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# 2 Meshed multipath routing with selective forwarding: 3 an efficient strategy in wireless sensor networks ☆

4 Swades De <sup>a,\*</sup>, Chunming Qiao <sup>b</sup>, Hongyi Wu <sup>c</sup>

5 <sup>a</sup> Department of Electrical Engineering, State University of New York at Buffalo, Buffalo, NY 14260, USA

6 <sup>b</sup> Department of Computer Science and Engineering, State University of New York at Buffalo, Buffalo, NY 14260, USA

7 <sup>c</sup> The Center for Advanced Computer Studies, University of Louisiana at Lafayette, Lafayette, LA 70504, USA

## 8 Abstract

9 Due to limited functionalities and potentially large number of sensors, existing routing strategies proposed for mobile  
10 ad hoc networks are not directly applicable to wireless sensor networks. In this paper, we present a *meshed multipath*  
11 *routing* (M-MPR) protocol with *selective forwarding* (SF) of packets and end-to-end *forward error correction* (FEC)  
12 coding. We also describe a meshed multipath searching scheme suitable for sensor networks, which has a reduced  
13 signaling overhead and nodal database. Our performance evaluations show that (1) M-MPR achieves a much improved  
14 throughput over conventional disjoint multipath routing with comparable power consumption and receiver complexity;  
15 (2) to successfully route a message using FEC coding, selective forwarding (SF) consumes much less network resources,  
16 such as channel bandwidth and battery power, than packet replication (or limited flooding).  
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18 *Keywords:* Sensor network; Meshed multipath; Selective forwarding; Forward error correction coding; Load balancing

## 19 1. Introduction

20 Miniaturization of processing and memory devices and their affordable cost have opened up a  
21 new paradigm of remote information access and control using sensor networks [2,7,10]. A wireless  
22 sensor network is similar to mobile ad hoc networks, but it differs from them in that the sensors  
23  
24  
25

26 have much reduced capabilities, such as limited 26  
27 transmission range, limited or no mobility, and 27  
28 limited battery power [1]. In addition, in many 28  
29 applications, such as remote field status monitor- 29  
30 ing, the field sensors may be located close to 30  
31 ground, thus causing ground wave absorption. 31  
32 Also, multiuser interference caused by densely 32  
33 populated sensors may lead to a high packet error 33  
34 rate. Therefore, existing MANET routing ap- 34  
35 proaches (e.g., [8,11,15,22,26,28]) may not work 35  
36 well, and new techniques need to be developed. 36

37 While retransmissions can be used to recover 37  
38 from data loss, basic sensors may not have enough 38  
39 storage space to save the collected information for 39  
40 necessary retransmission. Moreover, hop-by-hop 40  
41 retransmission based on either promiscuous lis- 41

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\* Corresponding author. Tel.: +1-716-645-5084x15; fax: +1-716-645-3464.

E-mail addresses: swadesd@cse.buffalo.edu (S. De), qiao@cse.buffalo.edu (C. Qiao), wu@cacs.louisiana.edu (H. Wu).

42 tening to the neighbor's transmission [15], or ac-  
43 knowledgment (or negative acknowledgment)  
44 from downstream neighbors [13,30] requires ad-  
45 ditional receive power and introduces delay in  
46 trans-to-receive mode changeover. To facilitate  
47 fast and successful end-to-end delivery of infor-  
48 mation, we propose to set up meshed multiple  
49 paths from a source (e.g., a field sensor) to a des-  
50 tination (e.g., a data collection/processing center).

51 Among the possible variants, there are two ways  
52 of effecting disjoint multipath routing (MPR) in  
53 multihop networks: (1) Each packet is sent along  
54 different disjoint routes (see e.g., [3,4,20,23,29]).  
55 The decision on which path to use is made by the  
56 source on a packet-by-packet basis. We will call  
57 such an approach *disjoint (or split) MPR (D-*  
58 *MPR) with selective forwarding (SF)*. (2) Multiple  
59 copies of a data packet are transmitted simulta-  
60 neously along multiple disjoint routes from a  
61 source to a destination (see, e.g., [13,18]). Such an  
62 approach will be called D-MPR with *packet rep-*  
63 *lication (PR)* (or limited flooding). In Section 5,  
64 other related approaches including what we call  
65 *preferential routing*, where one or more secondary  
66 routes that are either disjoint or non-disjoint (also  
67 termed meshed/braided) with the primary route  
68 are kept stand-by to recover from any failure of  
69 the primary route (see, e.g., [8,13,15,24]), will be  
70 described.

71 A forward error correction (FEC) coding  
72 scheme can be adopted in all of the above routing  
73 approaches. When FEC is employed, the second  
74 approach (D-MPR with PR) would require the  
75 minimum code length (and hence the least error  
76 correction overhead), but it may be inefficient with  
77 regard to resource utilization (as more trans-  
78 receive power is wasted and less traffic is served).  
79 The first approach (D-MPR with SF) completely  
80 relies on the end node (e.g., the source) to make a  
81 routing decision for every packet. Due to network  
82 dynamics (such as time-varying number of active  
83 nodes and their locations), the route information  
84 available at an end node may not be up-to-date.  
85 Moreover, in wireless sensor networks, it is not  
86 feasible to exchange the entire network informa-  
87 tion among all nodes. Therefore, the routing de-  
88 cision taken at an end node will not be well-  
89 informed and in fact is prone to be ineffective.

90 In this paper, we aim at reliable and efficient  
91 routing in sensor networks. We present a *meshed*  
92 multipath routing (M-MPR) scheme, which allows  
93 some (if not all) intermediate nodes to have more  
94 than one forwarding direction to a given destina-  
95 tion. In addition, we propose selective forwarding  
96 of packets (SF) where the forwarding decision is  
97 taken dynamically, hop-by-hop, based on the  
98 conditions of downstream forwarding nodes. End-  
99 to-end FEC coding is also used to avoid ac-  
100 knowledgment-based retransmission. A new *mesh-*  
101 *based* multipath searching scheme, which requires  
102 a lower control overhead and a smaller nodal  
103 database than *tree-based* (e.g., in [8,28]) and *se-*  
104 *quential* (e.g., in [13]) searching approaches, is also  
105 described. For completeness, we will touch upon  
106 issues related to mesh-based route discovery and  
107 routing protocols, but our main focus in this paper  
108 will be on the performance evaluation of the pro-  
109 posed M-MPR with the SF strategy, and its  
110 comparison with other approaches such as D-  
111 MPR-SF, D-MPR-PR, and M-MPR-PR.

112 Based on our evaluation, we draw the following  
113 conclusions: (i) In terms of throughput, M-MPR-  
114 SF outperforms D-MPR-SF. (ii) Throughput gain  
115 of M-MPR-SF is greater for longer end-to-end  
116 distance. (iii) To successfully route a message to  
117 the destination, PR has substantially higher re-  
118 source requirements than SF, along either disjoint  
119 or meshed multipaths.

120 The rest of the paper is organized as follows. In  
121 Section 2, our proposed M-MPR with SF scheme  
122 is introduced and the associated mesh-based mul-  
123 tipath searching approach is described. Section 3  
124 contains throughput analyses of M-MPR and D-  
125 MPR with PR and SF, respectively. Numerical  
126 and simulation based performance results in terms  
127 throughput gain, receiver complexity, and battery  
128 power usage are presented in Section 4. Related  
129 work is surveyed in Section 5, and finally, Section  
130 6 concludes the paper.

## 2. Meshed multipath routing

131

132 In this section, the steps for meshed multipath  
133 formation are outlined. Two possible variants of

134 packet forwarding schemes (PR and SF) are also  
135 described.

### 136 2.1. Multipath searching

137 In sensor network applications, such as remote  
138 field status monitoring, the field nodes primarily  
139 need to communicate with a common monitoring  
140 and control center, which could also be a cluster-  
141 head (henceforth called the *controller node*). We  
142 envisage that in such applications, the field sensors  
143 would be mostly stationary, and their location  
144 information can be imparted during the initial  
145 deployment phase via standard trilateration ap-  
146 proach using other GPS-capable nodes [12] or via  
147 the directional beaconing approach described in  
148 [25]. The controller node, which may be capable of  
149 limited movement but is mostly stationary, is  
150 also location aware and can make its location  
151 information known to the field sensors (e.g., via  
152 broadcast or beaconing) whenever it relocates  
153 itself. With the above considerations, a  
154 meshed multipath is set up in the following three  
155 steps.

156 *Acquiring neighborhood information:* Once de-  
157 ployed and localized, each active node broadcasts  
158 its ID, residual battery power, and location in-  
159 formation to local neighbors. Thereby, each active  
160 node gathers the local neighborhood information.  
161 For each active neighbor  $i$ , a node maintains the  
162 following information in its database:  $\{ID_i, loca-$   
163  $tion_i, residual\_power_i\}$ . Note that since the field  
164 nodes are assumed stationary, no periodic update  
165 of neighborhood status is necessary. In other  
166 words, unless there is any change in local neigh-  
167 bors' status, e.g., a node is going into sleep mode  
168 or has just woken up, the local neighborhood  
169 database does not need an update. Any such  
170 change of a node's status is locally broadcast,  
171 based on which of the neighborhood tables of  
172 nearby nodes are updated.

173 *Route discovery:* Based on the current neigh-  
174 borhood database and location information of the  
175 controller node, each of the field nodes tries to  
176 form a meshed multipath to it. To this end, an  
177 intermediate node is allowed to accept (and re-  
178 cord) more than one discovery packet. Typically,

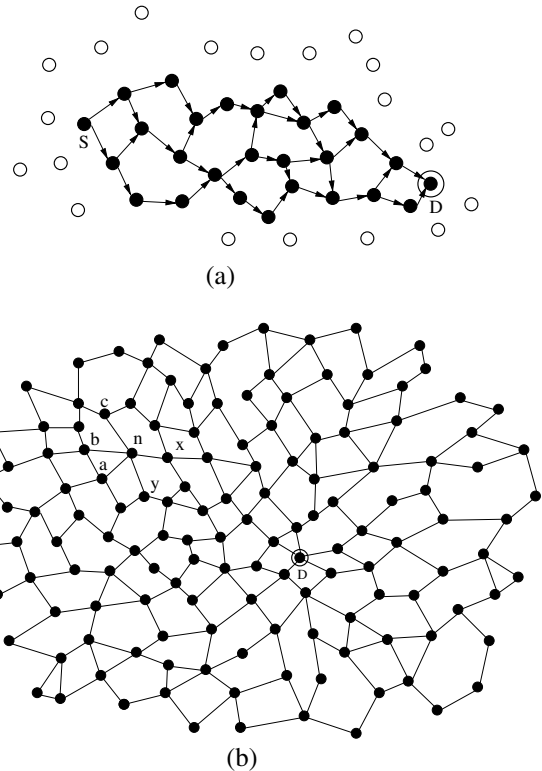


Fig. 1. Pictorial views of meshed multipath: (a) a source-to-destination meshed multipath and (b) meshed topology formed by many-sources-to-a-destination routes.

179 to reduce the receiver complexity<sup>1</sup> and power  
180 consumption of a node, for a source-to-destination  
181 route discovery process, at most *two* copies of a  
182 discovery packet are accepted by an intermediate  
183 node and *one* (the first arrival) is forwarded to  
184 maximum *two* downstream neighbors (see Fig.  
185 1(a)). We choose maximum *two* forwarding nodes  
186 as in [11], where it was observed that a maximum  
187 of two forwarding links at a node allow just en-  
188 ough flexibility for selecting an alternate route  
189 with a minimum possible additional control over-  
190 head.

191 A route discovery packet has the following  
192 fields:  $\{source\_ID, source\_location, intermedi-$   
193  $ate\_node\_ID, next\_node\_ID_1, next\_node\_ID_2, des-$

<sup>1</sup> The receiver complexity of a node is a function of the number of incoming links.

194 *tinatation\_ID, destination\_location, TTL*}. The IDs  
 195 of forwarding nodes (*next\_node\_ID<sub>i</sub>*,  $i = 1, 2$ ), *in-*  
 196 *termediate\_node\_ID*, and *TTL* values are updated  
 197 at each intermediate stage. The *TTL* (time-to-live)  
 198 value is slightly greater than an estimated hop  
 199 count to the destination, which is set such that if a  
 200 discovery packet fails to reach the destination it is  
 201 dropped after the *TTL* expires. Each intermediate  
 202 node maintains the following information in its  
 203 routing database:  $\{previous\_node\_ID_1, \dots, previ-$   
 204  $ous\_node\_ID_n, next\_node\_ID_1, next\_node\_ID_2\}$ .  
 205 Note that since there are many peripheral field  
 206 nodes trying to reach the same destination (the  
 207 controller node), an intermediate node can have  
 208 more than *two* “previous\_node” entries in its  
 209 routing table, although there will be no more than  
 210 *two* “next\_nodes” (see Fig. 1(b)). However, the list  
 211 of “previous\_node” does not grow indefinitely, as  
 212 (i) the number of local neighbors is finite and (ii)  
 213 no new entry in the routing table is made for a  
 214 discovery packet coming from an upstream  
 215 neighbor which is already listed in the list. If an  
 216 intermediate node, which has already forwarded a  
 217 discovery packet to the destination, receives an-  
 218 other discovery packet, it just updates the *previ-*  
 219 *ous\_node* list (for sending back the route reply  
 220 packet) in its routing table and drops the packet. It  
 221 may be noted that in some cases, due to the nodes’  
 222 random placement and/or due to its neighbors’  
 223 states, it is not necessary that all the nodes have  
 224 two forwarding neighbors all the time, although a  
 225 node is (or a group of nodes are) assumed to be  
 226 connected to the rest of the network.

227 An entry in the routing table at a node is  
 228 maintained as a soft-state, which is deleted after a  
 229 time out unless it receives a reply from the con-  
 230 troller node. Since sensor applications are mostly  
 231 data-centric, jitter (delay differences) between  
 232 packet arrivals is not a major concern. Therefore,  
 233 apart from storing and maintaining upstream and  
 234 downstream nodes’ information, no other resource  
 235 reservation is made during the route discovery  
 236 phase. Hence, the discovery process can also be  
 237 considered as a *topology construction* process.

238 *Route reply*: This message is necessary to notify  
 239 which of the nodes, involved in route discovery,  
 240 actually constitute the meshed multipath. Corre-  
 241 sponding entries at all other nodes involved in the

242 previous Route discovery process will eventually  
 243 disappear (upon expiration of the soft-state).  
 244 When the controller node receives the discovery  
 245 packets from a single source, it selects the first two  
 246 of them and sends a route reply following the  
 247 original links used by Route discovery packets  
 248 (but in reverse direction) with the following fields:  
 249  $\{source\_ID, source\_location, intermedi-$   
 250  $ate\_node\_ID, previous\_node\_ID_1, previ-$   
 251  $ous\_node\_ID_2\}$ . Each intermediate node changes  
 252 the state of its corresponding entries from ‘soft’ to  
 253 permanent (as long as the node remains active and  
 254 connected), updates the fields of the reply packet  
 255 other than the source information, and forwards  
 256 the reply packet to its upstream node (towards the  
 257 source). Note that in forwarding the route reply  
 258 message, a node does not need to know the source  
 259 information. If the discovery packets from many  
 260 sensor nodes arrive via a common path to the  
 261 controller node, the sensor nodes are replied back  
 262 via a multicast-based reply.

263 After the meshed network topology is formed, a  
 264 node along the meshed multipath has the respon-  
 265 sibility to remain connected. If an intermediate  
 266 node goes out of service (due to battery drainage),  
 267 or goes to sleep mode as a power saving measure,  
 268 the upstream nodes select appropriate neighbors  
 269 (and if needed, discover routes) to remain con-  
 270 nected. However, intermittent “link breakage” due  
 271 to, e.g., interference is not considered a form of  
 272 disconnection and will not trigger reconfiguration  
 273 of the meshed multipath. Rather, it will be handled  
 274 using selective forwarding (SF) as will be described  
 275 later.

276 From a sensor node’s view point, a typical me-  
 277 shed multipath to the destination is as shown in  
 278 Fig. 1(a). From a group of nodes’ view point, the  
 279 meshed multipaths to the controller node (*D*) is as  
 280 shown in Fig. 1(b). Observe that in the constructed  
 281 meshed topology the number of downstream links  
 282 is no more than *two*, but the number of upstream  
 283 nodes can be more. For example, in Fig. 1(b), the  
 284 node *n* has three upstream nodes: *a*, *b*, and *c*; and  
 285 two downstream nodes: *x* and *y*.

## 286 2.2. Multipath routing

287 After the meshed multipath is constructed, the  
 288 data packets can be forwarded (using the routing  
 289 table built in route searching phase at each active  
 290 node) to the destination along the meshed multi-  
 291 path using either *packet replication* (PR) or *selective forwarding* (SF).

292 In PR, a packet from a source is copied along all  
 293 possible paths to its destination. To reduce power  
 294 consumption due to transmission of multiple  
 295 copies of the same packet, a node receiving more  
 296 than one correct copy of the packet from upstream  
 297 nodes filters out one successful packet for for-  
 298 warding to the downstream nodes.

300 On the other hand, in SF, if more than one  
 301 downstream nodes are available at either the  
 302 source or an intermediate node, the packet is for-  
 303 warding along only one downstream link based on  
 304 local conditions (e.g., health of the downstream  
 305 nodes). If all outgoing links from a node are  
 306 equally good, one is selected randomly. Besides  
 307 achieving fault tolerance, such selective forwarding  
 308 along the meshed multipath is more efficient than  
 309 PR in terms of resource utilization and congestion  
 310 avoidance. It can also distribute the traffic among  
 311 multiple routes and conserve the energy among  
 312 different nodes more evenly than preferential  
 313 routing [8,13,15,24]. Also, this packet distribution  
 314 policy automatically refreshes a node's association  
 315 with the mesh, thereby minimizing the need for  
 316 explicit route maintenance.

317 It may be noted that while the signal transmitted  
 318 by a simple sensor node is generally broadcast to  
 319 all its neighbors, the major difference between PR  
 320 and SF is that in the former, the packet is intended  
 321 for multiple neighbors, each of which will receive  
 322 and forward the packet whereas in the latter, only  
 323 one receiver will receive and forward. On the other  
 324 hand, because of the broadcast nature, meshed  
 325 multipath routing (M-MPR) does not require any  
 326 extra transmission energy when compared to dis-  
 327 joint multiple path routing (D-MPR) and hence is  
 328 a natural choice. Moreover, M-MPR introduces  
 329 more flexibility than D-MPR in making selective  
 330 forwarding decision, thereby increasing the chance  
 331 of successful packet delivery. Nevertheless, to  
 332 minimize possible medium access conflict, M-

MPR would require either a tunable receiver (im-  
 333 plying more delay in channel access) or more fix-  
 334 tuned receivers (implying additional orthogonal  
 335 codes). In the rest of the paper, we will not con-  
 336 sider any further details of routing and MAC  
 337 protocol aspects. Rather, our focus will be the  
 338 performance evaluation of our proposed approach  
 339 and its comparison with other similar approaches.  
 340

## 3. Throughput analysis 341

342 We now evaluate the throughput performance  
 343 of M-MPR and D-MPR schemes with PR and SF,  
 344 respectively. In our analysis we have also consid-  
 345 ered *tree-based multipath routing*, as proposed in  
 346 the literature (see, e.g., [21]). Its throughput is in  
 347 between D-MPR and M-MPR performance, the  
 348 intuition being that, unlike in M-MPR, its routing  
 349 flexibility from a source is not extended all the way  
 350 to the destination. In this paper, we will restrict  
 351 our scope to D-MPR and M-MPR.

352 In analyzing the throughput for a source–desti-  
 353 nation pair, we do not consider FEC coding, and if  
 354 FEC coding is used, we do not distinguish the data  
 355 packets (blocks) from possible error correcting  
 356 blocks. We define *Normalized throughput* ( $T$ ) as the  
 357 probability of successful arrival of a packet to the  
 358 destination. The source-to-destination hop length  
 359 is denoted by  $H$ , where all routes are assumed to  
 360 be of equal length and the meshed multipath is  
 361 mostly regular (see Figs. 2 and 3). Note that al-  
 362 though the “equal length routes” and “regular  
 363 mesh” assumptions may not be very practical,  
 364 with these assumptions, the system lends itself to  
 365 tractable analytic performance evaluation which  
 366 can be used to gain intuitive understanding of  
 367 routing performance. In Section 4, we will study

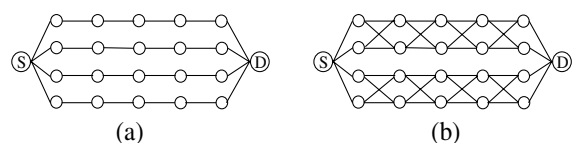


Fig. 2. Examples of 6-hop multiple routes: (a) disjoint multipath and (b) its node-equivalent meshed multipath (to be discussed later in Section 4.2.2).

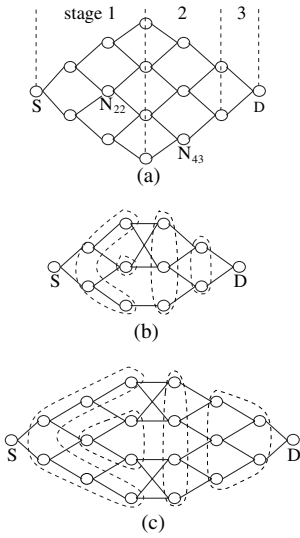


Fig. 3. Examples of meshed multipath: (a) even number of hops ( $H = 6$ ); (b) odd number of hops ( $H = 5$ ),  $\lfloor \frac{H}{2} \rfloor$  is even and (c) odd number of hops ( $H = 7$ ),  $\lfloor \frac{H}{2} \rfloor$  is odd.

368 the performance under more practical assumptions  
369 via simulations, where due to random location of  
370 field sensors, not all routes between a source to the  
371 destination are of equal length. In addition, for M-  
372 MPR, not all intermediate nodes will have two  
373 incoming as well as two outgoing links.

374 With the above simplified assumptions, the  
375 number of nodes associated with  $r$  disjoint  $H$ -hop  
376 source-destination routes in D-MPR, including  
377 source and destination, is:

$$N^{(d)} = r(H - 1) + 2. \quad (1)$$

379 On the other hand, with maximum *two* incom-  
380 ing or outgoing branches at each node (see Fig. 3),  
381 the number of nodes involved in M-MPR is

$$N^{(m)} = \begin{cases} \left(\frac{H+2}{2}\right)^2, & H \text{ even,} \\ \left\lceil \frac{H}{2} \right\rceil \left(\left\lceil \frac{H}{2} \right\rceil + 1\right), & H \text{ odd.} \end{cases} \quad (2)$$

383 Hereafter, for each packet transmission, link  
384 error and intermediate node failure probabilities  
385 are denoted by  $p_l$  and  $p_n$ , respectively. While  $p_l$   
386 captures Gaussian channel noise as well as the  
387 error due to medium access conflict,  $p_n$  captures  
388 the packet loss due to input buffer overflow and  
389 node failure. Note that, to highlight the differences

390 between different multiple path routing schemes,  
391 the end node (i.e., the destination) is considered  
392 ready to receive (i.e.,  $p_n = 0$ ) all packets.

393 In our analysis, a link is modelled as an additive  
394 white Gaussian noise (AWGN) channel. If  $p_b$  is the  
395 average bit error probability (or BER) due to  
396 channel error and  $B$  is the packet size (number of  
397 bits), then

$$p_l = 1 - (1 - p_b)^B. \quad (3)$$

399 For direct sequence spread spectrum (DS-SS)  
400 based channel access, with  $K$  contending nodes  
401 and  $C$  chips per bit, Gaussian approximation [27,  
402 p. 282] yields the average BER (using conventional  
403 matched filter receiver), which is

$$p_b = Q\left(\frac{1}{\sqrt{\frac{K-1}{3C} + \frac{N_0}{2E_b}}}\right), \quad (4)$$

where  $\frac{E_b}{N_0}$  is the signal-to-noise ratio per bit. 405

### 3.1. Packet replication (PR) 406

407 We now consider the normalized throughput  
408 performance with the PR approach.

#### 3.1.1. Disjoint multipath (D-MPR-PR) 409

410 Fig. 2(a) shows an example of a set of 4 disjoint  
411 routes, each of which is 6 hops long. In D-MPR-  
412 PR with  $r$  parallel  $H$ -hop routes, the normalized  
413 throughput  $T_{PR}^{(d)}$  can be obtained as:

$$T_{PR}^{(d)} = 1 - \left[1 - (1 - p_l)^H (1 - p_n)^{H-1}\right]^r, \quad (5)$$

415 where  $(1 - p_l)^H (1 - p_n)^{H-1}$  is the probability of  
416 successful delivery of a packet along a particular  
417 route.

#### 3.1.2. Meshed multipath (M-MPR-PR) 418

419 There could be different ways of forming me-  
420 shed multipaths. To facilitate a fair comparative  
421 analysis, we first consider three examples of me-  
422 shed multipath as shown in Fig. 3. How the stages  
423 are divided will be discussed later.

424 We denote the intermediate nodes by  $N_{ij}$  where  $i$   
425 stands for the hop length from source and  $j$  stands  
426 for its position from the top of the mesh (see nodes  
427  $N_{22}$  and  $N_{43}$  in Fig. 3(a) for example). Corre-

spondingly, successful packet arrival probability at the  $(i, j)$ th node is denoted by  $P_{ij}$ . Depending on the hop length, there are three possible cases of meshed multiple routes: (a) even  $H$ , (b) odd  $H$ , even  $\lfloor \frac{H}{2} \rfloor$ , and (c) odd  $H$ , odd  $\lfloor \frac{H}{2} \rfloor$ . Referring to Fig. 3, there can be up to four categories of intermediate nodes: (i) The nodes having only one predecessor node. For example, in Fig. 3(a), these are the nodes  $N_{ij}$ , where  $(i, j) = (1, 1), (1, 2), (2, 1), (2, 3), (3, 1), (3, 4)$ . In general,  $i = 1, 2, \dots, \lfloor \frac{H}{2} \rfloor$  and  $j = 1$  or  $j = i + 1$ . The nodes belonging to different categories are marked in Fig. 3(b) and (c). (ii) The remaining nodes in the left half of the mesh (i.e., the nodes with  $1 < i \leq \lfloor \frac{H}{2} \rfloor$  and  $1 < j < i + 1$ ), which have two predecessor nodes. In Fig. 3(a), the nodes  $N_{22}, N_{32}$  and  $N_{33}$  belong to this category. (iii) For odd  $H$ , the nodes  $N_{\lfloor \frac{H}{2} \rfloor, j}$ , where  $1 \leq j \leq \lfloor \frac{H}{2} \rfloor$ . Note that there is no category (iii) node in Fig. 3(a) (where  $H$  is even). (iv) All other nodes in the right half of the mesh except the destination, i.e., the nodes from  $\lfloor \frac{H}{2} \rfloor + 1$  hop to  $H - 1$  hop. In Fig. 3(a), the nodes 4-hop and 5-hop away from the source fall in this category.

For category (i) nodes: A packet will successfully reach node  $N_{ij}$  if  $N_{ij}$  is ready to receive, and its incoming link is error-free during transmission of the packet. That is,

$$P_{ij} = (1 - p_l)^i (1 - p_n)^i.$$

Note that  $P_{ij}$  is a function of  $i$  only, i.e., the hop distance of  $N_{ij}$  from  $S$ .

For category (ii) nodes:  $P_{ij}$  is recursively obtained as:

$$P_{ij} = (1 - p_n)[1 - (1 - (1 - p_l)P_{i-1, j-1}) \times (1 - (1 - p_l)P_{i-1, j})].$$

Here,  $(1 - p_n)$  is the probability that the node  $N_{ij}$  is ready to receive. The remaining term within the parenthesis is the successful packet arrival probability from at least one incoming directions, given that  $N_{ij}$  is ready to receive.

For category (iii) nodes ( $H$  odd): In this category, depending on whether  $\lfloor \frac{H}{2} \rfloor$  is even (as in Fig. 3(b)) or odd (as in Fig. 3(c)),  $P_{ij}$  is recursively obtained as shown below.

```

BEGIN
  i ← ⌊H/2⌋
  FOR j = 1 through ⌊H/2⌋, with increment of 2,
  /* Applies to both Fig. 3(b) and (c) */
    Pij ← (1 - pn)[1 - (1 - (1 - pl)Pi-1,j)
      × (1 - (1 - pl)Pi-1,j+1)]
    Pi,j+1 ← Pij
  end FOR
  IF ⌊H/2⌋ even, /* Applies to Fig. 3(b) */
    Pii ← (1 - pl)(1 - pn)Pi-1,i
  end IF
END

```

For category (iv) nodes: All nodes in this category (like the category (ii)) have two predecessor nodes node. The corresponding  $P_{ij}$  is given by

$$P_{ij} = (1 - p_n)[1 - (1 - (1 - p_l)P_{i-1, j}) \times (1 - (1 - p_l)P_{i-1, j+1})].$$

By determining the  $P_{i,j}$ 's for nodes in categories (i)–(iv), we obtain the probabilities  $P_{H-1,1}$  and  $P_{H-1,2}$ . Finally, the end-to-end successful arrival of a packet, or normalized throughput in M-MPR-PR is given by:

$$T_{PR}^{(m)} = 1 - (1 - (1 - p_l)P_{H-1,1}) \times (1 - (1 - p_l)P_{H-1,2}). \quad (6)$$

Note that the above is similar to  $P_{ij}$  for the nodes in categories (ii) and (iv), except that the destination node is presumed ready to receive all packets.

### 3.2. Selective forwarding (SF) 497

Below, we analyze normalized throughput with selective forwarding (SF) of packets. 498 499

#### 3.2.1. Disjoint multipath (D-MPR-SF) 500

In D-MPR-SF, route selection can be done only at the source. The corresponding normalized throughput is thus given by 501 502 503

$$T_{SF}^{(d)} = (1 - p_l)^H (1 - p_n^r) (1 - p_n)^{H-2}, \quad (7)$$

where  $(1 - p_l)(1 - p_n^r)$  is the probability of reaching to a next node from the source, and  $(1 - p_l)^{H-1}(1 - p_n)^{H-2}$  is the probability of successfully covering the remaining  $(H - 1)$  hops. 505 506 507 508

## 509 3.2.2. Meshed multipath (M-MPR-SF)

510 Referring to Fig. 3, depending on the hop  
 511 length, the meshed multipath is divided into three  
 512 stages. Stage 1 covers the nodes from the source up  
 513 to those  $\lfloor \frac{H}{2} \rfloor$  hops away, Stage 2 covers hops be-  
 514 tween  $\lfloor \frac{H}{2} \rfloor$  and  $H - 1$ , and Stage 3 is the last hop.  
 515 Successful packet arrival probability at the end of  
 516 each stage, denoted by  $P_s(i)$ , where  $i = 1$  and  $2$ , is  
 517 first obtained as follows:

518 *Stage 1:* In this stage, a packet successfully  
 519 reaches the next node if at least one of two  
 520 downstream nodes is ready to receive, with prob-  
 521 ability  $(1 - p_n^2)$ , and the channel is good during the  
 522 packet transmission, with probability  $(1 - p_l)$ .  
 523 Since Stage 1 has  $\lfloor \frac{H}{2} \rfloor$  hops,  $P_s(1)$  is given by

$$P_s(1) = [(1 - p_l)(1 - p_n^2)]^{\lfloor \frac{H}{2} \rfloor}. \quad (8)$$

525 The probability with which a successful packet  
 526 arrives at a node  $N_{ij}$  at the end of Stage 1 is bi-  
 527 nomially distributed:

$$P_{h,i+1} = \frac{1}{2^h} \binom{h}{i} \quad (9)$$

529 where  $h = \lfloor \frac{H}{2} \rfloor$  and  $i = 0, 1, \dots, h$ .

530 *Stage 2:*  $P_s(2)$  is obtained recursively as shown  
 531 in Appendix A. Note that one needs to take into  
 532 consideration up to three different cases depending  
 533 on whether  $H$  is odd or even, and if  $H$  is odd,  
 534 whether  $\lfloor \frac{H}{2} \rfloor$  is odd or even as illustrated in Fig.  
 535 3(a)–(c). Also, the edge nodes beyond  $\lfloor \frac{H}{2} \rfloor$  hops  
 536 (e.g.,  $N_{43}$  in Fig. 3(a)) have only one downstream  
 537 node.

538 Finally, counting Stage 3 (i.e., the last hop), the  
 539 end-to-end successful arrival probability of a  
 540 packet, or normalized throughput is given by

$$T_{SF}^{(m)} = (1 - p_l) \prod_{i=1}^2 P_s(i). \quad (10)$$

542 Note that, instead of the  $H$ -hop meshed multi-  
 543 path in Fig. 3, if Fig. 2(b) is considered (which il-  
 544 lustrates a meshed multipath with the same  
 545 number of nodes as in disjoint multipath shown in  
 546 Fig. 2(a)), the throughput can be obtained in a  
 547 straight forward way. Particularly, the first hop  
 548 success probability is given by  
 549  $P_1 = (1 - p_n^2)(1 - p_l)$ . For any  $h$  from 2 to  $H - 1$ ,  
 550  $P_h = P_{h-1}(1 - p_n^2)(1 - p_l)$  is obtained recursively.

Finally, the normalized throughput is obtained as  
 $T_{SF}^{(m)} = P_{H-1}(1 - p_l)$ . This configuration will be  
 considered in Section 4.2.2 for performance com-  
 parison between D-MPR and M-MPR.

Numerical and simulation results are provided  
 in the next section.

## 4. Performance results

In this section, we first present the numerical  
 results from throughput analysis and verify them  
 via discrete event simulation. Subsequently, we  
 will compare different MPR schemes in terms of  
 resource usage (e.g., energy or bandwidth con-  
 sumption). The intermediate nodes are assumed to  
 fail intermittently (with probability  $p_n$ ). If a node is  
 found ready to receive before transmitting a  
 packet (based on a priori local neighborhood in-  
 formation), it remains ready throughout the  
 packet transmission period. However, channel  
 noise can still corrupt a packet (with BER  $p_b$ ). In  
 studying the basic packet throughput perfor-  
 mance, no attempt is made to correct packet error  
 and all corrupted packets are discarded. However,  
 FEC will be considered when comparing resource  
 requirements of various schemes.

Unless otherwise specified, the parameter values  
 considered in the simulation are the following:  
 Number of nodes is 500, uniformly randomly  
 distributed over a  $500 \times 700$  m location space; the  
 range of circular coverage of each node is 40 m;  
 packet size is 50 Bytes (fixed); number of packets  
 per session is  $10^6$ ; link error probability  $p_l$  is close  
 to  $10^{-3}$ , calculated based on white Gaussian  
 channel with BER  $10^{-6}$ , correspondingly  $K = 7$ ,  
 $C = 127$ , and  $\frac{E_b}{N_0} = 17$  dB (in Eq. (4)); node error  
 probability  $p_n$  varies and may be much higher than  
 $p_l$  because unlike in MANET, while the sensor  
 nodes are mostly stationary (and accordingly,  $p_l$  is  
 relatively smaller), they have a much more limited  
 power and buffer space (and accordingly  $p_n$  could  
 be relatively higher).

Sufficient number of sessions are simulated to  
 achieve throughput within a 95% confidence in-  
 terval. Since in the simulation, end-to-end distance  
 and meshed multipath formation vary widely for  
 each session, instead of quantitative verification,



596 we compare the analytically obtained performance  
597 trends with those from simulations.

#### 598 4.1. PR versus SF

599 In studying relative performances of the PR and  
600 SF approaches, first, we consider normalized  
601 throughput. Then, we look into the resource us-  
602 age, which is also of major interest from an energy  
603 efficiency view point, particularly in wireless sensor  
604 networks.

##### 605 4.1.1. Throughput performance

606 Analytically obtained throughput performances  
607 of D-MPR and (its node-equivalent) M-MPR with  
608 PR and SF, respectively, for varying node failure  
609 probabilities, are shown in Fig. 4, which shows  
610 that PR has a higher normalized throughput than  
611 SF in D-MPR as well as in M-MPR. This is ex-  
612 pected as sending a packet along multiple error-  
613 prone routes (rather than along one route) in-  
614 creases the chance of successful arrival of at least  
615 one copy of the packet.

616 Fig. 5 shows simulation-based throughput as a  
617 function of the node failure rate, with average end-  
618 to-end distance of about 9 hops. Note that al-  
619 though the trends of results are similar as in Fig. 4,  
620 simulation gives a little poorer throughput per-  
621 formance because of the longer average hop

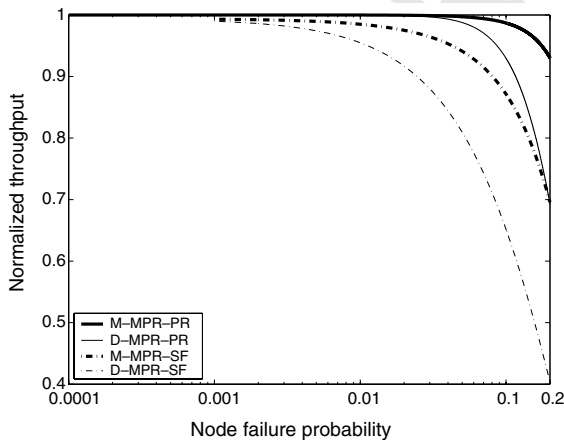


Fig. 4. Normalized throughput performances with PR and SF, respectively—from analysis.  $p_l = 10^{-3}$ ,  $H = 6$ , and  $r = 3$ .

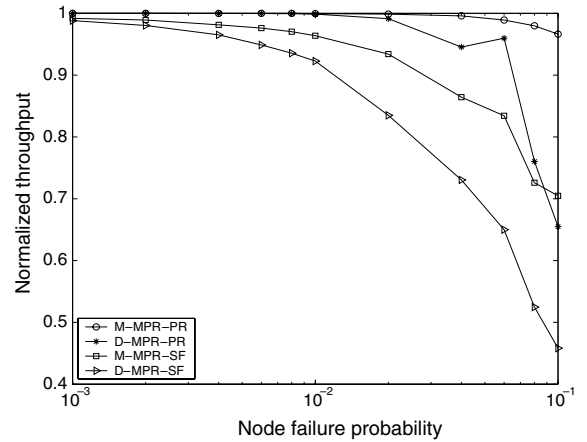


Fig. 5. Normalized throughput performance with PR and SF, respectively—from simulation. Average end-to-end distance is 9.06 hops.

length, irregular mesh, and unequal hop distance of multiple routes.

##### 4.1.2. Equivalent resource requirements

To compare the above four approaches on the same baseline, we define *equivalent resource usage* as the number of transmit and receive operations carried to successfully route a message, as such a number is closely related to the energy consumption as well as channel bandwidth consumption. In the following, we use  $E$  to denote the energy consumption.

We first determine the total number of packets to be sent for a given message using FEC coding. Assume that a message consists of  $D$  data blocks. In PR, let  $T_{PR}$  be the normalized throughput in PR (obtained in Eqs. (5) and (6)), and  $C_{PR}$  be the number of error correction blocks required to correctly retrieve the message (i.e., all  $D$  data blocks). The corresponding notations in SF are, respectively,  $T_{SF}$  and  $C_{SF}$ . Then, by [3],

$$(D + C_{PR})(1 - T_{PR}) \leq C_{PR},$$

$$(D + C_{SF})(1 - T_{SF}) \leq C_{SF}$$

that is, as long as the number of corrupted blocks is less than the number of error correction blocks, the message can be fully recovered at the receiver.

647 Taking the limiting cases and simplifying them,  
648 the minimum number of error correction blocks  
649 required in the two cases are

$$C_{PR} = \left\lceil \frac{D(1 - T_{PR})}{T_{PR}} \right\rceil, \quad (11)$$

$$C_{SF} = \left\lceil \frac{D(1 - T_{SF})}{T_{SF}} \right\rceil. \quad (11')$$

652 To determine the number of transmit and re-  
653 ceive operations needed for each packet, we make  
654 the following observations: (1) To reach more than  
655 one neighbor, a node requires only *one* transmit  
656 operation, which is the same as that for reaching a  
657 single neighbor. (2) Only if a node is an intended  
658 receiver (which is known at the MAC level), does it  
659 undergo *one* receive operation per packet trans-  
660 mission. (3) In PR, all nodes constituting the  
661 multipath route (disjoint or meshed) undergo  
662 transmit and receive operations. It is assumed that  
663 in M-MPR-PR, if an intermediate node receives  
664 more than one copy of a packet (with the same  
665 packet ID), it forwards only one. This, in a way,  
666 controls the data implosion at the destination [18]  
667 and also saves battery power.

668 Denote the number of transmit and receive op-  
669 erations for end-to-end packet delivery by  $TX$  and  
670  $RX$ , respectively. Referring to the example of dis-  
671 joint multipath in Fig. 2(a), its node-equivalent  
672 meshed multipath (having 22 nodes) shown in Fig.  
673 2(b), and its link-equivalent meshed multipath  
674 (having 24 links) shown in Fig. 3(a), we see that for  
675 each packet delivery using packet replication,  
676 while D-MPR-PR requires 21  $TX$  and 24  $RX$ , its  
677 node-equivalent M-MPR-PR requires 21  $TX$  and  
678 40  $RX$ , and its link-equivalent M-MPR-PR re-  
679 quires 15  $TX$  and 24  $RX$ . On the other hand, D-  
680 MPR-SF requires 6  $TX$  and 6  $RX$ , so do its node-  
681 equivalent and link-equivalent M-MPR-SF.

682 Assume that the energy spent for a one hop  
683 packet transmission and its reception are nearly  
684 equal.<sup>2</sup> Then, the equivalent energy spent per end-  
685 to-end packet delivery is  $TX + RX$ . With these

observations, equivalent energy resource required  
to deliver the same message with PR and SF are  
obtained as:

$$E_{PR} = (D + C_{PR})(TX_{PR} + RX_{PR}), \quad (12)$$

$$E_{SF} = (D + C_{SF})(TX_{SF} + RX_{SF}). \quad (12')$$

691 Table 1 shows the number of error correction  
692 blocks and the equivalent (energy) resource re-  
693 quirements for disjoint multipath (involving 15  
694 nodes, with  $H = 6$  and  $r = 3$ ),<sup>3</sup> as well as its node-  
695 equivalent meshed multipath involving 14 nodes  
696 (shown in Fig. 3(a)), with PR and SF, respectively.  
697 For example, from the third row of the table, we  
698 see that for a given  $p_l = 10^{-3}$ ,  $p_n = 10^{-1}$ , and  
699  $H = 6$  hops, to successfully deliver a 1000 block  
700 long message, D-MPR-SF requires 535 error cor-  
701 rection blocks ( $C$ ) and the associated equivalent  
702 energy usage is 18420 (units) (using Eq. (12)). In  
703 the identical scenario, D-MPR-PR requires only  
704 76 error correction blocks, but 36584 units of  
705 equivalent energy usage, which is nearly *double*  
706 the required resource in D-MPR-SF. Correspond-  
707 ingly, M-MPR-PR requires 39546 units of energy  
708 resource, which is nearly *2.8 times* that required in  
709 M-MPR-SF. It is apparent that PR wastes more  
710 network resources (in terms of battery power as  
711 well as channel bandwidth) compared to the SF,  
712 for achieving the same error performance limit,  
713 although SF needs more error correction blocks  
714 per message.

715 To verify the equivalent energy requirement ( $E$ )  
716 via simulation, we obtain from the simulation  
717 trace file the disjoint multipath and meshed mul-  
718 tipath for a specific source–destination pair (nodes  
719 282 and 128) that are at least 6 hops away, as  
720 shown in Fig. 6.

721 For this specific case, the number of error cor-  
722 rection blocks and the associated equivalent en-  
723 ergy resource required with PR and SF in D-MPR  
724 and M-MPR, respectively, are shown in Table 2.

<sup>2</sup> For unequal transmit and receive energies,  $TX$  will be multiplied by a constant factor, determined by the ratio of transmit energy to receive energy.

<sup>3</sup> We could have compared the disjoint multipath shown in Fig. 2(a) having  $r = 4$  disjoint routes with its node-equivalent meshed multipath shown in Fig. 2(b). Instead, we pick  $r = 3$  so as to be able to compare with the results from simulation later, where the disjoint multipath formed, shown in Fig. 6, has only  $r = 3$  disjoint paths.

Table 1  
Equivalent energy resource ( $E$ ) required with PR and SF, respectively—from analysis

$p_n$	D-MPR ( $H = 6, r = 3$ )				M-MPR (Fig. 3(a))			
	$C_{PR}^{(d)}$	$E_{PR}^{(d)}$	$C_{SF}^{(d)}$	$E_{SF}^{(d)}$	$C_{PR}^{(m)}$	$E_{PR}^{(m)}$	$C_{SF}^{(m)}$	$E_{SF}^{(m)}$
$10^{-3}$	1	34034	11	12132	1	39039	7	12084
$10^{-2}$	1	34034	48	12576	1	39039	16	12192
0.1	76	36584	535	18420	14	39546	147	13764
0.2	443	49062	1476	29712	85	42315	433	17196

$D = 1000, H = 6, p_l = 10^{-3}$ .

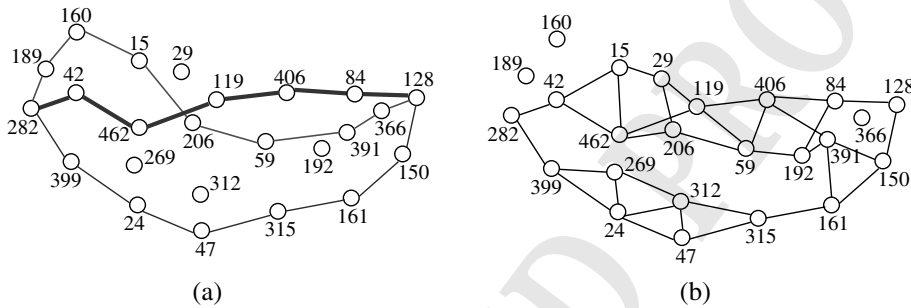


Fig. 6. Sketches of disjoint multipath and its node-equivalent meshed multipath, drawn from the network connectivity trace. End-to-end (shortest) distance 6 hops.

Table 2  
Equivalent energy resource required with PR and SF, respectively—from simulation

$p_n$	D-MPR (Fig. 6(a))				M-MPR (Fig. 6(b))			
	$C_{PR}^{(d)}$	$E_{PR}^{(d)}$	$C_{SF}^{(d)}$	$E_{SF}^{(d)}$	$C_{PR}^{(m)}$	$E_{PR}^{(m)}$	$C_{SF}^{(m)}$	$E_{SF}^{(m)}$
$10^{-3}$	0	40000	8	14112	1	54054	5	16080
$10^{-2}$	1	40040	55	14770	1	54054	21	16336
0.1	186	47440	717	24038	35	55890	261	20176
0.2	1110	84400	2280	45920	188	64152	773	28368

End-to-end (shortest) distance 6 hops.  $D = 1000, p_l = 10^{-3}$ .

725 Note that since “equal length routes” and “ideal  
726 mesh” could not be ensured in the simulation (due  
727 to random location of nodes), to route a message  
728 to the destination, the number of transmit–receive  
729 operations obtained from simulation is higher  
730 than the corresponding number obtained analytically,  
731 resulting in a higher  $E$ . Nevertheless, as  
732 shown in Fig. 7, in terms of the savings in the  
733 equivalent energy resource usage due to SF (over  
734 PR) in D-MPR and M-MPR, respectively, calculated  
735 from the data in Tables 1 and 2, the results

obtained from analysis follow closely those from  
simulations.

Given that for a successful message transmission  
PR has much higher energy resource overhead  
compared to the SF (even though PR has a higher  
packet throughput), in the subsequent discussions,  
we will concentrate only on the SF approach.

#### 4.2. M-MPR-SF versus D-MPR-SF

From the analytical results (columns 5 and 9 in  
Table 1), we can see that when the node failure

736  
737  
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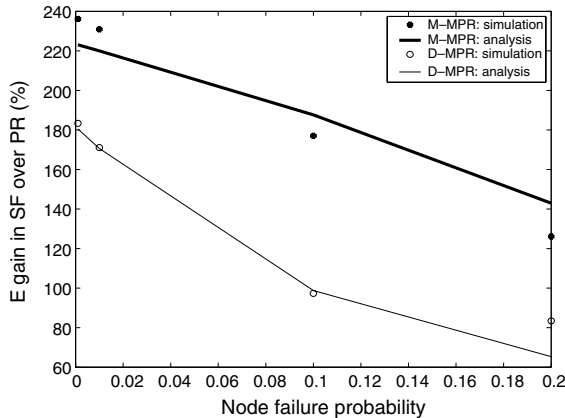


Fig. 7. Equivalent energy resource ( $E$ ) gain with SF over PR, in D-MPR and M-MPR, respectively. End-to-end (shortest) distance 6 hops.

746 rate  $p_n$  is low, D-MPR-SF consumes only slightly  
 747 more energy than its node-equivalent M-MPR-SF  
 748 to deliver the same message. However, the differ-  
 749 ence becomes quite significant when  $p_n$  becomes  
 750 large. This is because although D-MPR-SF and  
 751 M-MPR-SF undergo the same number of TX and  
 752 RX operations along a given path (of equal  
 753 length), D-MPR-SF has a poorer packet  
 754 throughput (or packet loss probability), and ac-  
 755 cordingly, it would require more error correction  
 756 blocks and hence more energy for successfully  
 757 delivering a message than with M-MPR-SF.

758 A further look at the simulation results (col-  
 759 umns 5 and 9 in Table 2) reveals that when  $p_n$   
 760 is low, M-MPR-SF consumes a little more energy for  
 761 successfully delivering a message than D-MPR-SF.  
 762 This is because in simulation, a packet may un-  
 763 dergo a longer path in M-MPR-SF than in D-  
 764 MPR-SF (see Fig. 6 where M-MPR-SF may use a  
 765 7- or 8-hops path while D-MPR-SF will only use a  
 766 6-hop path), and accordingly, requiring a larger  
 767 number of TX and RX operations. However, as in  
 768 the analysis, when  $p_n$  increases, the energy re-  
 769 quirement in D-MPR-SF increases at a much  
 770 faster rate compared to M-MPR-SF due to the  
 771 fact that the former requires a much larger number  
 772 of error correction blocks than the latter. Even-  
 773 tually, the energy requirement of D-DPR-SF  
 774 surpasses that of M-MPR-SF. Note that, this also  
 775 explains why in the case of packet-replication

(PR), D-MPR-PR also consumes more energy 776  
 than M-MPR-PR when  $p_n$  is large enough. <sup>4</sup> 777

Additional advantages of M-MPR-SF are 778  
 shown in the following subsections. 779

#### 4.2.1. Throughput gain 780

To compare the throughput of M-MPR-SF with 781  
 its node-equivalent D-MPR-SF, we determine the 782  
 number of disjoint routes,  $r$ , in D-MPR, so that 783  
 the number of nodes in M-MPR is approximately 784  
 equal to the number of nodes in D-MPR. Con- 785  
 sidering the routes in Fig. 2, the analytic 786  
 throughput gain in M-MPR-SF over its node- 787  
 equivalent D-MPR-SF is shown in Fig. 8, where it 788  
 is apparent that the improvement of M-MPR-SF 789  
 over D-MPR-SF increases as the route gets longer. 790  
 As a reason for the poorer performance of D- 791  
 MPR-SF, we note that once a route is decided at 792  
 the source end, no further alternate routing option 793  
 is available. Hence, any failure at the intermediate 794  
 stage implies packet loss. On the other hand, in M- 795  
 MPR-SF, routing flexibility is available through- 796  
 out the route. 797

Simulation-based results on the normalized 798  
 throughput of D-MPR-SF and its node-equivalent 799  
 M-MPR-SF as a function of end-to-end distance, 800  
 averaged over a number of simulation runs, is 801  
 shown in Fig. 9. The average source–destination 802  
 hop length is varied by changing the aspect ratio of 803  
 the location space. For the same aspect ratio of the 804  
 location space, the difference in average hop length 805  
 in disjoint and meshed MPR scenarios is caused by 806  
 the randomness of node locations. Hence, 807  
 throughput gain could not be computed directly. 808  
 However, the slopes of normalized throughput 809  
 (the straight lines, obtained by interpolation) in 810  
 the two cases indicate a higher gain in M-MPR-SF 811  
 for a longer route. The results on the improvement 812  
 of M-MPR-SF over its link-equivalent D-MPR- 813  
 SF are similar and hence omitted because of space 814  
 limitations. 815

<sup>4</sup> The reason that D-MPR-PR consumes less energy than M-  
 MPR-PR when  $p_n$  is small in both analysis and simulation is  
 that in the former, a packet goes through a fewer TX and RX  
 operations because a disjoint multipath contains a fewer links  
 than a node-equivalent meshed multipath (see, e.g., Figs. 2(a)  
 and 3(a)).

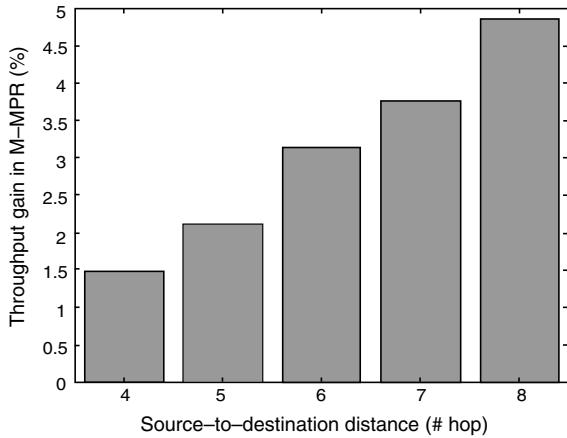


Fig. 8. Percentage throughput gain in M-MPR-SF over its node-equivalent D-MPR-SF scheme—from analysis.  $p_l = 10^{-3}$ ,  $p_n = 10^{-2}$ .

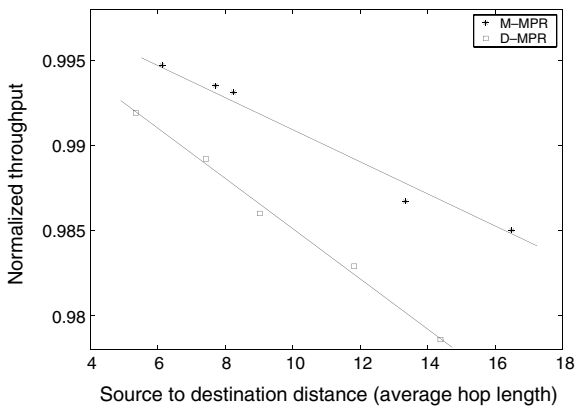


Fig. 9. Throughput variations of D-MPR-SF and its node-equivalent M-MPR-SF with end-to-end distance—from simulation.  $p_n = 10^{-3}$ .

#### 816 4.2.2. Receiver complexity

817 To compare the receiver complexity, without  
 818 loss of generality, we assume Direct Sequence  
 819 Spread Spectrum (DS-SS) based medium access,  
 820 where each node has its unique (orthogonal) code  
 821 for transmission. We do not consider spatial sep-  
 822 aration dependent code reuse. Therefore, the  
 823 number of orthogonal codes required is equal to  
 824 the number of transmitting nodes ( $N$ ) along the  
 825 route, and the number of correlators required in a

receiver is equal to the number of incoming links  
 ( $L$ ). The total number of correlators required in a  
 multipath route determines the receiver complexity  
 of the routing scheme.

Considering M-MPR-SF and its node-equiva-  
 lent as well as link-equivalent D-MPR-SF, Fig. 10  
 shows the analytically obtained normalized  
 throughput of 6-hops routes shown in Figs. 2(a),  
 (b) and 3(a). We note that in the node-equivalent  
 case (e.g., shown in Fig. 2(a) and (b), where  
 $N^{(d)} = N^{(m)} = 22$ ), although M-MPR-SF has a  
 much higher throughput, it has a higher receiver  
 complexity as well ( $L^{(m)} = 40$  versus  $L^{(d)} = 24$ ).  
 However, in the link-equivalent case (Figs. 2(a)  
 and 3(a) where  $L^{(d)} = L^{(m)} = 24$ ), M-MPR-SF still  
 achieves a better throughput than D-MPR-SF,  
 even though the former involves a fewer nodes  
 ( $N^{(m)} = 16$  versus  $N^{(d)} = 22$ ) and thus a lower re-  
 ceiver complexity.

Fig. 11 plots simulation results on normalized  
 throughput, where the end-to-end distance is  
 about 9 hops, averaged over multiple sessions. We  
 observe that the trend is similar to that from the  
 analysis as shown in Fig. 10. Note that due to  
 random placement of nodes, one can no longer  
 ensure idealized mesh and equal length multiple  
 routes (e.g., in Figs. 2 and 3), which, coupled with  
 longer average hop length, leads to poorer per-  
 formance from simulation than that from analysis.

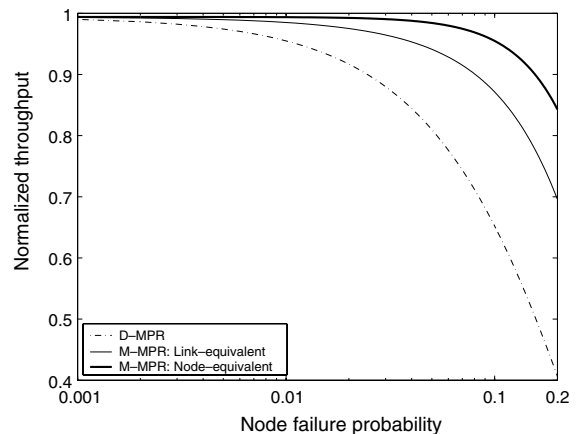


Fig. 10. Normalized throughput performance of D-MPR-SF and its equivalent M-MPR-SF schemes—from analysis.  $p_l = 10^{-3}$ ,  $H = 6$ .

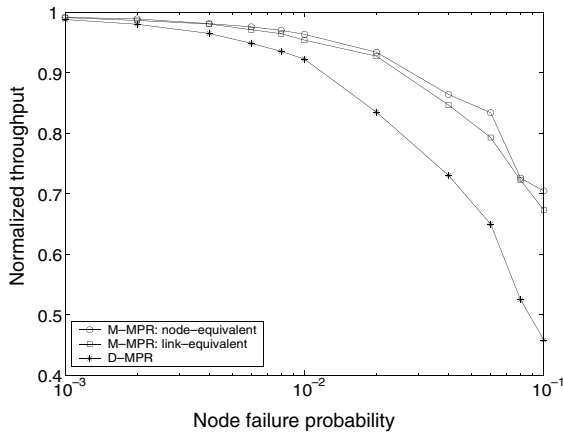


Fig. 11. Normalized throughput performance of D-MPR-SF and its equivalent M-MPR-SF schemes, obtained from simulations. Average number of hops is 9.06.

855 **5. Related work**

856 There have been numerous proposals on multi-  
857 path routing in interconnection networks for ei-  
858 ther high-speed operation or failsafe  
859 communication. We briefly survey the related  
860 work and highlight our contributions in this paper.

861 *5.1. Route discovery*

862 In conventional single route or multiple route  
863 searching strategies, one end node (e.g., the source)  
864 sends route query (or discovery) packets to the  
865 other end (e.g., the destination) via flooding  
866 [22,26,28], or scoped flooding [8,17] with a preset  
867 time-to-live (or hop count) value. In DSR-like [15]  
868 route discovery approaches, each discovery packet  
869 records the partial route it has followed so far  
870 [8,28]. For a source-to-destination route, an in-  
871 termediate node entertains *only one* discovery  
872 packet and forwards it to its downstream neigh-  
873 bors, thus forming a source tree towards the des-  
874 tination. The destination, upon receiving the  
875 discovery packets, replies to either one or multiple  
876 of them with reservation confirmation. Such an  
877 approach creates either disjoint multiple routes or  
878 a primary route. If only a single (i.e., primary)  
879 route is established at the first route search phase,  
880 disjoint secondary routes can be formed sequen-

tially [13] (by removing already established 881  
882 routes). To set up braided multipath around the  
883 primary route (i.e., having non-disjoint secondary  
884 routes), for each node along the primary route, an  
885 alternate route is discovered sequentially [13]. In  
886 either case, such a multipath searching approach  
887 would require high control overhead and associ-  
888 ated delay. Alternatively, in distributed route  
889 searching (e.g., AODV [26], AOMDV [22]), in-  
890 stead of the packet carrying the entire route in-  
891 formation, each involved node maintains its  
892 upstream and downstream nodes for forward and  
893 reverse path. In AODV [26], a single path is searched  
894 via tree-based query flooding, where at most  
895 one discovery packet (and the corresponding  
896 route) is accepted by a node. In AOMDV [22], the  
897 intermediate nodes are allowed to receive more  
898 than one discovery packet, thereby forming link-  
899 disjoint multiple routes. But the route searching is  
900 still done via flooding (which results in high net-  
901 work-wide control overhead and battery power  
902 consumption).

Our meshed multipath searching approach is 903  
904 similar to AOMDV [22]. However, in view of  
905 limited battery power and available location in-  
906 formation of nodes in sensor networks, our ap-  
907 proach has the following distinct features: (a) For  
908 route discovery from each source we restrict to no  
909 more than two best neighbors for discovery packet  
910 forwarding. (b) Because of many-sources-to-one-  
911 destination route discovery, routing table and  
912 discovery packet lengths are reduced. (c) To re-  
913 duce power consumption, a node forwards only  
914 one of possibly many discovery packets, received  
915 from its peripheral sources, to the destination. (d)  
916 Destination-to-many-sources route reply is sent  
917 via multicasting.

918 *5.2. Data packet routing*

The authors in [18] presented different ap- 919  
920 proaches for improving on a simple flooding  
921 technique for sensor networks by introducing  
922 node-to-node co-ordination, thereby reducing  
923 chances of overlapped data collection and data  
924 implosion. In [19], multicasting along mesh-based  
925 routes to a group of nodes in multihop wireless  
926 networks has been proposed. Packet replication

927 along a meshed multipath is similar to the dis-  
 928 tributed parallel processing in bus interconnection  
 929 networks [6], where the data to be operated on is  
 930 copied to all the operators (networks nodes); thus  
 931 faster computation speed is achieved at the cost of  
 932 communication bandwidth and nodal memory  
 933 consumption. In mobile ad hoc networks and  
 934 sensor networks, to ensure delay and/or loss  
 935 guarantee, multiple disjoint [8] or partially disjoint  
 936 [13,24] routes are set up, and data is transmitted  
 937 along primary routes while the unused secondary  
 938 routes are maintained via periodic control signal-  
 939 ing. To deal with network error, either end-to-end  
 940 [8] or adjacent node [13,30] acknowledgment (or  
 941 negative acknowledgment) based rerouting is  
 942 done. Traffic splitting along disjoint multiple  
 943 routes [20] (called disjoint multipath routing, or D-  
 944 MPR) is aimed at network load balancing. For a  
 945 given channel error probability, [29] studied the  
 946 optimum number of disjoint multiple routes to  
 947 ensure successful data delivery. Directed diffusion  
 948 approach [14] set up a single-path route from sink  
 949 to the source based on the interest gradient of  
 950 data. Credit-based mesh forwarding [31] intro-  
 951 duced flexibility of a single-path route selection to  
 952 address dynamic network conditions. Only one of  
 953 multiple routes, called the primary route, is used  
 954 for data transmission.

955 The distinct features of our meshed multipath  
 956 routing (M-MPR) over the existing multipath ap-  
 957 proaches are the following: (a) As opposed to PR  
 958 approach [18], a packet is forwarded along only  
 959 *one* selected next hop node. (b) Instead of splitting  
 960 traffic along *disjoint* multipaths [20,29], meshed  
 961 multipath introduces more flexibility in on-the-fly  
 962 routing decisions. (c) Instead of sending traffic  
 963 along a preferential (primary) route among a  
 964 number of disjoint or partially disjoint multiple  
 965 alternatives [8,13,14,22,24], M-MPR distributes  
 966 traffic more evenly in the mesh, thereby achieving  
 967 better load balancing and requiring less signaling  
 968 overhead to deal with link or node failure and for  
 969 multiple route maintenance. (d) Unlike in  
 970 [5,8,13,16,30], the absence of acknowledgment-  
 971 based retransmission and rerouting is aimed at a  
 972 simplified flow control mechanism, and reduced  
 973 buffer requirements, additional transmit-to-receive

mode changeover delay, and receive power con- 974  
 sumption at the field sensors. 975

## 6. Conclusion 976

977 We have presented a meshed multipath routing 977  
 978 scheme with selective packet forwarding for wire- 978  
 979 less sensor networks. The routing decision is taken 979  
 980 dynamically, hop-by-hop, based on the conditions 980  
 981 of downstream forwarding nodes. End-to-end 981  
 982 FEC coding is used to avoid acknowledgment- 982  
 983 based retransmission. Our aim has been to ensure 983  
 984 successful data communication with minimal buf- 984  
 985 fering and flow control overhead, and efficient use 985  
 986 of network resources such as bandwidth and bat- 986  
 987 tery power. The proposed routing strategy is a 987  
 988 more natural choice in multihop wireless sensor 988  
 989 networks, which have high nodal density, and 989  
 990 where each node has only partial network (local) 990  
 991 information, limited power, and limited function- 991  
 992 ality. 992

993 We have outlined the meshed multipath dis- 993  
 994 covery and routing strategies. Performance of the 994  
 995 proposed protocol has been evaluated and com- 995  
 996 pared with the existing competitive approaches 996  
 997 analytically as well as via simulations. Our evalu- 997  
 998 ation has shown that although packet replication 998  
 999 (or limited flooding) over multiple paths has a 999  
 1000 higher packet level throughput compared to se- 1000  
 1001 lective forwarding, the latter requires much less 1001  
 1002 network resources for successfully delivering a 1002  
 1003 message. We have shown significant improvement 1003  
 1004 in throughput performance with the proposed 1004  
 1005 meshed multipath routing scheme over its node- 1005  
 1006 and link-equivalent disjoint multipath, without 1006  
 1007 consuming additional network resources. Overall, 1007  
 1008 the proposed meshed multipath routing with se- 1008  
 1009 lective forwarding achieves a superior perfor- 1009  
 1010 mance. 1010

## 7. Uncited reference 1011

[9] 1012

1013 **Appendix A. Calculation of  $P_s(2)$  in M-MPR-SF**1014  $P_{\lfloor \frac{H}{2} \rfloor, i+1}$ ,  $0 \leq i \leq \lfloor \frac{H}{2} \rfloor$ , is obtained from Eq. (9).

1015 BEGIN

1016 IF  $H$  odd,1017 FOR  $j = 1$  through  $\lfloor \frac{H}{2} \rfloor$ , with increment 2,

1018 
$$P_{\lfloor \frac{H}{2} \rfloor, j} \leftarrow \frac{P_{\lfloor \frac{H}{2} \rfloor, j} + P_{\lfloor \frac{H}{2} \rfloor, j+1}}{2} (1 - p_n^2)(1 - p_l)$$

1019 
$$P_{\lfloor \frac{H}{2} \rfloor, j+1} \leftarrow P_{\lfloor \frac{H}{2} \rfloor, j}$$

1020 end FOR

1021 IF  $\lfloor \frac{H}{2} \rfloor$  even,

1022 
$$P_{\lfloor \frac{H}{2} \rfloor, \lfloor \frac{H}{2} \rfloor} \leftarrow P_{\lfloor \frac{H}{2} \rfloor, \lfloor \frac{H}{2} \rfloor} (1 - p_n)(1 - p_l)$$

1023 end IF

1024 end IF

1025 FOR  $i = \lfloor \frac{H}{2} \rfloor + 1$  through  $H - 1$ , with increment 1,

1026 
$$P_{i,1} \leftarrow P_{i-1,1} (1 - p_n)(1 - p_l) + \frac{P_{i-1,2}}{2} (1 - p_n^2)(1 - p_l)$$

1027 
$$j \leftarrow H + 1 - i$$

1028 
$$P_{i,j} \leftarrow \frac{P_{i-1,j}}{2} (1 - p_n^2)(1 - p_l)$$

1029 
$$P_{i-1,j+1} (1 - p_n)(1 - p_l)$$

1030 FOR  $j = 2$  through  $H - i$ , with increment 1,

1031 
$$P_{ij} \leftarrow \frac{P_{i-1,j} + P_{i-1,j+1}}{2} (1 - p_n^2)(1 - p_l)$$

1032 end FOR

1033 end FOR

1034 
$$P_s(2) = P_{H-1,1} + P_{H-1,2}$$

1035 END

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**Swades De** received his B.Tech degree in Radiophysics and Electronics from University of Calcutta in 1993 and his M.Tech degree in Optoelectronics and Optical Communication from Indian Institute of Technology Delhi in 1998. During 1993–1997 he was a hardware development engineer and in the first half of 1999 he was a software engineer in different telecommunication companies in India. He is a Ph.D candidate in the Electrical Engineering Department at State University of New York at Buffalo. His current research inter-

ests include performance study, QoS routing and resource optimization in mobile ad hoc networks and wireless sensor networks, integrated wireless technologies, multipath routing in high-speed networks, and communications and systems issues in optical networks.



**Chunming Qiao** is an Associate Professor at the University at Buffalo (SUNY), where he directs the Lab for Advanced Network Design, Analysis, and Research (LANDER), that conducts cutting-edge research work on optical networks, wireless networks, and the Internet. He has published more than one hundred forty papers in leading technical journals and conference proceedings, and is recognized for his pioneering research on Optical Internet, in particular, the optical burst switching (OBS) paradigm. His work on integrated cellular and ad hoc networking systems (iCAR) is also internationally acclaimed and has been featured in *Businessweek* and *Wireless Europe*.

He is on the editorial board of several journals and magazines including *IEEE Communications* and *IEEE/ACM Transactions on Networking (ToN)*, and has guest-edited three *IEEE JSAC* issues. He has chaired and co-chaired many international conferences and workshops including the *High-Speed Networking Workshop* (formerly GBN) at *Infocom'01* and *Infocom'02*, *Opticomm'02*, and the symposium on *Optical Networks* at *ICC'03*.



**Hongyi Wu** is currently a tenure-track Assistant Professor at The Center for Advanced Computer Studies (CACs), University of Louisiana (UL) at Lafayette. He received his Ph.D degree in Computer Science from State University of New York (SUNY) at Buffalo in 2002. He received his M.S. degree from SUNY at Buffalo in 2000 and B.S. degree from Zhejiang University in 1996, respectively. He worked in Nokia Research Center in the summers of 2001 and 2000. His research interests include wireless mobile ad

hoc networks, sensor networks, the next generation cellular systems, and the integrated heterogeneous wireless systems. He has chaired the *Integrated Heterogeneous Wireless Networks* symposium in *VTC 2003*, and served as a technical program committee member of several conferences and the guest editor of *ACM MONET* special issue on *Integration of Heterogeneous Wireless Technologies*. He has published about two dozen technical papers in leading journals and conference proceedings, as well as a book chapter.