

On Computing Resilient Virtual Backbone in Cognitive Radio Networks

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Background

- licensed spectrum bands, e.g. cell phone network
 - lower utilization, especially rural area
- cognitive radio network (CRN)
 - primary users (PUs)
 - rightful (paid) users of cell phone spectrum bands
 - cognitive users (CUs)
 - opportunistically use idle licensed spectrum bands for communication
 - must release the bands for the primary user once active
 - a supplementary network: a way to provide communication capacity for resource hungry unlicensed spectrum band users

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How CRN Works?

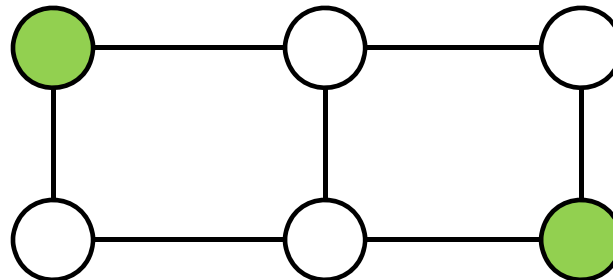
- CRN is a temporal network of CUs using licensed bands
- each CU detects any idle licensed spectrum bands
 - if two neighboring CUs share a common idle band, they can use it for the communication
 - once PU of the idle band becomes active, the CUs have to stop using the licensed band for the PU
- energy-efficiency is still an important issue of CRN
 - frequently, each CU is a battery-operated mobile node
- however, routing information is likely to be invalidated by PU activities even in static CRN

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Dominating Set

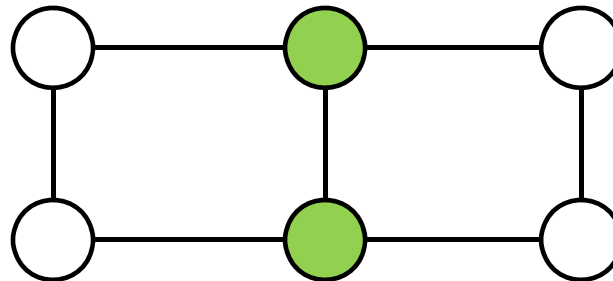
a **dominating set (DS)** is subset of nodes such that
(a) each node is either in the subset or
(b) neighboring to a node in the subset



Connected Dominating Set

a subset of nodes is a **connected dominating set (CDS)** if

- (a) it is a DS and
- (b) the sub-graph induced by the subset is connected



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Maximal Independent Set and CDS

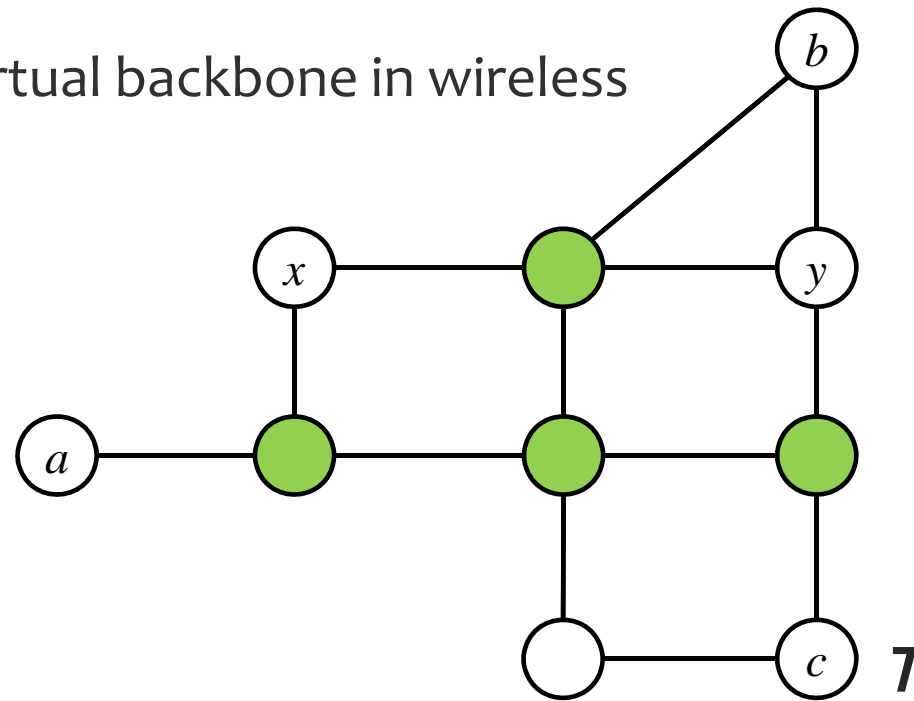
- **independent set (IS)** of G
 - a subset of $V(G)$ such that no two nodes in the subset are adjacent in G
- **maximal independent set (MIS)** of G
 - an independent set I of G such that for any $v \in V(G) - I$ $I \cup \{v\}$ is not an independent set
- an MIS is a DS
- computing an MIS and add more nodes to the MIS is a popular way to compute a CDS

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Virtual Backbone and CDS

- virtual backbone
 - connected subset of nodes responsible for message routing
 - CDS can serve as a virtual backbone in wireless networks



Advantage of Virtual Backbone

regular (flooding-based) routing	routing over virtual backbone
<ul style="list-style-type: none">• redundant• heavy collision and interference overhead• energy inefficient	<ul style="list-style-type: none">• smaller routing path search space• any routing scheme becomes more efficient

- size is an important metric
- computing a minimum CDS is NP-hard
 - cannot expect to compute an optimal solution in polynomial time
 - polynomial time approximation algorithm (sub-optimal algorithms with performance guarantee) is a popular subject

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Motivation

- most virtual backbone construction algorithms for wireless networks focus on
 - minimizing size for efficiency
 - considering battery level of nodes for lifetime maximization
- computing virtual backbone in CRNs [4]
 - given a node-weighted (remaining energy level) network graph find a CDS such that
 - objective 1: maximize minimum node weight in the CDS
 - objective 2: minimize the size of the CDS

Motivation – cont'

- lifetime of a CDS in wireless network is mostly affected by battery-lifetime
- however, CRN is a temporal network
 - depending on PU activities, link availability changes
 - lifetime of CDS in CRN is highly dependent on PU activities
- better formulation for maximum lifetime (fault-tolerant) CDS would be
 - consider an edge-weighted (expected lifetime of link connectivity) graph
 - find a spanning tree of the graph such that
 - objective 1: maximize the minimum edge weight of the tree
 - objective 2: minimize the number of the non-left nodes (CDS nodes) in the tree

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Notations

- $G = (V, E)$ is a graph with node set $V = V(G)$ and edge set $E = E(G)$
- Given $V' \subseteq V$, $G[V']$ is a subgraph of G induced by V'
- Given $E' \subseteq E$, $G[E']$ is a subgraph of G induced by E'
- $CU = \{CU_1, \dots, CU_n\}$: $n \geq 1$ CUs
- $PU = \{PU_1, \dots, PU_m\}$: $m \geq 2$ PUs
- $C = \{c_1, \dots, c_l\}$: the set of available spectrum bands
- C_i is the set of spectrum bands licensed to PU_i
 - C_i and C_j are not necessarily disjoint for each i and j pair
 - at any moment, PU_i is either actively using $c_h \in C_i$ or not



Problem Definition

- suppose $A_j \subseteq \mathcal{C}$ is the subset of channels to CU_j
- by [5], the activities of PU_j is modeled as a continuous time semi-Markov process
 - $X_{(c,j)}$, the time duration some channel c is available to CU_j , $\lambda_{(c,j)} e^{-\lambda_{(c,j)} X_{(c,j)}}$ for each $j = 1, 2, \dots, m$
 - $E(X_{(c,j)}) = \lambda_{(c,j)}$ is the expected value of $X_{(c,j)}$: known
- Definition 1. Lifetime of a Communication Link
 - consider C_i and C_j sharing a set of commonly available channels c_1, \dots, c_p
 - the expected lifetime of the communication link is
$$\rho(e_{(i,j)}) = \max_{1 \leq q \leq p} \{ \min [E(X_{(q,i)}), E(X_{(q,j)})] \}$$

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Problem Definition – cont'

- Definition 2. Lifetime of a Connected Network
 - given a connected network G , its lifetime is $\rho(G) = \max\{\rho \mid \text{deleting all communication links with expected lifetime less than } \rho \text{ cannot cause } G \text{ disconnected}\}$
- given a positive integer k , a graph G is k -edge-connected if G is connected after removing any combination of k edges
- Definition 3. k E k DS
 - given a graph $G = (V, E)$, a subset D of V is a k -edge-connected k -dominating set of G if $G[D]$ is
 - k -edge-connected, and
 - for each node u in $V - D$, u is connected to at least k nodes in D in the original graph G

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Problem Definition – cont'

- Definition 4. Lifetime of D , a $kEckDS$
 - internal lifetime: the minimum amount of time that makes $kEckDS$ disconnected
 - external lifetime: the minimum amount of time that any node outside $kEckDS$ is disconnected from $kEckDS$
 - lifetime of $kEckDS$: minimum of internal lifetime and external lifetime, i.e. the minimum time $kEckDS$ loses its function

$$\rho(D) = \min[\rho(D_{in}), \rho(D_{out})]$$

- Definition 5. MLSVB
 - given a CRN $G = (V, E)$ of n CUs and a positive constant k , MLSVB is to find a CDS D of G such that
 - D is $kEckDS$ of G
 - lifetime of D is maximized, and
 - size of D is minimized.



MLSVBA: Heuristic Algorithm for MLSVB in CRN

- maximum lifetime sturdier virtual backbone algorithm
 - a 3-stage polynomial time heuristic algorithm

lifetime of edges determined based on the history

Algorithm 1 MLSVBA $(G = (V, E), L = \{\rho(e) | \forall e \in E\})$

- 1: $G^{(1)} \leftarrow \text{TRIMMER}(G, L)$.
 - 2: $G^{(2)} \leftarrow \text{LIFETIME-MAXIMIZER}(G^{(1)}, L)$.
 - 3: $S \leftarrow \text{SIZE-MINIMIZER}(G^{(1)}, G^{(2)})$.
 - 4: Return S .
-

MLSVBA: Heuristic Algorithm for MLSVB in CRN – cont'

- TRIMMER
 - gradually remove all edges whose lifetimes are expected to be short such that the residual graph is still k -edge-connected

Algorithm 2 TRIMMER (G, L)

```
1: Let  $\rho_1 < \dots < \rho_l$  be the list of distinct lifetime levels in
    $L$ .
2:  $E^{(1)} \leftarrow E$ .
3: for  $i = 1$  to  $l$  do
4:    $E_i = \{e \mid \rho(e) = \rho_i \text{ and } e \in E^{(1)}\}$ .
5:   if the graph induced by  $(V, E^{(1)} \setminus E_i)$  is still  $k$ -edge
      connected then
6:      $E^{(1)} \leftarrow E^{(1)} \setminus E_i$ .
7:   else
8:     break;
9:   end if
10: end for
11: Return  $G^{(1)} = (V, E^{(1)})$ .
```

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MLSVBA: Heuristic Algorithm for MLSVB in CRN – cont'

- LIFETIME-MAXIMIZER
 - further remove any short-living edges such that the residual graph include a feasible solution

Algorithm 3 LIFETIME-MAXIMIZER ($G^{(1)}, L$)

```
1: Let  $\rho_1 < \dots < \rho_l$  be the list of distinct lifetime levels in
    $L$ .
2:  $E^{(2)} \leftarrow E^{(1)}$ .
3: for  $i = 1$  to  $l$  do
4:    $E_i = \{e \mid \rho(e) = \rho_i \text{ and } e \in E^{(2)}\}$ .
5:   if the graph induced by  $(V, E^{(2)} \setminus E_i)$  has a connected
      component containing a  $k\text{ECKDS}$  of  $G^{(1)}$  then
6:      $E^{(2)} \leftarrow E^{(2)} \setminus E_i$ .
7:   else
8:     break;
9:   end if
10: end for
11: Return  $G^{(2)} = (V, E^{(2)})$ .
```

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MLSVBA: Heuristic Algorithm for MLSVB in CRN – cont'

- SIZE-MINIMIZER

- find a feasible solution of $kEckDS$ from the output of the second stage

more than one connected component including a feasible solution is possible

Algorithm 4 SIZE-MINIMIZER ($G^{(1)}, G^{(2)}$)

```
1:  $S \leftarrow V$ . Let  $G_i = (V_i^{(2)}, E_i^{(2)})$ ,  $1 \leq i \leq c$ , be  $c$  connected components in  $G^{(2)}$ .
2: for  $i = 1$  to  $c$  do
3:    $S_i^1 \leftarrow \text{CONSTRUCT}kEckDS(G_i)$ .
4:   if  $S_i^1$  can  $k$ -dominate  $V \setminus V_i^{(2)}$  in  $G^{(1)}$  then
5:      $S_i \leftarrow S_i^1$ .
6:   else
7:      $S_i^2 \leftarrow \text{FIND}kDSC(V_i^{(2)} \setminus S_i^1, U)$ , where  $U \leftarrow \{v | v \in V \setminus V_i^{(2)} \text{ and } v \text{ is not } k\text{-dominated by } S_i^1\}$ .
8:      $S_i \leftarrow S_i^1 \cup S_i^2$ .
9:   end if
10:  while  $S_i$  is not  $k$ -edge connected do
11:    Construct a minimum CDS (MCDS)  $S_i'$  of  $S_i$  from  $V_i^{(2)} \setminus S_i$  using Guha et al.'s approach [3] and set  $S_i \leftarrow S_i \cup S_i'$ .
12:  end while
13:  If  $|S_i| < |S|$ , then  $S \leftarrow S_i$ .
14: end for
15: Return  $S$ .
```

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MLSVBA: Heuristic Algorithm for MLSVB in CRN – cont'

- SIZE-MINIMIZER
 - find a feasible solution of $kECKDS$ from the output of the second stage

if S_i^1 cannot k -dominate the all other nodes, all more nodes by solving a minimum weight set-cover problem

Algorithm 4 SIZE-MINIMIZER ($G^{(1)}, G^{(2)}$)

```

1:  $S \leftarrow V$ . Let  $G_i = (V_i^{(2)}, E_i^{(2)})$ ,  $1 \leq i \leq c$ , be  $c$  connected
   components in  $G^{(2)}$ .
2: for  $i = 1$  to  $c$  do
3:    $S_i^1 \leftarrow \text{CONSTRUCT}kECKDS(G_i)$ .
4:   if  $S_i^1$  can  $k$ -dominate  $V \setminus V_i^{(2)}$  in  $G^{(1)}$  then
5:      $S_i \leftarrow S_i^1$ .
6:   else
7:      $S_i^2 \leftarrow \text{FIND}MkDSC(V_i^{(2)} \setminus S_i^1, U)$ , where  $U \leftarrow$ 
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       $S_i \cup S_i'$ .
12:  end while
13:  If  $|S_i| < |S|$ , then  $S \leftarrow S_i$ .
14: end for
15: Return  $S$ .
    
```

MLSVBA: Heuristic Algorithm for MLSVB in CRN – cont'

- SIZE-MINIMIZER
 - find a feasible solution of $kEckDS$ from the output of the second stage

if S_i^1 is not k -edge-connected, add more nodes to make it true

Algorithm 4 SIZE-MINIMIZER ($G^{(1)}, G^{(2)}$)

```
1:  $S \leftarrow V$ . Let  $G_i = (V_i^{(2)}, E_i^{(2)})$ ,  $1 \leq i \leq c$ , be  $c$  connected components in  $G^{(2)}$ .
2: for  $i = 1$  to  $c$  do
3:    $S_i^1 \leftarrow \text{CONSTRUCTMkECKDS}(G_i)$ .
4:   if  $S_i^1$  can  $k$ -dominate  $V \setminus V_i^{(2)}$  in  $G^{(1)}$  then
5:      $S_i \leftarrow S_i^1$ .
6:   else
7:      $S_i^2 \leftarrow \text{FINDMkDSC}(V_i^{(2)} \setminus S_i^1, U)$ , where  $U \leftarrow \{v | v \in V \setminus V_i^{(2)} \text{ and } v \text{ is not } k\text{-dominated by } S_i^1\}$ .
8:      $S_i \leftarrow S_i^1 \cup S_i^2$ .
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12:  end while
13:  If  $|S_i| < |S|$ , then  $S \leftarrow S_i$ .
14: end for
15: Return  $S$ .
```

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MLSVBA: Heuristic Algorithm for MLSVB in CRN – cont'

- SIZE-MINIMIZER
 - find a feasible solution of $kECKDS$ from the output of the second stage

try to find the minimum size one

Algorithm 4 SIZE-MINIMIZER $(G^{(1)}, G^{(2)})$

```
1:  $S \leftarrow V$ . Let  $G_i = (V_i^{(2)}, E_i^{(2)})$ ,  $1 \leq i \leq c$ , be  $c$  connected components in  $G^{(2)}$ .
2: for  $i = 1$  to  $c$  do
3:    $S_i^1 \leftarrow \text{CONSTRUCTMkECKDS}(G_i)$ .
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5:      $S_i \leftarrow S_i^1$ .
6:   else
7:      $S_i^2 \leftarrow \text{FINDMkDSC}(V_i^{(2)} \setminus S_i^1, U)$ , where  $U \leftarrow \{v | v \in V \setminus V_i^{(2)} \text{ and } v \text{ is not } k\text{-dominated by } S_i^1\}$ .
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12:  end while
13:  if  $|S_i| < |S|$ , then  $S \leftarrow S_i$ .
14: end for
15: Return  $S$ .
```

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Conclusion

- the first paper studies fault-tolerance issue of virtual backbone construction in CRN
- a 3-staged polynomial time heuristic algorithm is proposed
- plan to
 - analysis the complexity of the problem
 - analysis the performance of the proposed algorithm
 - run the simulation to evaluate the average performance
 - distributed algorithm



Thank you
Question?

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