

Scheduling Wireless Virtual Networks Functions

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Abstract—Network function virtualization (NFV) sits firmly on the networking evolutionary path. By migrating network functions from dedicated devices to general purpose computing platforms, NFV can help reduce the cost to deploy and operate large IT infrastructures. In particular, NFV is expected to play a pivotal role in mobile networks where significant cost reductions can be obtained by dynamically deploying and scaling virtual network functions (VNFs) in the core network. However, in order to achieve its full potential, NFV needs to extend its reach also to the radio access segment. Here, mobile virtual network operators shall be allowed to request radio access VNFs with custom resource allocation solutions. Such a requirement raises several challenges in terms of performance isolation and resource provisioning. In this work, we formalize the wireless VNF placement problem in the radio access network as an integer linear programming problem and we propose a VNF placement heuristic, named wireless network embedding (WiNE), to solve the problem. Moreover, we present a proof-of-concept implementation of an NFV management and orchestration framework for enterprise WLANs. The proposed architecture builds on a programmable network fabric where pure forwarding nodes are mixed with radio and packet processing capable nodes.

Index Terms—Network Management, Resource allocation, Virtual Network Embedding, Virtual Network Functions Placement, Network Function Virtualization, Wireless Networks.

I. INTRODUCTION

NETWORK Function Virtualization (NFV) promises to reduce the cost to deploy and operate large networks by migrating network functions from dedicated hardware appliances to software instances running on general purpose virtualized networking and computing infrastructures. This, in time, shall improve the flexibility and the scalability of mobile networks in that the deployment of new applications and services will be quicker (software Vs. hardware development life-cycles) and different network functions can share the same resources paving the way to further economies of scale. This progressive process of network softwarization is set to play a pivotal role in fifth generation mobile networks. In this context, the Network-as-a-Service business model shall allow operators to tap into new revenue streams by further abstracting the

physical network into service specific slices possibly operated by different mobile virtual network operators (MVNOs). The envisioned vertical applications range from high-definition video delivery to machine-to-machine applications.

In order to cope with the diverse range of requirements that sprout for such use cases, future wireless and mobile networks will further rely on virtualized resources and on dynamic service orchestration. Although a rich body of literature exists on VNF placement [1], virtual network embedding [2], and component placement [3], most of these works focus on the problem of mapping an input virtual network request (often in the form of a VNF Forwarding Graph) onto a physical virtualized network substrate (often offering computational as well as networking resources). However, these works implicitly assume that once a VNF is mapped on a node, the virtualization layer (i.e. the hypervisor) will take care of scheduling the various VNFs ensuring both logical isolation and an efficient use of the substrate resources [4]. Such an assumption does not hold anymore if radio nodes are added to the set of virtualized resources available in the substrate network (alongside computational and networking resources). In this case, in fact, the amount of resources available at each substrate radio node is a stochastic quantity depending on both channel fluctuations *and* end-users distribution.

In this work, we investigate the VNF placement *and* scheduling problems in the Radio Access Network (RAN) domain. In this scenario we expect MVNOs to specify their requests in terms of a VNF Forwarding Graph. Such VNFs can include functions such as load-balancing and firewall, as well as virtual radio nodes. Moreover, in order to satisfy the diverse requirements imposed by future applications and services, MVNOs shall be allowed to deploy custom resource allocation schemes *within* their network slice. At the same time, the underlying system shall both enforce strict performance isolation between MVNOs and ensure efficient resource utilization across the network in spite of the non-deterministic nature of the wireless medium.

The contribution of this paper is twofold: (i) we formalize the VNF placement problem for radio access networks, and (ii) we propose a slice scheduling mechanism that ensures resource and performance isolation between different slices. The proposed solutions work jointly, i.e. performance isolation is ensured if slices are accepted under the constraints imposed by our VNF placement problem formulation. This paper builds upon our previous work [5] by refining the VNF placement heuristic *WiNE* (Wireless Network Embedding), extending the simulation study to additional types of VNF requests, and analyzing in deeper detail how the type of VNFs impacts on the substrate network utilization. Numerical simulations show that the proposed heuristic can approximate the performance

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of the optimal ILP-based placement algorithm. Moreover, the efficiency of the heuristic increases with the size of the substrate network hinting at the fact that *WiNE* may be capable of closing the gap with the ILP-based placement algorithm for realistic substrate networks. Finally, we also report on a updated proof-of-concept implementation of the proposed solution and on its field evaluation. The programmable data-path, the controller and the SDK have been released under a permissive license for academic use¹.

The rest of this paper is structured as follows. In Sec. II we discuss the related work. The physical network model, the VNF request model, and ILP problem formulation are presented in Sec. III. The VNF placement heuristics and its evaluation are presented in Sec IV and in Sec. V. The proof-of-concept is presented in Sec VI while some illustrative VNFs and their evaluation are presented in Sec. VII. Finally, Sec. VIII draws the conclusions pointing out the future work.

II. RELATED WORK

The recent advances in general purpose computing platforms paved the way to a new generation of software routers. However, many of these solutions focus on improving the pure raw packet processing speed [6]–[8] but do not tackle the problem of deploying and orchestrating VNFs. In parallel, there are significant efforts toward VNF management and orchestration. In particular the European Telecommunications Standards Institute (ETSI) has recently tackled the NFV concept [9] while OPNFV [10], OpenMANO [11], and OpenBATON [12] are working toward an open-source carrier grade platform for NFV.

A. Virtual Network Embedding

The amount of literature on virtual network embedding (VNE) topic is considerable. Seminal works in this domain include VINEYard [13] for single domain VNE and PolyVINE [14] for multi-domain VNE. For a comprehensive survey on VNE algorithms we point the reader to [2]. In [15] the authors put forward a novel model that reflects the time-varying resource requirements of a virtual network request. The authors also consider VNE in the context of opportunistic resource sharing at the level of the entire substrate network. In [16], the authors present the *SiMPLE* VNE algorithm. *SiMPLE* exploits path diversity in order to protect virtual networks from single link failures. However, to the best of the authors' knowledge, none of these works formulate the VNE problem for hybrid wired/wireless networks with the goal of ensuring performance isolation between tenants.

B. VNF Placement

The VNF placement problem is conceptually similar to the component placement problem in data-centers and cloud computing environments. The amount of literature in this domain is thus humbling [4], [17]–[19]. A survey on resource management in cloud computing environments can be found in [3]. In [17], the authors study the problem of placing virtual machine

instances on physical containers in such a way to reduce communication overhead and latency. In [18], the authors propose a novel design for a scalable hierarchical application components placement in cloud computing environments. The proposed solution operates in a distributed fashion ensuring scalability while at the same time providing performances very close to that of a centralized algorithm. This work is extended in [19] where several algorithms for efficient management of component-based applications in cloud environments are proposed. In [4] the elasticity overhead and the trade-off between bandwidth and host resource consumption are jointly considered by the authors when formulating the VNF placement problem. In [20], a joint node and link mapping algorithm is proposed. Finally, the authors of [1], [21], [22] tackle the problem of dynamic VNF placement. Targeting resource allocation in data-centers, these works do not tackle the problem of virtualized radio function placement.

C. Wireless & Mobile Networks

The topic of radio resources virtualization has received significant attention in the literature. In [23], a WLAN virtualization approach named *Virtual WiFi* is proposed extending the VNE problem from the wired to the wireless domain. Kernel-based virtual machines are used as a virtual wireless LAN devices while time domain multiplexing is used in order to provide isolation between the virtual wireless devices. In [24], [25], wireless network virtualization is applied to wireless mesh networks. A virtual network traffic shaper is introduced in [26], [27] for air time fairness in 802.16e networks. In [28], [29] the problem of virtualizing OFDMA-based wireless networks (i.e. WiMAX and LTE) is studied. The authors tackle the problem both at the radio and the core network level opening the way to interesting infrastructure sharing scenarios. Similar consideration can be also made for [30] where a framework for sharing a single WiMAX base station is proposed. Wireless Virtualization of 802.11 devices is the focus of [31]. In all the cases above, however, the channel-aware placement of VNFs over *radio* and *wired* resources is not formulated nor is the performance isolation challenge between multiple MVNOs tackled.

D. Middlebox Management

Systems like OpenNF [32] and its derivatives [33], [34] focus on providing a platform for consistent VNF management. However their focus is on maintaining backward compatibility with currently available VNFs such as Bro [35] for IDS and Squid [36] for caching web proxies. Conversely, in this work we set to explore the possibilities opened by a fully programmable networking substrate where also radio access is treated as a standard VNF. Similar considerations can be made also for Split/Merge [37], CoMB [38], and XoMB [39].

III. NETWORK MODEL

In the VNF placement problem, the input consists of Service Function Chains (SFC) composed by a variable number of

¹On-line resources available at: <http://empower.create-net.org/>

TABLE I
SUBSTRATE NETWORK PARAMETERS

Variable	Description
G_{nfvi}	Substrate network graph.
N_{nfvi}	Substrate nodes in G_{nfvi} .
E_{nfvi}	Substrate links in G_{nfvi} .
$\omega_c^s(n)$	Available CPU resources at node $n \in N_{nfvi}$.
$\omega_m^s(n)$	Available memory resources at node $n \in N_{nfvi}$.
$\omega_s^s(n)$	Available storage resources at node $n \in N_{nfvi}$.
$\omega_r^s(n)$	Available radio resources at node $n \in N_{nfvi}$.
$\omega_e^s(e^{nm})$	Available resources of link $e^{nm} \in E_{nfvi}$.
$\Lambda_{c,m,s,r}(n)$	Cost for each unit of node resources, $n \in N_{nfvi}$.
$\Lambda_e(e^{nm})$	Cost for each unit of link resources, $e^{nm} \in E_{nfvi}$.

VNFs, whereas the substrate network, called Network Function Virtualization Infrastructure (NFVI), provides the physical constraints in terms of bandwidth and capacity [9]. In this context, the term capacity is not related only to pure computational resources, such as number of CPU cores, memory, and/or storage. Instead it refers also to packet forwarding and radio processing capabilities. Before introducing the proposed, solution we need to detail specific notations for the NFVI and the SFC requests.

A. Network Function Virtualization Infrastructure Model

Let $G_{nfvi} = (N_{nfvi}, E_{nfvi})$ be an undirected graph modeling the physical network, where N_{nfvi} is the set of $n = |N_{nfvi}|$ physical nodes that compose the substrate network and E_{nfvi} is the set of edges or links. An edge $e^{nm} \in E_{nfvi}$ if and only if a point-to-point connection exists between $n \in N_{nfvi}$ and $m \in N_{nfvi}$. With respect to the physical network, links are actual wiring media, e.g., an Ethernet cable interconnecting the two nodes. Four weights, $\omega_c^s(n)$, $\omega_m^s(n)$, $\omega_s^s(n)$, $\omega_r^s(n)$, are assigned to each node $n \in N_{nfvi}$: $\omega_{c,m,s}^s(n) \in \mathbb{N}^+$ and $\omega_r^s(n) \in \mathbb{R}^+$, $0 \leq \omega_r^s(n) \leq 1$ representing the packet and radio processing resources *available* on that node. Nodes with all weights equal to 0 (zero) are assumed to be pure packet forwarding nodes. Nodes with $\omega_c^s > 0$, $\omega_m^s > 0$, $\omega_s^s > 0$, and $\omega_r^s = 0$ are assumed to be pure packet processing nodes. Finally, nodes with $\omega_c^s = \omega_m^s = \omega_s^s = 0$ and $\omega_r^s > 0$ are assumed to be pure radio access nodes.

Another weight $\omega_e^s(e^{nm})$ is assigned to each link $e^{nm} \in E_{nfvi}$: $\omega_e^s(e^{nm}) \in \mathbb{N}^+$ representing the capacity of the link connecting two nodes. In order to avoid exceeding the nominal capacity of the substrate links, traffic shaping is implemented at the nodes with packet and/or radio processing capabilities. Finally, let P_{nfvi} be the set of all substrate paths and $P_{nfvi}(s, t)$ the shortest path between nodes $s, t \in N_{nfvi}$. Table I summarizes the NFVI parameters.

The weights $\omega_{c,m,s}^s$ associated with the packet processing nodes represent, respectively, the amount of CPU, memory, and storage resources available on that node, while the weights $\omega_r^s(n)$ are specific to the radio access nodes and represent the normalized amount of wireless resources available at that node. Notice how with the term radio access nodes we refer to the generic nodes providing end-users terminals with wireless connectivity and how this model makes no assumptions on the type of resources that can be available at radio nodes. For example,

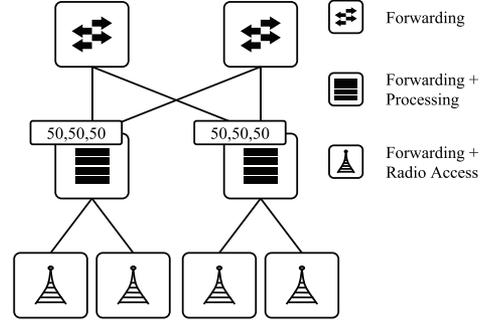


Fig. 1. NFVI network model. The figure shows the three basic virtual resources: forwarding, packet processing, and radio access.

in a 802.11-based network $\omega_r^s(n)$ could model the amount of airtime available at a certain Access Point (AP). Similarly, in an OFDMA-based network (e.g., LTE), $\omega_r^s(n)$ could be used to model the available radio resources in time *and* frequency at a certain eNodeB (eNB). For the sake of simplicity and without any loss of generality in this work we assume that all radio-enabled nodes initially have the same amount of resources $\omega_r^s(n) = 1, \forall n \in N_{nfvi}$.

A sample substrate network is sketched in Fig. 1. The network is composed by 8 nodes interconnected together. In order to improve readability link weights have been omitted. The substrate network in this example consists of 4 radio access nodes (at the bottom of the picture), and 4 switches, 2 of which supporting just basic forwarding capabilities.

B. Service Function Chain Requests

Users are allowed to request SFCs as a *directed* graphs $G_{sfc} = (N_{sfc}, E_{sfc})$. Where N_{sfc} denotes the set of nodes (i.e. VNFs) and $E_{sfc} \subseteq N_{sfc} \times N_{sfc}$ denotes the set of virtual links. An edge $e^{nm} \in E_{sfc}$ if and only if the packets from VNF $n \in N_{sfc}$ must be forwarded to the VNF $m \in N_{sfc}$. Notice that as opposed to the previous NFVI model, nodes in SFC requests represent virtual network functions through which packets must undergo before leaving the network. Packet processing nodes and links in the SFC request shares the same weights as for the NFVI substrate network ($\omega_c^v, \omega_m^v, \omega_s^v, \omega_e^v$). On the other hand, provisioning of radio resources can be made either in terms of fraction of available radio resources (ω_r^v) or in terms of bandwidth (ω_b^v). In the former case, the users will specify the percentage of radio resources they want to be assigned to a certain node, while in the latter case the users will specify the amount of bandwidth assigned to the node. A single SFC request can mix bandwidth-based and resource-based provisioning models.

Due to their stochastic nature, available bandwidth is a time-varying quantity in wireless networks. Channel fading, but also to the distribution of end-users, can greatly influence the network performance. For example, users at the center of the cell can, in general, use more efficient modulations and coding schemes thus achieving higher throughput for a fixed amount of radio resources than users at the edges of the cell. As a result, when the bandwidth-based provisioning model is employed,

TABLE II
SERVICE FUNCTION CHAIN REQUEST PARAMETERS

Variable	Description
G_{sfc}	Service function chain graph.
N_{sfc}	Virtual nodes in G_{sfc} .
E_{sfc}	Virtual links in G_{sfc} .
$\omega_c^v(n)$	Requested CPU resources at node $n \in N_{sfc}$.
$\omega_m^v(n)$	Requested Memory resources at node $n \in N_{sfc}$.
$\omega_s^v(n)$	Requested Storage resources at node $n \in N_{sfc}$.
$\omega_r^v(n)$	Requested Radio resources at node $n \in N_{sfc}$.
$\omega_b^v(n)$	Requested Bandwidth at node $n \in N_{sfc}$.
$\Omega_b^v(n)$	Reference bandwidth at node $n \in N_{sfc}$.
$\omega_e^v(e^{nm})$	Requested resources (e.g. bandwidth) of link $e^{nm} \in E_{sfc}$.

also the actual channel conditions experienced by the end-users must be taken into account.

Let us call $b(n)$ the actual aggregated throughput of the virtual radio node $n \in N_{sfc}$ in the fraction of resources currently assigned the node. We can then introduce an additional parameter named reference throughput $\Omega_b^v(n) \geq \omega_b^v(n)$ upon which the bandwidth reservation $\omega_b^v(n)$ is enforced. We can then define the effective target bandwidth $\tilde{\omega}_b^v(n)$ for the virtual radio node n as follows:

$$\tilde{\omega}_b^v(n) = \begin{cases} \omega_b^v(n) & \text{if } b(n) \geq \Omega_b^v(n) \\ \omega_b^v(n) \frac{b(n)}{\Omega_b^v(n)} & \text{if } b(n) < \Omega_b^v(n) \end{cases} \quad (1)$$

The parameter $\Omega_b^v(n)$ represents a threshold. When the actual throughput $b(n)$ of the virtual radio node n is above the threshold, then the bandwidth reservation is respected. Conversely, when $b(n) < \Omega_b^v(n)$ the requested bandwidth $\omega_b^v(n)$ is linearly scaled down. Choosing a small value for $\Omega_b^v(n)$ means that the network can utilize more resources in order to satisfy the bandwidth requirements, which in time could result in a higher pricing. Conversely, a high value for $\Omega_b^v(n)$ means that the network will try to satisfy the bandwidth requirements only for the tenants that are making a better use of the wireless spectrum. Notice how, as it will be more clear in Sec. VI, tenants can make a poor use of the wireless spectrum also due to custom scheduling disciplines that favor fairness at the expense of the aggregated throughput. This could be a reasonable trade-off in network slices aimed at emergency response applications where it is critical that all mobile clients get the same share of resources even if this could lead to a sub-optimal spectrum utilization.

If we define $\omega_r^v(n) = \frac{\tilde{\omega}_b^v(n)}{b(n)}$, then, in order for the SFC request to be feasible, it must hold:

$$\sum_{n \in N_{sfc}^b} \frac{\tilde{\omega}_b^v(n)}{b(n)} + \sum_{n \in N_{sfc}^r} \omega_r^v(n) \leq \omega_r^v(m) = 1 \quad (2)$$

Which means that the sum of the fractions of radio resources allocated to virtual nodes must be less than or equal to the resources available at the substrate node m . Table II summarizes the SFC request parameters.

For example, consider the case depicted in Fig. 2a. Here two tenants (A and B) requested two slices with aggregated capacity of, respectively, 6 Mb/s and 4 Mb/s, while the reference bandwidth (Ω_b^v) for both tenants has been set to 10 Mb/s. Moreover,

for simplicity and without losing generality, let us assume that only one client is active in either slice. If the cell capacity $b(n)$ experienced by both clients is equal to, or higher than, 10 Mb/s it is easy to see how both slices can be accommodated by the system, thus in this case $b(n) \geq \Omega_b^v(n)$ and $\tilde{\omega}_b^v(n) = \omega_b^v(n)$ for both slices.

However, if the cell capacity experienced by the wireless client in the tenant B 's slice is reduced to 5 Mb/s, then the same request can not be accommodated anymore. This is due to the fact that serving the same amount of data to the wireless client in the tenant B 's slice now requires twice the amount of radio resources it did before (see Fig 2b). In this case since $b(B) < \Omega_b^v(B)$, thus:

$$\tilde{\omega}_b^v(B) = \omega_b^v(B) \frac{b(B)}{\Omega_b^v(B)} = 4 \frac{5}{10} = 2$$

This results in the resource allocation sketched in Fig 2c which penalizes only the performance of the tenant B without affecting tenant A . It is worth noticing that this example can be easily generalized to an OFDMA system were resources are assigned across a time/frequency matrix.

A few sample SFC requests are sketched in Fig. 3. Notice that wireless terminals are not represented since they are outside the control of the orchestration framework. The linear SFC request in Fig. 3a consists of three VNFs including a WiFi hotspot, a firewall, and a load balancer. The WiFi hotspot request will also include parameters such as the name of the network and the authentication parameters (e.g. type of encryption, RADIUS server to be used, etc.) however these kind of information are purely functional and are thus omitted in this section. The SFC request in Fig. 3b implements a performance enhancing network service, namely duplicates filtering in dense urban scenarios. Finally, the SFC request in Fig. 3c accounts for an access enforcement scenario whereby multiple security related VNFs are deployed in parallel. Notice how all radio access VNF use the bandwidth-based resource provisioning model.

C. Virtual Network Function Placement

In this section we shall provide the optimal ILP formulation for the SFC embedding problem, while in the next section we will present a scalable heuristic. The overall objective is to compute the optimal VNF placement based on the available radio resources. The chosen objective function is:

$$\min \left(\sum_{n \in N_{nfv}} \sum_{n' \in N_{sfc}} (w_c^v(n') \Lambda_c(n) + w_m^v(n') \Lambda_m(n) + w_s^v(n') \Lambda_s(n) + w_r^v(n') \Lambda_r(n)) \Phi_n^{n'} + \sum_{e \in E_{nfv}} \sum_{e' \in E_{sfc}} \omega_e^v(e') \Lambda_e(e) \Phi_e^{e'} \right)$$

where, $\Phi_n^{n'}$, $\Phi_e^{e'} \in \{0, 1\}$ are two binary variables indicating respectively if the VNF $n' \in N_{sfc}$ has been mapped to node $n \in N_{nfv}$ and if the virtual link $e' \in E_{sfc}$ has been mapped to the substrate link $e \in E_{nfv}$.

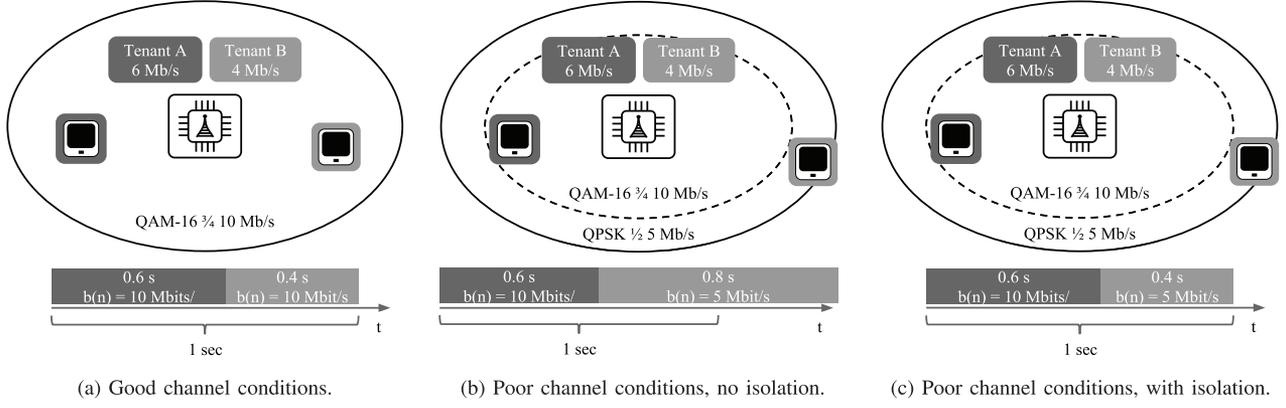


Fig. 2. Impact of channel conditions on slice isolation. Bandwidth demands can be met when channel conditions are good for both slices (a). Conversely, bandwidth targets can not be achieved when one of the tenants is experiencing poor channel conditions (b). Isolation can be preserved by linearly scaling down the bandwidth target for the tenant with adverse channel conditions (c).

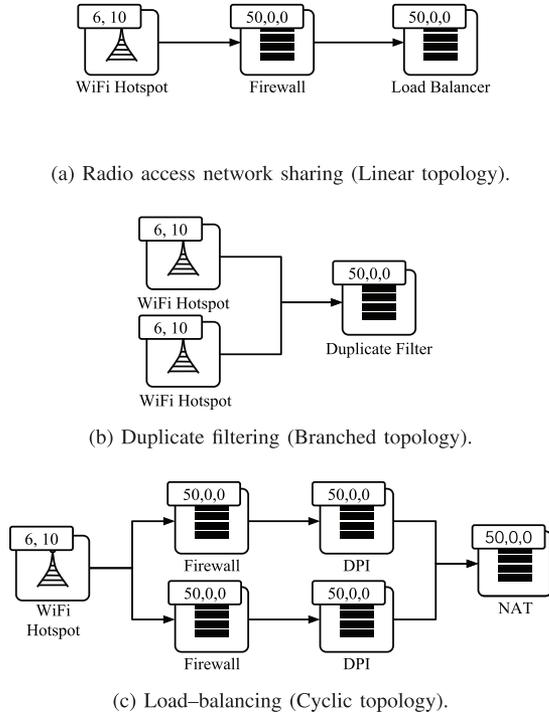


Fig. 3. Sample SFC Requests. Notice how resource requests for all radio VNFs are bandwidth-based.

A valid solution is the one where the resources utilized by the SFC request are at most equal to the available resources on the substrate network nodes:

$$\sum_{n' \in N_{sfc}} \omega_c^v(n') \Phi_n^{n'} \leq \omega_c^s(n) \quad \forall n \in N_{nfvi} \quad (3)$$

$$\sum_{n' \in N_{sfc}} \omega_m^v(n') \Phi_n^{n'} \leq \omega_m^s(n) \quad \forall n \in N_{nfvi} \quad (4)$$

$$\sum_{n' \in N_{sfc}} \omega_s^v(n') \Phi_n^{n'} \leq \omega_s^s(n) \quad \forall n \in N_{nfvi} \quad (5)$$

$$\sum_{n' \in N_{sfc}} \omega_r^v(n') \Phi_n^{n'} \leq \omega_r^s(n) \quad \forall n \in N_{nfvi} \quad (6)$$

and links:

$$\sum_{e' \in E_{sfc}} \omega_e^v(e') \Phi_e^{e'} \leq \omega_e^s(e) \quad \forall e \in E_{nfvi} \quad (7)$$

In this work we also assume that every VNF in the SFC request shall be mapped to a different substrate node:

$$\sum_{n' \in N_{sfc}} \Phi_n^{n'} \leq 1 \quad \forall n \in N_{nfvi} \quad (8)$$

Every VNF in the SFC request shall be mapped only once:

$$\sum_{n \in N_{nfvi}} \Phi_n^{n'} = 1 \quad \forall n' \in N_{sfc} \quad (9)$$

In terms of radio resources requirements, the following constraint, deriving from (1) and (2), enforces that for every radio processing node $n \in N_{nfvi}$ a feasible request has been made:

$$\sum_{n' \in N_{sfc}^b} \frac{\omega_b^v(n')}{\Omega_b^v(n')} \Phi_n^{n'} + \sum_{n' \in N_{sfc}^r} \omega_r^v(n') \Phi_n^{n'} \leq 1 \quad \forall n \in N_{nfvi} \quad (10)$$

Finally, the following constraint enforces that for each link $e^{nm} \in E_{sfc}$ there must be a continuous path allocated between the pair of physical nodes on top of which the VNFs $n, m \in N_{sfc}$ have been mapped.

$$\sum_{j \in N_{nfvi}}^{j>i} \Phi_{e^{ij}}^{e^{nm}} - \sum_{j \in N_{nfvi}}^{j<i} \Phi_{e^{ji}}^{e^{nm}} = \Phi_i^n - \Phi_i^m \quad \forall i \in N_{nfvi} \quad \forall e^{nm} \in E_{sfc} \quad (11)$$

IV. HEURISTIC

The ILP formulation described in the previous sections can not be applied to realistic scenarios due to its limited scalability. For example, embedding a 6-nodes linear SFC request over a $k = 8$ fat-tree substrate topology can take several hours on Intel Core i7 laptop (3.0 GHz CPU, 16 Gb RAM) using the Matlab[®] ILP solver (intlinprog). Notice also that even a $k = 8$ fat-tree substrate topology is rather small if compared with realistic

Algorithm 1. Compute list of candidate substrate nodes

```

1: procedure FindCandidates( $N_{nfvi}, N_{sfc}$ )
2:   for  $n \in N_{sfc}$  do
3:     for  $p \in N_{nfvi}$  do
4:       if  $\omega_{c,m,s,r}^s(p) \geq \omega_{c,m,s,r}^v(n)$  then
5:          $n.candidates.add(p)$ 
6:       end if
7:     end for
8:   end for
9: end procedure

```

Algorithm 2. Sort list of candidate substrate nodes

```

1: procedure SortCandidates ( $N_{sfc}$ )
2:    $sort(N_{sfc})$ 
3: end procedure

```

deployments where it is common to find $k = 24$ fat-tree networks, making the ILP problem formulation intractable. In this section we present a heuristic, named *WiNE*, that can handle similar (and more complex) requests in tens of minutes.

The proposed heuristic is composed of three steps. In the first step, for each virtual node $n \in N_{sfc}$, the heuristic computes the list of candidate substrate nodes (see Alg. 1). These are the substrate nodes that can support the virtual nodes in the SFC request given the input capacity constraints. In the second step, the virtual nodes $n \in N_{sfc}$ are sorted in decreasing order according to the number of candidate substrate nodes (see Alg. 2). In the third step, the sorted list of virtual nodes is traversed starting with the virtual node with more embedding opportunities. For each candidate substrate node $p \in N_{nfvi}$ the heuristic considers all the neighboring nodes $m \in N_{sfc}$ of the virtual node n . The heuristic, then, assigns the node n to the substrate node $m \in N_{nfvi}$ with the lowest virtual edge mapping cost (see Alg. 3).

We define the virtual edge mapping cost $W : E_{sfc} \times N_{nfvi} \times N_{nfvi} \rightarrow \mathbb{R}$ between a virtual edge $e^{nm} \in E_{sfc}$ and a pair of substrate nodes $p, q \in N_{nfvi}$ as follows:

$$\begin{aligned}
W(e^{nm}, p, q) &= \Lambda_{c,m,s,r}(p)\omega_{c,m,s,r}^v(n) \\
&+ \Lambda_{c,m,s,r}(q)\omega_{c,m,s,r}^v(m) \\
&+ \sum_{e \in P_{nfvi}(p,q)} \Lambda_e(e)\omega_e^v(e^{nm})
\end{aligned}$$

This represents the cost of embedding the virtual edge $e^{nm} \in E_{sfc}$ over the path $P_{nfvi}(p, q)$ between the substrate nodes $p, q \in N_{nfvi}$ given that virtual nodes n, m are mapped on, respectively, the substrate nodes p , and q . Minimizing the virtual edge mapping cost for node m essentially means that substrate nodes that are far away from node's m embedding opportunities are penalized. This results in virtual nodes in an SFC request to be placed close to each other over the substrate network, which in time means that less substrate resources are needed to support a given number of requests.

Algorithm 3. Nodes and links assignment

```

1: procedure NodeAndLinkAssignment ( $G_{nfvi}, G_{sfc}$ )
2:   for  $n \in N_{sfc}$  do
3:     for  $p \in n.candidates$  do
4:       if  $p.used$  then
5:         continue
6:       end if
7:       for  $m \in n.neighbors$  do
8:         if  $m.mapped$  then
9:            $cost = W(e^{nm}, p, m.mapped)$ 
10:        else
11:           $cost = +\infty$ 
12:          for  $q \in m.candidates$  do
13:             $cost = \min(cost, W(e^{nm}, p, q))$ 
14:          end for
15:          end if
16:           $mapping\_cost(p) += cost$ 
17:        end for
18:      end for
19:       $p \leftarrow \operatorname{argmin}(mapping\_cost(p))$ 
20:       $n.mapped \leftarrow p$ 
21:       $p.used \leftarrow True$ 
22:      for  $m \in n.neighbors$  do
23:        if  $m.mapped$  then
24:           $Allocate \quad path \quad P_{nfvi}(n.mapped,$ 
25:             $m.mapped)$ 
26:        end if
27:      end for
28: end procedure

```

V. EVALUATION

The goal of this section is to compare the *relative* performance of the ILP-based placement algorithm with the performance of our placement heuristic using different synthetic substrate networks and different SFC requests. In this section, we shall first describe the simulation environment and then the performance metrics. Simulations are carried out in a discrete event simulator implemented in Matlab[®].

A. Simulation Environment

The ILP-based placement algorithm and the proposed placement heuristic are evaluated in three different scenarios. In the first scenario, linear VNF requests, similar to the one depicted in Fig. 3a, are considered. In the second scenario, branched VNF requests, similar to the one depicted in Fig. 3b, are considered. Finally, in the third scenario, VNF requests with loops, similar to the one depicted in Fig. 3c, are used. The number of VNFs in each SFC request as well as the actual amount of radio, computational, memory, storage, and link resources are randomly generated for each request.

The reference substrate network is a k -ary fat-tree with $k = 4, 6, 8$, where leaf nodes are WiFi APs rather than servers. This results in a total of, respectively, 16, 54, and 128 WiFi APs. The computational, memory, storage, radio, and link resources

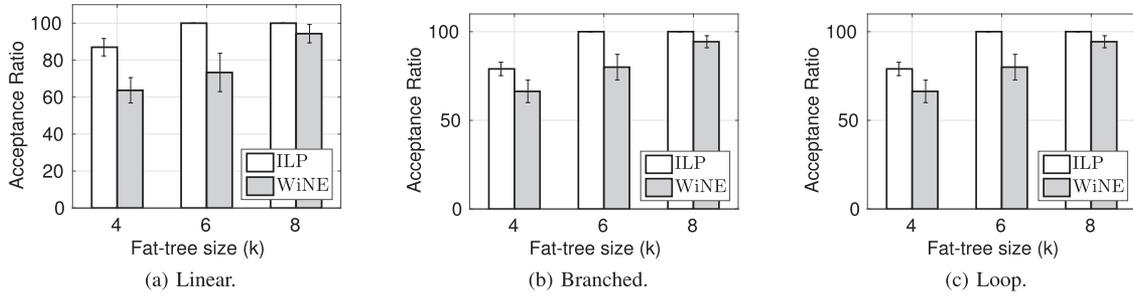


Fig. 4. Acceptance ratio using the ILP-based algorithm and the heuristics with different virtual and substrate topologies.

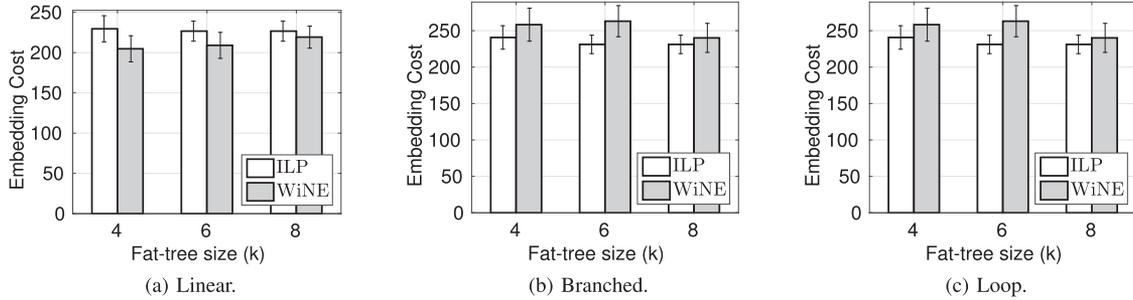


Fig. 5. Average embedding cost using the ILP-based algorithm and the heuristics with different virtual and substrate topologies.

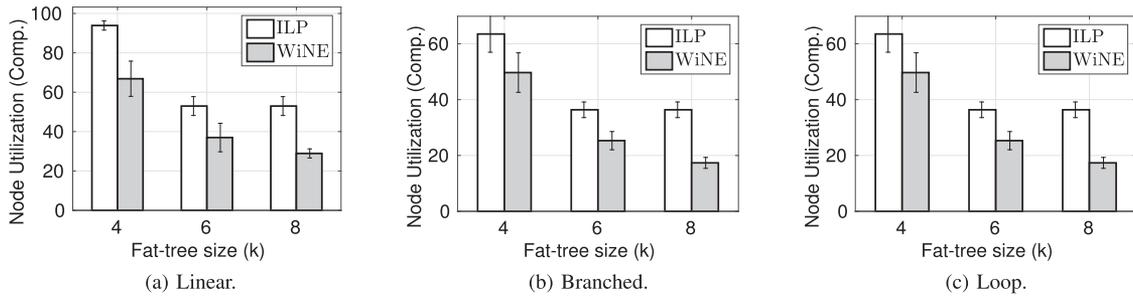


Fig. 6. Average computational nodes utilization using the ILP-based algorithm and the heuristics with different virtual and substrate topologies.

for the substrate network are initially all set to 100. The cost of using each unit of node $\Lambda_{c,m,s,r}(n)$ and link $\Lambda_e(e)$ resources is set to 1. The number of VNFs in each SFC request depends on the SFC type. In the case of linear and branched SFC requests the number is randomly picked in the set $\{3, 6\}$, while in the case of cyclic SFC requests the number is randomly picked in the set $\{4, 6\}$. The computational, memory, and storage requirements for each SFC requests are uniformly distributed between $[5, 30]$, while the radio and link requirements are uniformly distributed between $[5, 60]$.

The metrics used in this study are the standard ones adopted in several other related works [13], [40], [41]. For each scenario the number of accepted requests, the average embedding cost, the average node and link utilization, and the execution time using either the ILP-based placement or the proposed heuristic are considered. In this study we assume that a fixed number of SFC requests are embedded sequentially onto the substrate network. In particular in each run, the simulator tries to embed 30 randomly generated SFC requests. Reported results are the average of 10 simulations.

B. Simulation Results

Figures 4 and 5 shows the percentage of accepted SFC requests for different substrate networks and the average embedding cost. As expected the ILP-based placement algorithm is more efficient than *WiNE* in mapping the incoming requests. This can be seen in terms of both a higher number of accepted requests as well as a lower average embedding cost. Notice however that, at least for linear SFCs, *WiNE* actually has a lower embedding cost. This does not mean that *WiNE* is more efficient than the ILP-based algorithm but rather that, by accepting a lower number of SFC requests, *WiNE* also utilizes, on average, less substrate resources. It is also worth noticing that the efficiency of the proposed heuristic increases with the size of the substrate network. This hints toward the fact that *WiNE* may be capable of closing the gap with the ILP-based placement algorithm for realistic substrate networks.

Figure 6, 7 and 8 summarize the substrate resource utilization. As it can be noticed the ILP-based placement algorithm is characterized by a higher utilization ratio for both radio and computational nodes. This results in fewer substrate nodes

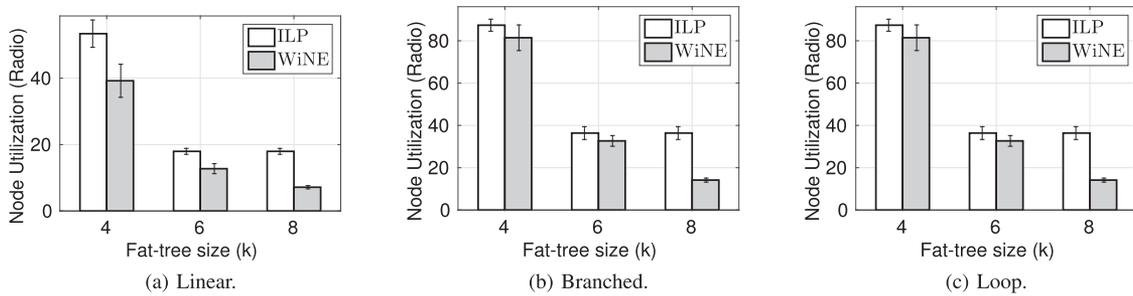


Fig. 7. Average radio nodes utilization using the ILP-based algorithm and the heuristics with different virtual and substrate topologies.

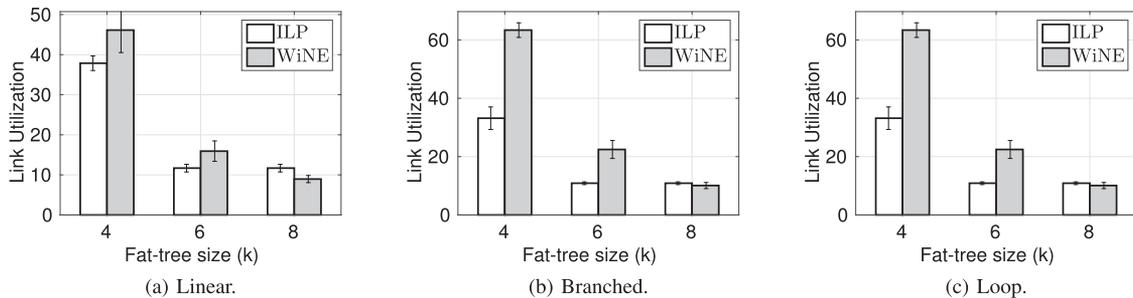


Fig. 8. Average link utilization using the ILP-based algorithm and the heuristics with different virtual and substrate topologies.

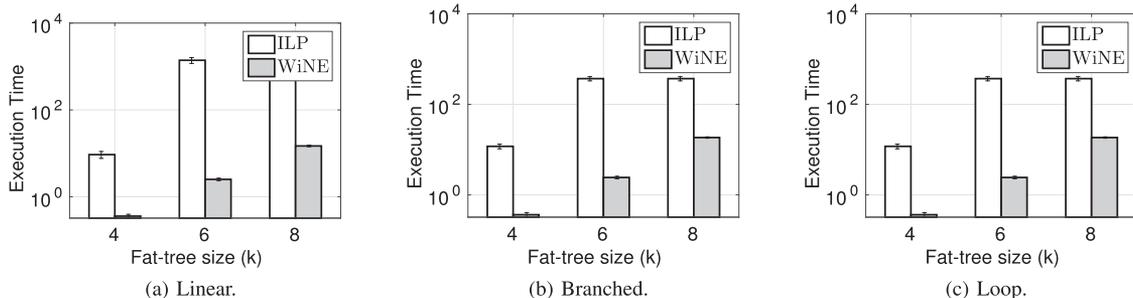


Fig. 9. Average execution time using the ILP-based algorithm and the heuristic with different virtual and substrate topologies.

being used to support the same number of SFC requests which in time could result in a more energy efficient operation if unused nodes can be turned-off. Notice that this is further supported by Fig. 8 where the substrate links utilization is reported. As it can be seen, *WiNE* is characterized by a higher link utilization, which means that the proposed heuristic is less efficient in finding shorter paths between VNFs. However, it is also worth noticing that the gap between the ILP-based placement algorithm and *WiNE* gets smaller as the size of the substrate network increase.

Figure 9 shows that the average amount of time required to embed a *single* SFC request using the ILP-based placement algorithm is significantly higher than the time required to embed the same request using *WiNE*. The ILP problem becomes essentially intractable for substrate networks with more than a few tens of nodes (irrespective of the number of VNFs in the request), while *WiNE* can effectively embed complex SFC requests on substrate networks with hundreds of nodes in a limited amount of time.

VI. IMPLEMENTATION

A. Overview

We implemented the VNF placement and scheduling solution presented in this work in a proof-of-concept NFV management and orchestration framework, named *EmPOWER*. Notice that, the prototype currently supports only wireless access networks based on the 802.11 family of standards and, as a consequence, the applications described in the next section target Enterprise WLANs and Campus networks scenarios. Nevertheless, as seen in the previous sections, the provisioning model does not make any assumption about the particular link-layer technology and can be as well applied to any kind of radio access network including OFDMA networks such as LTE and LTE-Advanced.

Our proof-of-concept is loosely modeled after the ETSI reference NFV Architecture [9]. As it can be seen in Fig. 10, the architecture is conceptually divided into three layers. The bottom layer consists of the physical as well as the virtualized resources composing the NFVI. In the second layer we have

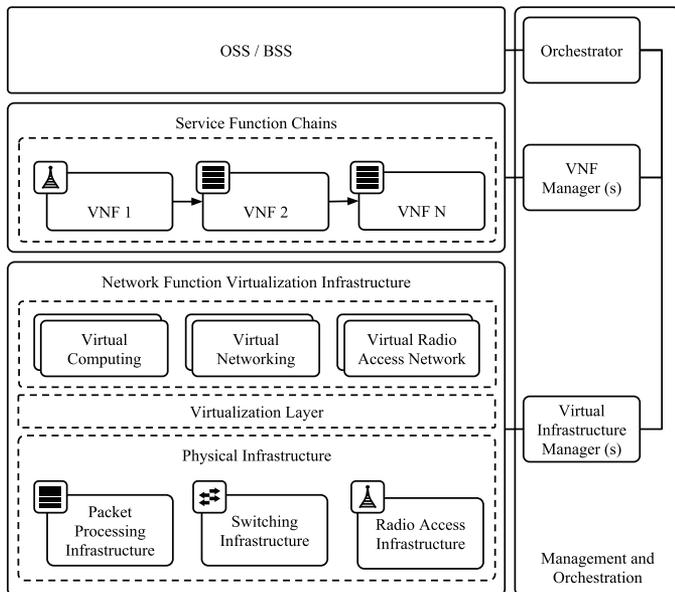


Fig. 10. Reference network function virtualization architecture [9].

the actual VNFs which are the software implementation of a particular network function capable of being executed over the NFVI. We remind the reader that in this work also radio access is treated as a VNF. Finally, in the third layer we have the Operational Support System (OSS) and the Business Support System (BSS) used by the network administrators to operate and manage their virtual networks. The Management and Orchestration plane covers the orchestration and the management of physical and/or virtual resources that support the NFVI as well as the life-cycle management of the VNFs, i.e. creation, configuration, monitoring, and destruction.

B. Network Function Virtualization Infrastructure

Our architecture currently accounts for three kinds of NFVI resources, namely: basic forwarding nodes (i.e. OpenFlow switches), packet processing nodes, and radio access nodes. The latter, in addition to the features supported by the packet processing node, also embed specialized hardware in the form of one or more 802.11 Wireless NICs. Figure 11 sketches the system architecture.

We name Wireless Termination Points (WTPs) the physical points of attachment in the RAN (e.g. WiFi APs or LTE eNBs) supporting virtualized radio processing capabilities. Conversely, the Click Packet Processors (CPPs) are the forwarding nodes with computational capacity. These nodes are essentially programmable switches running an embedded version of Linux and capable of performing arbitrary operations on the traffic, e.g. load-balancing, firewalling, deep packet inspection, etc.

As the name suggests the actual packet processing is performed by multiple instances of the Click Modular Router [42]. Click allows to build complex VNFs using simple and reusable components, called *elements*. Click includes over 300 elements supporting functions such as packet classification, access control, deep packet inspection. Elements can be composed in order

to realize complex VNFs. Finally, Click can be easily extended with custom processing elements making it possible to support features that are not provided by the standard elements.

Each WTP/CPP includes an OpenVSwitch instance, one or more VNFs, and one Agent. The latter is in charge of monitoring the status of each VNF as well as handling requests coming from the controller. In the current implementation the monitoring features include: number of packets/bytes transmitted and received as well as the amount of resources (cpu time, memory, storage) utilized by each VNF.

In the current prototype CPPs are built upon the Soekris 6501-70 platform consisting in single 1.6 GHz Intel Atom CPU, 2 Gbyte of SDRAM, and 12 Gigabit Ethernet Ports. CPPs run Ubuntu 15.04 Server as operating system. WTPs exploit the PCEngines ALIX (x86) embedded platform and run the OpenWRT operating system.

C. Virtual Infrastructure Managers

As Virtual Infrastructure Managers (VIMs) we use a combination of frameworks. Ryu [43] is used to configure the switching fabric while for the NFVI we extended the EmPOWER controller presented by the authors in [44] in order to support also the generalized packet processing nodes. The controller supports multiple slices on top of the same physical infrastructure. A slice is a virtual network with its own set of WTPs/CPPs. The controller is responsible for the deploying the VNFs on the network devices.

D. Orchestrator

From an architectural standpoint, the VNF placement algorithm resides in the Orchestrator which is in charge of deciding whether a particular request can be accepted or if it must be refused. If a request is accepted, then the Orchestrator is in charge of mapping the request onto the substrate network, i.e., network resources must be allocated and configured on both the substrate nodes and the substrate links and the VNFs must be instantiated on the selected nodes (see Fig. 11). Notice how, our proof-of-concept does not impose a specific Orchestrator leaving network administrators free to use other currently available solutions, such as OpenBaton [12].

VII. APPLICATIONS

In this section we shall describe two SFCs implemented and tested over a small scale testbed deployed at CREATE-NET premises. The testbed consists of 2 OpenFlow-switches, 2 CPPs, and 20 WTPs.

A. Radio Access Network Slicing

In this use case we aim at demonstrating the performance isolation features enabled by our joint VNF placement and scheduling solution. Such use case is supported by introducing a MAC Hypervisor implementing the slice scheduling techniques described in the previous sections. Figure 12 sketches

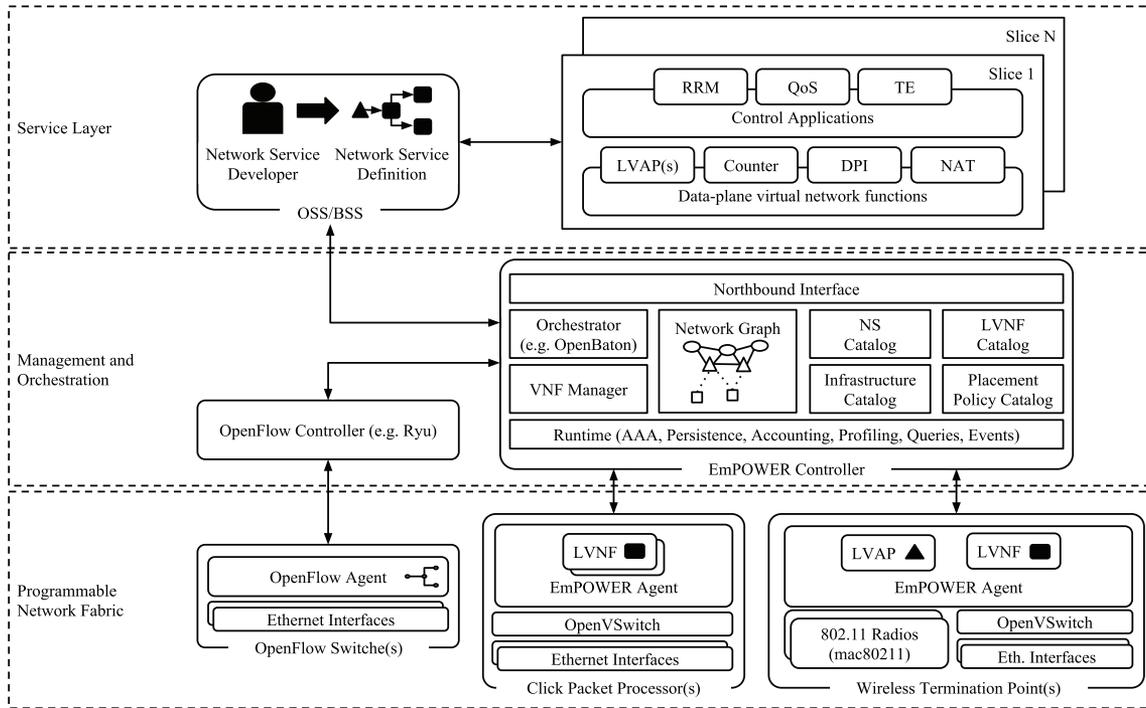


Fig. 11. The *EmPOWER* network architecture.

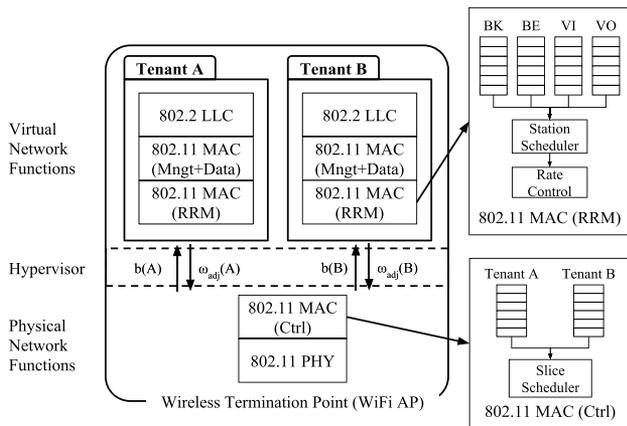


Fig. 12. Radio Access Network Slicing Application.

the internal architecture of a radio access node. Notice how, not the entire WiFi MAC is virtualized. More precisely, WiFi control frames generation (e.g. ACK and RTS/CTS) as well as the actual physical layer are not virtualized due to their tight timing/computational constraints. On the other hand each tenant can have its own Radio Resource Management (RRM) instance as well as its own management place. In this work with RRM we refer to wireless clients scheduling and to rate adaptation, which can be defined on a per-tenant basis². For example, one tenant can use a wireless station scheduler aimed at ensuring fairness while another tenant could opt for a scheduler aimed at improving the aggregated slice bandwidth.

²Notice how, the hypervisor implementation details are out of the scope of this work and are thus omitted.

The hypervisor monitors the channel utilization as well as the amount of traffic generated by each Tenant. Such information is used to compute the effective aggregated goodput of each slice ($b(n)$). It is worth stressing that both channel activity and goodput are two quantities that can be monitored by the hypervisor with low overhead and without affecting the operation of the RRM policy implemented by Tenants. For example a Tenant with wireless clients experiencing poor channel conditions will see its aggregated goodput reduced due to re-transmissions. Similarly a Tenant implementing wireless clients scheduling policies aimed at maximizing fairness will also see a reduction in goodput if some of its wireless clients require less efficient modulation and coding schemes.

The network setup used for this set of measurements consists of two tenants *A* and *B*. The bandwidth requests coming from Tenant *A* and *B* are, respectively, 4 and 2 Mb/s, while the reference bandwidth (Ω_b^v) is 6 Mb/s for both tenants. A total of three wireless clients is active in the networks. Clients 1 and 2 belongs to Tenant *A* while Client 3 belongs to Tenant *B*. Traffic is generated from a server sharing the same backhaul with the APs and consists of three UDP streams (one for each client). Each stream has constant inter-departure time and packet size resulting in a transmission rate of 10 Mb/s for each stream. In order to simulate a hotspot with limited capacity the rate control algorithm used by the AP has been modified in order to always use the lowest transmission rate (6 Mb/s). Measurements have been carried in two different scenarios differentiated by the channel conditions experienced by client number 1 which is positioned in such a way to experience channel conditions ranging from *Good* to *Poor*.

As it can be seen from Fig. 13a, when Client 1 is experiencing good channel conditions the proposed VNF scheduling

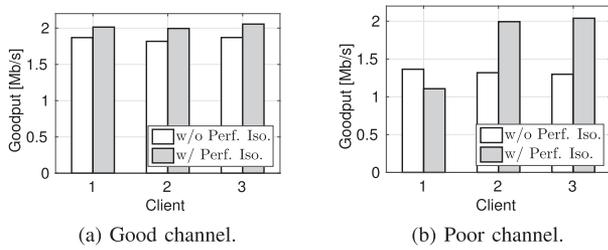


Fig. 13. Isolation across clients in different networks. Client 1 and 2 are in Tenant 1's network, while Client 3 is in Tenant 2's network.

method can satisfy the bandwidth request for both tenants (notice that Tenant A request of 4 Mb/s has been equality partitioned among the two clients). On the other hand, when Client 1 starts experiencing poor channel conditions (see Fig. 13b) the legacy resource provisioning mechanism allocates the same bandwidth to all the clients. This behavior, known as IEEE 802.11 performance anomaly [45], allows a node which experiences poor channel conditions to monopolize the wireless medium lowering the performance of the whole system. Conversely, the proposed resource provisioning mechanism can meet the bandwidth reservations made by Tenant A by linearly scaling down the amount of resources allocated to Tenant B that is experiencing poor channel conditions.

B. Data/Management Plane Offloading

Wireless, and in particular mobile networks, have been so far designed around the requirements of the downlink, i.e. cell or AP selection is performed using downlink signal strength measurements. In the recent years, however, we have witnessed a mushrooming of new uplink-centric applications such as Machine Type Communications (MTC), Internet of Things (IoT), and Vehicle to Infrastructure (V2I) as well as of symmetric mobile applications. This calls for a paradigm shift where the traffic originated from a wireless client is received by one node while the traffic destined to the same client is transmitted by another node. This kind of network setup is usually referred to as uplink/downlink decoupling and, in its most general form, can consist of two possibly non overlapping sets of transmitting and receiving nodes.

The *EmPOWER* platform [44] allows for network configurations where a wireless client can be attached to one AP in the downlink direction and to *one or more* APs in the uplink direction. This feature allows to exploit the broadcast nature of the wireless medium and to opportunistically receive the same transmission at multiple in-range APs. However, if not properly controlled such a feature can lead to an overload in the network core. For example, a wireless client scheduled on N APs in the uplink direction could increase the load on the network core by a factor of N . Moreover, a straightforward implementation of such a mechanism could generate a significant increase in the number of duplicate packets which in time could trigger anomalous behaviors at the transport layer.

As a result of the fact that the WiFi MAC is virtualized it is possible to offload parts of it to dedicated processing

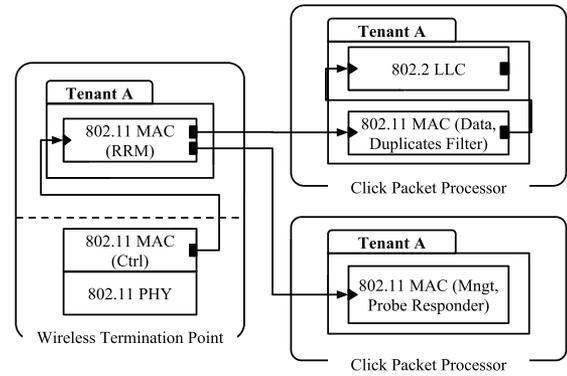


Fig. 14. Data/Management Plane Offloading application. Data-plane (duplicates filtering) and Management-plane (probe response generation) operations are offloaded to two different CPPs.

nodes as VNFs that can be then shared among several APs. In this use case we implemented a VNF which filters out duplicate 802.11 frames based on their sequence number. Figure 14 sketches a slightly more generic case where both data-plane (duplicates filtering) and management (probe response generation) functionalities are offloaded to two different CPPs. In this section however we shall evaluate only the performances of the duplicate filtering VNF.

Traffic originated from clients is received at one or more WTPs where it is encapsulated (802.11 over Ethernet) and then forwarded to a CPP where the duplicates filtering VNF is deployed. This VNF is also responsible for decapsulating the 802.11 frame and converting it into an Ethernet frame before forwarding it to its intended destination.

In order to evaluate this VNF we exploited a network setup composed of a single client and three APs. Traffic is injected from the wireless client as a single UDP stream. Packet transmission rate and payload are kept fixed at, respectively, 100 packets/s and 1472 bytes. Impairments on the link between client and APs are simulated by randomly dropping received frames with probability PL at all receiving APs. For all measurements a total of 6000 frames were generated. Confidence intervals were very small for all the data points and have therefore be omitted in order to improve readability. Measurements have been taken using three packet dropping probabilities, namely: 0.05 (good channel conditions), 0.2 (medium channel conditions), and 0.8 (poor channel conditions)

As it can be seen from Fig. 15a, the end-to-end packet delivery ratio increases with the number of available uplinks. The proposed uplink/downlink decoupling solution can provide a small performance improvement even when the channel conditions are good ($PL = 0.05$). On the other hand the performance improvements are significant when the channel conditions get worse. In particular this solution allows to turn an essentially broken channel (4 out of 5 dropped packets) into an usable channel (1 out of 2 dropped packets). Finally, in Fig. 15b and Fig. 15c we can see the impact of the duplicate filtering VNF on the bandwidth utilization. As expected without the VNF the bandwidth utilization increases with the number of uplinks, while using the VNF filtering the bandwidth utilization does not exceed the nominal goodput.

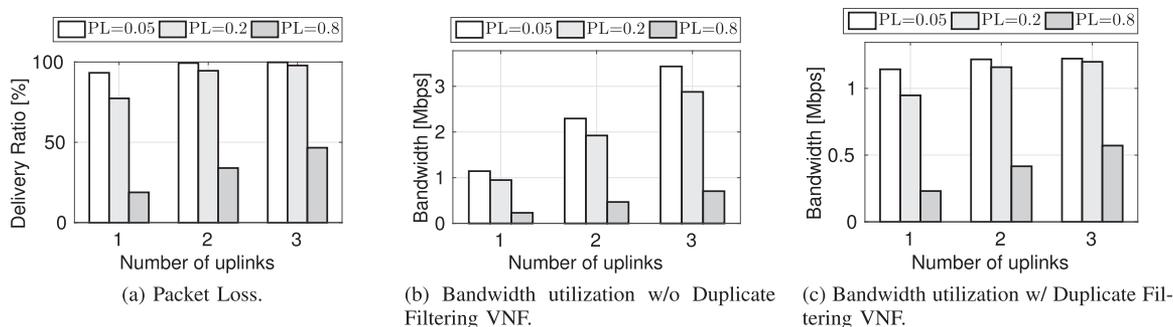


Fig. 15. Packet loss (a) and bandwidth utilization (b and c) for a single client scheduled at multiple APs in the uplink direction. The duplicate filtering VNF can reduce the load on the backhaul by selectively dropping duplicate packets.

VIII. CONCLUSIONS

NFV is rapidly emerging as a flexible solution to deploy and operate future mobile networks. However, in order to fully deliver on its promises, the concept of NFV must be extended also to the radio access segment of the mobile network. In this paper, we tackled this challenge by presenting a novel formulation of the VNF placement problem encompassing also radio access VNFs. We then introduced a ILP-based algorithm for small networks and a scalable heuristic, named *WiNE*, for larger deployments. Numerical simulations showed that the proposed heuristic can approximate the performance of the ILP-based placement algorithms for realistic substrate networks. Finally, we reported on a preliminary proof-of-concept implementation of a NFV Management and Orchestration framework for Enterprise WLANs.

As future work, we plan to investigate the resiliency properties of *WiNE* in case of nodes and link failures and to study how VNF placement can be optimized by taking into account wireless clients distribution and user mobility. We also plan to verify the applicability of our problem formulation to OFDMA-based radio access networks like LTE and LTE-Advanced and to extend the prototype (both the hypervisor and the controller) adding support for VNF migration and scaling as well as for Mobile Edge Computing capabilities.

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