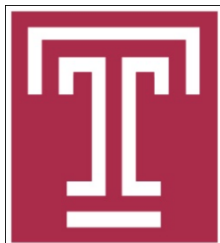


Minimizing the Subscription Aggregation Cost in the Content- based Pub/Sub System

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Road Map



- Introduction
- Subscription aggregation problem
- Proposed subscription aggregation algorithm
- Subscription tree construction
- Experiments
- Conclusion and future work

Introduction

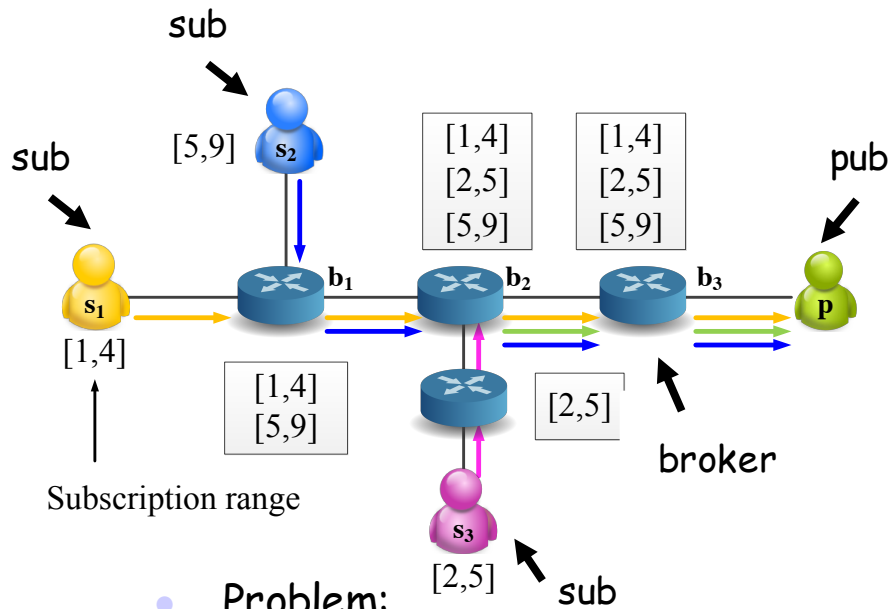


- Content-based pub/sub system
 - Messages are only delivered to a subscriber if the attributes or content of those messages match a subscription range.
 - Some subscription examples:
 - stock trade (issue = "IBM" & price < 120 & volume > 1000);
 - car brand (made = "ford" & price > 10,000 & price < 20,000);
 - news delivery (all the sports channels).
- Real projects:
 - IBM Gryphon, Microsoft's OpenPS project, WS-Messenger, SIENA, and Hermes.

Subscription Aggregation Problem

- Subscription tree

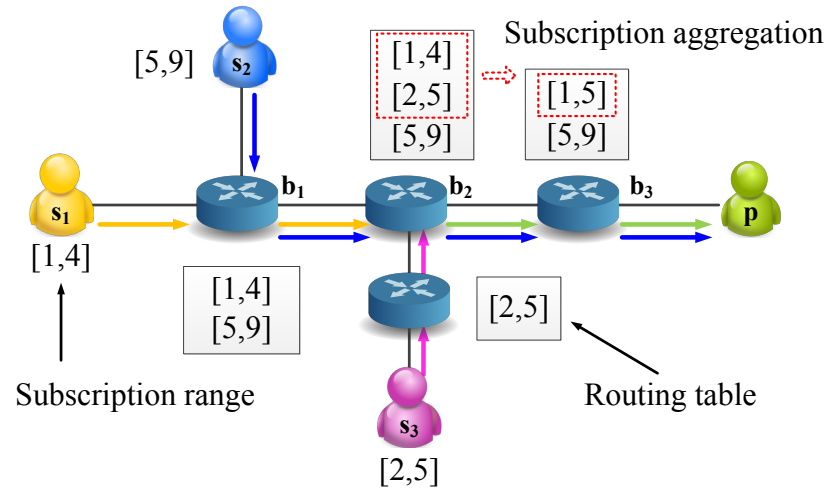
- Without subscription aggregation



Network congestion
High broker load

- Subscription aggregation (Benefit)

- Aggregate several subscriptions into one subscription

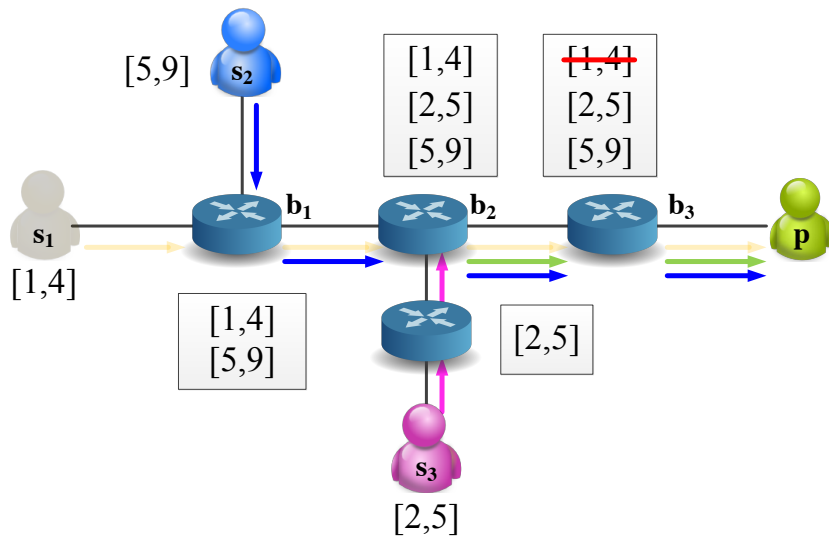


Reduce the routing table; reduce the bandwidth consumption; accelerate the routing decision

Subscription Aggregation Problem

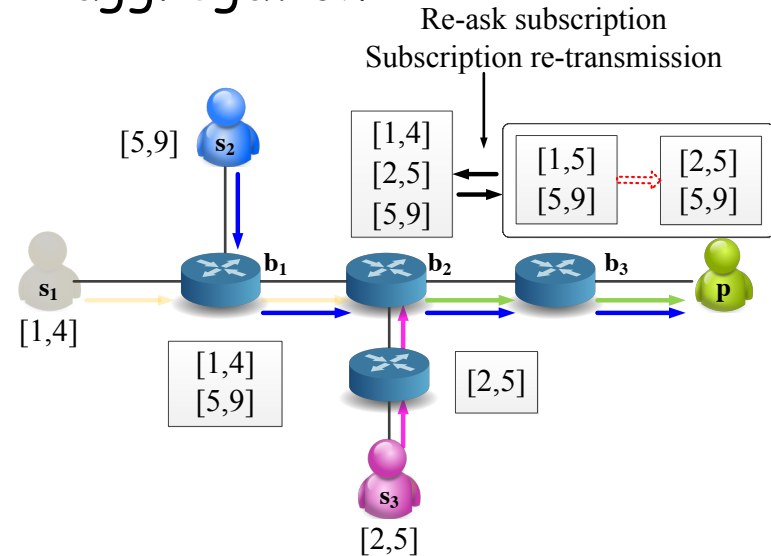
In a dynamic environment (e.g., s_1 leaves and reports immediately)

- Without subscription aggregation



- Update routing table
- (immediate)

- Cost of Subscription aggregation



- Re-ask subscription
- Subscription re-transmission
- (re-configuration needs time)

Challenges



- There is a trade-off between benefit and cost in the subscription aggregation.
- Questions:
 - **Where** to do the subscription aggregation?
 - Which broker should we try to do subscription aggregation?
 - **How** to do the subscription aggregation.
 - Which subscriptions should be aggregated?

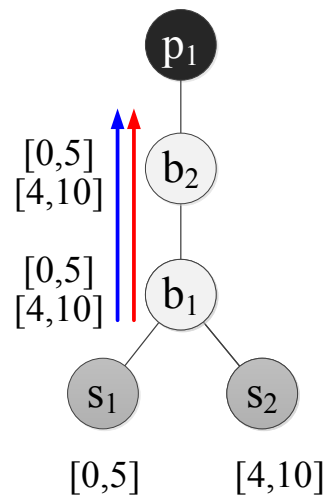
Subscription Aggregation Problem

- Model:

- Network benefit

- Proportional to the bandwidth saving amount.

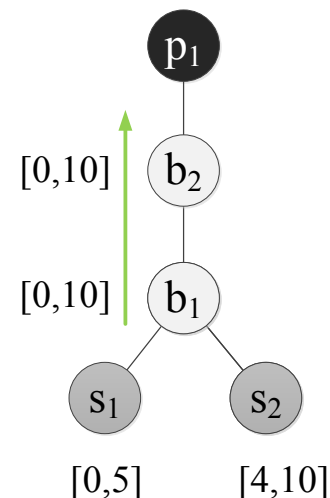
- Without subscription aggregation



- Subscription aggregation

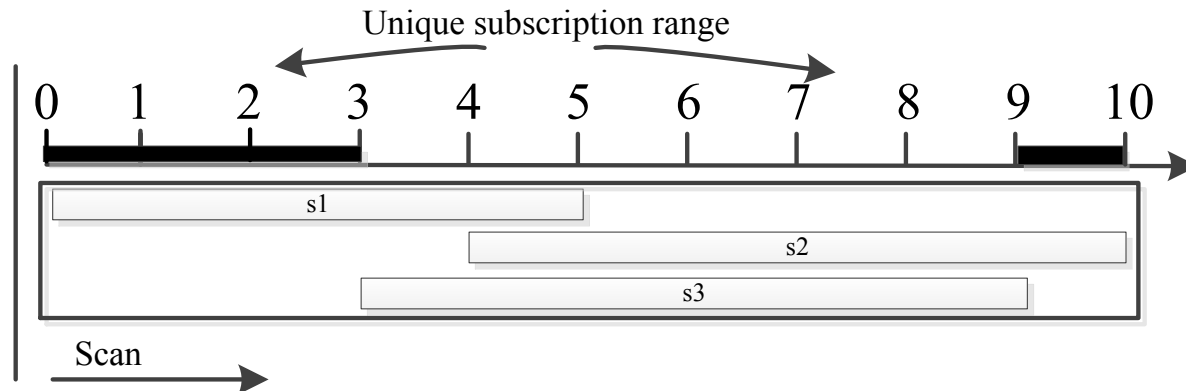
- Saving 2 bandwidth

-



Subscription Aggregation Problem

- Model:
 - Cost (the production of the two following metrics)
 - Unique subscription range (false subscription range after *one* subscriber leaves)



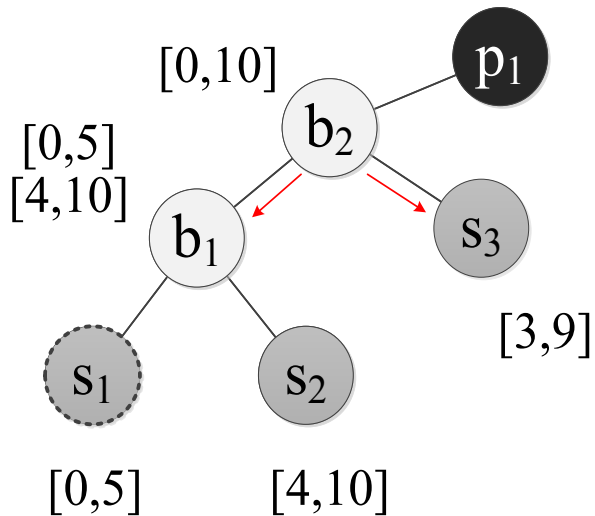
- Re-configuration delay
 - the largest hop counts to the aggregation broker.

Subscription Aggregation Problem

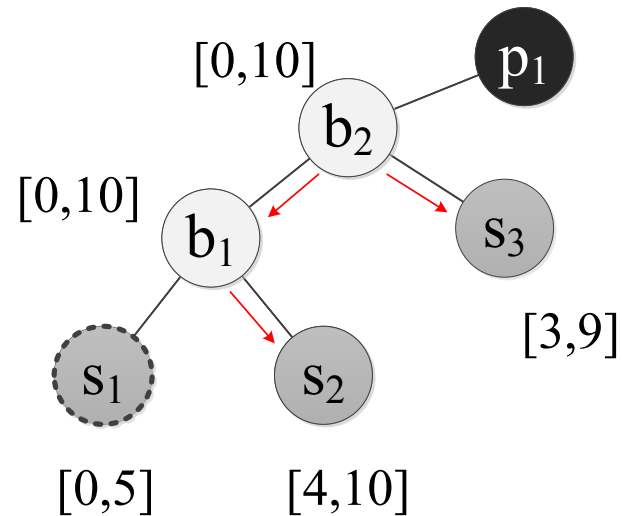
- Model:

- An illustration of cost (s_1 leaves the network)

- Range $[0, 3]$ (size of 3) becomes false subscription range



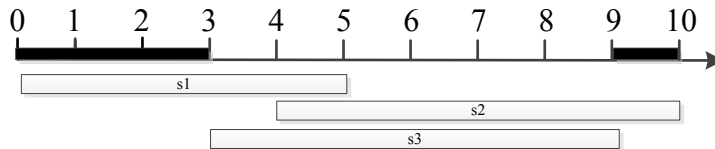
Cost: 3



Cost: $3*2$

Related works

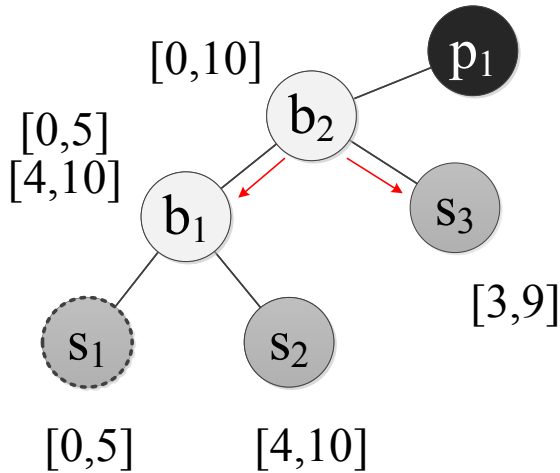
- Congestion Avoidance with Incremental Filter Aggregation in Content-Based Routing Networks, ICDCS, 2015.
- High-level idea (a threshold-based method):
 - For each broker
 - Calculate the subscription similarity of all the subscriptions through this broker
 - Once the subscription similarity of a broker exceeds a threshold,
 - aggregate **all** its subscriptions.
- Subscription similarity
 - 1 - unique subscription range/the whole subscription range



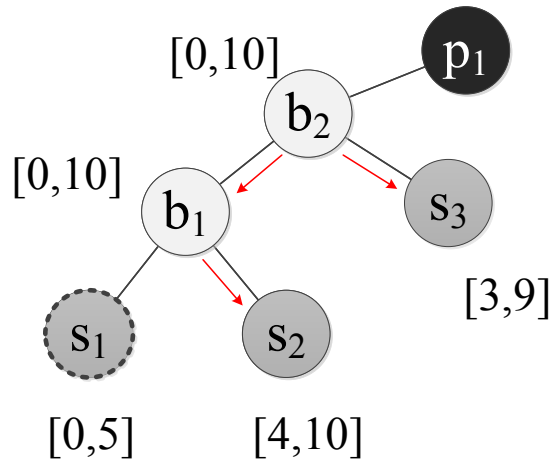
60%

Related works

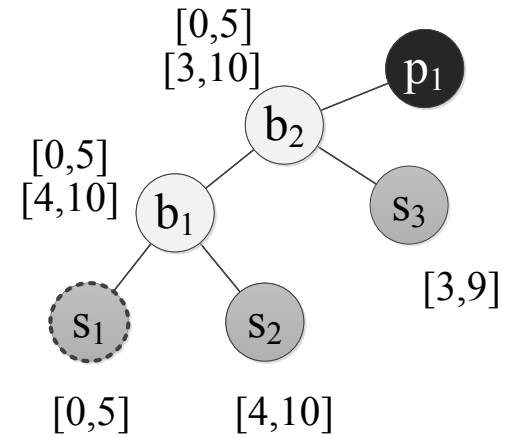
- An illustration (s1 leaves the network)



S1, S2 and S3
are aggregated at b2
Benefit: 2 Cost: 3



S1, and S2 are aggregated at b1,
then aggregated with s3 at b2
Benefit: 3 Cost: 3*2



S2 and S3
are aggregated at b2
Benefit: 1 Cost: 0

Problem formulation

- Cost minimization problem

- Save a target amount of network resources, while the amount of false-positive publications is minimized.

$$\begin{aligned} \min \quad & \sum_{i \in X} C_{ij} \times \lambda_{ij} \\ \text{s.t.} \quad & \sum_{i \in X} G_{ij} \times \lambda_{ij} \geq \theta \\ & \lambda_{ij} \in \{0, 1\} \end{aligned}$$

the pre-defined target gain
(e.g., the amount to avoid the possible congestion)

- Where λ_{ij} means the aggregation indicator between subscribers i and j , the corresponding cost and benefit are denoted as C_{ij} , G_{ij} correspondingly.

- NP-hard

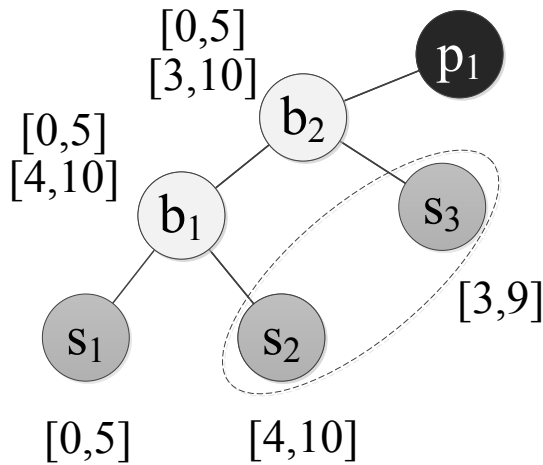
• Subscription aggregation algorithm

• Most-Efficient-First Algorithm (MEFA)

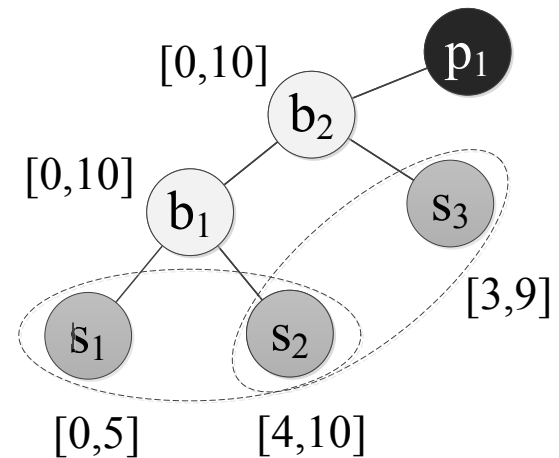
- Initialize $X = \emptyset$;
- Find maximum G_{ij}/C_{ij} ;
- // δ is a control value
- **While** (benefit in $X < \theta$ & $G_{ij}/C_{ij} > \delta$) **do**
 - Add λ_{ij} into set S ;
 - Propagate the pairwise aggregation result to the publisher;
 - Find maximum G_{ij}/C_{ij} ;
- **Return** X .
-

Subscription aggregation algorithm

- An example of MEFA algorithm



Subscription update at b2



- Round1

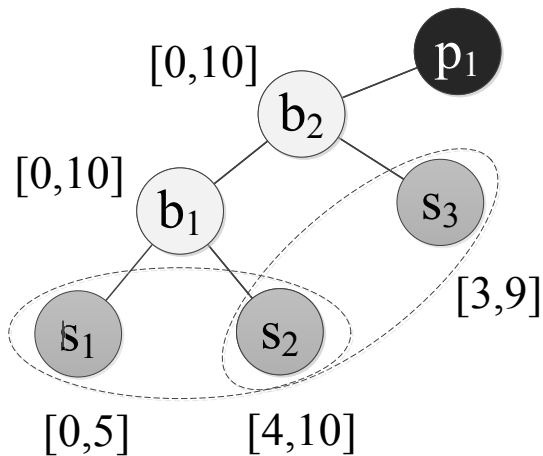
| Aggregation | Benefit | Δ Cost |
|-------------|---------|---------------|
| s1, s2 | 2 | 9*1 |
| s1, s3 | 1 | 9*2 |
| s2, s3 | 1 | 2*2 |

- Round2

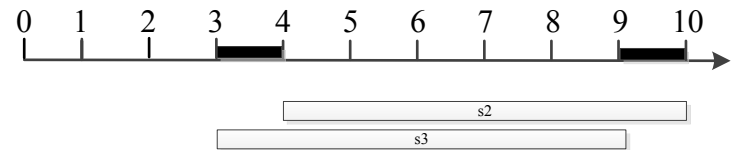
| Aggregation | Benefit | Δ Cost |
|-------------|---------|---------------|
| s1, s2 | 2 | 2*2 |
| s1, s3 | 1 | 2*2 |

Subscription aggregation algorithm

- Calculation of the incremental cost

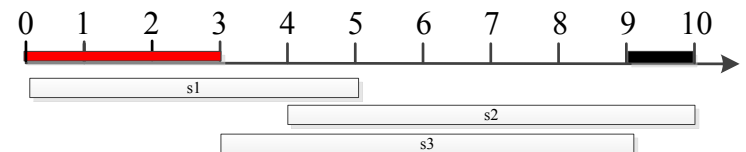


s2 and *s3* aggregate



Incremental cost $2*2$

Then *s1* and *s2* aggregate, after *s2* and *s3* has aggregated.



Incremental cost $(3-1)*2$

- Round2

| Aggregation | Benefit | Δ Cost |
|---------------|---------|---------------|
| <i>s1, s2</i> | 2 | $2*2$ |
| <i>s1, s3</i> | 1 | $2*2$ |

• Subscription aggregation algorithm

• Observations in the MEFA algorithm:

- Incremental benefit is based on individual pairwise units (which can be overlapped) -- linear.
- Incremental cost is calculated from clusters (which are non overlapped) -- sub-modular.

○ Theorem: The MEFA achieves the $1 + c \ln \theta$ asymptotic approximation ratio, where c is a constant value.

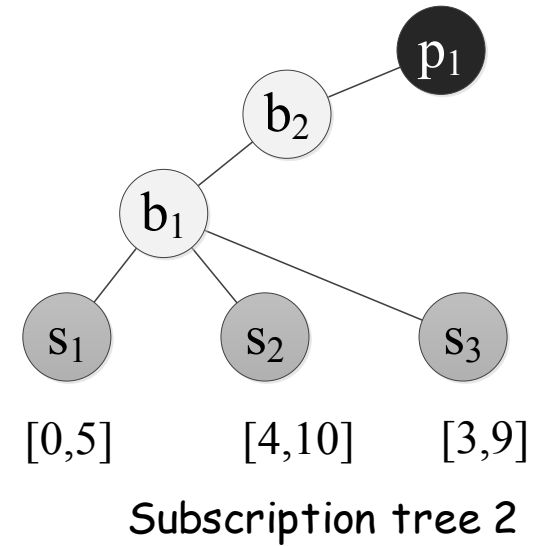
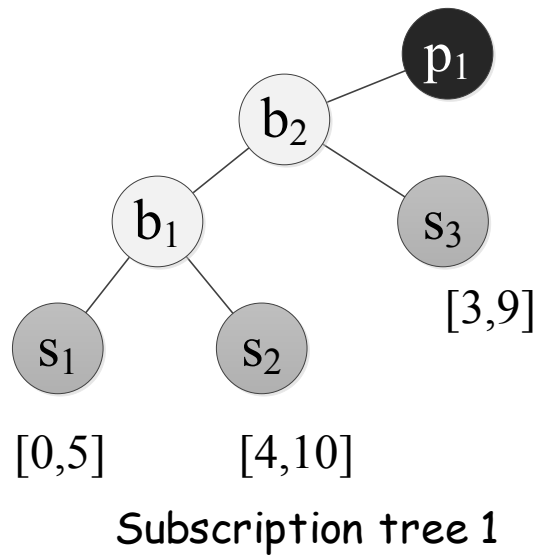
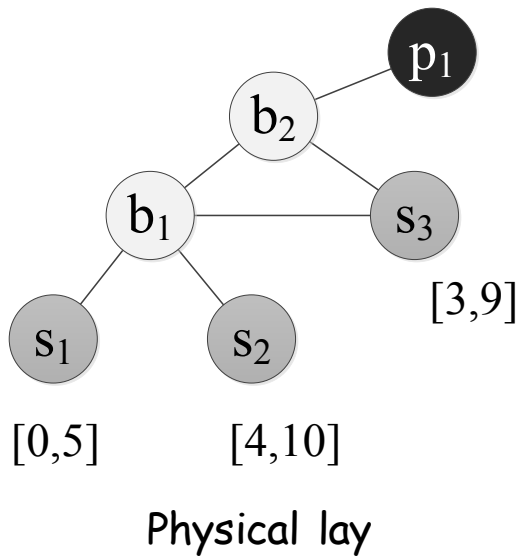


Subscription tree construction

- The construction idea
 - The communication delay ----- physical distance.
 - The unique subscription range ----- social distance.
- The traditional method
 - Only consider the communication delay to construct the subscription tree. May achieve relative poor performance in the subscription aggregation.
- Question
 - How to jointly consider the subscription tree construction in these two dimensions?

Subscription tree construction

- An example



For s_3 , it has two options:

In subscription tree 1, s_3 has smaller delay, larger unique subscription range of b_1

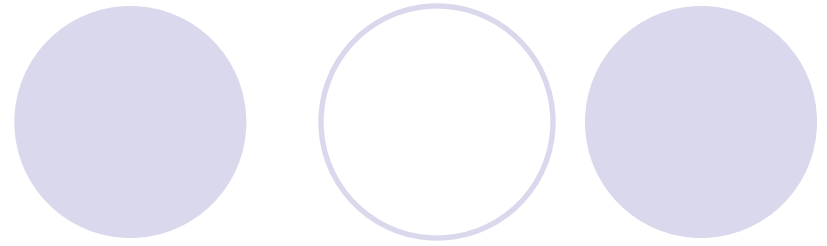
In subscription tree 2, s_3 has larger delay, smaller unique subscription range of b_1

Subscription tree construction

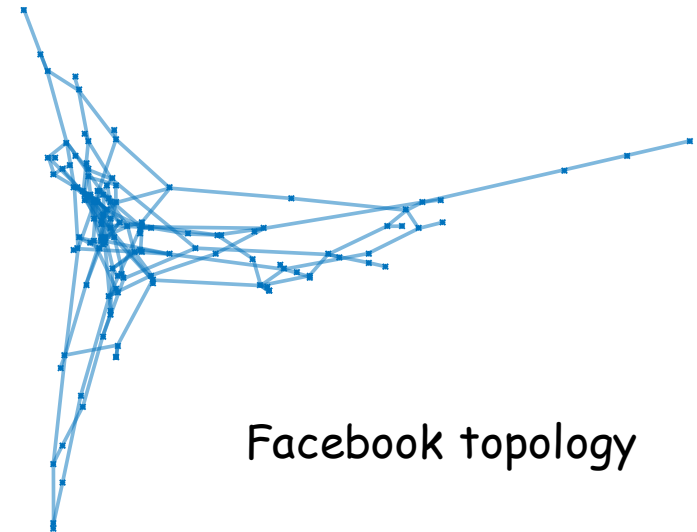
- Greedy algorithm

- Balance the social distance and the physical distances between subscribers.
- Call BFS algorithm to generate a subscription tree;
- Initialize $X = \emptyset$;
- **For** $i = 1:n$ **do**
 - **If** the subscriber i which can be reassigned to another broker j ;
 - // Denote the a_{ij} as the new assignment for subscriber i to broker j .
 - Add a_{ij} into X ;
 - // Denote the Δm_{ij} as the unique subscription range decreasing for b_j , due to a_{ij} .
 - // Denote the Δd_{ij} as the hop count increasing for s_i due to a_{ij} .
- Find maximum $\frac{\Delta m_{ij}}{\Delta d_{ij}}$ in X ;
- **While** ($X \neq \emptyset$ & $\frac{\Delta m_{ij}}{\Delta d_{ij}} > \gamma$) **do**
 - Change the subscription tree using a_{ij} and delete a_{ij} from X ;
 - Find maximum $\frac{\Delta m_{ij}}{\Delta d_{ij}}$ in X ;
-

Experiments

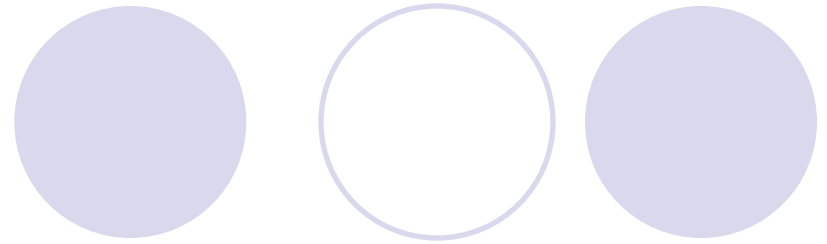


- Trace setting:
 - Real trace
 - Facebook topology trace from Stanford Large Network Dataset Collection (pick first 120 nodes).
 - The node with the largest degree as the publisher.
 - Use BFS algorithm to generate a subscription tree (one pub).
 - 63 leaf nodes are selected as subscribers.
 - Facebook subscription trace from Middleware System Research Group (120 nodes)
 - The min value and max value of a node is regarded as its subscription range's starting point and end point.
 - Average range size 1,687.
 - The subscription range from
 - from 267 to 32,947.



Facebook topology

Experiments



- Trace setting:

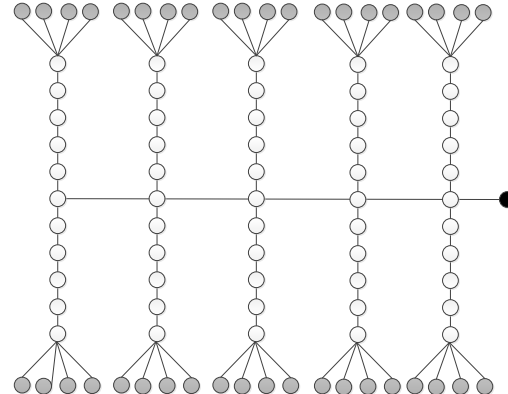
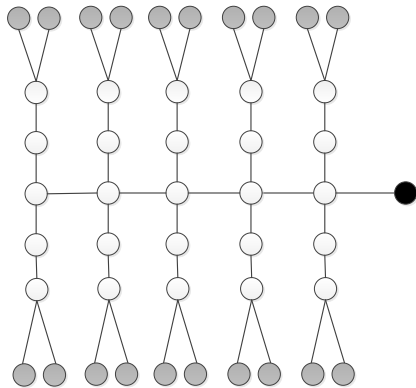
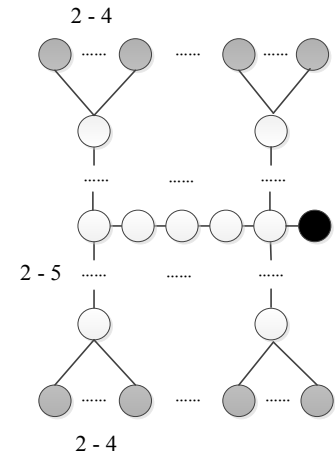
- Synthetic trace

- A subscription tree referred from the *.

- number of nodes from 46 to 96.
- number of subscribers from 20 to 40.

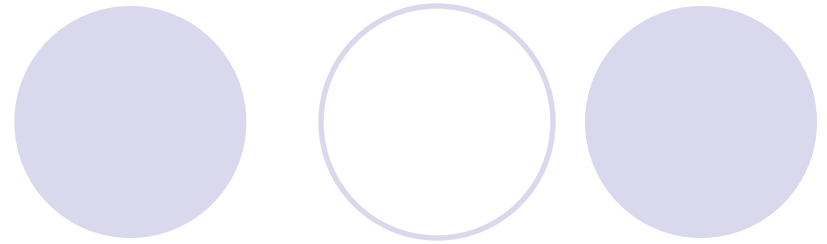
- Some topology examples:

- 46 nodes with 20 subscribers;
- 96 nodes with 40 subscribers.



* M. Chen, S. Hu, V. Muthusamy, and H.-A. Jacobsen, "Congestion avoidance with incremental filter aggregation in content-based routing networks. ICDCS 2015.

Experiments



- Trace setting:

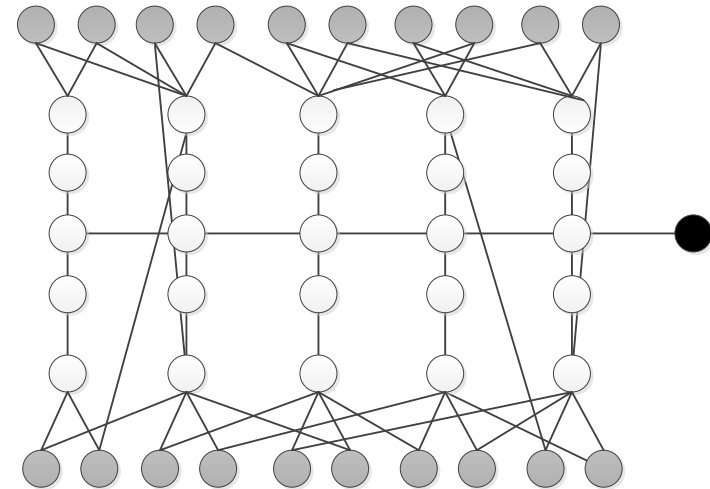
- Synthetic trace

- Node's subscription distribution range
 - Each node has one subscription range.
 - Average subscription size: 20 to 50
 - in a subscription range size of [0,400].

- Uniform distribution
- Exponential distribution
- with parameter 1

- Subscription tree construction.

- Physical layer topology
 - Based on the referred topology.
 - Each subscriber randomly has one more connection with the end broker.



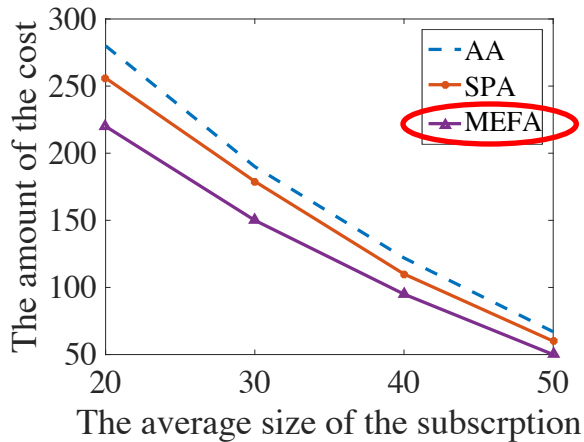


Experiments

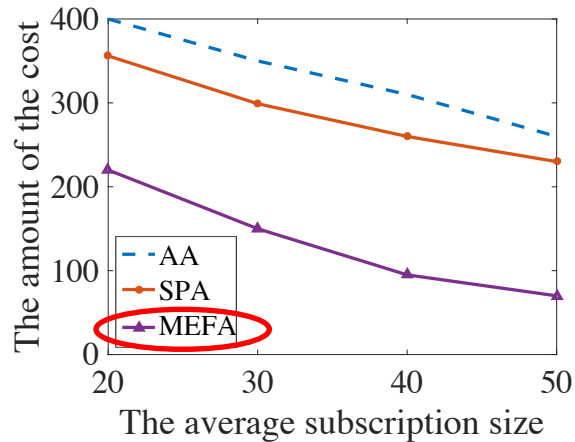
- Algorithm comparison:
 - Subscription aggregation
 - All aggregation (AA) algorithm
 - Aggregate all the subscription range or not.
 - Similarity-pair aggregation (SPA) algorithm
 - Aggregate the subscription ranges based on subscription similarity.
 - Most-efficient-first aggregation (MEFA) algorithm
 - Proposed algorithm.
 - Subscription tree construction
 - Distance-only tree construction algorithm (DO)
 - Proposed similarity considered algorithm (DS)

Experiments

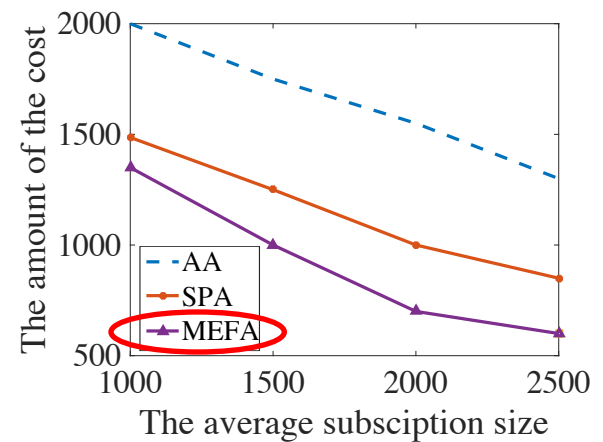
- The performance results of subscription aggregation algorithms ($\theta = 100$)



Uniform subscription range distribution



Exponential subscription range distribution



Real case

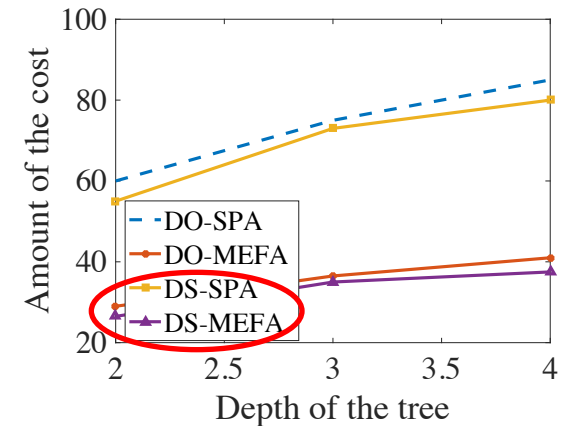
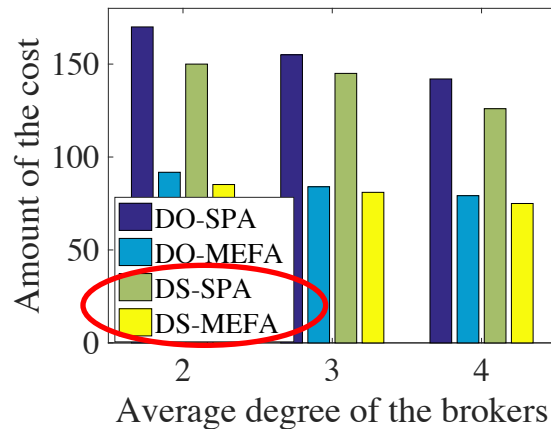
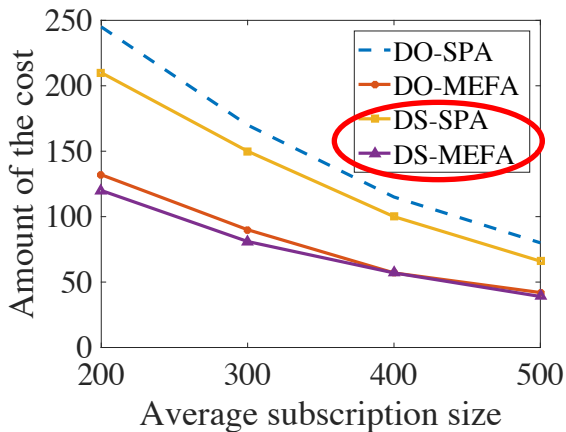
Synthetic traces

Facebook traces

The proposed MEFA algorithm greatly reduces the subscription aggregation cost, especially when the subscription range distribution is the exponential distribution. The proposed MEFA algorithm achieve good performance in real trace.

Experiments

- The influence of the subscription tree construction ($\theta = 100$)



A good subscription tree can further reduce the subscription aggregation cost.

Conclusions

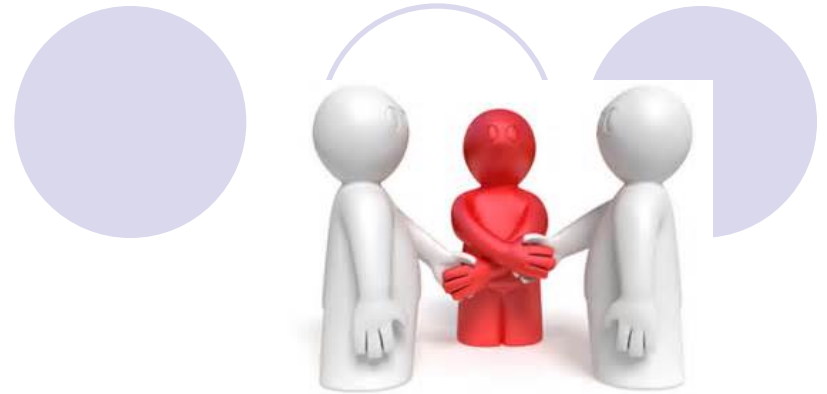


Subscription aggregation problem

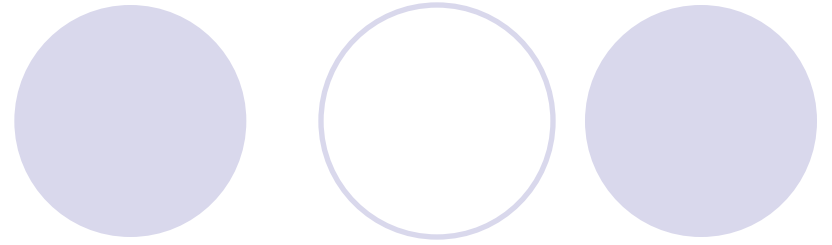
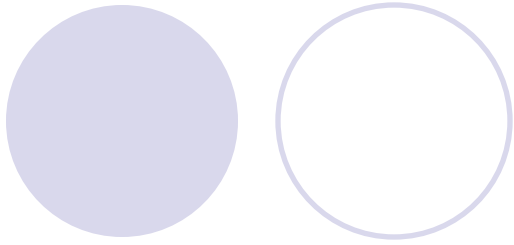
Trade-off between the benefit and the cost

- Partial subscription aggregation
 - Greedy solution with approximation bound
- Subscription tree construction
 - Further adapt the subscription aggregation

Future Works



- Churn situation (Subscribers come and leave)
 - The new coming subscriber can recover the false-positive range
- multiple subscribers leave in a period
 - Report the subscription change together, if the time interval is short to save re-configuration times
- Subscription aggregation strategy re-calculation and subscription tree re-build after a period of time



- Thanks!

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