

# Queueing in Space: design of Message Ferry Routes in static adhoc networks

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**Abstract**—We study the concept of Ferry based Wireless Local Area Network (FWLAN), in which a number of isolated nodes are scattered over some area and where communication between a node and the outer world, or communication between the nodes, are made possible via a message ferry. The Ferry has a predetermined cyclic path which collects packets from a node and delivers packets to it when it is in the vicinity of the node. We use the mathematical theory of polling systems to study the performance of the FWLAN. We consider three different architectures and each of them is mapped to a polling model. The polling disciplines that are needed for modeling the FWLAN involve non-standard variants of gating disciplines. Our goal is to design the routes of the Ferry as well as the points where it should stop to distribute and collect packets. This mathematical modeling brings another dimension to the classical related vehicle routing problem due to the radio channel: the cyclic path of the ferry need not touch every node. The distance between the node and the ferry at the point when communication occurs determines the transmission rate and hence the service time and thus the system's capacity.

## I. INTRODUCTION

Message Ferry are mobile relays or mobile base stations that serve as "postman" to deliver to static or dynamic wireless nodes messages (or packets) and to collect messages from them. Mobile base stations have been proposed in the context of mobile Ad Hoc Networks [15], of Vehicular Ad-Hoc Networks (Vanets) [11] and of wireless (static) sensor networks [12]. In the UmassDiesel project, computer have been installed in 30 out of 40 buses and these then serve as Message Ferry to deliver messages to throw boxes (see <http://prisms.cs.umass.edu/diesel/>).

In this paper we are concerned with a message ferry that serves as a mobile access point in a local area network which we call FWLAN (Ferry Wireless LAN); the ferry delivers and collects packets from static nodes on some geographic area  $\Delta$ . This problem is close in nature to the well studied problem in logistics where a central point receives service requests from points on the plain. A service vehicle is then sent for handling the requests and one has to design efficient or even optimal vehicle's route so as to serve all the points, see [3]. Beyond the resemblance of the vehicle routing problem to the problem of designing a route for a message ferry, we notice also a fundamental difference. In the vehicle routing problem, the routes need to pass **through** all the points in space that require service. In contrast, the routes of the message ferry need only pass in the vicinity of nodes (in their transmission and reception range). Moreover, this range itself is flexible: assuming a fixed transmission power, the range can

be increased at the cost of decreasing throughput. The relation between the range and the throughput are determined by the radio propagation conditions.

Taking into account the above radio conditions, we are concerned with the design of a cyclic route of the ferry and of the location of stops along the route. It is only when reaching a stop that the ferry collects (uplink) and dumps (downlink) the data from/to all the nodes who are closer to that stop than to other ones. The larger the number of stops, the more time the ferry has to spend for stopping and accelerating. The lesser the number of stops is, the larger are the distances at which it has to receive/transmit the data from/to the nodes and hence the larger is the time to achieve reliable communication. In addition to this trade-off which appears both in the one dimensional and the two dimensional cases, there is another important design issue that is specific to the plane: in order to achieve smaller service times the routes need to be longer, which may increase waiting times. Larger service times that would be needed if the routes were shorter imply smaller achievable throughput of the system.

We consider three architectures:

- **Sensor Access Network (SAN):** there is a fixed base station (BS) that is connected to the global Internet (or to other base stations) and thus enables communication between nodes in the FWLAN and the outer world. The ferry brings all traffic from (respectively to) nodes in the FWLAN to (resp. from) the BS. There is no traffic from nodes of the FWLAN to other nodes in the FWLAN.
- **Hybrid Access Network (HAN):** Same as SAN but traffic sent by a node in the FWLAN can also be destined to another node in the FWLAN. In that case the ferry first brings all uplink packets to the BS and then receives from the BS all downlink packets received during the last cycle including those just brought by the shuttle destined to other nodes in  $\Delta$ . Using this architecture we can achieve routing within the area also, however it always takes two cycles to complete the data transfer.
- **Autonomous Network (AUN):** the Ferry serves as a local mobile base station. Thus a packet sent by a node is transferred directly to the destination node without first transmitting through a fixed BS. In this case, in contrast to the HAN architecture, the data routing can take place

faster: depending on the location of the source destination nodes and the direction of the ferry's route, a packet may arrive at the destination in the same cycle of the Ferry.

This kind of system can best be studied using a polling system, wherein a ferry serves a finite number of queues in a cyclical order [2], [6], [4], [9], [14], [13]. Two queues are considered at each stop. The uplink arrivals from nodes that are nearest to the stop under consideration are modeled as one queue (uplink queue) while all the nearest downlink arrivals are modeled as the downlink queue.

The polling disciplines that are needed for modeling the FWLAN involve non-standard variants of gating disciplines. In SAN architecture, we note that upon arriving at a queue, the ferry serves (bring to the queue) all packets that were present at the base station when the ferry last visited the base station. If only downlink traffic existed then this would correspond to the "globally gated" (GG) discipline [6] (otherwise we call the discipline PGG for "partially globally gated"). In contrast, when the ferry arrives at a stop it can upload all the traffic present there upon arrival (so that the standard gated or exhaustive disciplines can be used to model this). In the autonomous network case, the polling discipline in the uplink queues will be shown to be a complex combination of PGG disciplines, related to the models in [9], [13].

In designing the ferry's routes and stops, we aim at minimizing the expected virtual workload in the system (which is some appropriate weighted expected waiting time (WWT) of a random customer).

The system, model and the notations of the paper are introduced in Section II. We consider SAN, HAN, AUN architectures respectively in Sections III, VI and V. The theoretical results obtained were simulated using some numerical examples in the respective sections itself. The paper is concluded in Section VII.

## II. SYSTEM MODEL AND NOTATIONS

We consider a 1-Dimensional or 2-Dimensional geographical area  $\Delta$  in which static nodes (sensors) are scattered. We assume that the network is sparse and there is no direct global connectivity. In order to receive messages (which we call also "packets") from the nodes or to send messages to them, a ferry called "message ferry" or "message shuttle" moves around and serves as a postman. The nodes either generate data to or require data from nodes within and/or outside the area. In order to route the data to and from outside the area, the shuttle has to pass through a base station that serves as a gateway.

It is possible that the BS is also needed to route the data within the area (for example in SAN architecture). In Section III on SAN architecture, all the data routing takes place via the BS: the ferry goes to the BS once in every cycle to collect and deposit the information. The ferry "serves" the nodes at each stop in a cyclic manner. We use throughout terms from queuing theory; by "serves" a message we mean that the ferry transmits it if the connection is downlink (i.e. the message is destined to a node), or receives it, if it is an uplink message. In Section V on AUN architecture, we consider instead the

situation where the server/ferry routes the data directly to the destination, if an uploaded packet was meant for a node within the FWLAN. Only the packets from/to the nodes outside  $\Delta$  are routed to BS. Finally in Section VI, we give a brief idea to study the HAN architecture.

**Ferry's Route :** The ferry moves in a closed path repeatedly and stops at the same finite number ( $\sigma$ ) of predetermined stops in every cycle. The area is divided into  $\sigma$  disjoint subareas and each stop is associated with one of the subareas. A node belongs to that subarea if and only if its signal is strongest there. At each stop, the ferry serves all the nodes located in the associated subarea.

Let  $\{Q_1, Q_2, \dots, Q_\sigma\}$  represent the location of stops of the ferry. For each  $i$  let  $I_i$  represent the subarea associated with stop  $i$ . We assume that BS is located near  $Q_1$ . The indexing in this paper is done in a circular manner.

**Arrival process :** We consider traffic generated at the nodes which we call "uplink", and traffic that arrives to the nodes which is called "downlink". We shall use for both cases the term "arrival". Uplink/Downlink traffic arrives according to an independent marked point processes  $\{T_n, M_n\}$ , where  $T_n$  is the arrival time of the  $n$ th point and  $M_n = [L_n^u, L_n^d, \eta_n]$  are the corresponding i.i.d. marks:

- $T_n$  is a Poisson point process with parameter  $\lambda$ ,
- $L_n^u$  is the source of the uplink (upload to Ferry) while  $L_n^d$  is its downlink (download from Ferry) node. Both  $L_n^u, L_n^d$  are in  $\Delta$ . When the BS is involved in data transfer then we either consider  $L_n^u$  or  $L_n^d$  appropriately to be the BS. This for example occurs whenever the actual source (resp. actual destination) is outside FWLAN.
- $\eta_n$  is the size of the packet. Its distribution can depend upon  $L_n^u$  and or  $L_n^d$ . It has finite first and second moments everywhere.

The point processes that counts only the uplink traffic (whose source, is in  $\Delta$ ) to BS is Poisson with  $\lambda^u$ . The point processes that counts only downlink arrivals from BS to  $\Delta$  (in the SAN and HAN architecture) is Poisson with  $\lambda^d$ . We shall use the superscript  $u$  or  $d$  to denote uplink or downlink.

For the SAN architecture one of the source or destination is BS itself and hence we find it convenient to define explicitly the exogeneous uplink (downlink) Poisson point processes  $\{T_n^u, M_n^u\}$  with rate  $\lambda^u$  ( $\lambda^d$ ), where  $M_n^u = [L_n^u, \eta_n^u]$  ( $M_n^d = [L_n^d, \eta_n^d]$ ) are the corresponding marks.

In case of AUN architecture the downlink/uplink traffic to/from nodes can be exogeneous (i.e., routed via BS) or can be from the other nodes in  $\Delta$ . We view both the downlink/uplink traffic as uplink traffic itself with a source and destination within  $\Delta$ . Note here that the actual downlink process also starts with upload of data to the Ferry at node (the node will be BS for exogeneous downlink) followed by the download of the data to the destiny node. In this case we model the arrivals with Poisson rate  $\lambda^u$  with Marks given by  $M_n = [L_n^u, L_n^d, \eta_n^u]$ .

**Radio channel conditions and service time :** The Ferry uses a wireless link to serve the customers. It can receive/transmit the packets from/to the nodes at a distance of  $d$  from it at a rate  $r(d)$  for some decreasing function  $r(\cdot)$ . We shall write  $r^u$  and  $r^d$  for the uplink and downlink rate functions (in case they are different). The upload/download service time of a packet with source located at  $l^u \in I_i$  close to stop  $i$  and sink located at  $l^d \in I_j$  is its size divided by the service rate (which depends on the distance between the node's location  $l^u/l^d$  and the corresponding Ferry's location  $Q_i/Q_j$ ) (for example in case of AUN architecture) :

$$B^m(l^u, l^d) = \frac{\eta^m(l^u, l^d)}{r^m(\|Q_{m(i,j)} - l^m\|)}.$$

where  $m$  stands for  $u$  or  $d$  and  $u(i, j) = i$  and  $d(i, j) = j$ . Throughout the paper  $\|\cdot\|$  represents either the area (length) of the two (one) dimensional region and or the distance between two points. Note the service times in SAN architecture depends either only on  $L^u$  (for uplink) or only on  $L^d$  (for downlink). Denote by  $b^m(l)$  and by  $b^{(2m)}(l)$  the corresponding first and second moments at location  $l$ . The first two moments of the service time at the uplink and downlink queues at station  $j$  are  $b_m^u, b_i^{(2m)}$  with

$$\begin{aligned} b_j^m &:= E [B^m(L^u, L^d) | L^m \in I_j], \\ b_j^{(2m)} &:= E [(B^m(L^u, L^d))^2 | L^m \in I_j]. \end{aligned}$$

(Note that up and downlink service times are defined for all three architectures, where downlink means from the Ferry and uplink - to the Ferry.)

**Walking times :** After serving all the nodes in a stop  $Q_i$ , the ferry walks to the next stop  $Q_{i+1}$ . The walking time is  $c_1\|Q_i - Q_{i+1}\| + c_2$ , for some appropriate constants  $c_1, c_2$ . The constant  $c_2$  represents the cost for acceleration/deceleration while  $c_1$  represents the cost of speed of the ferry.

The larger the number of stops, the larger the cost of walking will be. Yet at the same time, the lesser the number of stops the cost of serving the nodes increases as then the ferry will have to serve nodes at a more distant points. Because of *these two contrasting costs, one needs to design optimal number of stops for the ferry.*

### III. SENSOR ACCESS NETWORK ARCHITECTURE

Traffic is either uplink from the nodes (sensors) to the BS (through which it can be further routed to the Internet) or downlink from the Internet to nodes of the FWLAN again passing through the BS (which serves as a gateway). The cyclic route of the ferry starts when reaching the BS. It first deposits the (uplink) data collected from all the nodes of  $\Delta$  in the previous cycle to the BS. It then collects all the downlink data from the BS before walking on to the first stop. The radio connection between the ferry and BS are assumed to be very good and hence one can neglect the time taken by the ferry for serving the BS. While traversing through the path,

at every stop  $i$ , the ferry first downloads all the data collected from the BS destined to the nodes located in area  $I_i$  and then collects all the uplink data packets that have arrived since its last visit. It continues collecting the packets till there are no more uplink data packets in  $I_i$ .

#### A. Polling model and pseudo conservation laws

We analyze the performance of the FWLAN using the theory of polling systems. As a first step, we model each stop,  $Q_i$ , as 2 independent queues (one for uplink and the other for downlink) each with Poisson arrivals of rate  $\lambda_i^u$  (resp.  $\lambda_i^d$ ); Each of the uplink queues are served with Exhaustive Gating policy. On the other hand, the packets that are transmitted downlink are those present at BS when the Ferry arrives at the BS. In case there were only downlink transmission, this would correspond to the globally gated service discipline [6], [4]. In presence of nodes transmitting (exhaustively) uplink, globally gating is applied only to part of the queues (the downlink) so we call this the "partially Globally Gated" discipline. We thus have  $2\sigma$  polling system with half the queues experiencing Exhaustive service while the remaining half receive the globally gated service. The walking times in between queues are given by (walking distance between queues of same stop is zero):

$$V_{2i} = c_1\|Q_i - Q_{i+1}\| + c_2, V_{2i-1} = 0 \text{ for all } i. \quad (1)$$

With  $m = u$  or  $d$ , define (for  $i = 1, 2, \dots, \sigma$ )

$$\begin{aligned} l_j^m &:= Prob\{L_0^m \in I_j\} & \lambda_i^m &:= l_i^m \lambda^m \\ \bar{V}_i &:= \sum_{j < i} V_{2j} & \rho_i^m &:= \lambda_i^m b_i^m \\ \lambda_{2i} &:= \lambda_i^u & \lambda_{2i-1} &:= \lambda_i^d \\ b_{2i} &:= b_i^d & b_{2i-1} &:= b_i^u \\ b_{2i}^{(2)} &:= b_i^{(2d)} & b_{2i-1}^{(2)} &:= b_i^{(2u)} \\ \rho^{2m} &:= \sum_{i=1}^{\sigma} \rho_i^m & \rho &:= \rho^u + \rho^d \\ \bar{V} &:= \sum_{i=1}^{\sigma} V_{\sigma+1} = c_1 \sum_{i=1}^{\sigma} \|Q_i - Q_{i-1}\| + \sigma c_2. \end{aligned}$$

#### B. Stability

The load factor  $\rho$  is given by,

$$\begin{aligned} \rho &= \lambda^u \sum_{i=1}^{\sigma} Prob(L^u \in I_i) E \left[ \frac{\eta^u(L^u)}{r^u(\|Q_i - L^u\|)} \middle| L^u \in I_i \right] \\ &+ \lambda^d \sum_{i=1}^{\sigma} Prob(L^d \in I_i) E \left[ \frac{\eta^d(L^d)}{r^d(\|Q_i - L^d\|)} \middle| L^d \in I_i \right] \\ &= \sum_{m=u,d} \lambda^m E \left[ \frac{\eta^m(L^m)}{r^m(\min_{1 \leq i \leq \sigma} \|Q_i - L^m\|)} \right] \quad (2) \end{aligned}$$

A straightforward adaptation of [8], [1], [7] yields the following:

**Lemma 3.1:** FWLAN is stable if and only if  $\rho < 1$ . Further  $\rho$  is a non increasing function of  $\sigma$  and hence the stability of the system improves as the number of stops, increases.  $\diamond$

From (2) a necessary condition for stability is

$$\sum_{m=u,d} \lambda^m E \left[ \frac{\eta^m(L^m)}{\max_{l \in \Delta} r^m(l)} \right] < 1. \quad (3)$$

Note: the fading nature of the wireless medium and the shadowing (which we have not considered in this paper) may further reduce the stability region. Both of them can be introduced to our problem; the way to model up and downlink communications through polling systems remains the same, but the service time distributions become more complex.

For any pair of arrival rates  $(\lambda^u, \lambda^d)$ , the stability condition can be ensured as follows. First, ensure the stability condition for the polling system in which all nodes are located at distance zero from the stations (see (3)). The system now behaves like a wire line system. We request that  $\rho < 1$  for this system. If this holds, then by using a sufficient amount of transmission power one can ensure that the stability condition also holds for the wireless system. Alternatively, one can also ensure stability condition by also increasing the number of stops.

### C. Virtual Workload and conservation laws

Our aim is to minimize the expected virtual workload in the system, or equivalently, the expected weighted waiting time  $WWT := \sum_i (\rho_i^u E[W]_i^u + \rho_i^d E[W]_i^d)$  of a random arrival. By applying the Pseudo Conservation Laws of [6], [4] to our polling model, we get:

$$\begin{aligned} & \sum_i (\rho_i^u E[W]_i^u + \rho_i^d E[W]_i^d) \\ &= \rho \frac{\sum_{j=1}^{2\sigma} \lambda_j b_j^{(2)}}{2(1-\rho)} + \rho \frac{\bar{V}}{2} + \frac{\bar{V}}{2(1-\rho)} \left[ \rho^2 - \sum_{i=1}^{\sigma} (\rho_i^u)^2 \right] \\ & \quad + \rho \frac{\bar{V}(1+\rho)}{2(1-\rho)} + \sum_i \rho_i^d \bar{V}_i. \end{aligned} \quad (4)$$

As in the case of  $\rho$ , the first term in RHS of (4) is always decreasing in  $\rho$ , while the rest of the terms are product of a decreasing and increasing terms. The term  $\bar{V}$  is increasing at least linearly in  $\sigma$  and hence will eventually dominate the convergence behavior of the virtual workload under more realistic condition of  $\lim_{d \rightarrow 0} 1/r^m(d) > 0$ ,  $m = u$  or  $d$ . Thus the virtual workload initially may decrease with  $\sigma$  because of  $\rho$  terms but will eventually increase to infinity if  $\lim_{d \rightarrow 0} 1/r^m(d) > 0$ . Hence, there exist optimal number of stops  $\sigma^*$  for which the virtual workload is minimized.

**Symmetric conditions,** Assume full symmetry, i.e. that  $L^u$  and  $L^d$  are uniformly distributed over  $\Delta$ , the service times independent of the location, the stops at equal distances etc. Further assume that the parameters of uplink and downlink to

be same. Then for all  $i$  (assuming  $Q_1$  is at the zero location),

$$\begin{aligned} l_i^u &= l_i^d = \frac{1}{\sigma}, & \lambda_i^u &= \lambda_i^d = \frac{\lambda}{\sigma}, \\ b_i^u &= b_i^d = b_1 =: \eta_b \sigma \int_{l \in I_1} \frac{1}{r(\|l\|)} \frac{dl}{\|\Delta\|} \\ b_i^{(2u)} &= b_i^{(2d)} = b_1^{(2)} =: \eta_b^{(2)} \sigma \int_{l \in I_1} \frac{1}{r(\|l\|)^2} \frac{dl}{\|\Delta\|}, \\ \rho_i &= \frac{\lambda b_1}{\sigma} \quad \text{and} \quad \rho = 2\sigma \rho_1 = 2\lambda b_1. \end{aligned}$$

In the above,  $\eta_b = E[\eta]$  and  $\eta_b^{(2)} = E[\eta^2]$ .

The weighted expected waiting time of a random customer (4) under symmetric conditions simplifies to:

$$\begin{aligned} \sum_i \rho_i (E[W]_i^u + E[W]_i^d) &= \rho_1 \sum_i \bar{V}_i \\ & \quad + \frac{\rho_1 \sigma}{2(1-2\rho_1 \sigma)} \left( 4\lambda b_1^{(2)} + 4\bar{V} + \bar{V} \rho_1 \sigma \left( 4 - \frac{1}{\sigma} \right) \right) \end{aligned} \quad (5)$$

In the following we consider some interesting examples and obtain further insights into the problem under consideration.

## IV. EXAMPLES: FERRY MOVING ON A CIRCLE, RING AND RECTANGLE

### A. Ferry moving in a One Dimensional Circular Path

Assume  $\Delta$  is a circular path. In this case for each  $i$ ,  $I_i$  represents the interval (interval approximating the arc)

$$I_i := \left[ Q_i - \frac{\|Q_i - Q_{i-1}\|}{2}, Q_i + \frac{\|Q_i - Q_{i+1}\|}{2} \right].$$

In this case,  $\bar{V} = c_1 \|\Delta\| + \sigma c_2$ .

In these examples we consider only the signal attenuation due to path loss. However one can easily incorporate the shadowing and fading effects into our model. Consider that the antenna height difference between the nodes and ferry is exactly one unit. Assuming a path loss coefficient of  $2\alpha$ , for all  $i$ ,

$$r(d) = \frac{1}{(\sqrt{1+d^2})^{2\alpha}} = \frac{1}{(1+d^2)^\alpha} \quad (6)$$

$$\begin{aligned} b_i &= \eta_b \sigma \int_{-\|\Delta\|/2\sigma}^{\|\Delta\|/2\sigma} (1+l^2)^\alpha \frac{dl}{\|\Delta\|}, \\ b_i^{(2)} &= \eta_b^{(2)} \sigma \int_{-\|\Delta\|/2\sigma}^{\|\Delta\|/2\sigma} (1+l^2)^{2\alpha} \frac{dl}{\|\Delta\|} \quad \text{and} \quad \rho_i = \frac{\lambda b_i}{\sigma}. \end{aligned}$$

For example for  $\alpha = 2$  with appropriate constants,

$$\begin{aligned} b_i &= c_{b1} + \frac{c_{b2}}{\sigma^2} + \frac{c_{b3}}{\sigma^4}, \\ b_i^{(2)} &= c_{b1}^{(2)} + \frac{c_{b2}^{(2)}}{\sigma^2} + \frac{c_{b3}^{(2)}}{\sigma^4} + \frac{c_{b4}^{(2)}}{\sigma^6} + \frac{c_{b5}^{(2)}}{\sigma^8} \quad \text{and} \\ \rho_i &= \frac{c_{\rho1}}{\sigma} + \frac{c_{\rho2}}{\sigma^3} + \frac{c_{\rho3}}{\sigma^5}. \end{aligned}$$

### B. Annular Ring

We will assume here that the ferry walks in a circular path  $C$  as in the previous example, but serves all the nodes that come in between two concentric rings with the circular path of the ferry placed exactly in the center of the annular ring (see Figure 1). Say the rings are separated radially by a distance of  $2h$  meters. In this case with  $(R, \theta)$  representing the polar co-ordinates,

$$b_i^m = \frac{1}{l_i^m} \int_{-h}^h \int_{\frac{Q_{i-1,\theta}-Q_{i,\theta}}{2}}^{\frac{Q_{i+1,\theta}-Q_{i,\theta}}{2}} \frac{\eta_b^m(Q_i + (R, \theta)) L^m(d\theta dR)}{r^m(\|Q_i - [Q_i + (R, \theta)]\|)}.$$

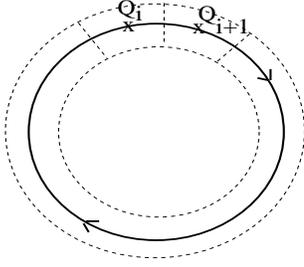


Fig. 1. Circular path of the Ferry moving in a Annular Ring

Under symmetric conditions,

$$b_i = \eta_b \sigma \int_{-h}^h \int_{-360/2\sigma}^{360/2\sigma} \frac{1}{r(\|Q_1 - [Q_1 + (R, \theta)]\|) \|\Delta\|} d\theta dR.$$

With fading model (6), approximately (the approximation is good if  $h$  is small or when  $\sigma$  is large) for all  $i$ ,

$$b_i = \eta_b \sigma \int_{-h}^h \int_{-\|C\|/2\sigma}^{\|C\|/2\sigma} (1 + x_1^2 + x_2^2)^\alpha \frac{dx_1 dx_2}{\|\Delta\|}.$$

In Figure 2 we consider a specific example and plot the WWT versus the number of stops. In this example we set,  $[c_1, c_2] = [5, 5]$ ,  $h = 0.5$ ,  $\|C\| = 16\pi$ ,  $[\eta_b, \eta_b^{(2)}] = [20, 440]$  and  $\lambda = 0.01$ . We consider two values of  $\alpha$  in this example.

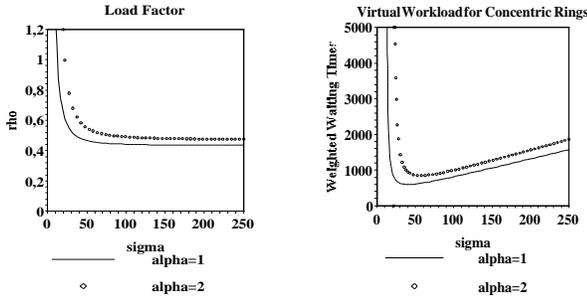


Fig. 2. Load Factor and Virtual Workload for Annular rings

From the figure, it is seen that  $\rho$  decreases with  $\sigma$ , i.e., the stability of the system improves with the increase in the number of stops, for both the values of  $\alpha$ , as shown in Lemma

3.1. Further the convergence is faster for smaller value of  $\alpha$ . This can be explained in the following way. The number of terms (the polynomial terms in  $\sigma$ ) in  $\rho_1, b_1, b_1^{(2)}$  increases with  $\alpha$ . Hence these terms converge faster to zero with smaller values of  $\alpha$ .

As expected and as explained in the previous sections, in Figure 2 the WWT first decreases with  $\sigma$ , reaches minimum at  $\sigma^*$  and then starts to increase to infinity. Also, the optimal number of stops,  $\sigma^*$ , increases with  $\alpha$ . The above is intuitively justified, as with smaller values of  $\alpha$ , the signal gets attenuated due to fading at a slower rate and hence lesser number of STOPS will suffice.

### C. Ferry moving in a Rectangular Area

Here we assume that  $\Delta$  is a rectangular area of length  $L$  and depth  $H$ . The ferry moves in a closed zig zag manner as shown in Figure 3. The distance between adjacent stops is

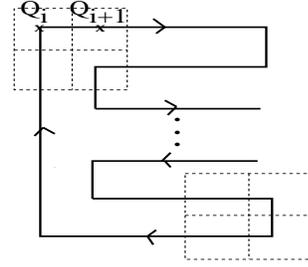


Fig. 3. Zig-Zag path of the Ferry moving in a rectangular area

same everywhere and the adjacent stops differ from each other either only in horizontal direction or only in vertical direction. At each stop the ferry covers a rectangular area as is shown in the Figure 3. Hence if  $2d$  is the distance between the stops then the number of stops (approximately) will be given by  $\frac{LH}{4d^2}$ . With the above and with the symmetric conditions,

$$\sigma = \frac{LH}{4d^2} \quad l_i = \frac{1}{\sigma}$$

$\vdots$

$$b_i = \eta_b \sigma \int_{-d}^d \int_{-d}^d (1 + x_1^2 + x_2^2)^\alpha \frac{dx_1 dx_2}{\|\Delta\|}$$

For a special case of  $\alpha = 2$  this simplifies to (for all  $i$ ),

$$\begin{aligned} b_i &= c_{b1} + c_{b2}d^2 + c_{b3}d^4 \text{ and similarly} \\ b_i^{(2)} &= c_{b1}^{(2)} + c_{b2}^{(2)}d^2 + c_{b3}^{(2)}d^4 + c_{b4}^{(2)}d^6 + c_{b5}^{(2)}d^8, \\ \rho_i &= c_{\rho1}d^2 + c_{\rho2}d^4 + c_{\rho3}d^6 \end{aligned}$$

However in contrast to all the previous models considered, the walking distances increase in a very different way. In this case the walking times are given by (for every  $i \leq \sigma$ ),

$$\begin{aligned} V_{2i} &= 2c_1d + c_2, \quad \bar{V}_i = (2c_1d + c_2)(i - 1) \text{ and} \\ \bar{V} &= \frac{2c_1LH}{d} + \frac{LHc_2}{d^2}. \end{aligned}$$

Hence the weighted walking time is once again given by (5) with the new  $\bar{V}$ ,  $\bar{V}_i$  and  $\rho_i$ 's.

We next consider the ferry of this section, moving along a zig zag path across a rectangular area in Figure 4. In this example we set,  $[c_1, c_2] = [2, 2]$ ,  $LH = 25$ ,  $[\eta_b, \eta_b^{(2)}] = [30, 940]$  and  $\lambda = 0.01$ . We consider two values of  $\alpha$  again. We make similar observations as before and one can support those observations once again as before.

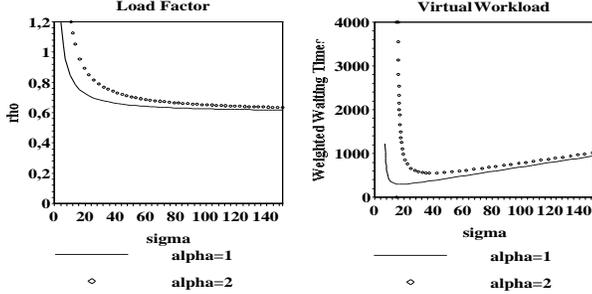


Fig. 4. Load Factor and Virtual Workload for Rectangular area with zig zag path

## V. AUTONOMOUS NETWORK ARCHITECTURE

The BS routes only the data flowing out of (or coming from outside) the area  $\Delta$  while remaining routing, i.e., the routing between nodes inside  $\Delta$  is done directly by the ferry. Here again, the ferry starts its cycle with BS, which is taken as located close to stop  $Q_1$ . One can view the BS as one of the nodes. At every stop  $i$ , it first downloads all the data it has for the nodes located in  $I_i$  and then uploads the data from the nodes in  $I_i$  once again in an exhaustive way.

The new data enters the system only as uplink data. That is, any new data is first uploaded to the ferry when it stops at a nearby stop. The uploaded data is then downloaded to the appropriate node by the ferry itself when the later stops close to destiny node the first time after upload. Note that, the downlink from external world also starts with upload, in this case upload from BS to the ferry.

We shall make heavy use of [13]. Note that the model of [13] requires independent service times. In our case the size of the packet that is sent from a source node to a destination service does not change. Therefore the service time up and downlink are naturally correlated. However, if their size is taken to be fixed and not random then one can still use the results of [13]. We thus assume **fixed packet sizes** both in this Section as well as in the one on the HAN architecture (in the latter we restrict this assumption to packets that go from one node to another).

### A. Sidi et al., Polling system with rerouting

We now model this system using the Polling System of Sidi et al., [13], which allows rerouting of the data packets to the polling system after their service.

Each stop is modeled again as two queues. At every stop, the ferry first serves the downlink queue using the usual

gated service in contrast to the global gated service of the previous section. This service discipline is more appropriate as in this case the downlink data is generated at all the stops in contrast to the previous section (where the downlink data is generated only at BS). After the downlink queue, the ferry serves the uplink queue using exhaustive service as before. It then walks to the next stop with walking times given by (1). Hence we once again have a  $2\sigma$  Poling system with half queues experiencing gated service while the rest of the queues experience exhaustive service. However this Poling system is very different from that of the previous section as in this system re routing of the data packets is possible.

In AUN architecture, there are only uplink data arrivals. Hence  $\lambda^d = 0$ . The uplink queue at stop  $Q_i$  has Poisson arrivals at rate  $\lambda_i^u = \lambda^u \text{Prob}(L^u \in I_i)$  while the downlink queue at  $Q_i$  has arrivals only due to rerouting of data packets. Using the models of Section II, the moments of the work load process/service times at the  $i^{\text{th}}$  queue of  $2\sigma$ -Polling system modeling FWLAN will be given by,

$$b_{2i} = b_i^u := E \left[ \frac{\eta^u(L^u, L^d)}{r^u(\|Q_i - L^u\|)} \middle| L^u \in I_i \right]$$

$$b_{2i-1} = b_i^d := E \left[ \frac{\eta^u(L^u, L^d)}{r^d(\|Q_i - L^d\|)} \middle| L^d \in I_i \right].$$

The second moments  $b_{2i}^{(2)} = b_i^{(2u)}$ ,  $b_{2i-1}^{(2)} = b_i^{(2d)}$  are defined in a similar way.

Every data packet is first served (uploaded to the ferry) at an uplink queue. After the first (uplink) service, the packets are routed to a downlink queue in the system according to the probability distribution<sup>1</sup> governing  $L^d$ . After the second (downlink) service (download from ferry to destiny node) the packet always leaves the system. Thus the probabilities describing the rerouting of the packets in our polling system is given by,

$$P_{2m, 2m'-1} = \text{Prob}(L^d \in I'_m) = l_m^d,$$

$$P_{m'', 2m} = 0$$

$$P_{2m-1, m''} = 0 \quad \text{for } 1 \leq m, m' \leq \sigma, 1 \leq m'' \leq 2\sigma.$$

The probabilities of data packets leaving the system at various queues equal:

$$P_{2m, 0} = 0 \text{ and } P_{2m-1, 0} = 1.$$

The total arrival rates  $\{\gamma_i; i \leq 2\sigma\}$  (equation (2.1) of [13]), total service rate moments  $\{\tilde{b}_i\}$ ,  $\{\tilde{b}_i^{(2)}\}$  (equations (2.2), (2.3) of [13]) for FWLAN can easily be computed as :

Downlink	Uplink
$\lambda_{2i-1} = 0$	$\lambda_{2i} = \lambda_i^u$
$\gamma_{2i-1} = l_i^d \sum_{j=1}^{\sigma} \lambda_j^u = l_i^d \lambda^u$	$\gamma_{2i} = \lambda_i^u$
$\tilde{b}_{2i-1} = b_i^d,$	$\tilde{b}_{2i} = b_i^u + \sum_{j=1}^{\sigma} l_j^d b_j^d$
$\tilde{b}_{2i-1}^{(2)} = b_i^{(2d)}$	$\tilde{b}_{2i}^{(2)} = b_i^{(2u)} + \sum_{j=1}^{\sigma} l_j^d b_j^{(2d)}$

<sup>1</sup>This distribution can be continuous random variable over  $\Delta$  but probably should have a point mass at the location of the BS to emphasize that BS is the gate way for routing all the data to outside world.

## B. Stability

With  $\rho_i = \gamma_i b_i$  for  $i \leq 2\sigma$ ,  $\rho = \sum_{i=1}^{2\sigma} \rho_i < 1$  is the stability condition of the system. As before, the load factor is given by:

$$\rho = \lambda^u \sum_{m=u,d} E \left[ \frac{\eta^u(L^u, L^d)}{r^m (\min_{1 \leq i \leq \sigma} \|Q_i - L^m\|)} \right].$$

Hence as in SAN architecture the stability region improves by increasing the number of stops.

## C. Virtual Workload

The appropriate weighted waiting time (WWT) or the virtual workload for FWLAN can be obtained using equations (6.3), (6.4), (6.5) of [13]. Since FWLAN is modeled by a mixed service polling system as in equation (3.22) [5], one need to add the terms of gated service (given by (6.4), [13]) and exhaustive service ((6.5), [13]) appropriately to obtain the expression for WWT. The gated service ((6.4), [13]) has extra terms in comparison with the exhaustive service ((6.5), [13]). However these extra terms are zero for FWLAN because :

- No external arrivals occur at a downlink/gated service queue ( $\lambda_{2i-1} = 0$  for all  $i$ ). Hence the extra new workload that would have joined the gated service queue, during its own service time, is also zero.
- No data packets are rerouted after a downlink queue and hence  $P_{2i-1,j} = 0$  for all  $i, j$ . Hence the extra rerouted workload added at a gated service queue (in comparison with exhaustive service queue), due to rerouting to itself, is also zero.

The WWT of FWLAN after all the possible simplifications will be given by:

$$\begin{aligned} & \sum_{i=1}^{\sigma} \left( \lambda_i^u \tilde{b}_{2i} E[W_i^u] + \gamma_{2i-1} b_i^d E[W_i^d] \right) \\ &= \frac{\sum_i \lambda_{2i} \tilde{b}_{2i}^{(2)}}{2(1-\rho)} - \sum_{i=1}^{2\sigma} \gamma_i \frac{b_i^{(2)}}{2} - \sum_{i=1}^{\sigma} \rho_{2i} (\tilde{b}_{2i} - b_{2i}) \\ &+ \rho \frac{\bar{V}}{2} + \frac{1}{1-\rho} \sum_{i=1}^{\sigma} V_{2i} \sum_{j=1, j \neq i}^{\sigma} \lambda_{2j} \tilde{b}_{2j} \sum_{k=2j+1}^{2i} \rho_k \\ &+ \frac{1}{1-\rho} \sum_{i=1}^{\sigma} \sum_{j=1, j \neq i}^{\sigma} \lambda_i^u l_j^d b_j^d \sum_{k=i}^{j-1} V_{2k}. \end{aligned}$$

**Symmetric Conditions** Under symmetric conditions as in previous section for all  $i \leq \sigma$ ,

$$\begin{aligned} \gamma_{2i} &= \gamma_{2i-1} = \frac{\lambda}{\sigma}, \quad \tilde{b}_{2i} = 2b_1, \quad \tilde{b}_{2i-1} = b_1, \\ \tilde{b}_{2i}^{(2)} &= 2b_1^{(2)} + 2b_1^2 \quad \text{and} \quad \tilde{b}_{2i-1}^{(2)} = b_1^{(2)}, \end{aligned}$$

and the WWT becomes,

$$\begin{aligned} & \sum_{i=1}^{\sigma} \left( \lambda_i^u \tilde{b}_{2i} E[W_i^u] + \gamma_{2i-1} b_i^d E[W_i^d] \right) \\ &= \frac{\lambda \tilde{b}_2^{(2)}}{2(1-2\rho_1\sigma)} - \frac{\lambda}{2} \left( \tilde{b}_1^{(2)} + \tilde{b}_2^{(2)} \right) - \rho_1 \sigma b_1 \\ &+ \rho_1 \sigma \bar{V} + \frac{\bar{V}(\sigma-1)\lambda 2b_1\rho_1}{(1-2\rho_1\sigma)} \\ &+ \bar{V} b_1 \lambda \frac{\sigma+1}{2\sigma(1-2\rho_1\sigma)}. \end{aligned} \quad (7)$$

## D. An Example : Ferry moving in a rectangular path

We now consider the ferry moving along a zig zag path in a rectangular area as in Section IV-C, but now using AUN architecture in Figure 5. In this example we set,  $[c_1, c_2] = [2, 2]$ ,  $LH = 25$ ,  $[\eta_b, \eta_b^{(2)}] = [30, 940]$  and  $\lambda = 0.01$ . We consider two values of  $\alpha$  again. We make similar observations as before and one can support those observations once again as before.

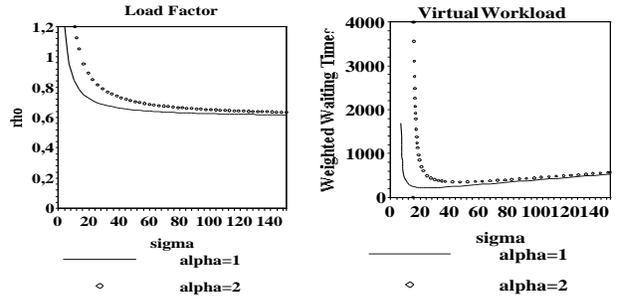


Fig. 5. Load Factor and Virtual Workload for Ferry moving in a Rectangular area with zig zag path for AUN

## VI. HYBRID ACCESS NETWORK ARCHITECTURE

We describe in this section how to model this architecture with polling models taken again from [13].

At each station  $i$  we shall use one upload queue per source-destination pair  $ij$  and one download queue. There is in addition another queue per each destination at the BS. Packets generated at node  $i$  and destined to node  $j$  will be modeled as following. They "arrive" at node  $i$  according to a Poisson process and queue up in queue  $ij$ . When the Ferry arrives at a station that handles station  $i$ , then it serves exhaustively all arrivals at queue  $ij$ . This service corresponds to uploading the packet to the Ferry. At the end of each service of a packet at a queue  $ij$ , the packet is routed to queue  $j$  at the BS and it stays there till the Ferry arrives at the BS.

The time the packet from  $i$  that was destined to station  $j$  waits from the instant it is routed to the BS till the ferry arrives there represents the time that it took for the packet to be relayed by the ferry to the base station (as in the real system the routing is not done instantaneously). When the ferry arrives at the BS, all the packets are routed instantaneously to their destinations (defined by the queue in which they wait). Only

when the Ferry arrives at the destination queue, the packet is served. Again this is not what really happens but it is exactly equivalent to what actual occurs; the reason we use this equivalence is that it allows us to use the tools of Sidi et al [13]. The time that elapses since the packet is served at the BS till it is served at the destination node in our model corresponds exactly the time from the instant it is loaded again to the Ferry at the BS till the time it is delivered to the destination.

## VII. CONCLUSIONS

We have used various uncommon elements of the theory of polling systems to model and analyze the Ferry Based Wireless Local Area Network. Three different architectures have been mapped into tractable polling models. Based on that, we have obtained optimal stopping locations taking into account the radio channel considerations. We made a special use of a variant of the globally gated regime and of the rerouting of customers introduced in [13].

We believe that our work can open doors to many other modeling aspects such as adding models to data traffic that generates acknowledgments or to interactive communications; both can be modeled using again ideas from [13].

So far we have focused on the virtual workload in the system. It is possible however to compute also the expected waiting time in each location on the plain. To that end, we note that when observing the FWLAN at arrival epochs of the Ferry to a station, all the models we have considered are in fact special cases of multi-type branching processes [10] for which expressions for the two first moments (as the unique solutions of a set of linear equations) are available. Since expected waiting time at each station can be expressed in terms of these two moments, we expect that individual expected waiting times could be computed.

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