

# Efficient Virtual Backbone Construction without a Common Control Channel in Cognitive Radio Networks

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**Abstract**—Virtual backbones have brought about many benefits for routing and data transmission in traditional wireless networks. In cognitive radio networks (CRNs), virtual backbones can also play a critical role, and would increase the efficiency of routing and data transport. However, the virtual backbone construction for CRNs is more challenging than for traditional wireless networks due to opportunistic spectrum access. Moreover, when no common control channel is available to exchange the control information, this problem is even more difficult. In this paper, we propose a novel approach for constructing virtual backbones in CRNs, without relying on a common control channel. Our approach first utilizes the geographical information to let the nodes of a CRN self-organize into cells. Next, the nodes in each cell form into clusters, and a virtual backbone is established over the cluster heads. The virtual backbone is then applied to carry out the end-to-end data transmission. The proposed virtual backbone construction approach requires only limited exchange of control messages. It is efficient and highly adaptable under the opportunistic spectrum access. We analyze the capacity between an active node and a passive node in a single area. Our approach is testified through evaluation of the cost, and also through comparison with other models.

**Index Terms**—Cognitive radio networks, self-organization, cluster head selection, virtual backbone construction, end-to-end data transmission, capacity.

## I. INTRODUCTION

*Cognitive radio networks* (CRNs) [1] are a promising solution to the channel (spectrum) congestion problem nowadays. Primary users (PUs) in CRNs are privileged users, for whom there should be no interference. Each secondary user (SU) or node in a CRN is capable of sensing the available channels, and can make opportunistic use of them without causing interference with primary users.

When a PU begins to occupy a channel, SUs on that channel need to quit immediately. Hence, the dynamics of channel availability makes it difficult to carry out end-to-end data transport in CRNs. For example, in Fig. 1, there are two PUs,  $Tx$  and  $Rx$ . There is a data transmission route, consisting of three SUs,  $S_1$ ,  $S_2$ , and  $S_3$ . When the link between PU  $Tx$  and  $Rx$  is active, the links between the three SUs may be broken if they use the same channel as the two PUs. Therefore, the end-to-end data transmission from  $S_1$  to  $S_3$  is unstable (A practical scenario is that the two PUs in Fig. 1 are TV towers, and the SUs here are wireless devices using IEEE 802.22). If a node in a CRN wants to reach another node that is multiple hops

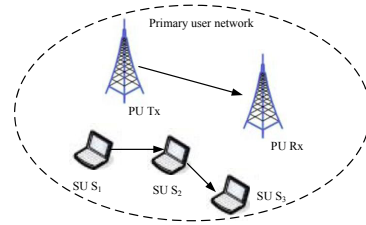


Fig. 1. Unstable data transmission.

away, two problems arise. First, the node needs to calculate the route to the destination node. However, the high dynamics of channel availability makes it costly to collect information from other nodes and construct a routing path. Second, even if the route is built, the links on the route are unstable. When the dynamic channels on a link of the route become unavailable, the route is broken.

To solve the problem of broken routes caused by unstable links, we can make use of the virtual backbone structure [2]. A virtual backbone consists of a connected subset of nodes in the network where every node is either in the subset, or is a neighbor of a node in the subset. We use *area* to refer to a backbone node and the nodes attached to it. If a virtual backbone is constructed for a CRN, the backbone nodes can calculate area routes for end-to-end communications. An area route means a set of areas that would be passed in order to reach the destination. For example, in Fig. 2, each node is either a backbone node or is attached to a backbone node.  $A_1$  denotes an area, which includes the backbone node and its attached nodes. Nodes on the borders are called *gateway* nodes. The source node  $S$  wants to reach the destination node  $D$ , which is located in another area. The backbone node that  $S$  is attached to calculates an area route for  $S$ , which is  $A_1 \rightarrow A_2 \rightarrow \dots \rightarrow A_k$ . Moreover, the virtual backbone can solve the unstable link problem, because with the area route, a packet can be sent to any node in the next-hop area. This is much more robust than the case with the route consisting of nodes, where a packet must be sent to the next-hop node. Therefore, the influence of unpredictable channel availability is reduced.

However, the virtual backbone construction in traditional wireless networks relies on a control channel to exchange extensive control information during the virtual backbone construction. The dynamic availability of channels in CRNs

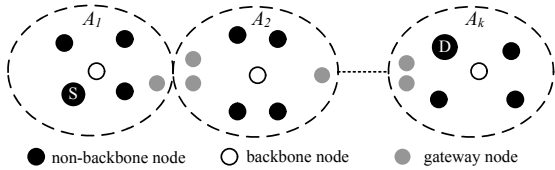


Fig. 2. Example of the end-to-end transmission using virtual backbone.

makes it impractical to use a static channel to exchange control information between nodes. While many studies on CRNs assume a *common control channel* (CCC), it is vulnerable to jamming attacks and congestion. Furthermore, in order for the spectrum authorities to allocate a static band as the control channel for CRNs, it is often involved with international negotiations, which are very time consuming. Therefore, we need to find an efficient way for nodes in CRNs to form a virtual backbone without a CCC. We also provide more intuitive explanations regarding the benefits of virtual backbones in CRNs and the challenges in Section 1 of supplemental material.

In this paper, we propose a novel approach for virtual backbone construction in a CRN without relying on a CCC. We use nodes to refer to secondary users. The cognitive radios of nodes are assumed to have the GPS waveform, so that each node knows its geographical location. We make use of the location information of each node, and select channels for distributed control message exchange. Here, we apply a cell division methodology and assign active/passive states to each node. Through an efficient process of message exchange, cluster heads are selected based on cells. Then, we efficiently construct a virtual backbone by selecting backbone nodes from the cluster heads. After the virtual backbone is constructed, it is used for the end-to-end data transmission in a CRN. The virtual backbone node calculates the area route for a source node. Our approach supports simultaneous transmissions of multiple communicating node pairs in an area. This differs from the data transmission in a virtual backbone of traditional wireless networks, in which individual nodes communicate only with the backbone node. Reliability and throughput are improved in our approach, in comparison with CRNs without a backbone, as well as traditional wireless networks with a backbone. To avoid co-channel interference among different links, we propose an algorithm that chooses a different transmission channel for each node pair communicating simultaneously.

The main contributions in our work can be described in the following five aspects:

- To our best knowledge, this is the first work to apply the technique of virtual backbone to the CRN, to reliably and efficiently transport data in CRNs.
- We provide an algorithm for CRN self-organization with distributed control message exchange without CCC.
- We develop an approach for constructing a virtual backbone for a CRN with limited message exchange.
- We also propose a novel end-to-end data transmission scheme for nodes in CRNs using the virtual backbone.

Here is the organization of our paper. In Section II, we describe the related works. The system model is introduced in Section III. Section IV describes the self-organization

algorithm. Sections V and VI present the virtual backbone construction, and the end-to-end data transmission scheme. The performance evaluation is presented in Section VII. We conclude our paper in Section VIII.

## II. RELATED WORKS

The related works are introduced from two perspectives. The first is that regarding the traditional backbone construction approach. The second part is about the data transmission in CRNs without CCCs.

There are many studies on the virtual backbone construction in traditional ad hoc networks [3]–[7]. The authors in [3] and [4] adopted clustering formation approaches to form a maximal independent set (MIS). In an ad hoc network, the set of cluster heads is an MIS, acting as a virtual backbone. There are disadvantages to these approaches, such as relatively slow convergence, and high redundancy or overhead, which make them difficult to apply in CRNs. Nodes in CRNs need to use available channels more efficiently. Constructing virtual backbones in CRNs requires a faster convergence and lower overhead. The special method of dealing with mobility and directional antennas in virtual backbone construction is discussed in [6] and [7]. In [5], the authors used a clustering formation approach followed by a pruning and marking process, which is able to control the density. In addition, they applied an adjustable transmission range, which reduces the energy cost and the MAC layer contention. Their algorithm is for ad hoc networks with one static channel, and requires the two-hop nodes to exchange their information. Our work is for CRNs, in particular, and solves the specific challenges of constructing virtual backbones in CRNs.

In [8]–[13], several approaches to building links in CRNs without CCC were proposed. [8] proposed an algorithm with the nodes rendezvous time as a function of the number of channels, while the algorithm in [9] has rendezvous time as a function of the number of nodes. Both are based on the assumption of some pre-known network information, such as the number of nodes. Our model does not rely on the assumptions of node numbers, and provides an efficient learning process for nodes to know about each other. Our work focuses on building virtual backbones for end-to-end data transmission use. The authors in [10] proposed a rendezvous algorithm based on the quorum systems. However, in this approach, many nodes need to compete for one rendezvous channel. A jump-and-stay model was proposed in [11]. It is a blind channel rendezvous model. The approach in [12] utilizes the channel diversity and allows all channels to be a control channel. The work in [13] proposes the quorum and Latin squares channel Hopping scheme, which has each node to guess the sequence of the other nodes based on node IDs.

## III. SYSTEM MODEL

We consider a CRN with a set of nodes  $N$ . Each node is equipped with a GPS device and, therefore, is able to know its current location. We assume that the transmission range of each node is controllable. This can be achieved through adjusting the transmitting power. Also, we assume the CRN

**Algorithm 1**  $Pro1(i, M(c_k))$ , to compute IHC for node  $i$

1. Set  $i$  as the seed for the pseudo-random number generator  $Z$ .
2. Let  $\mathcal{Q} = M(c_k)$  // The channel segment for  $c_k$
3. **repeat**
4.      $k = Z(|\mathcal{Q}|)$  // Generate  $k$  such that  $1 \leq k \leq |\mathcal{Q}|$
5.      $q = \mathcal{Q}(k)$  //  $\mathcal{Q}(k)$  is  $k$ th channel in  $\mathcal{Q}$
6.      $\mathcal{Q} = \mathcal{Q} \setminus \{q\}$  // Remove  $q$  from  $\mathcal{Q}$
7. **until**  $q \in M_i$
8. Return  $q$  // Selected IHC

is a dense network. Let  $M$  denote the set of all available channels to the CRN. The set of available channels at each node is expected to be different from node to node, due to spectrum sensing imperfection and the spatial diversity of channel availability. Therefore, not all channels in  $M$  are available at every node. We use  $M_i$  to denote the set of available channels at node  $i$ . We assume that the nodes on the same channel use an existing multi-access MAC protocol to access this channel.

We treat the geographical location of the network as a rectangle, and divide the network into a set of square cells,  $C = \{c_k | k = 1, 2, 3, \dots\}$ . The length of each cell side is  $L$ . Each cell has a unique ID, based on its geographical location. Each node knows the information of the network field (the rectangle), and  $L$ . Since each node knows its location using GPS, it is able to calculate which cell it is located in. The length of  $L$  is related to the transmission range of each node:  $L = \frac{\sqrt{2}}{4}R$ , where  $R$  is the data transmission range of each node. We will explain this setting later. We will adjust the transmission range for virtual backbone construction. When performing the end-to-end data transmission, the transmission range used by each node is  $R$ .

The objective of our model is to construct a virtual backbone without a CCC. Then, using the virtual backbone, the end-to-end data transmission can be efficiently conducted. Our approach contains three phases: 1) self-organization: nodes are spontaneously organized into cells, and learn the information of other nodes in the same cell with limited control message exchange; 2) virtual backbone construction: cluster heads are selected from each cell, and a subset of these cluster heads forms into a virtual backbone, which ensures both coverage and connectivity; 3) end-to-end data transmission: with the help of the virtual backbone, an efficient scheme for end-to-end data transmission is developed. We will introduce the above three phases in the following three sections.

#### IV. SELF-ORGANIZATION

We introduce the process of self-organization in this section. We first describe how two nodes can communicate without a CCC. Then, the process of how nodes are automatically organized in each cell is presented. We also give an analysis regarding the success probability of self-organization.

##### A. IHC Selection

For the communication between nodes that have no information about each other initially, we define two states for each

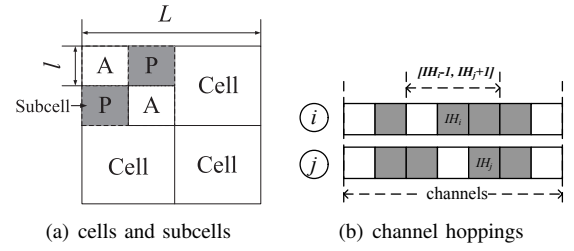


Fig. 3. Example of self-organization

node: *active* and *passive*.

**Definition 1:** A passive node is a node that keeps listening and receiving at a given channel. An active node is a node that guesses the channel that a passive node is on, and switches to that channel to send data packets. A node alternates between the active and passive states periodically.

For effective self-organization, it is critical to choose a channel on which a passive node can listen. We call such a channel for each node an *initial home channel* (IHC), which is used for exchanging control messages initially. We describe how to select an IHC next.

1) *IHC Selection Algorithm:* First, the whole channel set  $M$  is divided into  $|C|$  segments. Cell  $c_k$  is assigned a channel segment. We let  $M(c_k)$  denote this segment of channels for cell  $c_k$ . Since each node is equipped with GPS, it is able to know its location, and the cell that it is currently in. Thus, the node would also be able to know the channels segment that is assigned to its current cell. Nodes in the same cell would choose their IHCs from the segment of channels for the cell. For node  $i$ , its IHC is denoted as  $IH_i$ . The procedure  $Pro1(i, M(c_k))$  for node  $i$  in cell  $c_k$  to obtain its  $IH_i$  is shown in Algorithm 1, which uses a similar approach as in [9].

2) *Segment Size:* Sometimes it is impractical to simply use  $|M|/|C|$  to decide the number of channels for each segment. For example, if  $|M| = 16$  and  $|C| = 16$ , then each cell is assigned only 1 channel, which may result in unsuccessful self-organization. Hence, we use a better method, which can determine the size of the channel segment. We define a threshold for the minimum number of channels for each cell,  $\lambda$ . The value of  $\lambda$  can be chosen based on users' needs. The smaller value of  $\lambda$  may result in that nodes in the cell have fewer available channel choices. The larger value of  $\lambda$  may pose complexities in the later information learning phase. Then, the number of channels assigned to each cell equals the following expression:

$$\min(\max(\lambda, |M|/|C|), |M|).$$

3) *Segment Reuse:* The channel segment needs to be reused under some circumstances, such as when  $|C|$  is relatively large. For example, if  $|M| = 16$ ,  $|C| = 8$ , and  $\lambda = 2$ , then each cell can only be assigned 2 channel. Nodes in the same cell have only two channels for choosing, which may cause many conflicts. Under such circumstances, the channel segment can be geographically reused. In the above example, we can divide  $M$  into a smaller number of segments, e.g., 4 segments. Then, each cell is assigned with one segment. Obviously, some cells would be assigned with the same segment. We assign the adjacent cells with different channel segments. The same

channel segment would be reused in cells that are not adjacent.

The constraint for reuse is to avoid two adjacent cells from being assigned with the same channel segment. Our policy is to have the cells with smaller indices choose channel segments first, and the cells with higher indices choose channel segments that are different from their adjacent cells with smaller indices. This policy does not require adjacent cells communicate with each other. This is because each cell knows the cell numbers of adjacent cells, and it is able to calculate which channel segments are assigned to the adjacent cells that have smaller cell indices. The reuse policy is to move to the next channel segment that is not the same as that of any adjacent cell with smaller indices.

### B. Information Learning and Self-Organization within a Cell

After IHCs are selected, the next step is to have nodes in the same cell learn about each others' information, for cluster heads will be selected from each cell later. There are three problems to address. The first one is how to determine the states (active/passive) of different nodes. We assume that nodes in the network are synchronized. Another problem is how an active node can efficiently guess the IHCs of passive nodes. The third problem is how to let nodes in the same cell learn one another's information, with limited control message exchange. We will solve the three problems one by one.

1) *Subcell Construction*: To determine the state of each node, we apply the subcell concept here.

**Definition 2**: A cell  $c_k$  is divided into a set of square subcells,  $S_k$ . Each subcell is in either the active or passive state. Nodes in active subcells are active, and nodes in passive subcells are passive. Two adjacent subcells are in different states.

The size of each subcell is  $l < L$ , where  $L$  is the size of each cell. The value of  $l$  can be adjusted to ensure that the number of active nodes is similar to the number of passive nodes. Fig. 3(a) is an example of cells and subcells. In this example, the network is divided into four cells. Each cell is divided into four subcells. The subcells marked as "A" are active subcells, and the subcells marked as "P" are passive subcells. We let each node know the value of  $l$ , and the initial state settings of subcells are based on geographical locations of the subcells. Therefore, it is able to calculate which subcell it is located in, and switches to the corresponding state.

2) *Channel Hoppings*: For an active node to guess the IHCs of passive nodes in the same cell, it first runs Algorithm 1 and gets its own IHC. Since they are in the same cell, their calculated IHCs are based on the same channel segment. When the IHCs of active nodes and passive nodes are different, active nodes need to do channel hoppings until they reach the IHCs of passive nodes.

We define a channel hopping range for active nodes. Suppose node  $i$  is active, and node  $j$  is passive. They are in the same cell,  $c_k$ . We define an IHC for  $i$ , denoted as  $IH_i$ . We set a hopping range  $[IH_i - \Delta M, IH_i + \Delta' M]$  for  $i$  to scan, which means node  $i$  would scan  $\Delta M$  channels down from  $IH_i$  and  $\Delta' M$  channels up from  $IH_i$  in  $M_i$ . Later on, we will discuss how to analytically find  $\Delta M$  and  $\Delta' M$  so that the

self-organization process is successful, i.e., every node learns the information of every other node in the same cell.

An example is shown in Fig. 3(b). Nodes  $i$  and  $j$  are in the same cell, where  $i$  is active and  $j$  is passive. The squares denote channels. Squares marked as grey are available channels.  $IH(c_k)$  is the middle channel, as shown in Fig. 3(b). The  $\Delta M$  and  $\Delta' M$  here are both equal to 1. After searching on  $[IH_i - \Delta M, IH_i + \Delta' M]$ , node  $i$  will find  $j$ 's  $IH_j$  by receiving ACKs from  $j$ .

3) *Information Exchange and Self-Organization*: Active nodes send messages on the guessed IHCs of passive nodes. If a passive node receives the request from an active node, it would reply with an ACK. The transmission range used here is:  $r_0 = \sqrt{2}L$ . It ensures that a request from an active node can cover the whole cell. In our model, only two steps are needed for each node to know all other nodes' information in the same cell. Each node maintains two lists,  $L_a$  to store the list of active nodes, and  $L_p$  to store the list of passive nodes. The active node also maintains a list of channels with passive nodes,  $L_c$ . Initially,  $L_a = \emptyset$ ,  $L_p = \emptyset$ , and  $L_c = \emptyset$ . The node information here contains the node ID and its location in the network. The procedure for information exchange and self-organization is:

- 1) Each active node scans the channel hopping range. For each channel, it sends a request message containing its information. Each passive node returns an ACK with its own node information to every request it receives on its IHC, and stores the active node's information in list  $L_a$ ; upon receiving the ACK, the active node stores the passive node information into list  $L_p$ , and stores the corresponding IHC of the passive node into  $L_c$ .
- 2) After 1), each active node switches back to each channel in  $L_c$ . The active node sends its passive nodes list  $L_p$  to the passive nodes in this channel. On the other hand, the passive node replies its list  $L_a$  to the active node. Note that the active nodes are time-synchronized. If otherwise, each active node needs to wait until all active nodes complete channel hopping.

### C. Success Probability of Self-Organization

In this subsection, we analyze the *success probability of self-organization*, which is defined as the probability that a node in a cell successfully learns the ID and other information of another node in the same cell. In the self-organization procedure, when an active node scans through the channels to find passive nodes, it is still possible that the IHCs of some passive nodes are not accessible by this active node. From Section IV-B2, the channel searching range for an active node is  $\Delta M + \Delta' M + 1$  channels. Among the  $\Delta M + \Delta' M + 1$  channels, let  $m$  denote the number of channels which are available to the CRN communication. Let  $u_k$  and  $v_k$  denote the mean busy and idle durations on the  $k$ th channel of the  $\Delta M + \Delta' M + 1$  channels. Let  $X_k = 1$  or 0 denote whether the  $k$ th channel is available or not.  $X_k$  follows the Bernoulli distribution with parameter  $\frac{v_k}{u_k + v_k}$ . We assume that the PU activities on different channels are independent. If  $v_k = v$  and  $u_k = u$  for all  $k$ , then  $m = \sum_{k=1}^{\Delta M + \Delta' M + 1} X_k$

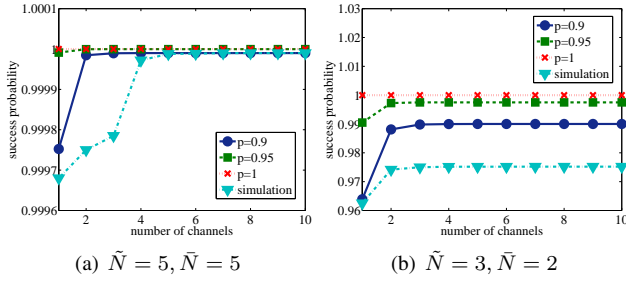


Fig. 4. The self-organization success probability

follows the Binomial distribution with parameters  $\frac{v}{u+v}$  and  $\Delta M + \Delta' M + 1$ . Otherwise,  $m$  approximately follows a normal distribution with mean  $\sum_{k=1}^{\Delta M + \Delta' M + 1} \frac{v_k}{u_k + v_k}$  and variance  $\sum_{k=1}^{\Delta M + \Delta' M + 1} \frac{u_k v_k}{u_k + v_k}$ . Furthermore, among the  $m$  channels, not every channel is available to every node, due to the spatial diversity of channel availability. Let  $p$  denote the probability that a channel among the  $m$  channels is available to a node. Next, we analyze the conditional success probability of self-organization, given  $m$  and  $p$ . The unconditional success probability can be computed utilizing the Binomial distribution, which  $m$  follows.

**Lemma 1:** Let  $Z_{jk}$  denote the event that passive node  $j$  selects the  $k$ th channel in the range  $[IH_j - \Delta M, IH_j + \Delta' M]$  as its home channel using Algorithm 1. Then the probability of  $Z_{jk}$ , denoted as  $\beta$ , is given as

$$\beta = \Pr(Z_{jk}) = \frac{1}{m} (1 - (1 - p)^m). \quad (1)$$

Note that  $\beta$  depends on  $m$  and  $p$  only, neither  $j$  nor  $k$ .

Let node  $i$  be an active node and node  $j$  be a passive node. Let  $P_s$  denote the probability that node  $i$  can meet the passive node  $j$  in the  $m$  available channels. Let  $\tilde{N}$  denote the number of passive nodes in the cell, and  $\bar{N}$  denote the number of active nodes in the cell. We have the following theorem on the self-organization success probability. The proof is presented in Section 2 of the supplemental material.

**Theorem 1:** The  $P_s$  is lower-bounded as follows,

$$P_s \geq 1 - (1 - m\beta p)^{\min(\tilde{N}, \bar{N})}. \quad (2)$$

#### D. Estimation of Channel Hopping Range

Based on Theorem 1, we can find  $m$  that satisfies the self-organization success probability requirement, for given  $p, \tilde{N}, \bar{N}$ . From  $m$ , we can find  $\Delta M$  and  $\Delta' M$ , the channel hopping range in the self-organization. Fig. 4 illustrates the self-organization success probability as a function of  $m$ . In the simulation, we generate primary users on each channel with random session requests. We can see that the analysis results match the simulation results very well. When  $p = 0.9$  and there are only 3 passive nodes and 2 active nodes,  $m = 3$  makes the success probability as large as 0.99. If  $\tilde{N}$  and  $\bar{N}$  are larger, the success probability is even larger, e.g., equal to 0.99999 for  $\tilde{N} = 5$  and  $\bar{N} = 5$ . Since the number of available channels follows Binomial distribution  $B(j : \frac{v}{u+v}, \Delta M + \Delta' M + 1)$ , as discussed in the preceding subsection, then the channel hopping range  $\Delta M + \Delta' M + 1 \approx m \frac{u+v}{v}$ . For instance, if  $\frac{v}{u+v} = 0.6$ , which is a high spectrum utilization for primary users, then the channel hopping range  $\Delta M + \Delta' M + 1 \approx 5$ .

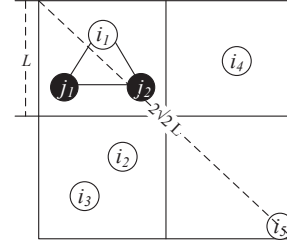


Fig. 5. Example of backbone nodes selection.

Therefore, in the self-organization procedure, the active nodes only need to scan about 5 channels to ensure that all nodes will be found/connected (success probability close to 1).

## V. VIRTUAL BACKBONE CONSTRUCTION

The next phase of our model is to construct the virtual backbone. It is accomplished through two steps. The first step is to select the cluster heads. The second step is to select backbone nodes from the cluster heads.

#### A. Cluster Head Selection

The classical clustering approach [5] works as follows: (1) all nodes are initially uncovered; (2) an uncovered node  $i$  becomes a cluster head if it has the highest priority among its 1-hop uncovered neighbors, including  $i$ ; (3) the selected cluster heads and its connected 1-hop neighbors are marked as covered; repeat (2) and (3) on all uncovered nodes (if any).

In our model, the cluster heads are selected distributively in each cell using the above approach, until every node, itself, becomes a cluster head, or has one neighbor selected as its cluster head. Based on our assumption, the transmission range of each node can be adjusted. Here, we set the transmission range for cluster head selection as:  $r_1 = \frac{2\sqrt{2}}{3}L = \frac{1}{3}R$ .

We can improve the head selection efficiency by utilizing the information collected by nodes in the same cell. Since each node learns about all other nodes' IDs and locations in the same cell from Section IV, it can run the classical clustering approach by itself, without exchanging information with other nodes. The priority we use here is the node's ID. The node with the lowest ID value has the highest priority. For example, in Fig. 5, there are three nodes,  $i_1$ ,  $j_1$ , and  $j_2$ , in the upper left cell. Since the three nodes already know each others' IDs and locations within range  $r_1$  in one cell ( $r_1 < L$ ). Therefore, they do not need to exchange any control message. All three nodes would choose  $i$  as the cluster head after applying the classical clustering approach distributively.

Since our cluster heads are selected based on each cell, they may differ from the results when running the clustering approach in the whole network without any cell. We need to prove that the coverage is unchanged in our algorithm. We use  $H$  to denote the set of cluster heads. Please refer to Section 3 in the supplemental material for the detailed proof.

**Theorem 2:** The coverage remains unchanged if the cluster heads are selected based on cells.



## B. Backbone Node Selection

After cluster heads are selected from cells, the next step is to select the backbone nodes from cluster heads. Here, we apply the approach in [5], consisting of two phases:

- *Marking process*: Each node is marked if it has two unconnected neighbors; otherwise, it is unmarked.
- *Pruning Rule*: A marked node can unmark itself if its neighbor set is covered by a set of connected nodes with higher priorities.

The approach is to reduce the number of cluster heads and construct the backbone, while ensuring the connectivity and coverage. The process completes when the marking process finishes, and there is no marked node that can perform the pruning action. The marked cluster heads are the backbone nodes. Details are in [5]. The priority among nodes still depends on their ID. The remaining problem is how the cluster heads exchange information with each other in order to run the above marking process and pruning rule.

1) *Cluster Head Communication*: A cluster head needs to exchange information with all cluster heads around it. Therefore, it would exchange information with the eight cells surrounding it. We set the transmission range used here as:  $r_2 = R$ , which is the same as the data transmission range  $R$  of each node. This is for ensuring the coverage of cluster heads in the eight surrounding cells, by the cluster heads in the central cell. With  $r_2 = R = 2\sqrt{2}L$ , it ensures that each cluster head is able to reach the adjacent eight cells, which covers all the cluster heads within  $r_2$  around it (since the longest distance between two cluster heads in adjacent cells is  $2\sqrt{2}L$ ). For example, node  $i_5$  in Fig. 5 is able to cover the upper left cell using  $r_2$ .

Since nodes in different cells use different cell IDs to calculate their IHCs, cluster heads need to guess the IHCs used by others in adjacent cells. For a  $h \in H$  that is located in cell  $c_k$ , it is not hard for  $h$  to guess the IHC of another cluster head in  $H$ , which is located in the cell  $c_{k'}$  adjacent to  $c_k$ . The process for node  $h$  to send the request message to other cluster heads in cell  $c_{k'}$  is in Algorithm 2. It uses Algorithm 1 to guess the IHC of the cluster heads in cluster  $c_{k'}$ . For every channel returned by Algorithm 1, cluster head  $h$  will broadcast request messages through that channel, increasing the probability that cluster heads in adjacent cells can receive the request message.

2) *Efficiency Improvement*: Because cluster heads are also nodes in the network, they have active/passive states. A cluster head sends a request message only when it is active. Cluster heads in the same cell know each others' information (ID, location). To increase efficiency, the request message sent by each active cluster head would include the information of all the cluster heads in the same cell. Also, if a passive cluster head receives a request message from its IHC, it replies a message with the information of all cluster heads in its cell. If a cluster head receives a request or reply message from an adjacent cell, it would mark that cell as known. If no message is received through the above process, the active cluster head would back off and retry again later, until receiving the reply or request message. The whole procedure continues for each cluster head until the adjacent cells are all marked as known.

**Algorithm 2**  $h$  sends requests to cluster heads in an adjacent cell  $c_{k'}$

- 
1.  $Temp = M_h$
  2. **while**  $Temp \neq \emptyset$  **do**
  3.      $temp = Pro1(h, M(c_{k'}))$
  4.      $h$  broadcasts a request message using  $temp$
  5.     Remove  $temp$  from  $Temp$
  6. **end while**
- 

For example, in Fig. 5, node  $i_1 \in H$  is an active cluster head, and wants to learn the cluster heads in the bottom left cell.  $i_2$  and  $i_3$  are passive cluster heads in the bottom left cell. If  $IH_{i_2} \notin M_{i_1}$ , then  $i_1$  cannot reach  $i_2$  directly. However, if  $i_1$  can reach  $i_3$ , it would receive a reply message from  $i_3$ .  $i_3$  would send both  $i_2$  and  $i_3$ 's information to  $i_1$ .  $i_1$  would mark this cell as known.  $i_3$  also marks the upper left cell as known, based on the information in the request sent by  $i_1$ . Then  $i_3$  shares the information with  $i_2$ . Therefore,  $i_2$  also marks the upper left cell as known.

3) *Backbone Formation*: After cluster heads in  $H$  learn about the neighbor information in adjacent cells, they perform the marking process and pruning rule, and then form the final virtual backbone. Now we need to prove that the connectivity and coverage is unchanged through constructing the backbone, using our approach. We have the following theorem (the detailed proof is in Section 4 of the supplemental file):

**Theorem 3**: For any nodes  $i$  and  $j$ , if they are connected in the original network, they are both covered and still connected through nodes in the backbone node set  $B$ .

## VI. END-TO-END DATA TRANSMISSION

We first describe how each node chooses the data transmitting channel and how the single-hop links are built. Then, we propose a scheme of having a virtual backbone to calculate the area route, and use multiple links to transmit data simultaneously within and between areas until the destination node is reached.

### A. Single Hop Transmission

To build single-hop links for the network, each node uses the active/passive states. The home channel for passive nodes here cannot be the same as the IHCs in the previous section. This is to allow multiple links to transmit simultaneously. If the active nodes transmit through the IHCs of the passive nodes, the interference would be relatively high among links nearby. This is because IHCs of nodes in the same cell, which are geographically close, are selected from the same channel segment. Therefore, we need to choose a new home channel for every node to transmit, which is called *transmission home channel* (THC).

1) *THC Selection*: We adopt the approach in [9] for the nodes to choose THCs and guess the THCs of others, which has minimal control overhead and is highly effective. Algorithm 3 describes how to select the THC of node  $i$  with the available channel set  $M_i$ , denoted as  $Pro2(i, M_i)$ . Note that Algorithm 3 is similar to Algorithm 1. The difference

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**Algorithm 3**  $Pro2(i, M_i)$ , to compute THC for node  $i$ 


---

1. Set  $i$  as the seed for the pseudo-random number generator  $Z$ .
  2. Let  $\mathcal{Q} = M$  // The total channel set
  3. **repeat**
  4.      $k = Z(|\mathcal{Q}|)$  // Generate  $k$  such that  $1 \leq k \leq |\mathcal{Q}|$
  5.      $q = \mathcal{Q}(k)$  //  $\mathcal{Q}(k)$  is  $k$ th channel in  $\mathcal{Q}$
  6.      $\mathcal{Q} = \mathcal{Q} \setminus \{q\}$  // Remove  $q$  from  $\mathcal{Q}$
  7. **until**  $q \in M_i$
  8. Return  $q$  // Selected THC
- 

here is the value of  $\mathcal{Q}$ . Here,  $\mathcal{Q}$  equals  $M$ , instead of the channel segment assigned to the corresponding cell. Also, the algorithm has been deliberately designed to make the channel estimation (to be discussed) highly successful. It has a subtle difference from a naive random channel selection that simply picks a channel from set  $M_i$  at random. This subtle difference has a profound impact on the success probability of a node estimating the home channel of another node. This has been proven in [9].

2) *THC Estimation*: When an active node  $i$  wants to transmit packets to a passive node  $j$ , it estimates the THC of node  $i$  as  $Pro2(j, M_i)$ , i.e., using node  $j$ 's ID, but node  $i$ 's accessible channel set  $M_i$  as parameters. Then node  $i$  switches to channel  $Pro2(j, M_i)$ . If the intended receiver, node  $j$ , is in fact on the estimated channel  $Pro2(j, M_i)$ , then the rendezvous is successful, and the packet transmission starts. Algorithm 3 has been designed to ensure that the successful probability of the channel estimation, i.e.,  $\Pr(Pro2(j, M_i) = Pro2(j, M_j))$ , is high. This is also proven in [9]. This approach does not require any exchange of control messages, which significantly streamlines the communication and reduces overhead.

3) *State Sequence Generation*: After each node has its THC selected, we need to decide the active/passive state sequences over a time period. There is a potential issue: when node  $i$  switches to the THC of node  $j$  to send packets, node  $j$  itself has switched to the home channel of another node. To resolve this issue, we adopt an approach similar to [14], and consider two *variants*, depending on if a node knows the number of nodes in its single-hop neighborhood. Since each node in our network is equipped with a GPS device, the cognitive radio is programmed to have the GPS waveform so that each node can receive the GPS signal to have a common time reference, i.e., all nodes are time-synchronized while operating in time-slotted mode.

*Variant 1*: The node does not know the number of nodes in its single-hop neighborhood. This happens when the number of nodes in the neighborhood changes dynamically, and we do not want to have overhead or incur a control structure to keep track of the number of nodes at each node. In this case, we let node  $i$  use a function  $g(i, t)$  to compute its state in time slot  $t$ . The function  $g(\bullet)$  is a pseudo-random number generator that uses  $i$  and  $t$  as the seeds to generate a random number, either 0 or 1. If  $g(i, t) = 1$ , then node  $i$  is a passive node in slot  $t$ , and stays on its home channel in this slot. If  $g(i, t) = 0$ , node  $i$  is an active node in slot  $t$ . It selects a passive node and

switches to the home channel of the selected passive node for packet transmission. Note that node  $i$  knows whether another node, say node  $j$ , is a passive node, by calling the function  $g(j, t)$  to find the status of node  $j$ .

*Variant 2*: Each node knows the number of nodes in its single-hop neighborhood. If we know  $n = |N|$ , which is the number of nodes in the network, then we can generate the node status, such that the number of passive nodes and the number of active nodes are balanced, to maximize throughput. Specifically, in time slot  $t$ , every node uses a pseudo-random number generator function  $g'(t, n)$  that uses  $t$  as the seed to generate the states for all  $n$  nodes, denoted as  $[g_1, g_2, \dots, g_n]$  with  $g_i = 1$  or 0, denoting that node  $i$  is a passive or an active node. To balance the number of passive nodes and the number of active nodes, we let the pseudo-random number generator continue to generate  $[g_1, g_2, \dots, g_n]$  until  $\sum_{i=1}^n g_i = \lceil \frac{n}{2} \rceil$ ; i.e., the number of passive nodes is  $\lceil \frac{n}{2} \rceil$ . Note that as every node uses the same seed  $t$ , every node would need exactly the same number of rounds of the pseudo-random number generator to get  $\sum_{i=1}^n g_i = \lceil \frac{n}{2} \rceil$ . Hence, the  $[g_1, g_2, \dots, g_n]$  generated by each node is still the same. With the number of passive nodes being equal to  $\lceil \frac{n}{2} \rceil$ , the spreading of both passive and active nodes into different channels is maximized, which maximizes the number of simultaneous transmissions (on different channels) and, hence, the throughput.

## B. Multihop Transmission

After the single-hop links are built, to implement the end-to-end data transmission, the source node needs to know the route to reach the destination. If the source node calculates a route of individual nodes, the overhead and delay would be very high. With the virtual backbone structure, we can provide an efficient multihop transmission scheme.

1) *Area route*: Since the virtual backbone is connected and covers the whole network, the backbone node that the source node is attached to can calculate an *area route* from the source area to the destination area.

**Definition 3**: The area route is a set of areas, through which the source node must pass to reach the destination node. Each area is a set of a backbone node and all the nodes attached to it.

As shown in Fig. 2, the area route from source  $S$  to destination  $D$  is  $A_1 \rightarrow A_2 \rightarrow \dots \rightarrow A_k$ . Source  $S$  belongs to  $A_1$  and destination  $D$  belongs to  $A_k$ . The backbone node only needs to communicate with other backbone nodes until reaching the backbone node, to which the destination node is attached. The overhead for a backbone node to calculate the area route is much less, compared to the one in which the source node calculates the full path to reach the destination. We can apply any classical routing algorithm among backbone nodes to calculate the area route.

2) *Intra-area Data Transmission*: For data transmission within a single area, since each node knows the number of nodes in the area, it applies the Variant 2 in the preceding subsection to generate its state: 1) based on the border nodes schedule, each node knows the number of nodes in this area in the current time slot. Let  $N'$  denote this number; 2) each node

generates the node status  $[g_1, g(2), \dots, g_{N'}]$ ; 3) if  $g_i = 0$ , then node  $i$  is active, and otherwise, node  $i$  is passive, and selects its THC to keep listening; 4) the active node selects a passive node, e.g., based on the first packet of the packet queue, and switches to the estimated THC of the passive node.

3) *Inter-area Data Transmission*: For data transmission between different areas, we need to design an active schedule for different areas. We make use of the *gateway nodes* here. If a node is at the border of two or more areas, then it is a gateway node. To select the gateway nodes, we can set a threshold of the distance differences from a node to two backbone nodes. If the distance difference is within the threshold, then the node becomes a gateway node. This can be easily implemented, since each node has the GPS device, and knows its own location, as well as that of the backbone nodes.

A gateway node needs to communicate with all nodes of each area it belongs to. Except the gateway nodes, a node communicates with the neighbors in the same area only, even though it can reach nodes in another area. A gateway node sequentially joins the areas it belongs to. Let  $\{A_1, A_2, \dots, A_k\}$  denote the set of the areas that a gateway node,  $i$ , belongs to. At time slot  $t$ ,  $i$  would join area  $A_{k_1}$  where  $k_1 = (t \bmod k) + 1$ . When  $i$  joins area  $A_{k_1}$  ( $1 \leq k_1 \leq k$ ), the nodes in area  $A_{k_2}$  ( $k_2 \neq k_1, 1 \leq k_2 \leq k$ ) know that node  $i$  is not in area  $A_{k_2}$ , by the control information from the backbone node, and hence do not try to communicate with node  $i$ . Nodes from an area would send the data to a gateway node when it joins this area. Then, after the gateway node joins another area, it would forward the information received in the previous area to the nodes in the current area.

The use of gateway nodes can improve the performance in two aspects. First, the throughput is increased, because there can be several gateway nodes in one area; hence, there can be simultaneous data transmissions on different channels between multiple nodes and the gateway nodes, as well as between gateway nodes themselves. Second, the backbone nodes only need to calculate area routes, and there are no data packets being forwarded through the backbone nodes. Hence, the traffic loads on the backbone nodes are minimized, which avoids the congestion at the backbone nodes if all traffic has to go through the backbone nodes. The packet delay is reduced as well. The theoretical analysis of the capacity between an active node and a passive node, and the capacity of an area, are given in Sections 5 and 6 of the supplemental material.

## VII. PERFORMANCE EVALUATION

In this section, we present the simulation settings and results for our model. The simulation results testify our model.

### A. Simulation Settings

We distribute nodes in a  $200 \times 200$  unit square. The cell size is set as  $50 \times 50$ . We also generate 40 PUs, which are randomly active. The PUs are randomly distributed in the unit square. When the PU is active, it occupies one channel from the total channels. The interference range of the PU is set as 30. We vary the following two network parameters.

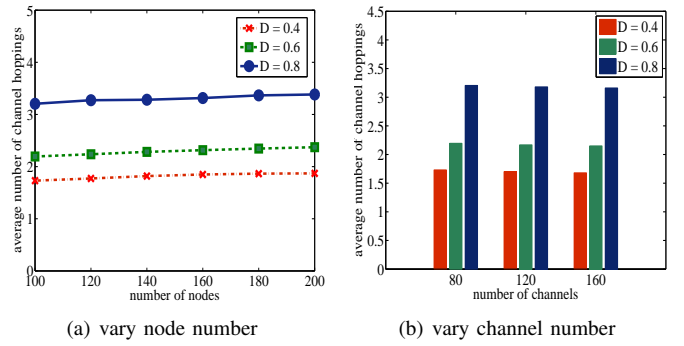


Fig. 6. Average number of channel hoppings for different detection probabilities.

- 1) number of nodes: 100 ~ 200 with an increment of 20;
- 2) number of channels: 80 ~ 160 with an increment of 40.

We first evaluate the performance of self-organization. Then we compare the throughput and delay with the approach in [9], which does not have a virtual backbone construction.

### B. Simulation Results

The simulation results are presented from three aspects, based on the three categories above.

1) *Performance of our model*: We first show the cost of self-organization in terms of the average number of channel hoppings for an active node to reach a passive node in Figs. 6(a) and 6(b). We compare the average number of channel hoppings with three different channel busy time ratios, i.e.,  $\frac{u}{u+v} = 0.4, 0.6, \text{ and } 0.8$ . The results show that the number of channel hoppings for all cases are less than 5, which verifies the analysis in Section IV-D. Fig. 6(a) shows that when the number of nodes increases, the number of channel hoppings increases slowly. Fig. 6(b) actually has a slight increment in the number of channel hoppings when the number of channels increases. However, the increase of the channel availability does not have a huge influence on the number of channel hoppings. This is because of simulation settings. Even the minimum number of channels here is sufficient for one cell to have enough channels to ensure high success probabilities, as proved in Section IV-C.

Next, we set the number of nodes as 100 and the number of total channels as 80. Also, we show the process of backbone node selection using our model. The process is shown in Fig. 7. Fig. 7(a) shows the nodes distribution in the network with cell divisions. In Fig. 7(b) the square nodes are the selected cluster heads from each cell. Fig. 7(c) shows the selected backbone nodes (the diamond ones).

2) *Comparison with other models*: We implement the algorithm in [9], which does not have a virtual backbone construction, and compare it with our approach. In the network without a virtual backbone, each node does not know the number of nodes in the network, and uses the Variant 1 in Section VI to reach their next hop. Also, since no virtual backbone exists, the source needs to calculate the route to the destination itself.

The comparison results of throughput are shown in Figs. 8. The throughput is the average throughput for all the active sessions in the network. In Fig. 8(a), the throughput at the



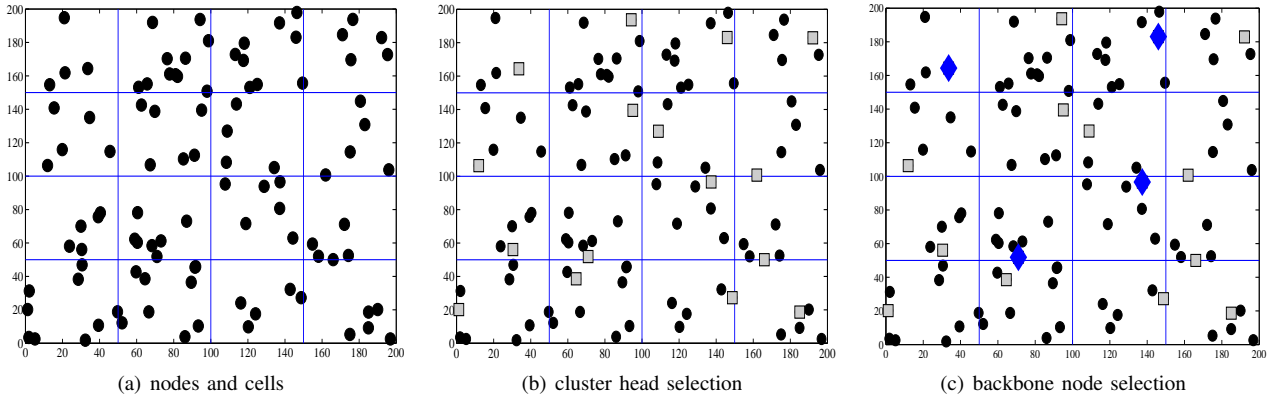


Fig. 7. Process of a backbone construction.

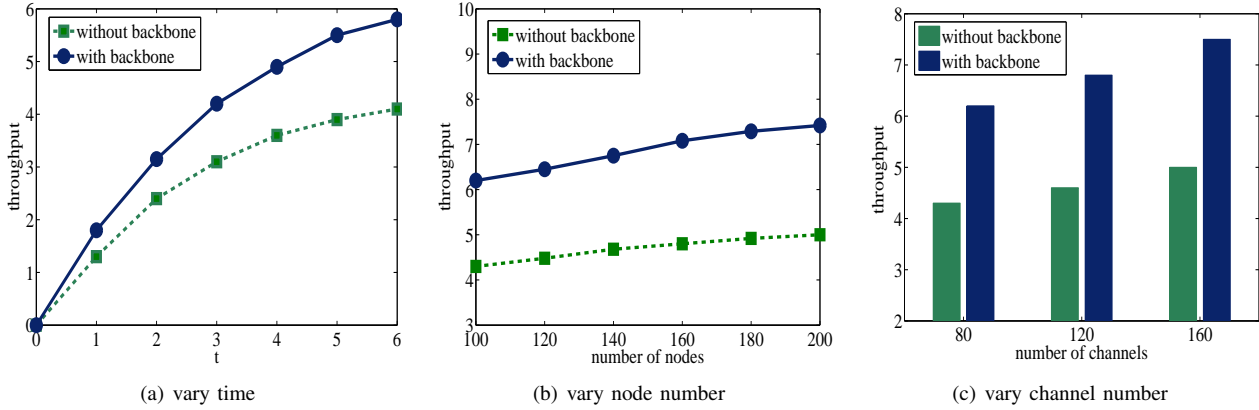


Fig. 8. Comparison of average throughput for different models.

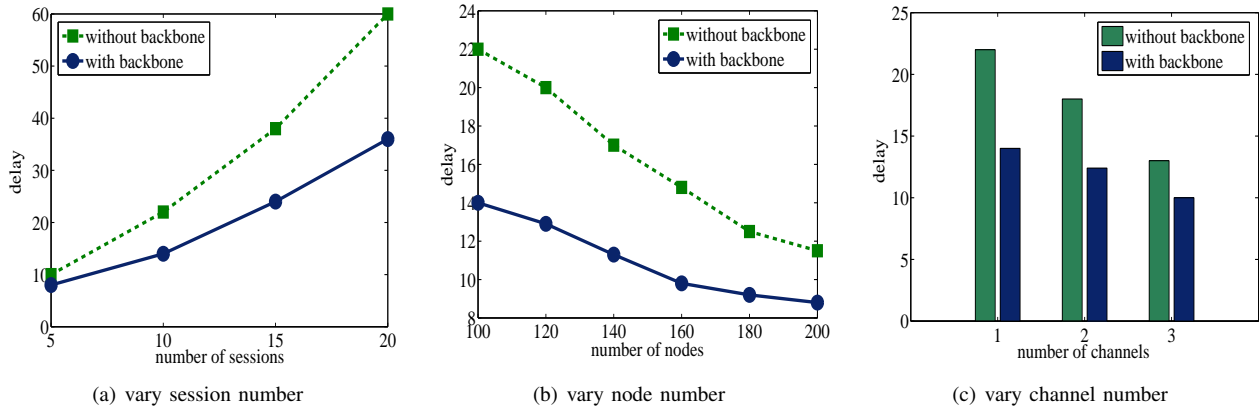
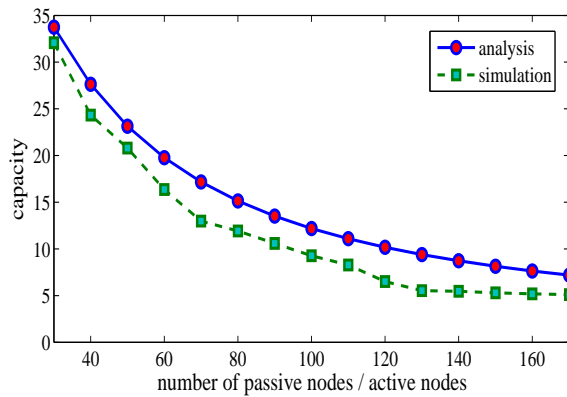


Fig. 9. Comparison of average delay for different models.

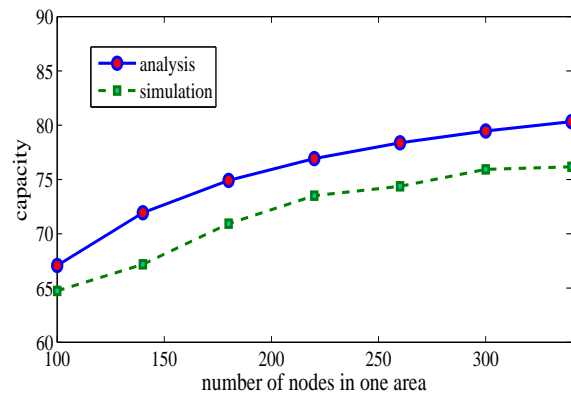
first 6 time slots are shown. The one with the virtual backbone structure increases faster than the one without the virtual backbone over time. At the 6th time slot, our approach achieves almost 1.6 times over the one without virtual backbone. In Fig. 8(b), the results show that the throughputs of both approaches increase slowly when the number of nodes increases. In Fig. 8(c), the throughput of both approaches increases while the number of channels increases. Overall, the throughput with the virtual backbone structure is much larger than the one without a virtual backbone structure.

Moreover, we compare the packet delay between the two

approaches. The results are shown in Figs. 9. In Fig. 9(a), we vary the number of active sessions, while setting the number of nodes as 100. The delay in both approaches increases, when the number of active sessions increases. The delay for the approach without the virtual backbone structure increases more rapidly. In Fig. 9(b), the delay in both approaches decreases, as the number of nodes increases. Nevertheless, the speed of delay decrement becomes slower as the number of nodes increases. This happens when there are more nodes, the average number of channels available to each node is smaller. In Fig. 9(c), we vary the number of total channels



(a) among two nodes



(b) among a forwarding area

Fig. 10. Average capacity.

in the network, while setting the number of nodes as 100. The results show that when the number of total channels increases, the delay decreases for both approaches. Overall, the delay of the approach with the virtual backbone structure is less than the one without a virtual backbone structure.

3) *Area capacity evaluation*: We also perform the simulation regarding the capacity between an active node and a passive node in one area, and also the average capacity of a forwarding area. The simulation results are presented to be compared with the analysis results. First, we simulate the capacity between an active node and a passive node within the same area. We increase the average number of nodes in a single area from 10 to 60. Other settings remain the same as in the above parts. We evaluate the mean capacity between an active node and a passive node. The results are shown in Fig.10(a). The capacity decreases as the number of nodes in a single area increases. Fig. 10(b) is the function graph of the capacity regarding the total number of nodes in one area. The number of gateway nodes is set to be half of the total nodes in each area. The simulation results are also shown in the same figure. The two lines have the similar values and trends, which testify our analytical results. The gateway nodes,  $\mathcal{G}$ ,  $\mathcal{G}'$ , are set to 0.25 of the number of nodes in one area. The value of  $\mathcal{I}$  is set to be 0.5 of the number of nodes in one area. There are gaps in both figures regarding the analysis results and the simulation results. This is because the channel set of each node in the simulation is different, due to the location of primary users nearby. Some links cannot be built because of the primary users.

## VIII. CONCLUSION

In this paper, we propose an approach regarding how to construct a virtual backbone in CRNs. Our approach does not rely on a common control channel (CCC) for coordination among different nodes. Each node makes use of the location information and adjustable transmission range for the virtual backbone construction. We let each node choose its own channel for data transmission, and reduce the interference among different links. We analyze the success probability of two nodes selecting the same channel for initial transmission. In addition, we propose an efficient scheme for end-to-end data

transmission. We select gateway nodes to reduce the overhead among backbone nodes. The simulation results verify our theoretical analysis. In comparison to another model without a virtual backbone, the improvement in the efficiency of our approach is proven.

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