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# Serialized optimal relay schedules in two-tiered wireless sensor networks<sup>☆</sup>

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### Abstract

In two-tiered wireless sensor networks (WSNs), sensor nodes (SNs) are scattered in clusters, and are responsible for collecting relevant information from designated areas and transmitting to an application node (AN) in the cluster. The AN then constructs a local-view for the cluster by exploring correlations among information received from nearby SNs, and sends the local-view toward a base-station that creates a global-view for the entire WSN. ANs can also relay local-views for other ANs, if the resultant network lifetime is longer. In this paper, we want to arrange inter-AN relaying optimally, which is an important process in topology control for maximizing the topological lifetime of a WSN with regard to a certain amount of initial energy provisioning. We first propose some criteria on relay candidates preselection, which can considerably reduce the overhead of obtaining an optimal relaying. We then design an algorithm to serialize the parallel relay allocation, so that each AN only needs to have one relaying AN at any time. Finally, we demonstrate the equivalency in network lifetime of the serialized inter-AN relay schedules.

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Keywords: Wireless sensor networks; Topology control; Network lifetime; Inter-node relaying; Relay schedule

### 1. Introduction

Wireless sensor networks (WSNs), driven by recent advances in micro-electromechanical system (MEMS) and short-to-medium-range radio technologies, may have a broad and in-depth impact on many aspects of our digitalized and connected society [1,2]. In a two-tiered WSN, small and even tiny sensor nodes (SNs) are scattered in clusters in the lower tier, and are responsible for capturing, encoding, and transmitting relevant information from designated areas. Application nodes (ANs), on the other hand, are responsible for constructing a local-view for the cluster by exploring correlations among information received from nearby SNs. Then, the composite local-view streams are sent from different ANs toward a common

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base-station (BS) in the upper tier, where a global-view is created for the entire WSN.

Normally, both SNs and ANs are battery-powered and energy-constrained. Once they are deployed in field, it is unlikely, if not impossible, to recharge them economically. It is also very expensive for them to acquire energy from the environment themselves. A fundamental challenge thereby in WSNs is how to maximize network lifetime with regard to a given sensing mission and a certain amount of initial energy provisioning. When an SN runs out of energy, its AN may still have the capability to construct a comprehensive local-view with the assistance of other related SNs. If the AN is out of energy, from the viewpoint of the BS, the coverage for that cluster is completely lost even when some SNs are still alive, which can jeopardize the entire mission in many cases. Although ANs can have better energy provisioning than SNs, they also consume energy at a much higher rate due to the transmission of streams over greater distances. Here, the energy constraints of ANs are our main concern. 

There are many research efforts focusing on media 110 access control (MAC) [3–6], multi-hop routing [7–9], and 111 higher layer issues for WSN and mobile ad hoc networks 112

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(MANET) [10,11]. For example, an energy-saving MAC 113 scheme can conserve energy by avoiding consistent media 114 sensing and frequent transmission collisions; an energy-115 116 aware routing scheme can route packets around dead nodes 117 or nodes that are about to run out of energy, and balance the 118 remaining energy of neighboring nodes. Localized flow, 119 error, and congestion control schemes [12,13] and domain-120 specific designs [14] are also proposed for WSNs. 121 Nevertheless, most schemes are still within the traditional 122 seven-layer open systems interconnection protocol refer-123 ence model.

124 In this paper, we follow another approach and investigate 125 the inter-AN relaying process in topology control, which is 126 designed for maximizing the topological lifetime of a WSN 127 by placing SNs, ANs, and BSs intelligently and by arranging 128 inter-AN relaying optimally. Conceptually, topology con-129 trol is below the conventional seven-layer protocol stack, 130 and is complementary to other efforts in higher layers when 131 maximizing the overall network lifetime. Energy-con-132 strained topology control is unique for WSNs, where the 133 distances between ANs and the BS, as well as those among 134 ANs, have a dominant impact on the power consumption of 135 each AN and thereby the achievable network lifetime. These 136 distances are considered to be optimal for a WSN when its 137 lifetime is maximized under the process of topology control. 138

Our contributions in this paper are twofold. First, we 139 propose some criteria for preselecting inter-AN relay 140 candidates. With the proposed preselection process, we 141 show that the overhead of obtaining an optimal relaying can 142 be reduced considerably. Second, we develop an algorithm 143 to serialize the obtained relay allocation due to its parallel 144 nature. The parallel inter-AN relaying implies that an AN 145 potentially has to send its streams to all other ANs 146 simultaneously, which can cause a major technical chal-147 lenge to the AN transceiver design. With the proposed 148 serialization algorithm, we transform any parallel relaying 149 allocations to serialized relay schedules, so that each AN 150 only needs to have one relaying AN at any time. We also 151 show that the transform can be executed in a distributed 152 manner and is equivalent in terms of network lifetime; 153

therefore, the parallel optimal inter-AN relaying still 169 preserves its optimality after the serialization process.

The remainder of this paper is organized as follows. In 171 Section 2, we present the system architecture of two-tiered 172 WSNs, their AN power consumption and energy dissipation 173 models, and the definition of topological network lifetime. 174 We also outline a sample WSN without inter-AN relaying as 175 a baseline for numerical illustrations in the following 176 section. In Section 3, we first propose criteria to preselect 177 relay candidates, and then obtain the parallel optimal relay 178 allocation by formulating and solving a constrained 179 optimization problem. We also show the benefit of having 180 a preselection process. Finally, we develop a serialization 181 algorithm to transform the obtained parallel optimal 182 relaying. Section 4 offers some further discussions and 183 Section 5 reviews related work. Section 6 concludes this 184 paper with issues for future work. 185

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### 2. System model

#### 2.1. Two-tiered wireless sensor networks

A two-tiered WSN, as shown in Fig. 1(a), consists of a 193 number of SN/AN clusters and at least one BS. In each 194 cluster, there are many SNs and at least one AN. SNs are 195 responsible for all sensing-related activities: once triggered 196 by an internal timer or an external event, an SN starts to 197 capture live information encoded by the SN and directly 198 transmitted to an AN in the same cluster. SNs are small, low 199 cost, and disposable; they can be densely deployed in a 200 cluster. SNs do not communicate with other SNs in the same 201 or other clusters, and usually are independently operated. 202 ANs, on the other hand, have much more responsibilities 203 than SNs. First, an AN receives raw data from all active SNs 204 in the cluster. It may also instruct SNs to be in sleep, idle, or 205 active state if some SNs are found to always generate 206 uninterested or duplicated data, thereby allowing these 207 SNs to be reactivated later when some existing active 208 SNs run out of energy. Second, the AN constructs an 209



Table 1

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application-specific local-view for the cluster by exploring 225 correlations among data generated by SNs. Excessive 226 redundancy in raw data can be alleviated; the fidelity of 227 228 captured information will be enhanced. Third, the AN sends the composite stream toward a BS that creates a compre-229 hensive global-view for the entire WSN. ANs can be also 230 involved in inter-AN relaying if such activity is system-231 feasible, application-acceptable, and energy-favorable. 232

The two-tiered architecture of WSNs is motivated by the 233 234 latest advances in distributed signal processing and source coding [15]. Under this architecture, the goal of lower-tier 235 236 SNs and their ANs is to gather data as effectively as possible; upper-tier ANs and BSs are designed to move 237 *information* as efficiently as possible. As shown in Fig. 1(b), 238 ANs, which extract useful information and construct local-239 240 views, are the logical bridge for these two tiers. With this function partition, we can optimize the performance of each 241 tier separately, since they are designed for different 242 purposes and have different concerns. Practically, both 243 SNs and ANs are battery-powered. Although ANs can have 244 245 more initial energy, they also consume energy at a much 246 higher rate due to the transmission of streams to BSs that are comparatively far away. When an SN runs out of energy, its 247 AN may still have the capability to construct a comprehen-248 sive local-view with other correlated SNs; but if the AN runs 249 out of energy, the whole coverage of the cluster will be 250 completely lost from the viewpoint of BSs, even when some 251 SNs in the cluster are still alive. Therefore, we focus on 252 energy constraints of ANs. 253

254 Once being deployed, an AN can obtain and report its own location by using an on-board GPS receiver, through 255 256 triangulation with a few reference points [16], or as instructed by network operators during manual deployment. 257 ANs are in sleep state initially, until they are activated by 258 the on-board wake-up circuit. Then, ANs are instructed with 259 mission schedules, aggregation schemes, and relay routes to 260 261 accomplish the mission cooperatively with other SN/AN clusters. An SN/AN cluster may undergo the sleep-idle-262 active cycle repeatedly during its lifetime until the AN 263 exhausts its on-board energy. Once being activated, the AN 264 should feed live local-views or view-changes to other ANs 265 and, eventually, to BSs. According to a specific mission, all 266 ANs can be activated at the same time, or they can be 267 activated independently. The first style is referred to as 268 269 synchronized activation; the second one is unsynchronized. An AN can be left in active state once it is activated, or it 270 can be in active and inactive (including sleep and idle) states 271 alternatively. The first mode is referred to as continuous 272 activation; the second one is discrete. Although different 273 missions can choose different activation styles and modes, 274 from the viewpoint of topological lifetime, an unsynchro-275 nized discrete mission can always be converted to an 276 277 equivalent synchronized continuous mission, as soon being discussed in Section 2.2. 278

Once ANs have been placed, an immediate challenge is 279 to locate BSs so that network lifetime can be maximized 280

Table 1	
Notations	
Symbol	Description
$V_N$	A set of N ANs of a WSN
$\nu_i$	An AN at $(x_i, y_i)$ on a plane
b	Base station (for notation convenience, $v_0 = b$ )
$d_i$	Euclid distance from $v_i$ to b
$d_{i,j}$	Euclid distance from $\nu_i$ to $\nu_j$
$r_i(t)$	Data rate generated locally by $v_i$ at time t
r <sub>i</sub>	If $r_i(t)$ is time-invariant
$r_{i,j}(t)$	Data rate relayed from $v_i$ to $v_j$ at time t
$p_i(t)$	Power consumption of $v_i$ at time t
$p_i$	If $p_i(t)$ is time-invariant
$e_i(t)$	Remaining energy of $v_i$ at time t
$e_i(0)$	Initial energy allocation of $v_i$
$l_i$	Node lifetime of $v_i$
L	Network lifetime without relaying
R	Network lifetime with relaying
$RC_i$	Relay candidates set for $v_i$
$RR_i$	Parallel relay allocation for $v_i$
ε	e(t=L) or $e(t=R)$
$\phi_{i,j}$	Energy quota to relay data from $v_i$ to $v_j$ for R
$RS_i$	Serialized relay schedule for $v_i$

302 even without inter-AN relaying. We assume that ANs can 303 communicate with BSs independently, and that BSs are 304 always reachable for ANs as long as ANs can draw enough 305 transmission power from their remaining energy supply. 306 This property and the characteristics of steady live local-307 views constructed by ANs, suggest a deterministic MAC 308 scheme such as TDMA employed by ANs. Although an SN, 309 depending on the amount of sensible information available 310 at a certain time, can send raw data in burst to its AN, the 311 aggregated live local-views should be relatively smooth and 312 in low volume, whereas the TDMA scheme can save the 313 extra control overhead and power consumption encountered 314 by contention-based MAC schemes. Our study does not rely 315 on any specific MAC schemes, since topology control is 316 even under the regular MAC layer. After BSs are located, 317 and if inter-AN relaying is desirable, BSs can derive relay 318 schedules, and instruct ANs to communicate cooperatively 319 to achieve a longer network lifetime. Table 1 lists some 320 frequently-used symbols. 321

#### 2.2. Power and energy models

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Communication is a dominant source in power con-325 sumption for WSNs, where live local-views are transmitted 326 over the air. Thus, we focus on the communication-related 327 activities for battery-powered ANs, since BSs are not 328 energy-constrained. For an AN to transmit a stream at rate r 329 over Euclid distance d, its minimal transmitter power 330 consumption is 331

$$p_t(r,d) = r(\alpha_1 + \alpha_2 d^n),$$
 (1)  $\frac{332}{333}$ 

where  $\alpha_1$  is a distance-independent term (e.g. the power 334 consumed in transmitter circuit), and  $\alpha_2$  reflects the 335 distance-dependent one. Eq. (1) mainly considers the path 336

loss of exponent *n*, and usually  $2 \le n \le 4$  for free-space and short-to-medium-range radio communications.

For an AN to receive a composite stream at rate r from other ANs, its power consumption in receiver circuit is

$$p_r(r) = r\beta. \tag{2}$$

For an AN to relay a bypassing stream at *r* and to transmit it further over distance *d*, its relaying power consumption is

$$p_f(r,d) = p_r(r) + p_t(r,d).$$
 (3)

If an AN generates a stream at  $r_0(t)$  itself, relays *j* bypassing streams at  $r_k(t)$ , where  $1 \le k \le j$ , and then transmits an outgoing stream at  $\sum_{i=0}^{j} r_i(t)$  to another AN or a BS that is *d* away, its total communication-related power consumption is

$$p(t) = p_r \left(\sum_{i=1}^{j} r_i(t)\right) + p_t \left(\sum_{i=0}^{j} r_i(t), d\right).$$
 (4)

If the initial energy allocated for the AN is e(0), its node lifetime l is defined by

$$\int_{t=t_0}^{t_0+l} p(t) \mathrm{d}t = e(0), \tag{5}$$

where  $t_0$  is the time when the AN is initialized. Even with a non-linearity model for conventional batteries (e.g. battery lifetime is determined by both battery capacity and discharge current raised to the Peuker constant), as long as we can derive *l* from e(0) and p(t) empirically, the proposed approaches should still apply in practice.

From the viewpoint of remaining energy, as shown in 367 Fig. 2, an unsynchronized discrete mission can always be 368 converted to an equivalent synchronized continuous mission 369 [17]. For example, Fig. 2(a) represents a discrete mission. If 370 we group all sleep, idle, and active states together, we have 371 Fig. 2(b), which is a continuous mission equivalent in 372 remaining energy. In Fig. 2(c), two ANs,  $\nu_1$  and  $\nu_2$ , have 373 unsynchronized activation cycles. However, we can always 374 rearrange the converted continuous missions to make sure 375 that they are synchronized at least once. The convertibility 376

is due to the additive property of consumed energy, which is 393 the integral of power consumption over time in (5). 394 Therefore, we mainly focus on a synchronized continuous 395 mission, where ANs have constant-rate streams and are 396 activated at  $t_0=0$ . The results can be extended to a general 397 mission with arbitrary activation styles and modes. 398

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#### 2.3. Topological lifetime definition

402 For a WSN of N ANs placed on a plane, i.e.  $V_N = \{v_i =$ 403  $(x_i, y_i)$ , given the initial energy allocation  $e_i(0)$  at  $v_i$ , which 404 generates a stream at rate  $r_i$ , the node lifetime is  $l_i$ . For 405 topology control, our focus is network lifetime (R or L for 406 the case with or without inter-AN relaying) from network 407 initialization to a point when the WSN cannot maintain 408 enough ANs alive to continue its given mission. The goal of 409 topology control is to maximize the topological lifetime of a 410 WSN with regard to a certain amount of initial energy 411 provisioning. 412

According to the *criticality* of a specific mission, we have 413 the most stringent definition of topological lifetime for a 414 WSN: *N-of-N* lifetime  $(L_N)$ ; i.e. mission fails if any AN runs 415 out of energy, or  $L_N = \min\{l_i\}$  for  $1 \le i \le N$ . The first ANs 416 that run out of energy are denoted as *critical* nodes in  $\nu_C$ . 417 Maximizing the topological lifetime  $L_N$  is equivalent to 418 maximizing min $\{l_i\}$  for  $1 \le i \le N$ , where min $\{l_i\}$  is the 419 lifetime of the critical ANs. Fig. 3 shows a sample WSN of 420 N=10 ANs (identified by numbered crosses in Fig. 3(a)) 421 scattered in a unit square, and the BS b (filled triangle) has 422 been located optimally without inter-AN relaying. We 423 assume that ANs are homogeneous with unit initial energy 424 and produce streams at a unit rate. The cases with 425 heterogeneous ANs are discussed in Section 4. For an 426 ease illustration, we assume that n=2 and  $\alpha_1=0$  in (1). As 427 we shall see, b locates at the center of a circle C with 428 minimum radius, crossing all critical ANs  $\nu_C = \{\nu_2, \nu_9, \nu_{10}\},\$ 429 and enclosing all non-critical ANs. In this case, max  $L_N =$ 430 5.504 normalized unit time without inter-AN relaying. 431 Fig. 3(b) shows the remaining energy and node lifetime 432



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Fig. 3. Normalized N-of-N lifetime without inter-AN relaying; (a) optimal b for N=10, and (b) node energy and lifetime.

for each AN. When critical ANs are out of energy, many non-critical ANs still have considerable energy left to keep them alive for a while.

### 3. Serialized optimal inter-AN relaying

With the determined BS location, we can further prolong network lifetime if inter-AN relaying is application-acceptable and energy-favorable. Here, we first define *relay* candidates for a given AN. We then obtain a parallel optimal allocation through Linear Programming. Finally, we introduce an algorithm to convert the parallel relaying, which requires an AN to potentially communicate with all of its relays simultaneously, to a serialized relay schedule, with which an AN only needs to have one relaying AN at any time.

#### 3.1. Relay candidates selection

As discussed in Section 2.3, critical ANs run out of energy first. To further prolong network lifetime, it is necessary to find relay candidates for critical ANs first.

#### 3.1.1. One-dimension relaying

For a critical AN  $v_1 \in v_C$ , assume there is a non-critical 488 AN  $\nu_2 \in V_N / \nu_C$  between  $\nu_1$  and b.  $\nu_2$  can be a relay candidate 489 for  $v_1$ , if  $v_2$  has energy left when  $v_1$  runs out of energy, i.e. 490  $e_2 - (e_1 p_2)/p_1 > 0$ . As shown in Fig. 4(a),  $v_2$  relays x portion 491 of the data generated by  $v_1$ . Here, we assume that relaying is always favorable, i.e.  $\beta = 0$  in (3). The communicationrelated power consumption is 494

$$p_1(x) = r_1[x(d_1 - d_2)^2 + (1 - x)d_1^2]$$

at  $v_1$  and

 $p_2(x) = (r_1 x + r_2)d_2^2$ 498 499

at  $v_2$ . For  $v_1$ , its node lifetime with relaying is  $l_1(x) =$ 500 501  $e_1/p_1(x)$ , and for  $\nu_2$ ,  $l_2(x) = e_2/p_2(x)$ . By increasing x from 0 to 1, or  $v_2$  relays more data for  $v_1$ ,  $l_2(x)$  is reduced. This 502 process stops either x = 1 or  $l_2(x) = l_1(x)$ . In the former case, 503  $\nu_2$  still has energy left when  $\nu_1$  is out of energy. In the latter 504

519 one,  $v_2$  cannot relay more for  $v_1$ , otherwise  $v_2$  is out of 520 energy first.

521 Fig. 4(b) plots the optimal x as a function of  $\rho = d_2/d_1$ . If 522  $p_1(x) = p_2(x)$ , i.e. 523

or 
$$526$$
  
 $d_1^2 - 2xd_1d_2 - d_2^2 = 0.$   $527$   
 $528$ 

When x = 1. 529 530

$$d_1^2 - 2d_1d_2 - d_2^2 = 0,$$
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$$\rho^2 + 2\rho - 1 = 0.$$
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<sub>534</sub>

Hence,  $\rho = \sqrt{2} - 1 \approx 0.414$  when the optimal x becomes 1. 535 As shown in Fig. 4(b), when  $d_2 \le (\sqrt{2} - 1)d_1$ ,  $\nu_1$  should 536 use  $v_2$  as its full relay, i.e. x = 1. When  $(\sqrt{2} - 1)d_1 \le d_2 \le d_1$ , 537 the optimal x decreases gradually. When  $d_2 = d_1$ , x = 0; i.e.  $v_2$ 538 is no longer a relay candidate for  $v_1$ , since they are the same 539 540 distance away from b. In Fig. 4(b),  $p_1$  and  $p_2$  are the power 541 consumption of  $v_1$  and  $v_2$  without relaying, respectively. To minimize the power consumption at  $v_1$ , 542

$$x = 1$$
 543  
544

$$\rho = \sqrt{2} - 1$$
 (6) 545 546

and min  $p_1(1) = [(2 - \sqrt{2})d_1]^2$ . When x = 1, to minimize the total power consumption  $p_1(x) + p_2(x)$  at  $v_1$  and  $v_2$ ,

$$p_1(1) + p_2(1) = (d_1 - d_2)^2 + 2d_2^2 = 3\left(d_2 - \frac{d_1}{3}\right)^2 + \frac{2d_1^2}{3}, \quad \begin{array}{c} 549\\ 550\\ 551\end{array}$$

i.e.  $\min\{p_1(1) + p_2(1)\} = 2d_1^2/3$  when

$$f x = 1$$
 554  
(7) 555

$$\left( \rho = \frac{1}{3} \right)$$
(7) 556
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Eqs. (6) and (7) can be used to locate the best relay for an AN 558 to minimize its own or the total power consumption for the 559 AN and its relay, respectively. These equations can also be 560

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J. Pan et al. / Computer Communications xx (xxxx) 1–13



Fig. 4. Relay ratios in one-dimension relaying; (a) relay routes, and (b) relay ratio x vs.  $\rho = d_2/d_1$ .

used to assist the SN/AN cluster placement process when dedicated relay nodes are introduced to further increase the network lifetime for a deployed WSN.

### 3.1.2. Two-dimension relaying

Unfortunately, determining relay routes and data ratios on a plane becomes much more complicated. We will use Linear Programming (LP) to obtain the two-dimension relay allocation. Since there are in total  $N^2$  possible relay routes, the computational complexity may become an obstacle when N is large. Therefore, we shall develop some criteria to preselect the relay candidates for an AN, so that the LP complexity is affordable.

Consider a homogeneous WSN of ANs with unit r and e, as shown in Fig. 5(a), there are several possible criteria for an AN  $\nu_1$  to choose its relay candidate  $\nu_2$ .

- (c1) Closer to  $v_1$  than b:  $v_1$  does not choose an AN which is indeed farther away from  $v_1$  than b; i.e.  $d_1 > d_{1,2}$  is required for  $v_2$  to be a relay candidate for  $v_1$ .
- (c2) Relay toward b:  $v_1$  does not choose an AN which is farther away from b than  $v_1$ ; i.e.  $d_1 > d_2$  is required for  $\nu_2$  to be a relay candidate for  $\nu_1$ .

(c3) Energy conservativeness: optionally,  $v_1$  does not choose  $v_2$  as its relay if the energy saving at  $v_1$  cannot compensate the extra overhead  $(\hat{p}_2)$  at  $\nu_2$ ; i.e.  $p_1 - p_2$  $p_{1,2} > \hat{p}_2$  is required for  $\nu_2$  to be a relay candidate for  $v_1$ .

The first criterion (c1 in Fig. 5(a)) excludes any ANs that are actually farther away to reach for  $v_1$  than to b. The second criterion (c2) excludes any ANs that are farther away from b than  $v_1$ : since under the e and r assumptions, they are more *critical* than  $v_1$ . The last criterion (c3) is optional and only applicable when ANs need to conserve total energy consumption as well. c1 and c2 do not alter the optimality of network lifetime for homogeneous WSNs, but c2 has such potential when the initial energy and data rate among ANs are significantly different. When preselecting relay candidates, which criteria are used to filter out bad relays depends on specific applications. Here, we adopt c1 and c2.

Table 2 outlines an algorithm in Tcl-like pseudo code to preselect relay candidates and form relay routes for WSNs. Initially, the relay candidate set RC is empty (line 1), and a non-relayed set NR is built (line 3) and then sorted (line 4)



Fig. 5. Relay criteria and routes in two-dimension relaying; (a) relay candidate criteria, and (b) possible relay routes.

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1	set RC NULL
2	foreach v in VN
3	lappend NR {v dv}
4	set NR [lsort -index 1 NR]
5	while NR
6	set v [lindex NR 0 1]
7	foreach r in RC
8	ifr(R(v)
9	lappend RR_v {vr0}
10	set NR [lrange NR 1 end]
11	lappend RC v

by the distance between ANs and the BS. For the first AN  $\nu$ 686 (line 6) in NR, we examine whether there is a relay 687 candidate r for this AN in RC (line 8) according to the 688 chosen criteria  $\mathcal{R}$ . If so, the relay route {vr0} is added to 689 the relay route set RR. After all ANs in RC have been 690 examined, v is removed from NR (line 10) and added to RC 691 (line 11). When NR becomes empty, RR contains all 692 possible relay routes under the chosen criteria. Since there 693 are N ANs, and each AN can be a relay for other ANs, the 694 time complexity for this algorithm is  $O(N^2)$ . However, it is 695 much better to have this preselecting process, instead of 696 leaving the complexity for LP, as we shall see soon. 697 Fig. 5(b) gives all possible relay routes for the sample WSN 698 with the chosen criteria c1 and c2. 699

After obtaining the possible relay routes, we need to 700 determine the amount of data relayed through each route, as 701 we did with the relay ratio x in Section 3.1.1. The relay 702 routes and their data rate are referred to as a feasible relay 703 rate allocation. The allocation is optimal if network lifetime 704 can be maximized with such an inter-AN relaying 705 arrangement. 706

#### 708 3.2. Parallel relay routes

710 To obtain an optimal relay allocation, we first assume 711 that an AN has the capability to transmit data to multiple 712 relay candidates simultaneously (or *parallel* relaying).

713 Assume AN  $\nu$  relays for ANs  $\{v_1^r, v_2^r, ..., v_m^r\}$ , and  $\nu$  has its 714 own relay candidates  $\{v_1^t, v_2^t, \dots, v_n^t\}$ .  $\nu$  generates a bit-stream 715 at rate r itself, and relays for  $v_i^r$  at  $r_i^r$ . It then transmits an 716 outgoing stream at  $r_i^t$  to its relay candidate  $v_i^t$ . Therefore, 717

$$\sum_{i=1}^{718} \sum_{i=1}^{m} r_i^r + r = \sum_{j=1}^{n} r_j^t,$$
(8)

i.e. the rate of incoming streams plus the rate of self-721 generated stream should equal to the rate of outgoing 722 streams, as all local-views should be sent to the BS 723 724 (aggregation is application-specific and not considered 725 here). This property is referred to as *flow conservation*.

Let e be the initial energy that  $\nu$  has, and  $\varepsilon$  be the 726 remaining energy that  $\nu$  has when the WSN fails to carry on 727 its mission.  $e - \varepsilon$  is the energy to receive flows from  $v_i^r$  at  $r_i^r$ 728

and to transmit flows to  $v_i^t$  at  $r_i^t$  throughout network lifetime 729 R. Let  $p_i^r$  and  $p_i^t$  be the power consumption at v to receive 730 and transmit these flows, respectively. We have

$$R\left(\sum_{i=1}^{m} p_i^r + \sum_{i=1}^{n} p_j^r\right) + \varepsilon = e.$$
732
733
734

$$\left(\sum_{i=1}^{r}\sum_{j=1}^{r}\sum_{j=1}^{r}\right)$$
734
735

This property is referred to as *energy conservation*. When 736 the network fails to carry on its mission, the remaining 737 energy  $\varepsilon \ge 0$ . This equation can be further rewritten as 738

$$\frac{\sum_{i=1}^{m} p_i^r + \sum_{j=1}^{n} p_j^t}{e} + s = \frac{1}{R},$$
(9)
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where  $s = (\varepsilon/eR) \ge 0$  is treated as a *slack* variable.

Now, we can formulate a constrained optimization 743 744 problem with the objective of maximizing the network 745 lifetime R, i.e.

$$\min \frac{1}{R} = \frac{\sum_{j=1}^{m} p_{j,1}^{r} + \sum_{k=1}^{n} p_{1,k}^{t}}{e_{q}} + s_{1}$$
(10) (10)

with the following constraints at each AN  $v_i$ 

$$\left(\sum_{j=1}^{m} r_{j,i}^{r} + r_{i} - \sum_{k=1}^{n} r_{i,k}^{t} = 0\right)$$
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$$ST \left\{ \sum_{i=1}^{m} p_{j,i}^{r} + \sum_{k=1}^{n} p_{i,k}^{t} \right\}, \qquad (11) \quad 754 \quad (11) \quad 754 \quad (11) \quad 754 \quad (11) \quad 755 \quad 755 \quad (11) \quad 755 \quad 755$$

$$\left(\frac{\sum_{j=1}^{r} e_{j,i} + \sum_{k=1}^{r} e_{i,k}}{e_{i}} + s_{i} - \frac{1}{R} = 0\right)$$
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757

where  $r_i$  and  $e_i$  are the data rate and initial energy that  $v_i$ 758 generates and carries, respectively. In this formulation, we 759 have N flow conservation constraints and N energy 760 conservation constraints, i.e. 2N constraints in total (term 761 1/R can be removed from (11) by linking energy constraints 762 at any two nodes, which results an equivalent standard LP 763 formulation with 2N-1 resultant constraints in total, and 764 can be solved by applying regular LP-solving techniques). 765

If we did not preselect relay candidates in Section 3.1, we 766 have  $N^2$  relay routes (including the final routes to the BS). 767 These variables will add considerable computational over-768 head when we solve this problem. In other words, the 769 problem formulation has a high complexity, despite the fact 770 that LP itself is expensive to solve in time complexity. Since 771 we cannot reduce the number of constraints, we try to reduce 772 the number of total variables (routes). According to c2, if  $v_i$ 773 chooses  $v_i$  as its relay,  $v_i$  should not choose  $v_i$  as its relay, since 774 it is energy-inefficient to bounce traffic between AN/BSs; i.e. 775 there are at most (N(N+1))/2 preselected relay routes. With 776 the criteria adopted in Section 3.1.2, we can further reduce 777 the number of considered routes, as we shall see shortly. 778

Table 3 gives the optimal relay rate allocation with the 779 preselected relay candidates. Blank entry in  $r_{i,j}$  denotes the 780 routes not in the RR set, and 0 denotes the routes in the RR 781 set but not in the optimal relay allocation set. Since self-782 relay is not energy-conscious, it is denoted by-in Table 3. 783 Positive  $r_{i,j}$  is the actual relay allocation when network 784

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Table 4

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J. Pan et al. / Computer Communications xx (xxxx) 1-13

ı	$r_i$	$r_{i,1}$	$r_{i,2}$	<i>r</i> <sub><i>i</i>,3</sub>	$r_{i,4}$	$r_{i,5}$	$r_{i,6}$	$r_{i,7}$	<i>r</i> <sub><i>i</i>,8</sub>	<i>r</i> <sub><i>i</i>,9</sub>	$r_{i,10}$	$r_{i,b}$	$e_i$	$\varepsilon_i$	$p_i$	$l_i$
1	1	-			1.386				0			0	1	≈0	≈0.119	≈8.420
2	1	0	-	0.386	0	0			0			0.164	1	0	0.119	8.420
3	1	0		-	1.386				0			0	1	0.033	0.086	11.609
4	1				-				0			4.501	1	0	0.119	8.420
5	1	0.386		0	0.506	-			1.107			0	1	0.065	0.054	18.47
6	1						-					1.495	1	0	0.119	8.420
7	1							-				2.230	1	0	0.119	8.420
8	1								-			1.107	1	0.100	0.018	54.359
9	1				0.222			0.778		-		0	1	0	0.199	8.420
		~	0.8 - 0.6 - 0.4 - 0.2 -	10	78		- 	node ID	8 7 6 5 4 3 2	<u>}</u>	~					
			0.2				2			×						
			0	0.2	0.4	U.6 (	J.O 1		05	10 1	5 20 25	30 35 4	0 45	50 55 60		
					Х							ime				

lifetime is maximized. A quick statistics can tell that among all 100 relay routes, there are 29 preselected relay routes, and LP finally chooses 16 optimal relay routes, which are shown in Fig. 6(a), for the maximized network lifetime of 8.420 unit time. ANs with the shortest lifetime in Fig. 3(b), i.e. { $\nu_2,\nu_9,\nu_{10}$ }, now have a longer lifetime by transmitting a portion of their data to nearby ANs, at the cost of other ANs such as { $\nu_1,\nu_4,\nu_8$ } having a shorter lifetime, as shown in Fig. 6(b).

Table 4 compares the overhead of the regular LP formulation and the enhanced one with preselected routes. They both have 20 constraints, i.e. one flow and one energy conservation for each AN. For the regular LP formulation,

870 there are 100 considered relay routes, while for the 871 enhanced LP, only 29 routes are considered after the 872 preselection process. The number of relay routes is related 873 to the number of total variables in the LP formulation. The 874 more variables, the higher overhead to solve the problem. 875 With the regular LP, it takes 51 iterations to find the optimal 876 allocation, while with the enhanced LP, it only takes 21 877 iterations. They both obtain the optimal relay allocation 878 with the same network lifetime. With the preselection 879 process, we can considerably speed up the LP problem-880 solving process, as indicated in Table 4. 881

Table 5 lists the topological network lifetime achieved through random BS location (by exhaustive grid search),

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	# Constraints	# Variables	# Iterations	Max $R_N$
Regular LP	20	100	55	8.420
nchanced LP	20	29	21	8.420
able 5 omparison on randon	n optimal base station location v	with optimal relay allocation		
ble 5 omparison on randon	n optimal base station location v	with optimal relay allocation		
able 5 omparison on randon	n optimal base station location v Random <i>b</i>	with optimal relay allocation	Optimal <i>b</i>	Optimal b
able 5 omparison on randon	a optimal base station location v Random <i>b</i> Median	with optimal relay allocation Maximum	Optimal <i>b</i> w/o optimal relay	Optimal <i>b</i> w/optimal relay

978

optimal BS location without relaying, and optimal BS 897 location with optimal relay allocation. It shows the 898 substantial efficacy of the proposed topology control 899 approaches. The *N*-of-*N* topological lifetime with inter-AN 900 relaying is denoted as R, and L without inter-AN relaying. 901 For the sample WSN, the optimal BS location with optimal 902 relay allocation can improve network lifetime by 445% over 903 the random BS location without relaying, and by 50% over 904 the optimal BS location without optimal relay allocation. 905

ANs  $\{\nu_2, \nu_4, \nu_6, \nu_7, \nu_9, \nu_{10}\}$  are critical and run out of energy 906 first in the optimal relay allocation of the sample WSN. It is 907 908 worth pointing out that for non-critical ANs  $\{v_1, v_3, v_5, v_8\}$ , their feasible relay allocation can be different from the one 909 shown in Fig. 6(a) and Table 3, unless they become critical 910 nodes themselves. In addition, the optimal relay allocation 911 912 may not be unique due to different initial LP solutions, but they all give the same network lifetime. 913

### 915 916 3.3. Serialized relay schedule

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917 The parallel optimal relay allocation obtained in Section 918 3.2 requires that ANs always have the capability to transmit 919 data to multiple relaying ANs simultaneously. This require-920 ment can impose a technical challenge to the radio 921 transceiver design when a transmitter can only tune to a 922 specific time slot, frequency band, or code sequence at any 923 time. Therefore, it is necessary to derive a *serialized* relay 924 time schedule, so that an AN transmits its data to exactly one 925 node (AN or BS) at any time. At a predetermined time, the 926 AN switches its time slot, frequency band, or code sequence, 927 and communicates with the next relay node. Since the 928 turnaround operation is also expensive, we expect at most one 929 *switch* per each relay node throughout network lifetime. 930

The proposed serialization algorithm is based on relay 931 energy allocation, not relay rate, power, or time allocation. 932 Although energy allocation is an integral of power and time 933 allocations, only energy (data) allocation is an invariant 934 during the serialization process, as shown in Fig. 2. In a 935 parallel relay rate allocation, an AN  $v_i$  transmits a stream at 936 rate  $r_1$  to its relay node  $v_1$ ,  $r_2$  to  $v_2$ , and so on. e and  $\varepsilon$  have 937 the same definition as that in Section 3.2. Throughout 938 network lifetime R, the energy allocation (or *quota*) for  $v_k$  at 939  $v_i$  is 940

$$\phi_{i,k} = \frac{(e-\varepsilon)p_{i,k}}{p_{i,1} + p_{i,2} + \dots + p_{i,m}},$$
(12)

where  $p_{i,k}$  is the power for  $v_i$  to send a stream at  $r_k$  to  $v_k$ .

During network lifetime R, AN  $v_i$  has the flexibility to 945 choose which relay to use at a certain time and how long it 946 uses the relay, as long as the flow conservation and the 947 energy quota are both satisfied. For example, once the WSN 948 949 is initialized,  $v_i$  can randomly pick an AN  $v_1$  in its relay set, and transmit all data it has, including the data it generates 950 and the data relayed for others, until it exhausts the energy 951 quota  $\phi_{i,1}$  for  $\nu_1$ .  $\nu_1$  will be removed from the relay set. Then, 952

 $v_i$  picks another unchosen node  $v_2$  in its remaining relay set and exhausts the energy quota  $\phi_{i,2}$  for  $v_2$ . This process repeats until the relay set becomes empty. No matter in which order the relay nodes are chosen,  $v_j$  always achieves the same node lifetime; therefore, the WSN achieves the same network lifetime.

Table 6 outlines the approach to obtain the serialized 959 relay schedule. Procedure  $addr{v dr}$  is used when an 960 AN  $\nu_i$ , which  $\nu$  relays data for, changes its data relayed from 961  $v_i$  to v by  $\Delta r$ . If v is the BS, such change has no impact, since 962 b is not energy-constrained (line 2). Otherwise,  $\nu$  cancels its 963 next switch event (line 4) and sets up a new one (line 9), 964 according to the remaining energy quota of its current relay 965 966  $\nu_2$  and the updated outgoing data rate  $r_t$ . This procedure is called for  $\nu_2$  and its current relay recursively. 967

968 switch  $\{v\}$  determines the actual relay *time* schedule. It is 969 called when the current relay  $\nu_2$  has exhausted its energy 970 quota. Therefore, relay  $v_2$  is updated by addr{v2 -rt} (line 14) since the data rate from  $\nu$  to  $\nu_2$  drops from  $r_t$  to 0. 971 972 Then, the next relay node for  $\nu$  is retrieved from the relay 973 list, and a new switch event is set up according to the energy 974 quota for the new relay and the current outgoing date rate of 975  $\nu$ . For the new relay  $\nu'_2$  and its relays, addr is called 976 recursively (line 20) since the data rate from v to  $v'_2$  jumps 977 from 0 to  $r_t$ .

Table 6 Algorithm t	o calculate relay schedule	
1	proc addr {v dr}	
2	if v==b	
3	Return	
4	cancel switch v	
5	set v2 [lindex EQ_v 0 1]	
6	set e2 [lindex EQ_v 0 2]	
7	update e2 in EQ_v	
8	set rt [expr rt+dr]	
9	at now $+ \frac{e_2}{p(r_t, d_{v,v_2})}$ switch v	
10	addr v2 dr	
11	Endproc	
12	proc switch {v}	
13	set v2 [lindex EQ_v 0 1]	
14	addr v2rt	
15	set EQ_v [lrange EQ_v 1 end]	
16	set v2 [lindex EQ_v 0 1]	
17	set e2 [lindex EQ_v 0 2]	
18	at now $+\frac{c_2}{p(r_t,d_{v,v_2})}$ switch v	
19	lappend RS {now v v2}	
20	addr v2 rt	
21	Endproc	
22	Foreach v VN	
23	set ps 0	
24	Foreach {vtrr} RR_v	
25	set rs [expr ps+pt(rr,dt)]	
26	set eq $(e-\varepsilon)$ /ps	
27	Foreach {vtrr} RR_v	
28	lappend EQ_v {vteq·pt}	
29	set EQ_v [lsort -ran 1 EQ_v]	
30	set EQ_v [concat { } EQ_v]	
31	Foreach v VN	
32	switchv	

### 



Code from line 22 to 28 calculates the energy quota (EQ) 1024 for each relay of a given node  $\nu$ , according to the output of 1025 the candidate preselection in Section 3.1 and the rate 1026 allocation in Section 3.2. When applicable, line 29 1027 randomizes relays in the list, so that it is less likely that 1028 multiple ANs choose the same AN as their relay at the same 1029 time. Line 30 intentionally prefixes a *dummy* relay at the 1030 beginning of the EQ list, so that we can issue a pseudo 1031  $switch{v}$  at network initialization and switch from the 1032 *dummy* relay to a *real* relay in  $V_N$ . Assume that add{v r} 1033 have the complexity O(1), then each switch {v} has the 1034 complexity O(N) since a relay path at most has N-11035 intermediate relays to b. Therefore, the total time complex-1036 ity to obtain the relay schedule is O(N|RR|). This schedule 1037 can actually be calculated in a distributed manner at each 1038 AN, if b dispatches the energy quota by (1) to ANs directly, 1039 unless the relay schedule needs to be coordinated with the 1040 mission schedule at *b*. 1041

Fig. 7(a) plots the resultant serialized relay schedule. The 1042 numbered cross denotes when an AN chooses another node 1043 as its new relay, and the unnumbered cross denotes when the 1044 AN serves as a relay for other ANs and the incoming data rate 1045 changes. For example, at network initialization,  $v_{10}$  chooses b 1046 as its relay for 0.446 unit time. When its remaining energy 1047 drops to 0.918 unit,  $v_{10}$  has used up the energy quota for b and 1048 switches to the next relay  $v_6$ . At 4.616 unit time,  $v_{10}$  has used 1049 up the quota for  $v_6$ , and switches to  $v_7$  until at 8.420 unit time 1050

the network fails to carry on its mission due to multiple ANs (including  $\nu_{10}$ ) out of energy.

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1081 Although AN  $\nu_7$  does not change its relay (the BS) 1082 throughout network lifetime, its power consumption also 1083 changes due to different ANs using it as their relay. During 1084 [0,1.873] unit time, no other ANs use  $\nu_7$  as a relay;  $\nu_7$  has the 1085 least power consumption for an outgoing stream at 1 unit rate. 1086 Then at 1.873 unit time,  $v_9$  starts to use  $v_7$  as its relay. 1087 Therefore,  $\nu_7$  begins to have a higher power consumption (or 1088 a quicker drop of its remaining energy) with a two-unit 1089 outgoing flow. After 4.616 unit time, both  $v_9$  and  $v_{10}$  use  $v_7$  as 1090 their relay.  $\nu_7$  now has the highest power consumption in its 1091 lifetime for a three-unit outgoing flow. At 8.420 unit time,  $v_7$ 1092 exhausts its energy, and at the same time the entire network 1093 fails to carry on its mission. Fig. 7(b) gives a snapshot of the 1094 relay schedule for the sample WSN at t=2.0 unit time. The 1095 arrow of lines shows the direction of relayed flows; the line 1096 width implies the data rate. For serialized relaying, at any 1097 time,  $V_N$  always forms a tree rooted at the BS. 1098

A certain amount of energy quota allocated for  $v_k$  at v1099 represents the amount of data transferred from  $\nu$  to  $\nu_k$ . Since 1100 the total energy and energy quota for each relay are identical 1101 in either parallel or serialized relaying, the amount of data 1102 transferred should also be the same. A formal proof of this 1103 equivalency was given in [17]. Therefore, an AN has the 1104 same lifetime with parallel or serialized relaying, as shown 1105 in Fig. 8(a) for AN  $\nu_7$ . With parallel relaying, the remaining 1106



Fig. 8. Equivalency between parallel and serial relay  $(\nu_7)$ ; (a) node remaining energy, and (b) node power consumption.

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1121 energy at  $\nu_7$  decreases at a constant rate throughout its node 1122 lifetime. With serialized relaying, the remaining energy at 1123  $\nu_7$  decreases at different rates according to its current power 1124 consumption shown in Fig. 8(b). Although the remaining 1125 energy curves for parallel and serialized relaying are 1126 different most of the time, they meet again when  $t=R_N$ . 1127

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### 1129 **4. Further discussions**

We have developed approaches to obtain the optimal
relay rate allocation and time schedule if inter-AN relaying
is feasible, acceptable, and favorable, in order to maximize
the topological lifetime of a WSN with a certain amount of
initial energy provisioning. In this section, we further
discuss the applicability and extensibility of these proposed
approaches in a more practical context.

4.1. Topology control process1140

1141 Fig. 9 illustrates the relationship among these approaches 1142 and their positions in the whole topology control process. 1143 Given a geographical coverage C, the information source S, 1144 and the expected network lifetime  $\mathcal{T}$ , the first step is to 1145 collocate SN/AN clusters V with S, which gives a proper 1146 coverage [18]. With the incremental cluster grouping 1147 techniques, some SN/AN clusters are then grouped into a 1148 WSN partition  $V_N$  that is served by a common BS. The BS is 1149 then located optimally for a WSN partition so that the 1150 network lifetime L, according to N-of-N or other lifetime 1151 definitions, is maximized even without inter-AN relaying. If 1152  $L \geq \mathcal{T}$ , the topology control process exits with the optimal 1153 BS location.

1154 If  $L < \mathcal{T}$ , topology control can either adjust the SN/AN 1155 cluster partition, or request more BSs. If inter-AN relaying 1156 is application desirable, energy favorable, and most 1157 importantly, system feasible, topology control can also 1158 invoke the approaches in Section 3.1 to preselect relay 1159 candidates. With the LP approach in Section 3.2, network 1160 lifetime can be prolonged to R. If  $R \ge \mathcal{T}$ , this relay allocation 1161 is acceptable and will be converted into a serialized relay



COMCOM 2727-12/2/2005-13:46-SHYLAJA-134825-XML MODEL 5 - pp. 1-13

schedule, according to the approach developed in Section 1177 3.3. Then, topology control exits with both the optimal BS 1178 location and optimal relay schedule. 1179

However, if  $R < \mathcal{T}$ , topology control has to rely on its last 1180 two resorts: more BSs or dedicated relay nodes. Although 1181 we did not address the node placement and partition 1182 problem in this paper, the relay candidacy criteria in 1183 Section 3.1 can assist the process of deciding, where to place 1184 the additional dedicated relay nodes. It turns out that 1185 topology control actually is an interactive process with 1186 multiple iterations. During the course of network operation, 1187 nodes may fail and be substituted by other nodes, and the 1188 mission may get extended. These changes require a revisit 1189 of some building blocks in the topology control process 1190 depicted in Fig. 9. 1191

### 4.2. Practical considerations

In the previous discussions, we focused on the distance-1195 related portion of power consumption and its role in 1196 topology control. In a practical WSN, other non-distance-1197 related power consumptions may become non-negligible, 1198 e.g. the energy consumed within the transmitter or receiver 1199 circuit, as well as in the data processing and view 1200 composition components. Node homogeneity may not 1201 always be guaranteed, especially when we consider the 1202 WSN redeployment scenarios (i.e. new nodes join the 1203 network long after old nodes have been initialized and 1204 activated). Also, transmission power consumption may take 1205 a path loss exponent greater than two and include other 1206 portions to combat multi-path, shadowing, interference and 1207 other effects. A third geometry dimension may be 1208 introduced when node elevation varies considerably. 1209

The approaches proposed in this paper are extensible to 1210 accommodate these challenges. For the relay candidates 1211 selection, instead of the Euclid distance used in criteria 1212  $\{c1, c2, c3\}$  in Section 3.1, we can replace it by: how 1213 expensive, in terms of node lifetime, it is for a node to use a 1214 relay. For example, a node should not choose the node that 1215 is more expensive than b as its relay. Within this schema, 1216 the LP formulation is similar, and we can still obtain the 1217 optimal relay allocation. The serialization process is based 1218 on the actual energy quota, so it will not be challenged by 1219 heterogeneity in practice. ANs count the energy consumed 1220 for the current relay, and switch to another relay when the 1221 energy quota for the current one has been exhausted, while 1222 non-transmission-related energy consumption can be set 1223 aside early. 1224

The proposed approaches on inter-AN relaying arrange-1225 ment, along with other blocks in topology control such as 1226 SN/AN/BS placement and partition, give us the capability to 1227 maximize network lifetime topologically. Although we 1228 assumed that topology control is done before network 1229 initialization in this paper, further improvement can be 1230 introduced by adaptively updating topology control 1231 throughout the entire mission. For example, the BS can 1232

have certain mobility, and may change its location when 1233 some ANs are dead or about to run out of energy. Here, we 1234 adopt a two-stage approach: locate the BS first; then arrange 1235 1236 inter-AN relaying optimally. Another attempt can allow the BS to change its location while rearranging inter-AN 1237 relaying to achieve an even longer network lifetime. At 1238 each step, the approaches proposed to obtain the optimal 1239 relay arrangement still apply. 1240

#### 1241 1242

### 1243 5. Related work

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MANETs and regular WSNs have attracted intensive 1245 research interest in recent years. A comprehensive survey on 1246 WSNs can be found in [10] and the references therein. The 1247 1248 research challenges and directions for MANETs can be found in [11]. Although two-tiered WSNs have many aspects 1249 in common with MANETs and regular WSNs, its tiered 1250 structure and mission-driven nature bring in some unique 1251 characteristics. For example, most research activities in 1252 1253 WSNs assume a dense and microsensor deployment. 1254 Microsensors have very limited energy provisioning to capture scalar-only data such as temperature and motion 1255 triggered by external events. But for a two-tiered WSN, ANs 1256 are much more capable than ordinary microsensors (SNs), as 1257 they are required to construct and feed live local-views to 1258 BSs when they are activated. With the considerable coverage 1259 of a single SN/AN cluster, there is no need to have a very 1260 dense deployment of SN/AN clusters (generally, SN/AN 1261 clusters are placed with the proximity of designated areas). 1262 Due to this sparse deployment, the inter-AN distance is 1263 1264 comparable with the dimension of coverage, and scalability is manageable even with a few BSs and a certain number of 1265 ANs. Based on these facts, the lifetime of an AN is dominated 1266 by its distance-related communication power consumption. 1267 Therefore, topology control that determines the distance 1268 1269 from ANs to BSs and chooses relay candidates according to the inter-AN distance, plays a vital role in maximizing the 1270 topological network lifetime of WSNs. 1271

There are a few lifetime and topology-focused research 1272 activities in the literature. The lifetime upper bound of 1273 1274 information harvest sensor networks that convey probabilistic data from a point, a line, or an area source is derived in 1275 [19]; simulation-based evaluations to validate the tightness 1276 1277 of the derived bound are also given there. In [20], the optimal role assignment is further explicitly formulated as a 1278 maximal network flow problem, again in data harvest 1279 networks. In our context, instead of harvesting from 1280 probabilistic information sources, when being activated, 1281 WSNs should consistently offer an in-situ, real-time, and 1282 steady global-view of the whole network. In [21], a family 1283 of flow augmentation algorithms, which redirect data flows 1284 1285 among nearby nodes to balance their energy consumption in a distributed but empirical manner, is presented. Our 1286 approach is a centralized one due to the application nature 1287 of WSNs. After the BS is located, if inter-AN relaying is 1288

feasible, we first select relay candidates and then obtain the 1289 optimal parallel relay allocation. In contrast to previous 1290 work in this area, we further convert the relay allocation to a 1291 serialized relay schedule with the equivalent optimality, and 1292 allow ANs to choose their relays locally according to energy 1293 quota. Therefore, an AN only needs to have one relay 1294 destination at any time. In some two-tiered WSNs, BSs can 1295 further have certain mobility (e.g. mounted on vehicles), 1296 and have sophisticated processing and storage capabilities 1297 to accommodate the centralized topology control and other 1298 functionalities. 1299

Other topology-related research mainly focused on 1300 multi-hop routings in WSNs. For example, [22] considered 1301 fixed topologies of  $\{4,6,8\}$ -neighbor on a two-dimension 1302 plane and 6-neighbor in a three-dimension space, and 1303 proposed a power-aware routing scheme to reduce the total, 1304 and even the per-node, power consumption. In this paper, 1305 we consider an arbitrary node placement on a plane, without 1306 any geometrical constraints on the node neighborhood. In 1307 practice, the location of SN/AN clusters is determined by 1308 specific missions, not by topology control. [23] considered 1309 adjusting the transmitter output power to create a desired 1310 topology for connectivity and bi-connectivity; it also 1311 observed that a poor topology can only offer a small 1312 fraction of the achievable lifetime, but they focused on 1313 multi-hop networks without any common sinks like those in 1314 WSNs. [24] proposed a sparse topology and energy 1315 management (STEM) technique that aggressively puts 1316 nodes in sleep mode and only wakes them up when they 1317 are needed to forward data; it also explored the equivalency 1318 of nearby nodes for data forwarding. However, in two-tiered 1319 WSNs, due to their application characteristics, once being 1320 activated, the already-sparsely-deployed ANs usually can-1321 not be forced into sleep. Otherwise, the designated local-1322 views are lost. [25] proposed a distributed cone-based 1323 topological control to maintain the global connectivity with 1324 minimum power paths in multi-hop ad hoc networks. [26] 1325 considered a distributed algorithm to determine whether a 1326 node should be awake or asleep, depending on how many of 1327 its neighbors will get benefit and how much remaining 1328 energy it has. The focus in these work, i.e. the purpose of 1329 topology control, is different from the one that we have in 1330 this paper. Instead of minimizing the power consumption 1331 for individual nodes or along a forwarding path, we 1332 minimize the power consumption of those critical ANs 1333 that dominate the lifetime, or utility, of the entire WSN. 1334 Overall, the WSNs under our consideration are BS-centric 1335 with multi-hop inter-node relaying, where SN/AN clusters 1336 with a certain amount of initial energy are sparsely deployed 1337 in designated areas without significant redundancy. 1338

### 6. Conclusions

In this paper, we have proposed approaches to obtain the optimal relay allocation to maximize the topological 1339 1340 1341

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lifetime of a WSN with a certain amount of initial energy 1345 provisioning, when inter-node relaying is application-1346 desirable and energy-favorable. We also converted the 1347 1348 parallel relay rate allocation into a serialized relay time schedule so that any node only needs to have one relaying 1349 node at any time. Experimental evaluations have demon-1350 strated the efficacy of topology control as a vital process for 1351 two-tiered WSNs, and they also validated the optimality of 1352 proposed approaches. 1353

For future work, the main focus will be on the other few building blocks in the topology control diagram shown in Fig. 9: node placement and partition techniques, and their impact on the BS location and inter-node relaying arrangement. Others scenarios, such as dynamic deployment and redeployment, as well as hierarchical and heterogeneous WSNs, can also be taken into consideration.

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