

## Ontology-Based Routing for Large-Scale Unstructured P2P Publish/Subscribe System

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### ABSTRACT

Recent works in structured P2P systems exploit DHT to support publish/subscribe(Pub/Sub) protocols. Some of these approaches require the existence of a so-called rendezvous node where subscriptions meet events, thus easily creating bottlenecks. By contrast, unstructured P2P systems needn't maintain current topologies for the networks, they are robust. We presents an ontology-based Pub/Sub event routing mechanism, called UP2S2, for modeling and implementing the architecture of large-scale unstructured P2P Pub/Sub System. According to subscription deviation, UP2S2 is divided into multiple subnets. There is a subscription probability tree in each subscription subnet. Events are forwarded along the most likely subscription nodes. We design and implement the algorithms for UP2S2 to construct and reconstruct subscription routing tables, and derive conclusions from the simulation experiments. The results show that UP2S2 routes the events more quickly and accurately.

**Keywords**–LargeScale, P2P, Publish/Subscribe, Routing, Ontology

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### I. INTRODUCTION

Pub/Sub is an asynchronous communication paradigm that supports many-to-many interactions between a set of clients. Pub/Sub communication can be anonymous, where participants are decoupled from space, flow, and time. A Pub/Sub system contains three kinds of clients: a publisher who publishes events, a subscriber who subscribes his interests to the system, and an event broker network to match and deliver the events to the corresponding subscribers. When an event is published, a Pub/Sub system doesn't specify a specific subscriber. After each agent node receives an event, it decides which nodes should be propagated in the next step. Therefore, routing of Pub/Sub system is also called content-based routing(CBR). Routing algorithm resolves how to find an appropriate path in event broker networks, and how to efficiently and reliably route event to the relevant subscribers at a low cost. Both accuracy of event routing and network efficiency are the most important design goals, which determines the size and scalability of the network.

P2P networking is a distributed application architecture that subnets tasks or work-loads between peers. We can classify networks as unstructured or structured. Structured P2P systems impose a specific linkage structure between nodes. In contrast, in unstructured P2P systems, peers are not linked according to a predefined deterministic scheme. Instead, links are created either randomly, or are probabilistically based on some proximity metric between nodes. Because of its advantages, such as rapid information dissemination, and content-based routing, unstructured P2P network has been used to construct the Pub/Sub system in order to improve the ability to improve the efficiency for event routing.

The rest of the paper is organized as follows. In Section 2, we review some related works. Our main methods including the algorithms for constructing and reconstructing subscription routing tables in UP2S2 are presented in Section 3. Both validations and evaluations are given in Section 4. Finally, the paper is concluded in Section 5.

### II. RELATED WORK

Enabling the Pub/Sub services in P2P systems has thus become an interesting topic in recent years. The structured P2P system has its advantage in searching efficiency. To provide subject-based Pub/Sub services, data and queries with a certain topic can be easily mapped and routed to the same node using DHT. Chaabane proposed an approach based on a community-wide ontology in order to allow publishers and subscribers to use a common semantic space to characterize production and consumption of resources and services. Based on this ontology, these ontology-based community topics are used to compute keys for routing events in a DHT[1]. Setty presented PolderCast, a P2P architecture for topic-based Pub/Sub which aims to achieve relay-free, fast and robust

dissemination over a scalable overlay with a minimal maintenance cost[2]. Pandey presented the architecture of distributed mobile brokers which are dynamically reconfigurable in the form of structured P2P overlay and act as rendezvous points for matching publications and subscriptions[3]. Pellegrino introduced two versions of a content-based Pub/Sub matching algorithm for RDF described events, working on an adapted version of the CAN structured P2P network designed to both store and disseminate RDF events[4]. Einziger introduced Postman, a Pub/Sub architecture tailored for self-sustained service independent P2P networks. Postman is designed to provide its users with a self-organizing, scalable, efficient and churn resilient Pub/Sub service[5]. Detti discussed the benefits of building mobile Ad-hoc networks Pub/Sub system exploiting content centric networking technology, rather than TCP/IP, and presented different design approaches, and described a topic-based Pub/Sub content centric networking system[6]. Tryfonopoulos studied the problem of distributed resource sharing in p2p networks, focused on the problem of information filtering, used an extension of the DHT Chord to organize the nodes and store user subscriptions, and utilized efficient publication protocols that keep the network traffic and latency low at filtering time[7].

Compared with the structured P2P-based Pub/Sub system, the unstructured Pub/Sub services can be provided on deliberately designed overlay topologies. In unstructured P2P systems, subscribers and publishers rely on distributing the queries and data messages throughout the network to make a successful subscription. Rahimian introduced Vitis that exploits two ostensibly opposite mechanisms: unstructured clustering of similar peers and structured rendezvous routing. A gossiping technique was embedded a navigable small-world network, which efficiently establishes connectivity among clusters of nodes that exhibit similar subscriptions[8]. Chacko proposed a CoQUOS approach, which supports continuous queries in unstructured P2P networks. In order to solve this problem of flexibility and complexity, proposing an approach of CoQUOS with consistency maintenance[9]. Papadakis proposed ITA, an algorithm which creates a random overlay of randomly connected neighborhoods providing topology awareness to P2P systems, while at the same time has no negative effect on the self-\* properties or the operation of the other P2P algorithms[10]. Klusch presented the mobile system, MyMedia, which features a high-performance semantic P2P search and a dynamic adaptive live streaming of annotated MPEG-DASH videos from mobile to mobile devices over HTTP in wireless networks with an unstructured and semantic P2P overlay[11]. Baraglia proposed a general architecture of a system whose aim is to exploit the collaborative exchange of information between peers in order to build a system able to gather similar users and spread useful suggestions among them, and presented mechanisms for building communities both in a simple way and in a more complex way[12]. Margariti considered flooding, a fundamental mechanism for network discovery and query routing, in unstructured P2P networks, and analyzed the behavior of flooding related to duplicate messages and provide simple bounds and approximate models to assess the associated overheads[13]. Ferretti analyzed the performance of an unstructured P2P overlay network that exploits a very simple dissemination strategy to build P2P Pub/Sub systems. A mathematical analysis is provided to estimate the number of nodes receiving the event[14]. Leng introduced both replica maintenance and update mechanisms for the BubbleStorm P2P overlay and related rendezvous search systems. A complete solution covering all identified use cases included a maintainer-based mechanism for data managed by a single node and a collective mechanism for data that shall be persistent beyond any particular node's session time[15].

Recent works in structured P2P systems exploit DHT to support CBR. Some of these approaches require the existence of a so-called rendezvous node where subscriptions meet events, thus easily creating bottlenecks. By contrast, unstructured P2P systems needn't maintain current topologies for the networks, they are robust. However, the structured P2P systems are vulnerable to networks storm and data overlapping. In this paper, we propose a new unstructured P2P system, suitable for large-scale Pub/Sub. The design guidelines are as follows.

- 1) We propose the concept of subscription ontology. Based on the similarity of the subnet, the unstructured P2P network is divided into subnets.
- 2) Based on the subscription deviation, the routing strategies make the choice for event flooding route. The strategies forward events to the most likely directions.

### **III. OURMETHODS**

#### **3.1 Subscription ontology**

In information science, ontology is a formal naming and definition of the types, properties, and interrelationships of the entities that really or fundamentally exist for a particular domain of discourse. In an ontology tree, each node represents an independent concept, each edge represents a directed edge from a parent node to a child node, and child nodes represent sub-concepts of the corresponding parent nodes. In UP2S2, an

event is expressed as an ontology tree, a subscription is actually a tree model based on ontology tree syntax. A tree pattern defines the shape of a tree as well as the constraints on certain nodes and edges.

**Definition 1** subscription probability tree. A subscription probability tree represents a tree form distribution of nodesubscription probability. It is a mathematical structure which is used to reveal the random output of subscription ontology with hierarchical structure.

By using subscription probability tree, we can effectively establish the heuristic index information. This class of index information has a faster synchronization speed. It's completely decentralized for unstructured P2P networks topology, and can effectively prevent broadcast storms and information overlap.

**Definition 2** subscription probability. If there is a directed path between node X to node Y, the subscription probability of node X to node Y, denoted as SP(X,Y), is the product of probabilities of all the directed edges between the nodes.

SP indicates the subscriber node X's degree of interest in the events that are published by the publisher node Y.

For a probability tree for node A, we assume SP(A,B)=0.8, SP(A,C)=0.2, SP(B,D)=0.9, SP(B,E)=0.1, SP(C,F)=SP(C,D)=0.5. If there is a path from the node A to the E, and the path passes through directed edges (A, B) and (B, E), then SP(A,E)=SP(A,B)\*SP(B,E)=0.1\*0.8=0.08. If there is no path from nodes G to B, then SP(G, B)=0.

**Definition 3** subscription deviation. Subscription deviation is used to measure the degree of deviation between two subscription probability trees. Given P and Q to be two subscription ontologies, the subscription deviation between P and Q is defined as follows.

$$SD(P, Q) = \sum_{i=1}^N \lim_{\substack{SPT(P,i) \rightarrow a \\ SPT(Q,j) \rightarrow b}} \left( \frac{SPT(P, i)}{SPT(Q, j)} - 1 \right)^2$$

Where N is a union set of directed edges of the two subscription ontology probability trees corresponding to P and Q, SPT(P,i) and SPT(Q,j) are respectively the probability values of the corresponding edges in the two subscription probability trees, we assume SPT(P,i)=a, and SPT(Q,j)=b.

### 3.2 Subscription subnet

We assume that all nodes in UP2S2 use the same type of subscription ontology SO1. According to subscription ontology, each node establishes a subscription routing table which includes subscription probability values. When the node S publishes subscription condition, the node S hasn't the subscription probability information of the other nodes in the system. UP2S2 uses the broad flooding search algorithm which is based on the needs of the subscribers. If a node A receives a query message and a match is found against its subscription routing table by broad flooding search, the node A responds with a query hit message, supplying its subscription routing table information for the subscription node S to generate a subscription probability tree. The subscription probability tree for the node S is constructed from the subscription probability values carried by query hit messages. In UP2S2, the nodes respond to the node S with the query hit messages. At the end of broad flooding (BF) algorithm, the node S will receive the query hit messages sent by a group of nodes PG(S)={A<sub>1</sub>, A<sub>2</sub>, ..., A<sub>n</sub>} with  $\forall 1 \leq i \leq n, SD(S, A_i)$ . The subscription subnet algorithm extracts the subscription probability values from the query hit messages to construct a subscription probability tree of node S.

The key to subscription routing is to establish the corresponding routing tables in the corresponding subscription subnets. The algorithm for UP2S2 to construct subscription routing tables is described as follows.

/\* Formal parameters: the set of subscription subnet nodes: spn, current subscription node: cn, subscription deviation threshold value t \*/

```
void procedure sub_routing_table_constructing(SPNs spn, CN cn, SDT t) {
    /*data type of subscription routing table SRT, the current subscription routing table pointer psrt */
    float u;
    struct SRT *psrt;
    psrt=malloc(sizeof(struct SRT));
    for ( ;  $\forall x \in spn, spn - \{x\}; spn = \emptyset$  ) do {
```

```

u=SD(cn,x);
if (u<t &&routing_table(x)≠psrt->routing_table)
/*Createa new subscription item routing_table(x)in the subscription table of node cn*/
psrt->routing_table=psrt->routing_table+routing_table(x);
}

```

When a node exits or is offline due to external reasons, UP2S2 take the following strategies. The subscription node associated with the offline node recalculates subscription probability, and updates the subscription probability tree of the publish nodes. When the next constructing subscription table cycle comes, the subscription table construction algorithm will add new subscription nodes, which are associated with the node, into a new subscription table. The algorithm for UP2S2 to reconstruct subscription routing tables is described as follows.

/\* Formal parameters: the set of old subscription subnet nodes: old\_spn, the set of new subscription subnet nodes: new\_spn, current subscription node: cn \*/

```

void procedure sub_routing_table_reconstructing(SPNs old_spn, SPNs new_spn, CN cn) {
    SPNs xor_spn;
    xor_spn=old_spn⊕new_spn;
    /* for each node x, x has been offline node already*/
    for (; ∀x, x ∈ xor_spn, xor_spn - {x}; xor_spn = ∅) do {
        /* for each node y, y has the subscription relationship with x*/
        for (; ∀y ∈ old_spn, old_spn - {y}; old_spn = ∅) do {
            u=SD(x,y)=∞;
            if (routing_table(x) ∈ routing_table(cn)) ;
            /*Delete the subscription item routing_table(x) from the subscription table of node cn*/
            routing_table(cn)=routing_table(cn)-routing_table(x);
            /* Update the subscription probability tree of the subscription subnet*/
            update_SPT();
        }
    }
}

```

### 3.3 Routing strategy

Controlling node set (CNS) is defined as a node set in UP2S2, which makes the other nodes in UP2S2 adjacent to a certain node in the node set. A node in CNS is called controlling node (CN). Otherwise, the node is called non-controlling node (non-CN). CN is an important concept in subscription subnet-based routing. It has been widely used in the layout problem of Pub/Sub nodes. In CBR, each node tends to publish events and to propagate subscriptions. In order to reduce traffic congestion caused by the excessive routing and forwarding messages, typically, nodes are divided into subnets.

UP2S2 uses the routing strategy based on the metric of subscription deviation. The routing strategy isn't consistent across the whole network, but is based on the differential measurement of subscription demands. The core idea of UP2S2 is as follows. According to subscription deviation, the sub\_routing\_table\_constructing algorithm divides the whole unstructured P2P network into multiple subscription subnets. There is a subscription probability tree in each subscription subnet. Events are forwarded along the most likely subscription nodes. As for events, UP2S2 strategy is made of two constituents. First, events are routed through their own subnets. Second, An event disseminated along CNS.

In this section, we propose a CBR method based on CNS to describe the model of CBR management layer integrated Pub/Sub mechanism and CNS. The method is described as follows.

First, we assume that UP2S2 is divided into three subnets which are responsible for publishing/subscription by CNS a, b and c respectively. In each subscription subnet, a subscription probability tree is established by using a node as the root node. It's shown in Fig.1. In the legend, we use rectangle and circle to represent CN and non-CN respectively.

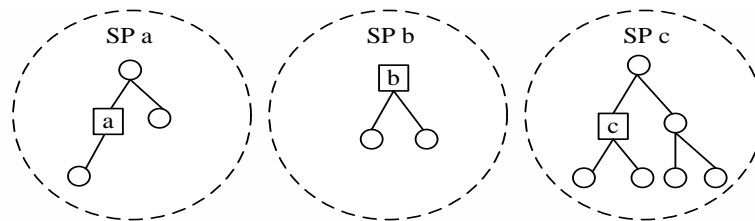


Fig.1: Construction of subscription probability tree

Second, UP2S2 calculates the subscription deviation values between non-CN and its corresponding CN. And then, the sub\_routing\_table\_constructing algorithm creates subscription routing tables for these non-CN. The propagations of subscriptions in subnets are shown as in Fig.2. In the Figure, the dashed arrows represent the direction of propagating subscriptions.

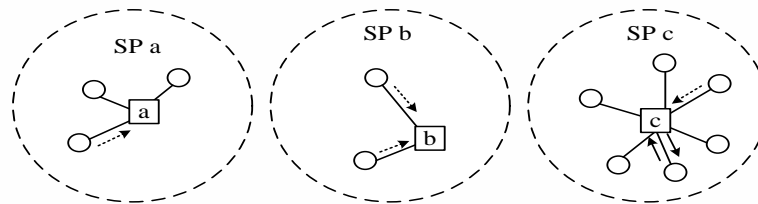


Fig.2: The propagations of subscriptions in subnets

Finally, each subnet establishes an unstructured P2P network, and CNs are connected to form UP2S2. So, the UP2S2 is divided into two levels. In such networks, a CN adjacent to a non-CN is responsible for publishing event of the non-CN. A CN publishes events to other CNs. Event and subscription routing strategies are shown as in Fig.3. In the Figure, the solid arrows indicate publishing events.

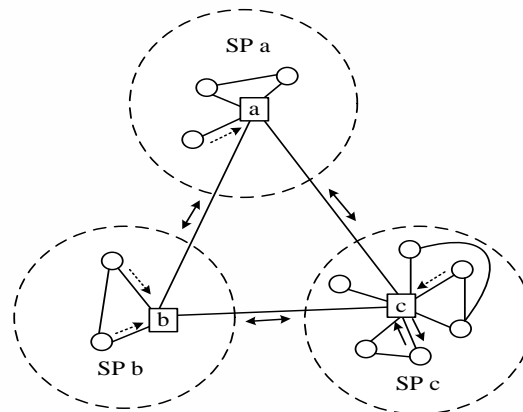


Fig.3: Event and subscription routing strategy

### 3.4 The cost of obtaining subscriptions

To obtain user's subscription is a prerequisite for UP2S2 to establish subscription routing table. Due to diversity and the differences among subscriptions, the cost of obtaining subscriptions becomes an important problem that can't be ignored. The user's subscriptions aren't static over time. Therefore, this requires a more rational approach to obtaining subscriptions. Without affecting the time and space complexity, UP2S2 uses a method of mining association rules in relation of quantitative attribute. By classifying user's subscriptions, subscribe sets which have different functional attributes are constructed. And then, combined with the extensible transformation principle, UP2S2 can deduce the new if-then rules. In this process, the costs of UP2S2 are mainly focused on the collection and processing of subscriptions. It divides the user's subscription data into several property sets, and determines the conditional attribute sets and the conclusion attribute sets. To compute support and confidence is UP2S2's additional overhead.

## IV. VALIDATION AND EVALUATION

According to the needs of P2P network operations, we design simulation experiments and comparative analysis methods, which are compared with the BF routing strategy. Experimental contents include three aspects:

- 1) According to the subscription tables, UP2S2 routes the events more quickly and accurately;
- 2) UP2S2 can save network bandwidth and reduce unnecessary network overhead;
- 3) UP2S2 has the characteristics of quick-response and high-efficiency constructing the subscription tables.

We validate UP2S2 by simulation. The simulator uses PeerSim, a discrete event simulator for large-scale distributed systems. In the following experiments, assume that the P2P network size is 10000 nodes, there are 100 subscription subnets, and each subnet has 100 nodes. To simulate a realistic network environment, the uniform

distribution of the publishing event nodes was discussed. Assume that the numbers of the event nodes are 800, the event subscription rate ESR=1%, and the event and subscription message time to live value equal to 10.

#### 4.1 Accuracy of event routing

The purpose of this experiment is to verify the ability of UP2S2's quick event routing. This capability includes the success rate at routing event, the event routing time in different subscription subnets, and the hit rate of event matching. Figure 4 shows the results of the success rate at routing event vs. periods of time (POT).

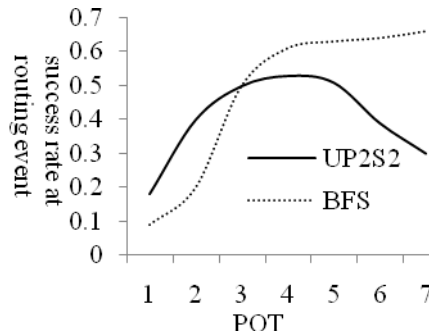


Fig.4: The success rate at routing event vs. POT

As shown in Figure 4, when POT=4, the BF event routing accuracy reaches its peak. Because the network is flooded with a large number of query information, a large number of nodes die energy resources when POT=1. The accuracy of BF event routing decreases by nearly 20%. Because UP2S2 is divided into subnets according to user's subscriptions, when events are routed in a subnet, accuracy of event routing is higher, and is up to 75%. With the decrease of POT, the accuracy monotonically increases. This indicates that compared with the BF algorithm, the UP2S2 event routing accuracy is higher.

#### 4.2 Cost of redundant events of network

The purpose of this experiment is to verify that UP2S2 can save network bandwidth and reduce unnecessary network overhead. Figure 5 shows the results of the redundant events vs. POT.

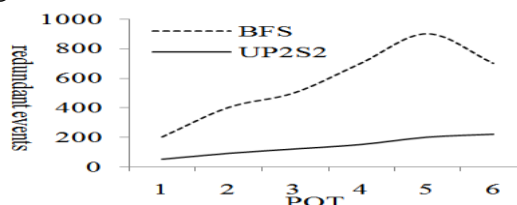


Fig.5: The redundant events vs. POT

As shown in Figure 5, UP2S2 has an increase of 100 on redundant events in every event flooding. The number of redundant events in UP2S2 is 75% lower than that of BF, and there is an increasing trend with the reduction in POT value. Finally, the number of redundant events tends to be stable. This indicates that compared with the BF algorithm, UP2S2 has obvious advantages in reducing redundant events generated by flooding and save the cost of network resources.

#### 4.3 Subscription table construction time

The purpose of this experiment is to verify that UP2S2 can construct subscription tables quickly and efficiently. Figure 6 shows the results of subscription table construction time vs. POT.

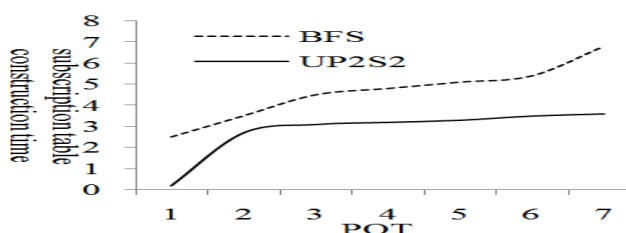


Fig.6: Subscription table construction time vs. POT

As shown in Figure 6, UP2S2 is better than BF in terms of subscription table construction time. Especially in the number of events is small, subscription table construction time of UP2S2 is nearly 30% less than that of BF.

## V. CONCLUSION

In this paper, we propose UP2S2, a large-scale ontology-based Pub/Sub for Unstructured P2P networks, to provide the architecture of Pub/Subrouting. UP2S2 is based on event and subscription subnet model. We design and implement the algorithms for UP2S2 to construct and reconstruct subscription routing tables, and derive conclusions from the simulation experiments. The results show that UP2S2 routes the events more quickly and accurately.

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