

WhiteMesh: Leveraging White Spaces in Multihop Wireless Topologies

TBA

Dinesh Rajan, and Joseph Camp

Abstract—Wireless mesh network deployments are low cost effective way to serve large populations internet connections. As the network usage grows, more mesh networks may need to improve the performance serving the neighborhoods. However, this may bring more contention for existing network. Since FCC freed UHF band for wireless communication, to deploy mesh networks in white band could bring additional capacity for existing capacity. In this paper, we study the problem of adding new capacity to an existing mesh network with multiband gateways. We first present a protocol model based multiband capacity calculation for gateway-limited fair capacity as a function of the networks. Then we introduce a global measurement strategy estimating link capacity saving tons of measurement work in neighborhoods. Then, we present multiband online gateway placement algorithms that use local search operations to joint assign channel and routing on multiband network. Multiband links make the network topology complex bringing a NP-hard problem. The challenges are addressed with a placement algorithm with linear optimization. The algorithm is validate in single band scenario on Orbit grid. The results show that the algorithms outperform the FIXME (Heuristic IGW/Degreebased) by up to FIXME on realistic topologies.

I. INTRODUCTION

FCC adopted rules to allow unlicensed radio transmitters to operate in the white space freed from TV band since 2010 [1]. White space is popularly referred to unused portions of the UHF and VHF spectrum includes, but not limited to 54M-72MHz, 76M-88MHz, 174M-216MHz, 470M-608MHz, and 614M-806MHz [2]. To use these band, FCC ruling requires white space devices (WSDs) to learn of spectrum availability at their respective locations from a database of incumbents. For example, in Dallas/Fort Worth, TX, 482M-488MHz band should be yielded for TV channels, in Chicago, IL 470M-482MHz band is reserved for TV channels. [3] These bands provides superior propagation and building penetration compared to licensed ISM Wifi bands like the 2.4 and 5GHz bands, holding rich potential for expanding broadband capacity and improving access for wireless users.

The advantages of white space equipment could be seen straight forward from using in *Wireless mesh network*. Wireless mesh network is able to provide broadband Internet access to large contiguous areas through less mesh nodes equipped with WSDs due to the propagation characteristic of ISM bands. White space mesh is an economic way to provide back-haul Internet service in neighborhood area employing the propagation characteristics. White space could also be used to improve the urban or high density area connectivity through lower interference channels.

Mesh deployment requires selecting the number and locations to place mesh nodes to cover the whole area and the nodes are inter-connected in order to access to Internet gate-

way points. Unfortunately, prior white space mesh placement research fails to address the compatibility of current existing devices, for instance, iPhone, Mac Laptop do not have white space radios to access white space gateway points. For a realistic mesh network, the end hop to the client need to be able to work in ISM Wifi band. So the practical way to employ white space could be creating Internet access backhaul with less nodes or improve existing Wifi network by adding the frequency band, avoiding interference and reduce the hop relay among Wifi network. To approach the multiband mesh deployment problem, it is important to understand the differences between white spaces and the licensed ISM bands where Wifi devices operate. First, in FCC rules, users in white space band have to yield primary users to improve individual performance. Before enter a white space channel, users have to detect the channel occupation [4], [5] Second, white space band may suffer some unknown interference such as wireless speakers. Such devices may turn on at anytime without warning [6]. Third, white space is cleaner than ISM bands since most of the TV stations have stopped using the bands and white space is in lower frequency, the coverage of these band is larger than higher frequency ISM band which could help to reduce the amount of mesh nodes [7]. According to these advantages and disadvantages, the balance between white space bands and ISM bands is possible to provide improvement of mesh network by reducing the construction cost or grabbing more capacity.

This work focus on improving the performance of mesh network with multiband gateways and mesh nodes for neighborhood. As far as we know, there is no previous work has solution for the problem adding multiband capacity in a mesh network. Our work fomulate the problem and propose 2 algorithms approaching the optimal solution. We analysis the problem complexity through a regular grid network and evaluate our approaching in two in-field network placement. We also investigate the influence of the FCC regulation and environment parameters for multiband network placement.

The main contributions of our work are as follows:

- We formulate the heterogeneous mesh node placement problem as a FIXME problem.
- We propose a methodology to leverage the influence of white space in mesh networks.
- We propose FIXME algorithms to minimize the number of deployed mesh nodes.
- We perform extensive outdoor experiments from multiple environments and simulations to evaluate the proposed algorithms.

The remainder of this paper is organized as follows. In

Section IV, we present the multiband mesh network capacity model and analyze the characteristics of multiband network.

II. PROPAGATION IN MULTIBAND MESH NETWORK

In this section, we introduce the way propagation across bands influence mesh network.

Wireless propagation is the behavior of the signals loss characteristics when they are transmitted, or propagated from one point to another. The factors rule radio propagation are complex and diverse, and in most propagation models three basic propagation mechanisms: reflection, diffraction, and scattering [8]. Wireless propagation could be affected by the daily changes of environment, weather, and atmosphere changes due to cosmos activities. Understanding the effects of varying conditions on wireless propagation has many practical applications for wireless network, from choosing frequencies, to designing multihop routing, to avoiding interference, to frequency reusing.

Usually in wireless networks, the received signal power of a node is represented as $P_{dBm}(d) = P_{dBm} - 10\alpha \log_{10}(\frac{d}{d_0}) + \epsilon$. Pathloss exponent α in outdoor environments range from 2 to 5, higher frequency has a heavier pathloss. [9]. The propagation of frequency becomes an important characteristic in multiband network since the pathloss exponent varies with channel frequency. The propagation difference makes the performance of radios vary from band to band in the same location with the same configuration.

Employing multiband gateway nodes bring 2 advantages for mesh network, 1) more bandwidth make the contention in the network lower, 2) the propagation difference brings flexible topology by increasing the communication range without more contention.

Specifying each link individually enables us to encode propagation characteristics of different bands k . In other words, ideally without considering cost, each grid can be covered by an arbitrary node through specific band. The propagation alternation brings the advantages of providing more possible path for multihop network without increase interference of their neighbors.

The path loss exponent varies from urban area to rural area and from plane to mountains make the question which band is fit for the environment interesting for wireless network deployment. A lower band node may have more coverage with a small path loss to decrease the cost of wireless network deployment. However a higher band may have more network capacity through frequency reuse. These characteristics make the white space mesh node have a role to get the gain either in reduce the cost for network deployment or increase the network capacity. Furthermore, FCC has different rule to balance white band utility in different areas and environment, the demand of evaluating the white band mesh network in different scenario for industry design request and FCC regulation is urgent.

To answer the question how to balance white space bandwidth and propagation range in a network. We choose the area with different propagation characteristics and evaluate the FIXME algorithms to leverage the propagation influence for network deployment and network capacity.

III. WHITE MESH OF TYPICAL CITIES

In this section, we introduce the multiband mesh network placement problem from policy regulation and our in-field measurement.

FCC has assigned white space with different bandwidth according to the population density and geographical condition across US. There are cities which have strict rule for white space usability, such as in New York, there is no white space band available [10]. In Dallas, the available spectrum is 2 channels, 12MHz which is much smaller than Tuscon, AZ as 16 channels, 96MHz [10].

The gain of a mesh network deployment varies of these cities due to the FCC ruled bandwidth. Also, these cities have different environment, for instance, Arizona cities may have less influence from the trees, but in Dallas area, there are tons of plant will change the large scale propagation characteristics. Propagation is another factor for deploying mesh network in these cities as mentioned in II. An intuition is that with small propagation, the hop count for a mesh network would increase make the capacity decrease. With the data collection in VI, we leverage the propagation characteristics in different environments: Downtown, neighborhoods, urban area. The propagation difference exist among these areas, this difference change the topology of the network directly with different communication and contention click in the same frequency as introduced in II.

Combined with the propagation characteristics of different environment in these cities, generally there are four scenarios in large scale we are trying to leverage for multiband mesh network placement fit for FCC regulation.

A. More bandwidth Low propagation

The first kind of cities are with lower path loss exponent and wide FCC approved white space band, such as Tuscon, AZ. We measured the propagation as FIXME through WiEye will discuss in VI. In such cities, the advantage white space band has larger coverage and less interference bringing substantial gain of white space.

B. More bandwidth High propagation

The second kind of cities we are considering are high path loss exponent due to geographical conditions or buildings, but have wide FCC approved white space band, such as Austin with 15 channels, 90MHz white bandwidth. FIXMECheck the WiEye database

More bandwidth inject to a networks would bring gains for capacity, but the reduction of the cost for deployment does not benefit a lot from the white band.

C. Less bandwidth Low propagation

A third kind of cities which may benefit for the larger coverage of white space mesh nodes but the capacity is still limited by the bandwidth such as Houston FIXME

D. Less bandwidth High propagation

Cities like Dallas who has few available channels, 2 channels, 12MHz, but high propagation in its downtown area are the fourth scenario we are trying to deal with.

In such cities, the advantages of white space band is the least across all these cities, but we still could see some gain from white mesh node deployment.

IV. WHITE SPACE MESH DEPLOYMENT

In this section, we first formulate the white mesh deployment problem with propagation, connectivity and QOS constraint of multiband scenarios. Then introduce the *Protocol Model* gateway-limited fair capacity of a white band mesh network modified from previous work [11]. For ease of discussion, all capacity points are referred as "gateways" no matter how they get access to internet.

In this paper, we consider two-tier wireless mesh networks, consisting of an access tier for connection between mesh nodes and clients, and a backhaul tier for interconnection between mesh nodes. Since most of the clients have only ISM band wireless devices, we assume all the mesh node has the capacity in ISM band for clients. And for the backhaul tier mesh nodes have multiband capacity with different click range according to the propagation in each band.

Further, we focus on a multiradio, multiband backhaul and access tier architecture. We let the user-specified cost of installing a physical wire or dedicated wireless connection be different for each location and allow non-uniform capacities at each location.

A. Problem Formulation

The objective of the wireless mesh node placement problem in multiband scenario is referred to minimize the number of deployed gateway nodes related to budget and mesh nodes adding capacity for existing network. or to maximize the capacity of existing mesh network topology by given specified budget for adding multiradio capacity points in existing network.

It is defined as follows. The set of potential gateway node locations, W , is assumed know. Let G be a k dimension binary $(0,1)$ -vector of size n that indicates whether a given mesh node i in band k is a capacity point or not. Discrete locations for mesh nodes follows naturally from practical constraints on deployment, such as the availability of wired connection or other infrastructure for gateway nodes installation. On an operational multiband mesh network, $G[i, k] = 1$, for all $i \in G$, having active radio working in band k . Let the monetary cost of installing a capacity point be $f[i] + r(i) \times \sum_k G[i, k]$, $f(i)$ represent the cost for infrastructure, $r(i)$ is the cost for a single band, and G_0 represent the currently deployed capacity points. We define the total cost, $C(G)$, of installing new capacity points in the mesh network as:

$$C(G) = \sum_{\forall i \notin G_0} (f(i) + r(i) \times \sum_k G[i, k]) \times \text{sgn}\{\sum_k G(i, k)\} \quad (1)$$

B. Mesh Network Capacity

Wireless bandwidth is shared among all clients and mesh nodes, as a result, it is usually desirable to limit the number of potential shares of the scarce wireless spectrum. In this work the capacity calculation based on *Protocol Model*, a node can use the channel if the distance between the node and next relay

nodes is less than the threshold and other nodes in the click is not transmitting. The model is good for 802.11-style MAC [12].

The capacity calculation in this paper considers access networks where all traffic to and from clients must traverse a gateway, making the gateways bottlenecks in the network. Therefore, the performance of gateway nodes represent the capacity of the network. More complete capacity of formulations in other research take into account on-demands and fairness [13], but we do not get into these scenarios in this paper. The advantages of this model are 1) exact computation in polynomial time and 2) extension to local search algorithms by enabling tractable approximations which optimize over one of two components of capacity definition: route lengths or contention [11].

We carry the capacity calculation idea from [11] to model the wireless interface of gateway as alternating its time between transmitting to one-hop neighbors, receiving from one-hop neighbors, and deferring to other neighbors within contention range. The *gateway limited fair capacity* is a function of the airtime utilization share of gateways, which depends on the routes used and amount of time the routes lead to a gateway deferring. From the definition, the capacity represent fairness for all nodes in the network. The calculation impose a fairness constraint of each mesh node to receive their fair share of the wireless airtime at the gateway nodes. For multiband scenario we re-define the expression of the capacity calculation.

Mesh node i has a traffic demand $d[i]$ represents the aggregate demand of all the edn-clients associated with it. We present the routes used by each mesh node to reach one or more gateways as a 3 dimensional matrix R , where $R[i, j, k]$ indicates the amount of node i 's demand that traverses physical link j on band k . $\text{src}(i)$ is designated as the access tier link for mesh node i and assign $R[i, \text{src}(i)] = d[i]$. The calculation ensure fairness by requiring that $\lambda d[i]$ units of mesh nodes i 's demand are served by gateways. And R matrix as solution to a transshipment problem optimizing capacity, potentially allowing multipath routing [11]. The contention caused by each physical link j on band k three-dimensional matrix I , where $I[i, j, k]$ indicates if physical link j in contention range of node i of band k .

A link induces contention equal to the number of mesh nodes that cannot be actively transmitting or receiving when the link is active in the band. Contention is used as a simplification of interference only happens in the same band.

The total contention on a gateway node $g \in G$ caused by link j in band k is $\sum_{i=1}^n R[i, j, k] \times I[g, j, k]$. the total contention on gateway g , v_g is then given by:

$$v_{gk} = \sum_{j=1}^m \sum_{i=1}^n R[i, j, k] \times I[g, j, k] \quad (2)$$

We assume the access tier and backhaul tier in the same ISM band choose different channels to avoid interference among the two tiers. For the backhaul tier the contension only comes from other mesh nodes.

Gateway g services total demand s_g which is the sum of demands on all links incident to gateway g , denoted as the link

subset $link(gk)$ which has connection of the gateway node in band k :

$$s_{gk} = \sum_{j \in link(gk)} \sum_{i=1}^n R[i, j, k] \times I[g, j, k] \quad (3)$$

The capacity of gateway g as the amount of wireless time v_g required to server s_g units of time for internet service, also a gateway node will provide capacity to the area it located in.

$$u_g = \sum_{k \in B} s_{gk} / v_{gk} + R[g, k] \quad (4)$$

The sum is a the worst case for mesh network due to double-counting of contention with the gateway. Wireless network is able to increase the capacity through decreasing the contention or increase the contention to deploy less nodes for an arbitrary network. Multiband network provide potential solutions of decreasing the contention and deploy less nodes simultaneously. The question comes out how could a mesh network approaching the objective has the lowest cost for construction subject to the capacity request or achieve the highest capacity under a certain budget.

The gain of minimize deployment mesh node could be noted as the nodes amount of ISM Wifi mesh network A_{ISM} minus the nodes amount of mesh network with multiband nodes A_{ws} , $G_a = A_{ISM} - A_{ws}$.

To employ the propagation advantages brings a NP-hard problem to arrive the optimal solution [13]. To approach the optimal solution we have FIXME frameworks to solve part of the problem subject to time fairness of each node.

V. SOLVING THE PLACEMENT PROBLEM

We propose two local search based algorithms with *BandAssign* operation to adapt the multiband scenario. The gateway placement problem could be formulated as an integer program (IP), however, the solution based on IP has following disadvantages: (i) can not be solved exactly in polynomial time, (ii) has an unbounded integrality gap (iii) IP is not suitable for online computation [11].

To approach the maximizing capacity, we switch to local search algorithms. *Local Search Algorithms* optimize one of the two major components of our capacity calculation: the size of the routes in R or the the impact of contention in I on mesh nodes.

In the worst case, without proper algorithms to approach the optimal placement, running the brute force algorithm to find the optimal placement is almost an impossible mission. The combination of placement in a n nodes network is 2^n , with the capacity of calculation for each node, the complexity is $O(n2^n)$. It is a nightmare even for a powerful server. That is why we have to approach the optimal placement verse finding the solution by traversing all possible options.

Previous work J, Robinson proposed two *Local search algorithms* to optimize the capacity for single band mesh network deployment [11]. We therefore develop the *Local Search Algorithms* to adopt multiband scenario.

A. Minimizing Hop Count

The available gateway locations are W , which is a specific subset of all mesh node locations. G represent the set of installed gateway with multiple radios work in different bands locations throughout the execution of the algorithm, meaning if there is a gateway node work in band k in the location, $G[i, k] = 1$. We start to add network capacity from an designed deployment single mesh placement, since there are tons of methods for a single band mesh deployment [14].

We perform *add()*, *assign()*, *open()* and *close()*, to output a deployment of mesh network. To terminate the process, we require that each step lowers the cost by at least $c(S)/p(n, \varepsilon)$, S is the deployment for this step, $p(n, \varepsilon)$ is a chosen polynomial in n and $1/\varepsilon$.

add(s) installs a multiband mesh node at potential location s , *assign(s, T)* install a gateway at node s and discover the coverage of different band, assign the band to different mesh nodes according to the demands and fairshare of the nodes. *open(s, T)* installs a gateway at location s and removes all the gateway nodes in set T , and *close(s, T)* removes the gateway at location s and installs gateway nodes at all nodes in set T .

As found in [11] all possible combinations for set T can not be evaluated in polynomial time, we inherited the methodology of solving a knapsack problem for the set T discovering. T is found as the set of items to put in the knapsack which has an arbitrary capacity. The details of the operation is described as:

- *add(s)* for all non-gateway nodes s , evaluate the cost to open a gateway at $s \in W$. This cost evaluation requires solving a transshipment problem to find optimal routing matrix R for the set of all installed gateways in $G \cap \{s\}$
- *assign(s, T)* Assign the bands to the nodes in coverage according to the demands and contention. Distribute the capacity of a multiband gateway node to mesh nodes. We first assign the lower band for remote mesh nodes and then the higher band for the close nodes. If we have more bandwidth than required for the first step, then we assign the remaining higher bandwidth to close nodes and then the lower bands for all nodes in coverage since the nodes close to the gateway may suffer more contention. The process of assign helps to reduce the hop count/contention of the network. The operation adopt the propagation characteristics of different making the problem scale of transship and knapsack become smaller.
- *open(s, T)* Install gateway at location $s \in W$ and remove gateways in set $T \subseteq G - \{s\}$, transfer the traffic on T to the gateway nodes s . Gateway s could be a node with some unused capacity.
- *close(s, T)* Remove $s \in G$ and install a set of gateways $T \subseteq W - \{s\}$. Then reassign routes destined to s to gateways in T without any effect on mesh nodes served by other gateways. T should be gateway nodes have unused capacity.

Hop count is a first-order approximation of the capacity. The relation between the capacity and the hop count is the decrease of the hop count will reduce the contention and increase the capacity in 2. The advantage of hop count as the cost function is that it preserves the triangle inequality, which provable the

Algorithm 1 Multiband MinHopCount Algorithm

Input:

M : The set of all mesh nodes
 $u_{init}[i]$: Initialize values of capacities

Output:

G : Installed Gateway Locations
Valid Here means satisfies budget
Start with arbitrary, valid solution G

```
1: Foreach  $s \in M$  do
2:   while  $\sum_{i=1}^N u_{prev}[i] - u_{cur}[i] \geq \phi$  do
3:     while  $\Delta cost \geq c(G)/p(n, \epsilon)$  do
4:       Find valid add(s)
5:       Assign(s,T)
6:       Find valid open(s,T)
       where  $T$  is solution to knapsack problem with knapsack
       size of  $u[s]$ 
7:       Find valid close(s,T)
       where  $T$  is minimal covering knapsack with knapsack
       size of  $u[s]$ 
       Calculate  $\Delta cost$  for all valid operations
       Apply operation to  $G$  with best  $\Delta cost$ 
8:     end while
       Output  $G$  as locally optimal solution
       Calculate capacities  $\hat{u}[i]$  of placement  $G$ 
       Update  $u_{cur}[i]$  to new lower bound if  $\hat{u}[i] < u_{prev}[i]$ 
9:   end while
10: Output  $G$  as Solution
```

upbound of network capacity. The local search operations are not able to know a priori of the placement, we use lower bound estimates for the gateway capacities $u[i]$ and update the capacity every successful iteration. The process will end when the current sum of the lower bound capacity estimate $u_{cur}[i]$ does not decrease by more than user-chosen parameter ϕ from the previous estimate, $u_{prev}[i]$. In the process, subject to the lower capacity bound, we capture the optimal placement. The run time of the *Multiband MinHopCount Algorithm* is polynomial in $\frac{1}{\epsilon}$ and $\frac{1}{\phi}$.

B. MinContention

The second approaching, Multiband MinContention, finds the gateway placement that minimizes the average contention in the network. The main idea of the Multiband MinContention algorithm is to install k gateways to minimize the average contention on the mesh nodes, related to the links contend with each node and how often these links are used in routes. We can not count the total contention on gateways, since the full gateway placement is not known in advance. The problem could be mapped to a k -median problem [11]. In this work, we introduce the k -median problem and propose a *Multiband MinContention* local search algorithm. We find the placement with the lowest average contention region size.

1) *k-median*: The k -Median Problem is a variant of the facility location problem where there are only a fixed number k of facilities that can be opened. The objective is to minimize the cost of connecting all clients to a facility. There is a local search algorithm for the uncapacitated k -median problem with a locality gap of $3 + 2/p$ [15], where the locality gap is the maximum difference between the worst local optimum and the global optimum and the parameter p controls the number of gateways the algorithm considers for simultaneous swapping. This locality gap results in an approximation ratio of $3 + \epsilon$.

The algorithm repeatedly swap p open gateways for p unopen gateways until no swaps can improve the solution. Larger p can improve the accuracy but result in exponential increase running time.

For multiband scenario, to employ the local search algorithm, designer need to balance the contention among different bands. It happens that one band may reach the best contention placement but other bands are not in optimization status. The main difference from single band MinContention algorithm is that when we choose an additional gateway node, we try to assign the same number of one hop links for different band. To implement the equal assignment, we prefer to use higher frequency band since there click is smaller than lower frequency band. A similar process is designed to start from assigning higher band first and then lower band with iteration.

2) *Swap-Function*: *Swap-based Local Search*: The Multiband MinContention algorithm is summarized in 2. The cost of a placement is the sum of the active link weights, which are each assigned to be the total number of mesh nodes in contention range of the link.

Algorithm 2 Multiband MinContention Algorithm

Input:

M : The set of all mesh nodes
 $u_{init}[i]$: Initialize values of capacities

Output:

G : Installed Gateway Locations
Valid Here means satisfies budget
Start with arbitrary, valid solution G

```
1: while  $\Delta cost \geq C(G)/p(n, \epsilon)$  do
2:   Find all valid swap(S,T)
   where  $S$  is set of  $p$  gateways to open
   and  $T$  is set of  $p$  gateways to close
3:   Assign(S)
   Assign equal number of one hop mesh node for different band
4:   Calculate  $\Delta cost$  for all valid operations
5:   Apply swap with largest positive  $\Delta cost$ 
6: end while
   Output  $G$  as locally optimal solution
```

3) *triangle*: *Triangle Inequality for Contention* A simple example is a three nodes mesh network. The contention caused by link AB is less than the sum of the contention of links AC and BC. This characteristic is useful to find the minimum contention links.

bitcpf: V-A 1

VI. EXPERIMENTAL ANALYSIS FOR PREDICTION ALGORITHMS

In this section we examine the performance of the multiband placement algorithms. We study the algorithms on regular grid topologies and then real topologies in different scenarios distinguished by propagation and legal white bands.

J. Robinson has validated the capacity calculation in [11] through TFA network measurement and calculation. Multiband scenario has the same calculation and physical meanings with single band described in [11]. The actual throughput values are able to be mapped to real network.

A. Performance in Regular Grid

First we study the performance of the two algorithms, *Multiband MinHopCount*, *Multiband MinContention* presented

in Section V. For all experiments, we consider an 802.11b system with the single band link wireless throughput assumed to be 6Mbps. All mesh node locations are fixed and gateways can be installed on any mesh node. We compare the algorithms against a FIXME placement strategy.

The topology for experiment in this sub-section is a placement of 7×7 regular grid. A mesh node communicates directly with at most 4 neighbors and contents with all two hop neighbors in a single band.

B. In-Field Data Collection

Next we will introduce the analysis based on in-field experiment. We collect data on a off-shelf multiband platform and smartphone platform. The potential gateway nodes locations are from existing mesh network TFA and Google Wifi. The two algorithms in 4 different kind of environment with propagation and white bands are analyzed in the following.

We introduce the experimental set up for *Multiband Mesh Network*. There are two set of experiments for characteristic leveraging of multiple scenarios presented II. One is the *Local Multiband Measurement* grab propagation information across bands; the other is *WiEye* helps to find the propagation relationship of multiple cities. The methodology to process the data is also introduced.

1) *Local Multiband Measurement*: To discover the propagation diversity, we measure 4 different bands, 450MHz, 900MHz, 2.4GHz, and 5.8GHz on our off-shelf multiband platform. The measurement platform is made of Gateworks 2358 with GPS, Smartbridge 450MHz radio, Ubiquite XR2, XR5, and XR9 radios. The software on the platform is Linux based Openwrt with several third party applications such as Iperf, TCPdump. We bring 2 of this platform on cars and run Iperf at the transmitter with GPS records to generate traffic on the four bands simultaneously sending through the radios on the platform. The TCPdump running on the receiver side sniffs the packets and report the SNR with GPS information.

Comparing the GPS records on both side help to grab the distance between the transmitter and receiver with time stamps. The SNR and distance could be synchronized according to the time stamps. The propagation relationship of four different bands across different environment could be found through the curve fitting.

2) *WiEye Measurement*: WiEye is an Android application help users to measure the *Access Point* signal strength provided by SMU *Wireless Networks Group* for free. It also help *Wireless Networks Group* collecting measurement data of signal strength to leverage the propagation characteristics on large scale [16]. Due to the hardware limitation, most of the cellphones can only work on 2.4GHz, most of the measurement data is on 2.4GHz. The data from WiEye helps to get the propagation of a city in 2.4GHz and according our 2.4GHz multiband measurements, we map the propagation in other bands of the cities.

An issue of the WiEye measurement is that the *Wifi Access Points* are unknown of the users. To overcome the issue, we propose a methodology to estimate the *Access Point* through multiple measurement. The *Path Loss Exponent* varies from 2 to 5 in different environment [9]. First we grab measurements in the same area, pull out their location information and signal

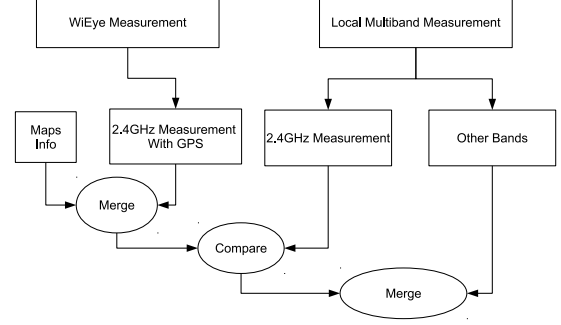


Fig. 1. Data Merge Process

strength information. Then, we assume the area have a small *Path Loss Exponent*. If there are *Access Points* at the location of the users, their connectivity circle click will cover the actual *Access Point*. The area covered by the most virtual click is believed to be the plane contain the *Access Point*. Third, we increase the *Pass Loss Exponent* to decrease the click of the virtual click getting close to the *Access Point* in the plane of the last step. We iteratively repeat the process to narrow the possible location of the *Access Point* till there are only two virtual click cover the same location in the previous step plane. Then the location is believed as the *Access Point*.

Base upon the estimation, the distance from the *Access Point* to the users could be calculated and mapping to the SNR for propagation estimation.

FIXMEAdd diagram to describe the process

3) *Data Processing*: First we leverage the propagation exponent from the WiEye data set. Since WiEye WiFi measurement only focus on ISM 2.4GHz with GPS data, from the GPS we can learn the environment of the location from Google map. We map the WiEye single band measurement to our local multiband measurement to estimate the propagation characteristics in other bands.

After the processing step, we can grab the propagation in different environment even in multiple cities. Based on the measured data, we investigate the performance of the algorithms in different scenario.

4) *Real-World Topologies*: We consider the placement algorithms on the topologies of FIXME currently deployed mesh networks:FIXME For each topology, we fix a number of already installed gateways and focus on upgrading with new gateways. The in-field nodes locations are involved in the experiment.

First, we begin with four known FIXME gateways and place additional capacity points in the network assuming the propagation characteristics are the same in the area.

Then we split the network covered area as different regions according to the geological information and FCC regulation and evaluate the algorithms performance.

C. Performance Analysis of Algorithms

We now investigate the performance of our proposed multiband network placement algorithms in different scenarios.

First we analyze the performance of the two algorithms in a 7x7 regular grid whose mesh nodes could be installed on the cross points. Then we put the algorithms on in-field network placement of TFA and Google network.

VII. CONCLUSION

In this paper, we investigated the multiband placement to leverage the propagation and FCC regulation for mesh network applications.

REFERENCES

- [1] FCC, "White space," <http://www.fcc.gov/topic/white-space>, 2012.
- [2] Wiki, "White space(radio)," http://en.wikipedia.org/wiki/White_spaces, 2013.
- [3] B. W. Consulting, "Tv white space," <http://www.broadband-mapping.com/tv-white-spaces.html>, 2013.
- [4] P. Cui, H. Liu, J. He, O. Altintas, R. Vuyyuru, D. Rajan, and J. Camp, "Leveraging diverse propagation and context for multi-modal vehicular applications."
- [5] H. Liu, J. He, P. Cui, J. Camp, and D. Rajan, "Astra: Application of sequential training to rate adaptation," in *Sensor, Mesh and Ad Hoc Communications and Networks (SECON), 2012 9th Annual IEEE Communications Society Conference on*. IEEE, 2012, pp. 443–451.
- [6] M. Nekovee, "A survey of cognitive radio access to tv white spaces," in *Ultra Modern Telecommunications & Workshops, 2009. ICUMT'09. International Conference on*. IEEE, 2009, pp. 1–8.
- [7] Y.-C. Liang, A. T. Hoang, and H.-H. Chen, "Cognitive radio on tv bands: a new approach to provide wireless connectivity for rural areas," *Wireless Communications, IEEE*, vol. 15, no. 3, pp. 16–22, 2008.
- [8] J. B. Andersen, T. S. Rappaport, and S. Yoshida, "Propagation measurements and models for wireless communications channels," *Communications Magazine, IEEE*, vol. 33, no. 1, pp. 42–49, 1995.
- [9] J. Camp, J. Robinson, C. Steger, and E. Knightly, "Measurement driven deployment of a two-tier urban mesh access network," in *Proceedings of the 4th international conference on Mobile systems, applications and services*. ACM, 2006, pp. 96–109.
- [10] Google, "Spectrum database," <http://www.google.org/spectrum/whitespace/>, 2013.
- [11] J. Robinson, M. Uysal, R. Swaminathan, and E. Knightly, "Adding capacity points to a wireless mesh network using local search," in *INFOCOM 2008. The 27th Conference on Computer Communications*. IEEE, 2008, pp. 1247–1255.
- [12] K. Jain, J. Padhye, V. N. Padmanabhan, and L. Qiu, "Impact of interference on multi-hop wireless network performance," *Wireless networks*, vol. 11, no. 4, pp. 471–487, 2005.
- [13] S. Arkoulis, E. Anifantis, V. Karyotis, S. Papavassiliou, and N. Mitrou, "On the optimal, fair and channel-aware cognitive radio network reconfiguration," *Computer Networks*, 2013.
- [14] I. F. Akyildiz, X. Wang, and W. Wang, "Wireless mesh networks: a survey," *Computer networks*, vol. 47, no. 4, pp. 445–487, 2005.
- [15] V. Arya, N. Garg, R. Khandekar, A. Meyerson, K. Munagala, and V. Pandit, "Local search heuristics for k-median and facility location problems," *SIAM Journal on Computing*, vol. 33, no. 3, pp. 544–562, 2004.
- [16] R. Meikle and J. Camp, "A global measurement study of context-based propagation and user mobility," in *Proceedings of the 4th ACM international workshop on Hot topics in planet-scale measurement*. ACM, 2012, pp. 21–26.