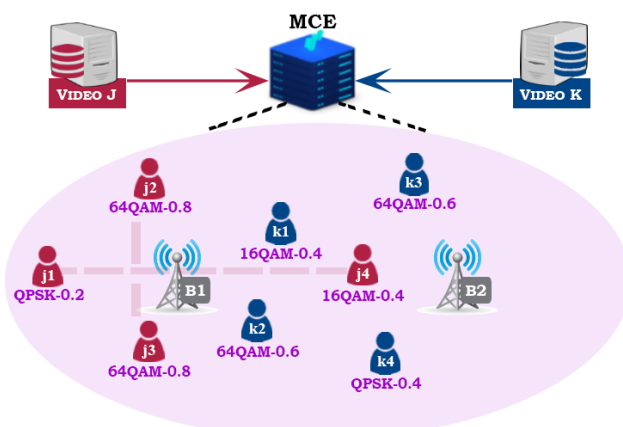
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CASE C: SFN CLUSTERS (1)



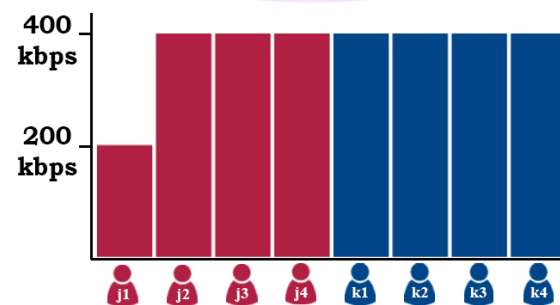
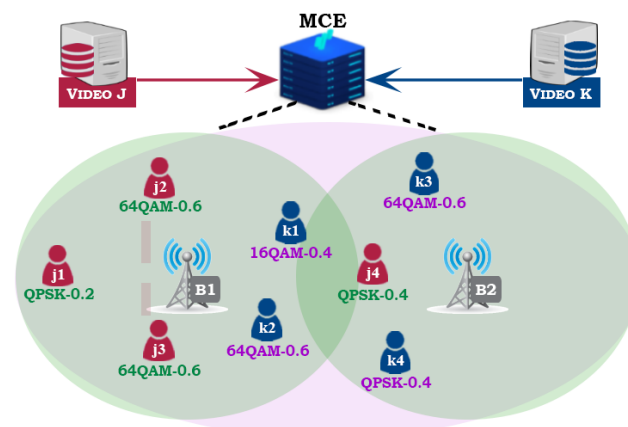
Utility = **45.84** & Avg. Rate = **325**

CASE D: USER GROUPS (2)



Utility = **46.54** & Avg. Rate = **350**

CASE E: JOINT SOLUTION



Utility = **47.24** & Avg. Rate = **375**

(1): R. Sivaraj et al., "BoLTE: Efficient network-wide LTE broadcasting", ICNP 2017

(2): J. Chen et al., "Fair and optimal resource allocation for LTE multicast (eMBMS): Group partitioning and dynamics", INFOCOM 2015



OPTIMIZATION MODEL

Outputs: **eNB configurations – Bitrates for user groups – RBs for user groups**

Maximize **Rate-based utility function for user groups of all videos**

Subject to: **Available resources at each eNB** **Clusters not overlapping**

Each user assigned a bitrate

Users able to decode bitrates



OPTIMIZATION MODEL

Outputs: **eNB configurations – Bitrates for user groups – RBs for user groups**

$$P_{vp}$$

$$M_{vpcer}$$

$$X_{vpcer}$$

Maximize **Rate-based utility function for user groups of all videos**

$$\sum_{v \in V} \sum_{p \in P} P_{vp} \cdot \sum_{c \in p} \sum_{r \in R_v} \left(f(r) \cdot \sum_{e=1}^E M_{vpcer} \cdot M_{vpce} \right)$$

Subject to: **Available resources at each eNB**

$$\sum_{v \in V} \sum_{p \in P} \sum_{c \in p} \sum_{r \in R_v} b_{pc} \cdot X_{vpcer} \leq \min(\alpha T, T - Y_b)$$

Clusters not overlapping

$$\sum_{p \in P} P_{vp} = 1, \forall v \in V$$

Each user assigned a bitrate

$$\sum_{p \in P} \sum_{c \in p} \sum_{r \in R_v} \sum_{e=1}^E M_{vpcer} \cdot M_{vpce} = M_v, \forall v \in V$$

Users able to decode bitrates

$$X_{vpcer} \geq \max_e \left(\frac{M_{vpcer} \cdot r}{S_e} \right), \forall r \in R_v, c \in C$$



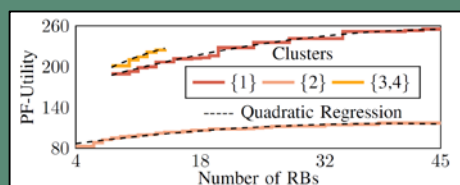
HEURISTICS: OVERVIEW

- Finds the **optimal** solution or a near-optimal solution with **less than 1% gap**
- Solves the problem in less than 500ms **regardless of the number of users**

CHOOSE CANDIDATE ENB CONFIGS. FOR EACH VIDEO



FIND UTILITY VS RB GRAPHS FOR CANDIDATE CONFIGS.

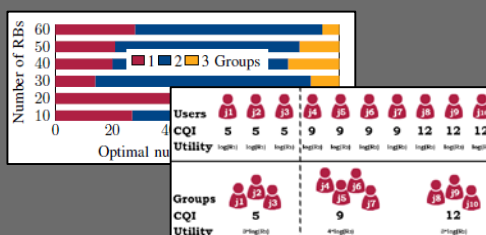


SOLVE FOR DIFFERENT COMBINATIONS OF CANDIDATE CONFIGS.

$$\max \sum_{v \in V} \sum_{c \in P_v} i_{vc} \cdot X_{vc}^2 + j_{vc} \cdot X_{vc} + k_{vc}$$

$$X_{vc} \geq L_{vc}, \forall v \in V, c \in C$$

FIND THE UTILITY OF PARTITIONING USERS





HEURISTICS: ENB CONFIGURATION

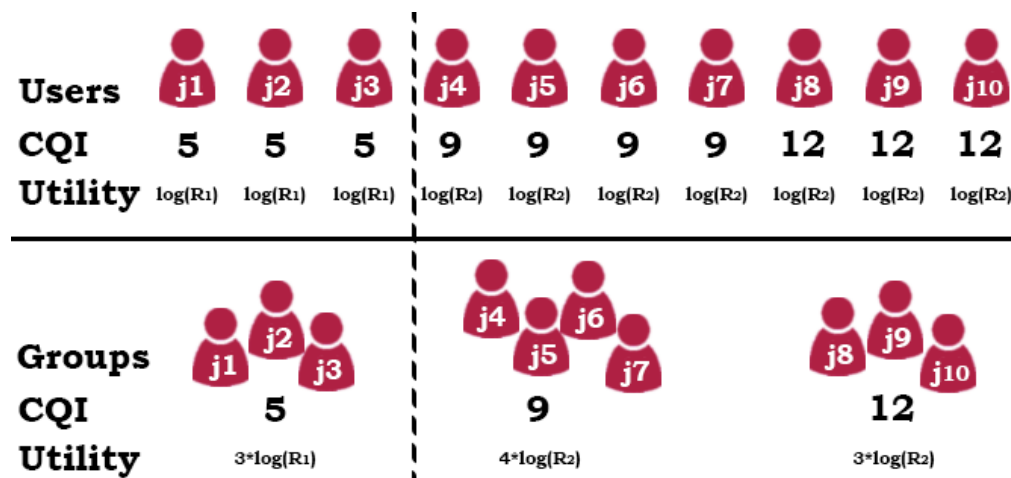
- Classify configurations based on the **number of clusters** in them
- For multiple video** scenarios, choose one configuration from each class

	● Number of Clusters	● A cluster in an eNB configuration	● Utility of a cluster	● eNB configuration name and utility	● Best eNB configuration in a class
n = 1					
				1a	
		{1,2,3,4}	597	Util.	597
n = 2					
	2a	{1} {2,3,4}	249 334	Utility 583	
	2b	{1,2} {3,4}	370 226	Utility 596	
	2c	{1,2,3} {4}	541 99	Utility 640	
	2d	{1,3,4} {2}	473 117	Utility 590	
	2e	{1,3} {2,4}	414 198	Utility 612	
	2f	{1,2,4} {3}	438 145	Utility 583	
	2g	{1,4} {2,3}	337 262	Utility 599	
n = 3					
	3a	{1} {2} {3,4}	255 117 226	Utility 598	
	3b	{1} {2,3} {4}	262 262 99	Utility 623	
	3c	{1,2} {3} {4}	377 145 99	Utility 621	
	3d	{1} {2,4} {3}	262 198 145	Utility 605	
	3e	{1,3} {2} {4}	415 117 99	Utility 631	
	3f	{1,4} {2} {3}	336 117 145	Utility 598	
n = 4					
	4a	{1} {2} {3} {4}	262 117 145 99	Utility 623	

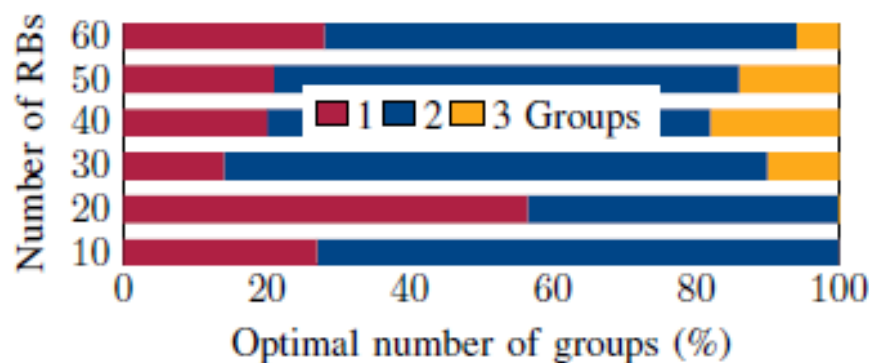


HEURISTICS: USER GROUPS

- Pre-group users** based on their CQI values



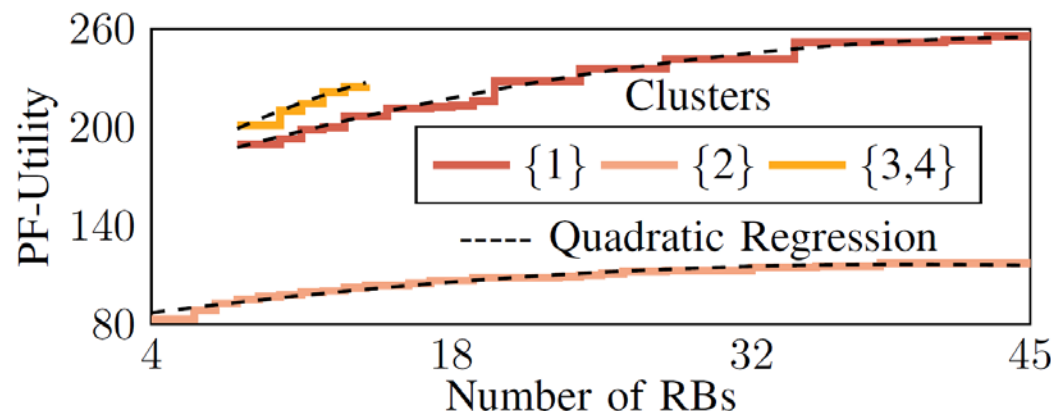
- Limit the maximum **number of groups allowed** for users





HEURISTICS: RESOURCE ALLOCATION

- Use **quadratic regression** to approximate Utility vs RB graphs for each SFN cluster



- Solve the resource allocation problem with **regressed graphs** for videos and clusters

Maximize: **Utility for all videos in their clusters**

$$\max \sum_{v \in V} \sum_{c \in P_v} i_{vc} \cdot X_{vc}^2 + j_{vc} \cdot X_{vc} + k_{vc}$$

Subject to: **Available resources at each eNB**

Allocate sufficient RBs to each video

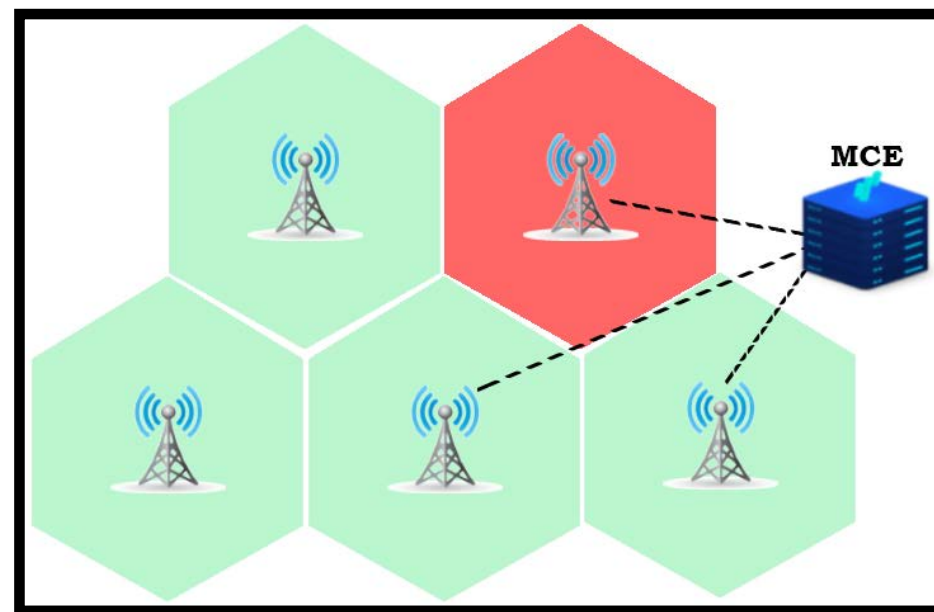
$$\sum_{v \in V} \sum_{c \in P_v} b_{pc} \cdot X_{vc} \leq \min(\alpha T, T - Y_b), \forall b \in B$$

$$X_{vc} \geq L_{vc}, \forall v \in V, c \in C$$



EVALUATION

- Discrete event-based simulation testbed with **LTE/4G** physical-layer parameters
- Comparison with state-of-the-art approaches
 - **BoLTE (1)**: Creates **SFN clusters** but no user groups
 - **VG (2)/LSFN**: Only creates **user groups**
- Two different simulation scenarios:
 - Generic: **Multiple videos**
 - **Mega-Event**: Large number of users
- Realistic user distributions
 - Uniform: e.g. Shopping malls
 - Normal: e.g. Stadiums
- Performance metrics:
 - **Proportional fairness** utility
 - **Probability Mass Function** of user-bitrates
 - Degraded users: Throughput lower than all bitrates
 - Computation time: Time taken to find the solution



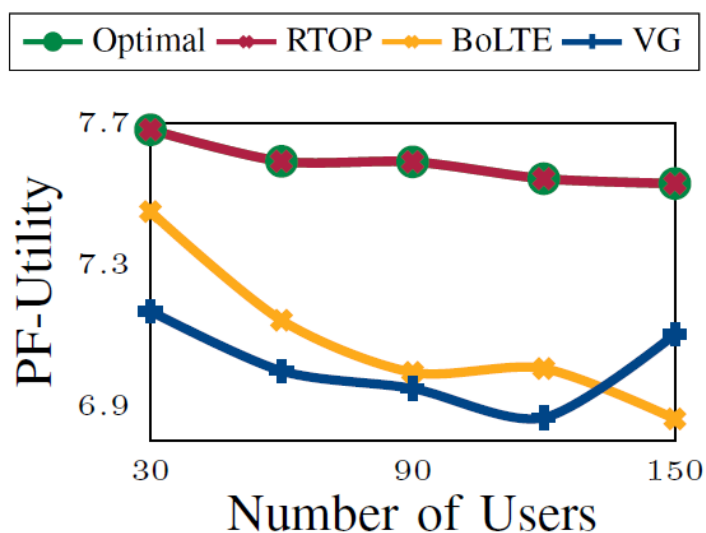
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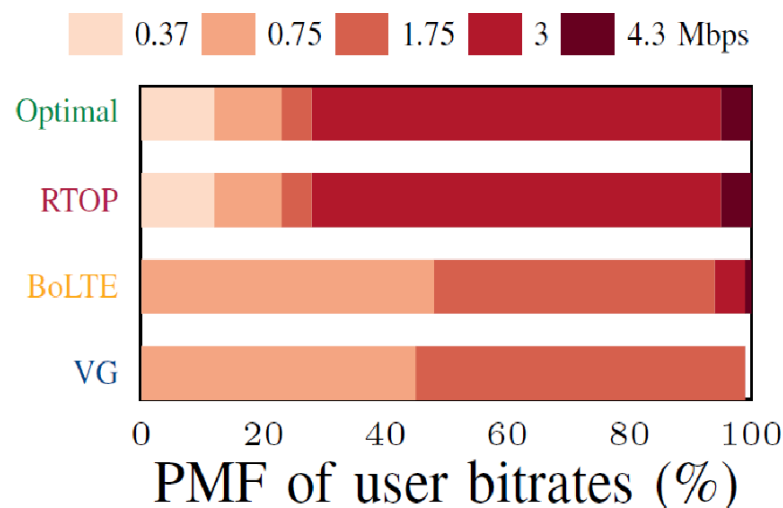


RESULTS: UTILITY & PMF

- Our approach:
 - **Increases the percentage of users receiving high bitrates** (5% to 75%)
 - Reduces the percentage of users receiving low bitrates (50% to 20%)



**AVERAGE SYSTEM UTILITY
ACHIEVED PER USER**

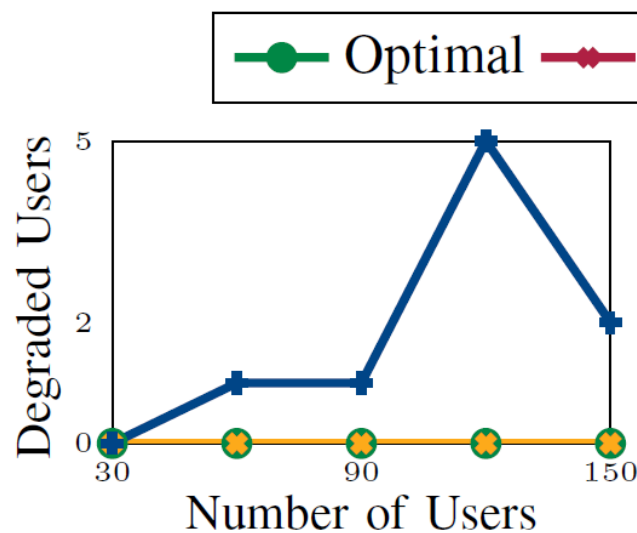


**PROBABILITY MASS FUNCTION OF
BITRATES ASSIGNED TO USERS**

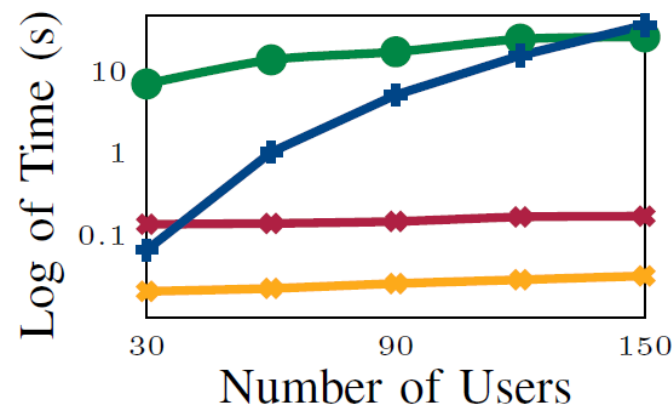


RESULTS: DEGRADED USERS & TIME

- Our approach:
 - Ensures that each user is assigned a bitrate
 - Solves the problem **in real-time** and does not increase with number of users



TOTAL NUMBER OF
DEGRADED USERS



TIME TAKEN TO FIND THE
FINAL SOLUTION

Rapid increase in popularity of live video streaming created challenges for cellular operators

User grouping and SFN clustering problems should be jointly optimized for eMBMS users

We maximize user experience rather than lower-layer network throughputs

Real-time heuristics for practical deployment in dynamic cellular networks



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