

Seasonal trajectories of plant-pollinator interaction networks differ following phenological mismatches along an urbanization gradient

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31 **1. Introduction**

32 Urbanization is one of the major global threats to pollinators and a main driver of plant-pollinator interactions (Harrison and Winfree 2015; Nieto et al. 2015), although cities can be important 33 hotspots for pollinators (Baldock et al. 2015; Theodorou et al. 2020). Local microclimate variability 34 (Hamblin et al. 2018), the availability of nesting sites (Wray and Elle 2014), and the type and 35 availability of foraging resources (Hülsmann et al. 2015) can shape pollinator communities in urban 36 37 areas. Moreover, modifications of the urban climate and urban landscapes can drive changes of plant phenophases and species distribution (Roetzer et al. 2000; Godefroid and Koedam 2007; 38 Wohlfahrt et al. 2019). Therefore, urban plant and pollinator communities can differ from 39 40 communities in (semi-)natural or rural areas in terms of phenology, abundance, richness and 41 composition (Deguines et al. 2012, 2016; Leong et al. 2016; Harrison et al. 2018). 42

A useful approach to studying effects of urbanization on plant and pollinator communities is to 43 study patterns of mutualistic interactions through the use of complex interaction networks. Studies 44 performed along diverse urban gradients have shown mixed results regarding the specialization of 45 interactions, reporting negative (Baldock et al. 2015), positive (Martins et al. 2017) or non-46 significant (Theodorou et al. 2017) relationships of specialization with the degree of urbanization. 47 48 However, pollinators always visited a higher diversity of flowering plants, but proportionally fewer 49 of the available species, in more urbanized areas (Baldock et al. 2015; Martins et al. 2017; Theodorou et al. 2017). In a study performed in France (Geslin et al. 2013), the number of 50 51 interactions decreased with increasing urbanization, while interactions were more evenly distributed in urban than in suburban and agricultural areas. Contrastingly, in a similar study in Germany (Udy 52 et al. 2020), the number of interactions varied along the gradient depending on the taxonomic 53 groups considered, and interaction evenness decreased with increasing urbanization. These results 54 55 underline a marked regional variability, likely related to a variety of historical, geographical and 56 climatic factors. Moreover, Wenzel et al. (2020) suggested that differential responses to

urbanization gradients among studies might be explained by their design. However, while networklevel metrics such as these are useful to understand general patterns of species interactions, they
may overlook significant differences at lower structural levels (Baker et al. 2015). To date,
thorough analyses on species roles and on the distribution and diversity of their interactions within
plant-pollinator networks have not yet been performed in urban environments.

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63 Plant-pollinator interaction networks are also highly dynamic in time (Olesen et al. 2008; Poisot et al. 2015). Temporal changes in floral resource availability and pollinator abundance shape the 64 patterns of interactions and network topology (Bendel et al. 2019; Bramon Mora et al. 2020; 65 66 CaraDonna and Waser 2020; Guzman et al. 2021). In particular, species phenology is a major driver 67 of interaction networks, as it plays a key role in determining the probability and intensity of interactions (Carter et al. 2018; de Manincor et al. 2020), the structure and properties of interaction 68 69 networks (Vázquez et al. 2009; Encinas-Viso et al. 2012; Arroyo-Correa et al. 2021), and the role of species within networks (Ponisio et al. 2017). Any modification in the phenology of one or both 70 partners caused by external factors, such as the local climate, has therefore the potential to affect the 71 outcome of their interactions. However, empirical evidence of the effect of phenological changes on 72 73 the structure of plant-pollinator networks in urban environments has not been reported yet.

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75 Urban areas can contain diverse floral resources and act as refuges for pollinators, thus offering important opportunities for their conservation (Hülsmann et al. 2015, Hall et al. 2017). The study of 76 77 interaction networks can be a useful tool to guide and assess conservation and management strategies (Kaiser-Bunbury et al. 2010a; Tylianakis et al. 2010). Describing the distribution and 78 79 diversity of interactions can help identify vulnerabilities and strengths of networks, and recommend guidelines for the development of targeted conservation measures (Kaiser-Bunbury and Bluthgen 80 2015). Identifying species that interact directly or indirectly through shared partners with numerous 81 82 other species makes it possible to determine which plants or pollinators play central roles in

maintaining network connectivity and cohesion (Martín González et al. 2010). On the other hand,
identifying species with only one or a few interaction partners can be important for targeting
conservation actions to facilitate rare or specialist species. For example, careful selection of plant
species in urban environments (Garbuzov and Ratnieks 2014; Lowenstein et al. 2019; Staab et al.
2020) and the maintenance of diverse habitats (Baldock et al. 2019) can enhance the conservation of
urban pollinators.

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Here we analyse how the structure of plant-pollinator interaction networks changed between spring 90 and summer along an urbanization gradient in the metropolitan area of Lille, France. Strong 91 92 phenological mismatches between plants and their pollinators have been previously observed along 93 this gradient, where flowering peaked significantly earlier in the season in more urbanized areas while flight phenology did not differ among pollinator communities (Fisogni et al. 2020). Because 94 95 phenological mismatches can affect patterns of interactions between mutualistic partners, we expect trends in network structure to change along the urbanization gradient according to the availability of 96 flower resources. Specifically, we ask (i) how does the structure of plant-pollinator interaction 97 networks change along an urbanization gradient? and (ii) how do species roles within networks and 98 99 patterns of interactions change through time along a gradient where the phenology of plant and 100 pollinators showed different responses? To survey comparable sites in terms of plant communities, while differing in the urban environment, we compared sites that were managed by local 101 practitioners with standardized native plant seed mixes along a gradient of importance of 102 103 impervious surfaces. This is an emerging method of managing green spaces in cities, which allows higher comparability among studies from different geographical areas. 104

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To comprehensively understand the changes that have taken place in networks over space and time,
we approach these questions on multiple levels. First, we assess how general patterns of interaction
density and distribution (i.e., connectance, evenness, specialization) varied among networks. Such

an analysis at the macroscopic scale allows a direct comparison with the existing literature on urban 109 110 pollination networks (Geslin et al. 2013; Baldock et al. 2015; Theodorou et al. 2017; Martins et al. 2017; Udy et al. 2020). Second, we detail how species interactions are distributed within networks 111 by looking for species clusters. Such an analysis allows to highlight groups of species that interact 112 in similar ways and therefore potentially undergo similar ecological processes along the space-time 113 gradient. Third, we assess changes in the centrality and position of species within motifs, and in the 114 115 interaction paths between them within each network. Finally, we tackle how urbanization influences α - and β -diversity of plants, pollinators, and their interactions. Considering different levels of 116 complexity allows us to get a more accurate picture of the spatio-temporal trajectories of interaction 117 118 networks along the urban gradient. We draw from our results to discuss implications for nature conservation and land-use management in urban areas. 119

120

121 **2. Methods**

122 *2.1. Study sites*

This study was performed in the Métropole Européenne de Lille (MEL), in Northern France, an 123 area historically subject to prolonged and strong anthropogenic pressure (Toussaint et al. 2008; 124 125 Hautekèete et al. 2015; Insee 2017). We collaborated with the MEL Parks and Gardens Services to find meadows with public access that have been managed in the same way for at least two years 126 127 prior to our study conducted in 2017. We thus chose sites that had been sown between 2010 and 2015 with the same standardised seed mix including only native and perennial herbaceous plants 128 native to the region (purchased from Ecosem, Corroy-le-Grand, Belgium; list of species in Table 129 130 A1). Sites had different sizes and irregular shapes, and were sown throughout their surface with the 131 standardized seed mix (Table A2). All sites were left free to develop throughout the sampling period until the beginning of July, when they were all mown for management purposes. Among the 132 available sites, we selected 12 sites about 1 km apart from each other to avoid overlapping flight 133 ranges for most pollinators, and equally divided them into three classes of urbanization (Fig. 1). 134 Classes were based on the percentage of impervious areas within a 500 m buffer around each site: a 135 low urbanization class (< 50 %), a medium urbanization class (between 50 % and 70 %), and a high 136 urbanization class (\geq 70 %). To standardize the measurement of urbanization degree among sites, 137 138 buffers were drawn around the edges of the sites (i.e., size and shape of sites did not affect the surface considered within the buffers). A buffer of 500 m is sufficient to include the estimated 139 maximum foraging distance of most wild bees and hoverflies species (Wratten et al. 2003; 140 141 Zurbuchen et al. 2010; Wright et al. 2015), and comprises the maximum distance at which successful pollen transfer may be expected in urban areas (Van Rossum and Triest 2010). 142 Impervious areas (i.e., buildings, roads, parking lots, commercial and industrial areas, railroads) 143 were defined at a 5 m resolution on the basis of GIS analysis (ArcGIS version 10.4, ESRI, 2011) of 144 a pre-existing land-use map for the *Métropole Européenne de Lille* (OCS2D, Agence de 145

développement et d'urbanisme de Lille Métropole (ADULM), 2016) and photo interpretation ofaerial photographs taken in 2015 (www.ppige-npdc.fr).

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149 *2.2. Field sampling*

We visited each site every other week from the beginning of April to the end of June 2017, for a 150 total of 69 sampling events (six samplings per site, except three sites that were sampled five times 151 152 due to bad weather). The temporally limited sampling period was dictated by management measures for urban green areas, where local practitioners usually mowed plants during summer (i.e., July) to 153 avoid an overgrowth of grasses and to favour blooming in the following season. We visited three 154 155 sites per day on four consecutive days, starting sampling trials around 11 am, 1 pm and 3 pm at 156 each site, respectively, to encompass daily variability of insect activity. The order of visits was swapped among sites each sampling day to account for daily variability of temperatures and insect 157 behaviour. Sampling was carried out on days with low wind, low cloud cover and average air 158 temperatures higher than 15°C (April) or 20°C (May, June). The same two people sampled each site 159 for 45 minutes throughout the season, walking randomly throughout the site and capturing all bees 160 (Hymenoptera: Anthophila) and hoverflies (Diptera: Syrphidae) visiting open flowers, and 161 recording the observed interactions. We focused on these groups because they included the vast 162 163 majority of floral visitors in the study sites and are the major pollinators at middle European latitudes (Ballantyne et al. 2017; Ollerton 2017), although other taxa might frequently visit plants in 164 urban areas (e.g., Baldock et al. 2019). Sampled insects were individually placed into plastic tubes 165 166 (Falcon, Dutscher) containing strips of paper soaked in ethyl acetate, and later pinned in the laboratory. Each individual was identified at the genus level by AF and at the species level by 167 expert taxonomists (full list in the Acknowledgements section). Specimens are deposited at the EEP 168 laboratory at the University of Lille. Flowering plants were identified at the species level by AF, 169 NH and YP with the help of a dichotomous key (Lambinon et al. 2004). 170

172 *2.3. Data analysis*

173 2.3.1. Interaction matrix construction

All analyses were performed using R v. 3.4.3 (R Core Team 2019) and the associated script can be 174 found at https://zenodo.org/record/5570297. To analyse the spatial and temporal dimensions of 175 176 plant-pollinator networks, we constructed different weighted interaction matrices for bipartite networks (i.e., networks comprising two levels of species which only interact between levels, not 177 within) in which the value in the cell at row 'a' and column 'p' represents the number of visits of 178 pollinator species 'a' to plant species 'p' in a given observation period. Because mean species 179 turnover between sites in the same urbanization class was low for both plants and pollinators (see 180 181 Table A3 for values and distributions), we aggregated data from the four study sites within each 182 urbanization class to increase the statistical robustness of network analyses. First, we built one overall pollinator-by-plant visit matrix for each urbanization class considering the complete three-183 184 month study period. Then, we built three monthly (April, May, June) pollinator-by-plant visit matrices for each urbanization class. This subdivision was made to obtain robust networks 185 sufficiently dense to correctly represent the marked temporal changes of flowering phenology and 186 diversity previously observed along the studied gradient (Fisogni et al. 2020). Moreover, because 187 we only aggregated data collected from two consecutive sampling events within each month, 188 189 species turnover was low for both plants and pollinators (Table A3). Although some 'forbidden links' (i.e., constraints due to the absence of species in urbanization classes at any given moment; 190 Jordano et al. 2003) were potentially created, these should only marginally affect the analyses used 191 192 here. The urbanization gradient was thus characterized by three overall networks (one per urbanization level), and nine monthly networks (three per urbanization level), that allowed to 193 analyse changes in network structure and species roles over the time × space dimensions here 194 considered. 195

196

197 2.3.2. Network-level metrics

For each network, we calculated three widely used metrics: (i) network connectance, i.e., the 198 199 proportion of realised links among all possible ones; (ii) interaction evenness of weighted links, 200 based on Shannon's diversity (Blüthgen et al. 2008); (iii) specialization at the whole network level (H2'), a Shannon entropy index that varies between 0 (complete generalization) and 1 (complete 201 202 specialization; Blüthgen et al. 2006). Network specialization was calculated using the R package 'bipartite' (Dormann et al. 2008). To evaluate if these metrics varied significantly across space 203 204 (urban classes) or time (months), we compared differences in observed values with those obtained by permutation-based null models assuming random location or timing of visits: for each network 205 pair to compare, we pooled together the two networks, we kept constant the number of visits in each 206 207 one, and we re-sampled the visits by randomly shuffling them between the two networks (R script 208 available at https://zenodo.org/record/5570297). We then compared the observed absolute difference in the metric of interest to its distribution given by 10,000 permutations of visits between 209 210 networks to look for significant differences. The *P*-values of these tests were obtained by computing the permutation-based probability of drawing an absolute difference larger than the 211 observed value. These metrics describe general patterns of interactions within networks, and 212 underline fundamental structural properties of the entire plant-pollinator communities. 213

214

215 *2.3.3. Clustering of species in the network*

216 To analyse non-random associations of subgroups of species in the three urbanization classes (i.e., clusters of highly interacting species), we applied latent block models (LBMs) on weighted 217 218 networks using the R package 'blockmodels' (INRA and Leger 2015). LBMs are probability-based models that allow to simultaneously cluster rows (here pollinator species) and columns (here plant 219 species) based on latent blocks which determine model parameters – in our case, the mean number 220 of visits per insect-plant pair following a Poisson distribution (Govaert and Nadif 2008; Keribin et 221 222 al. 2015; Thomas et al. 2015). LBMs are the most efficient method to retrieve the number and the 223 composition of subgroups in weighted bipartite networks (Leger et al. 2015). Following the

inference of blocks, a rearranged incidence matrix was generated for each time period and
urbanization class to highlight homogeneous blocks of plant and pollinator species. This analysis
shows how plants and pollinators are divided into subgroups including species that interact in a
similar way at any point in time and space.

228

229 2.3.4. Species centrality within networks

230 For each plant and pollinator species, we calculated their centrality using the eigenvector centrality score (Bonacich 1972) in order to assess their position with respect to the whole network, using the 231 R package 'igraph' (Csardi and Nepusz 2006). This measure is a true node-centrality when 232 233 normalized using the Euclidean norm (Ruhnau 2000), and is much less correlated with species 234 degree (i.e., the number of links per species) than betweenness centrality (Koschützki and Schreiber 2004). Eigenvector centrality depends on the number and quality of links, roughly giving to each 235 species a score proportional to the sum of the scores of its neighbours (Newman 2010). 236 237 Standardized centrality scores vary between 0 (low centrality) to 1 (high centrality). To evaluate whether species rank based on centrality changes among urbanization classes across all the season, 238 we used Spearman's rank-order correlation tests for both plant and pollinator species. Centrality 239 quantifies how connected species are with each other. Central species are highly connected to 240 241 species that are themselves interconnected, and are therefore important for network structure and 242 stability.

243

244 2.3.5. Direct and indirect interactions

To describe network structure in terms of direct and indirect (species not directly interacting but connected through paths of common interacting species) interactions, we used the motif analysis proposed by Simmons et al. (2019a) for bipartite mutualistic networks implemented in the R package 'bmotif' (Simmons et al. 2019b). Motifs are sets of nodes connected by a given pattern of edges, e.g., motif 2 (Fig. A1) comprises one pollinator node and two plant nodes, both of them

connected to the pollinator node. The motifs we considered comprise between two and six species 250 251 (nodes), as this is the most common size used in bipartite networks to achieve a good compromise between motif sophistication, mathematical tractability, and computation time (Simmons et al. 252 2019a), and all possible interaction patterns between them. Within a single motif, species occupy a 253 unique position (in Fig. A1, the 44 possible six-node motifs and the 148 unique species positions 254 are represented). The general idea behind the study of motifs within networks is that comparing 255 256 motif counts with expectations from random network models will help assess which interaction patterns are associated to each environmental condition (here, urbanization classes), and thence 257 formulate ecological hypotheses as to why, e.g., some more asymmetric motifs can be more 258 259 prevalent in rural than in urban context (Stouffer et al. 2007; Simmons et al. 2019a; Ouadah et al. 2021). Motif counts can also be considered as a "signature" of networks which can help compare 260 them without having to resort to actual species identity (i.e., connection patterns can be compared 261 262 using motifs even if no species are shared between networks).

263

First, we decomposed the seasonal and the monthly networks in all urbanization classes in their 264 constituent motifs and we calculated the frequency with which each motif occurred. We normalised 265 motif frequencies using the number of sets of species that could potentially form a given motif 266 267 (Simmons et al. 2019b). Second, we calculated the frequency with which each species occurred in 268 each position to describe species roles within motifs. We used sum-normalisation to divide position counts for each node by the total number of times that node appears in any position (Simmons et al. 269 270 2019b). A species role was thus defined by this normalized vector of position counts. To evaluate if motif frequency and species roles within motifs varied between months and urbanization classes, 271 we performed the non-parametric multivariate analysis of variance advocated by Anderson (2001) 272 using the function 'adonis2' in the R package 'vegan' (Oksanen et al. 2019) with 1000 permutations 273 274 and Mahalanobis distance to account for covariance between motif positions in multivariate space 275 (De Maesschalck et al. 2000). To simplify the visual representation of multivariate (i.e., spatialtemporal) patterns of motif positions, we performed a Principal Component Analysis (PCA) in the
'ade4' R package (Dray and Dufour 2007).

278

279 2.3.6. Species and interaction diversity

To measure the diversity of species (i.e., nodes) and interactions (i.e., links) across the spatial and 280 temporal scale, we used the framework proposed by Ohlmann et al. (2019), implemented in the R 281 282 package 'econetwork' (Dray et al. 2019). We calculated Hill numbers with q = 1 (corresponding to the exponential of Shannon's entropy) on species and interaction abundances to measure α -diversity 283 in each of the seasonal and monthly networks. To measure dissimilarities in species and link 284 285 abundances between urbanization classes in the different months, we computed pairwise Horn dissimilarities, which are built from Hill numbers of order q = 1 (Ohlmann et al. 2019). We chose 286 Hill numbers of order 1 because they weight rare and abundant species equally well (i.e., in 287 proportion to their frequency in the community), while Hill numbers of order 0 do not count species 288 abundances (i.e., they are equal to species richness), and Hill numbers of order 2 favour abundant 289 species and discount rare species (Chao et al. 2014). Spatial and temporal variation of species and 290 interaction dissimilarity were visualised using a Principal Coordinate Analysis (PCoA) in the 'ade4' 291 R package (Dray and Dufour 2007). These analyses show how patterns of α - and β -diversity of the 292 293 plant and pollinator communities and of their interactions are affected by different levels of urbanization. 294

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All *p*-values were adjusted using the Benjamini and Hochberg method to control the false discoveryrate (Verhoeven et al. 2005).

298

299 **3. Results**

300 *3.1. Overall plant-pollinator interactions*

At the end of the sampling season in the 12 study sites, we had sampled a total of 56 plant species 301 and 121 pollinator species (full list of species in Tables A1, A4), accounting for 2,630 plant-302 pollinator visits overall. The number of interactions was lowest in April and highest in June in all 303 urbanization classes (Fig. 2). The number of interactions increased through the season at low (Fig. 304 305 2a) and medium (Fig. 2b) urbanization, while they showed a marked increase between April and May at high urbanization level (Fig. 2c). The total number of interactions was similar among the 306 three urbanization classes (N = 846, N = 929 and N = 855 at low, medium and high urbanization, 307 308 respectively).

309

Centaurea jacea and Leucanthemum vulgare were the most abundant (Table A1) and the most 310 visited species overall, accounting for around 35 - 50% of all visits in each urbanization class. In 311 addition to these, only five other plant species received more than 5% of pollinator visits in at least 312 one urbanization class (Table 1): species that received > 5% of pollinator visits overall accounted 313 for a total of > 60% of all recorded visits in all urbanization levels (Table 1). These plant species 314 hosted more than 77% of the recorded pollinator species at low and medium urbanization levels, 315 316 and 66% of the recorded pollinator species at high urbanization level (Table 1). The overall highest number of visits was observed for the bee family Apidae (N = 1494), followed by the diptera 317 Syrphidae (N = 457). Bees of the family Halictidae and Andrenidae had similar number of 318 319 interactions (N = 211 and N = 199, respectively), followed by Megachilidae (N = 141) and Colletidae (N = 128). The contribution of each pollinator family to the observed interactions varied 320 through time (Fig. A2). 321

322

323 *3.2. Network-level metrics*

324 *3.2.1. Overall spatial variability*

Overall, connectance was significantly higher at medium (0.091) than at low (0.078) urbanization (from null model comparisons: P < 0.05), while no differences were found between low or medium urbanization and high urbanization level (0.086). Interaction evenness was similar among all urbanization classes (0.578, 0.589 and 0.586 at low, medium and high urbanization, respectively),as well as network level specialization (H2': 0.396, 0.392 and 0.369 at low, medium and highurbanization, respectively). Seasonal bipartite networks are shown in Fig. A3. All delta and *P*values are reported in Table A5.

332

333 *3.2.2. Spatial variability within months*

Connectance was significantly higher at low than at high urbanization level in April, while it was lower at low than at both medium and high urbanization levels in May (Fig. 3). Interaction evenness was comparable among urbanization levels in all months (Fig. 3). Network specialization (H2') was comparable among urbanization levels in April, while it was higher at medium than at both low and high urbanization levels in May, and it was higher at high than at low urbanization level in June (Fig. 3). All delta *P*-values are reported in Table A5.

340

341 *3.2.3. Temporal variability within urbanization classes*

342 Connectance always decreased through time except at low urbanization where it decreased in May and increased back in June, with significant differences between April and June at all urbanization 343 levels (Fig. 3). Interaction evenness showed the same trend in the three urbanization classes, with 344 345 lower values in June than in both April and May at all urbanization levels (Fig. 3). Network specialization (H2') was significantly lower in May and June compared to April at low urbanization 346 level (Fig. 3), while no significant differences were found among months at medium urbanization 347 level and H2' was only marginally significantly higher in June than in April and May at high 348 urbanization level (Fig. 3). Monthly bipartite networks are shown in Fig. A4–6. All delta and P-349 350 values are reported in Table A6.

351

352 *3.3. Clustering of species in the network*

LBMs retrieved several cohesive groups for both plant and pollinator species in all urbanization classes and time periods. Considering the overall season, super-generalist species with long phenology tended to cluster alone or with one or two other species, while more specialist species with overlapping phenology clustered in medium-sized blocks. Infrequent species with different phenology were included in large blocks (Fig. A7).

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The composition of cohesive groups in monthly networks was mainly driven by the level of species 359 360 generalization and by the number of interactions (Fig. A8–10). A few groups corresponded to 361 oligolectic foraging behaviour in pollinators (e.g., the bees Anthidium manicatum and Megachile willughbiella at medium urbanization and Colletes daviesanus at high urbanization in June, Fig. 362 A9–10). The hoverfly species Eristalis tenax and Sphaerophoria scripta were generally included in 363 large clusters in April and in smaller clusters as the season advanced. In particular, both species 364 were included within the same cluster in June at all urbanization classes, where they mainly visited 365 abundant and long-flowering plant species (e.g., C. jacea, L. vulgare, A. millefolium; Fig. A8-10). 366 A strong reorganisation of blocks between urbanization classes was highlighted in April. 367 368 Taraxacum sect. ruderalia formed an individual cohesive block at low and medium urbanization, being visited by most of the observed pollinator species, while it was included in a block with two 369 other plant species at high urbanization level because of a higher number of shared interactions with 370 371 other plant species (Fig. 4a-b). Anthophora plumipes and Bombus pascuorum were included in the same cohesive group at low and medium urbanization level, while they were split into two different 372 groups at high urbanization level following changes in their foraging choices (Fig. 4a–b). 373

374

375 *3.4. Species centrality within networks*

Considering the overall season, super-generalist species with long phenology were the most central
in all urbanization classes (e.g., *C. jacea* and *L. vulgare* for plants, *Bombus lapidarius*, *B. terrestris*, *B. pascuorum*, *Apis mellifera* and the hoverfly *Sphaerophoria scripta* for pollinators, Fig. A11).

Monthly networks generally showed the same patterns, with different generalist plant and pollinator species having the highest centrality scores depending on month and urbanization class (Fig. A12– 14). Similar to LBMs, clear changes in species centrality scores between urbanization classes were highlighted in April. *Taraxacum* sect. *ruderalia* was the only central species at low and medium urbanization levels, while it shared high centrality scores with other species at high urbanization level (Fig. 4c). *Eristalis tenax* and *S. scripta* had comparably high centrality scores in June throughout the gradient (Fig. A12–14).

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The rank of species eigenvector centrality scores was not significantly correlated between urban classes for plants (low *vs.* medium: Spearman's $\rho = 0.14$, P = 0.44; low *vs.* high: $\rho = 0.09$, P = 0.62; medium *vs.* high: $\rho = -0.19$, P = 0.31) and for pollinators (low *vs.* medium: $\rho = 0.17$, P = 0.14; low *vs.* high: $\rho = 0.02$, P = 0.84; medium *vs.* high: $\rho = 0.09$, P = 0.44). In other words, the centrality of both plant and insect species varied quite substantially between urban classes.

393

394 *3.5. Direct and indirect interactions*

Motif frequency was not significantly different among urbanization classes (Adonis: F = 1.02, P = 0.49) or months (Adonis: F = 0.75, P = 0.99). Plant species positions (i.e., roles) within motifs changed significantly among urbanization classes (Adonis: F = 2.20, P = 0.001) and among months (Adonis: F = 2.39, P = 0.001). Plant roles were more different between high urbanization and both low and medium urbanization classes in April than in the other months (Fig. 5a, A15a). The first PCA axis distinguished motifs including specialist plant species that had indirect interactions with both other plant and pollinator species, from motifs with generalist plant species with few indirect interactions with other plant species only. The second PCA axis distinguished motifs including
generalist plant species that shared the same pollinator species, from motifs with super-generalist
plant species that had few indirect interactions with other plant species only (details in Fig. A16a).

406 Pollinator species positions within motifs also changed significantly among urbanization classes (Adonis: F = 3.95, P = 0.001) and among months (Adonis: F = 4.81, P = 0.001). Pollinator roles 407 408 showed the highest temporal variability in the low urbanization class, while they showed limited temporal variability in the medium and especially high urbanization classes (Fig. 5b, A15b). The 409 first PCA axis opposed specialist pollinators with indirect interactions with both plants and 410 411 pollinators to super-generalist pollinator species with indirect interactions with other pollinators 412 only. The second PCA axis opposed peripheral specialist pollinators with indirect interactions with both plants and pollinators to specialist pollinators visiting a same super-generalist plant species 413 (details in Fig. A16b). 414

415

416 *3.6. Species and interaction diversity*

417 Species α -diversity slightly decreased from low to high urbanization class, while the diversity of 418 network interactions was constant among urbanization classes when considering the overall season 419 (Fig. A17). Monthly species α -diversity was quite constant at high and medium urbanization 420 classes, while it was more variable at low urbanization with the lowest diversity found in April and 421 the highest diversity in May (Fig. A18a). Interaction α -diversity showed similar patterns in the three 422 urbanization classes, with lowest diversity in April and highest diversity in May (Fig. A18b).

423

PcoA highlighted high species dissimilarity between low urbanization and both medium and high
urbanization classes in April and May, while dissimilarity was lower among the three urbanization
classes in June (Fig. 6a). A similar pattern was observed for the dissimilarity of interactions, except
for a higher diversity between medium and high urbanization classes in April (Fig. 6b). The first

- 428 principal axis highlighted a similar temporal trajectory of dissimilarities for both species and
- 429 interactions, with a more gradual dissimilarity observed in sites at low urbanization compared to
- 430 sites at medium and high urbanization (Fig. 6a–b).

431 **4. Discussion**

432 Here we showed that asymmetric changes in plant phenology affected the temporal dynamics of plant-pollinator interaction networks in different ways along an urbanization gradient. We found 433 limited variability in the macroscopic network structure along the urbanization gradient. Fewer and 434 435 more specialized interactions occurred at urban than at peri-urban sites in early summer, coinciding with reduced resources available to pollinators driven by advanced flowering phenology. When 436 437 considering species roles, we found common patterns shared throughout the gradient. Longflowering generalist plants were visited by different types of pollinators along the season, providing 438 a basic resource for both specialists and generalists with varying flying phenology. Moreover, both 439 440 plants and pollinators with long phenology were highly central to all networks, even though their 441 identity changed throughout the season and gradient. This suggests that such species are important to guarantee network stability, regardless of resource availability and changes in species phenology. 442 443 The significant advancement of flowering in urban sites (Fisogni et al. 2020) increased the presence of long-flowering species throughout the study period, which led to similar interaction patterns 444 between spring and summer. Conversely, higher temporal species turnover led to increased 445 interaction diversity and stronger temporal dynamics at low-urbanization sites over the season. 446 These results suggest that favouring diverse flowering communities in urban areas, including early-447 448 flowering species, can be an effective strategy to support the local pollinator fauna in artificial environments. 449

450

451 *4.1. Network-level structure*

452 Considering the whole sampling period, we did not find any significant variation in the level of 453 network specialization along the urbanization gradient. These results are in accordance with 454 Theodorou et al. (2017) but in contrast with both Baldock et al. (2015), who found higher 455 specialization in farmlands than in urban areas, and Martins et al. (2017) who found higher 456 specialization in suburban than semi-natural areas. Moreover, we found comparable interaction

evenness across the gradient, in contrast with both Geslin et al. (2013) and Udy et al. (2020) who 457 458 found increasing and decreasing evenness with increasing urbanization, respectively. These discrepancies among studies suggest the presence of regional variability of plant-pollinator 459 networks in response to different gradients of urbanization. However, because such studies use 460 461 different experimental designs and plant communities (e.g., comparing urban vs either agricultural areas or suburban gardens), comparison of results and extrapolation of urbanization effects may be 462 463 limited (Wenzel et al. 2020). Here, we surveyed similar plant communities in order to highlight the effect of phenological shifts on mutualistic partners along the urbanization gradient. When 464 comparing whole-season networks, we agree with Baldock et al. (2015) and Wenzel et al. (2020) 465 466 that the ecological quality of the sites, including non-native plant species richness, might drive the 467 observed patterns. However, differences might be expected along the season, due to the asymmetry in phenological shifts of the mutualistic partners alone. 468

469

Monthly networks showed moderate temporal variation, with two general patterns that can be 470 recognised. First, connectance has decreased over time, consistent with the fact that the number of 471 visits has not increased as fast as the number of species, and interactions were less evenly 472 distributed among species later in the season. Less connected networks can be less functionally 473 474 robust (Kaiser-Bunbury and Blüthgen 2015), potentially increasing their fragility as the season advances. Second, specialization showed two opposite patterns: networks became more generalised 475 at low urbanization and more specialised at high urbanization later in the season, following changes 476 477 in floral resource availability. A smaller proportion of resources used by pollinators in urban areas could reduce pollination efficiency by reducing pollen flow, while at the same time increasing 478 pollination efficiency through reduced heterospecific pollen deposition (Briggs et al. 2016). 479 Although we could not relate changes in network metrics to plant reproductive success, to date no 480 clear relationship between increased network specialization in urban areas and pollination success 481 482 has been found (Theodorou et al. 2017).

483

484 *4.2. Interaction homogeneity*

Super-generalist plant species with long phenology acted as temporal connectors within cohesive 485 blocks of highly interacting species (Fig. A7). Pollinators with short flight periods may have time 486 487 constraints and rely heavily on these plants because of overlapping phenology; at the same time, pollinators with longer flight periods can use these plants as a constant resource for pollen or nectar 488 489 within a context of rapid turnover of other floral resources (Ogilvie and Forrest 2017). Similarly, long-flowering generalist plants can be critical in providing pollen to some oligolectic pollinators, 490 as well as in supplying a basal amount of nectar and pollen to polylectic bees and hoverflies that 491 492 rely on different resources for their sustenance (Pellissier et al. 2012; Larson et al. 2014; Lundgren 493 et al. 2015).. Therefore, long-flowering plant species can mitigate potential negative impacts due to asymmetric changes in the phenology of plants and pollinators, as observed along the studied 494 495 gradient (Fisogni et al. 2020), by providing flower resources more consistently throughout the season (Salisbury et al. 2015; Deguines et al. 2016). These species can therefore act as a lifeline in 496 fast changing "food landscapes" and should be included in management plans of urban green areas. 497

498

499 *4.3. Species centrality within networks*

500 Long-flowering generalist plants and generalist pollinators with long flight periods were the most 501 central throughout the gradient, highlighting their key roles in seasonal and monthly networks. However, in both cases the same species could rank differently depending on the level of 502 503 urbanization. Generalist species are usually central in mutualistic networks and are therefore important for maintaining their structure and cohesiveness, being at close distance to several species 504 505 in the network and connecting different sub-groups of interacting species (Martín González et al. 2010; Sazima et al. 2010). Our results suggest that the presence of several generalist species that 506 507 "replace one another" throughout the season is a potential asset to guarantee network stability, as 508 different species can play the same central role in different periods. Moreover, the marked temporal

dynamics observed in a relatively limited time period emphasize the importance of considering different temporal scales to identify changes in the centrality of species.

511

509

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Some pollinator species became more central throughout the urbanization gradient as the season 512 advanced. This pattern was driven by the widespread availability of long-flowering generalist 513 species, which buffered phenological shifts (i.e., advanced flowering) in more urbanized areas and 514 515 the consequent reduction in the availability of short-flowering species (Fisogni et al. 2020). However, strong rearrangements in network structure and species centrality related to plant 516 phenological shifts were observed throughout the urbanization gradient early in the season. For 517 518 example, the large generalist bees *B. pascuorum* and *A. plumipes* stopped visiting *Taraxacum* flowers in the presence of a wider array of plants in urban sites (Fig. 4), likely to reduce 519 interspecific foraging competition (Fründ et al. 2013; Carvalho et al. 2014) and to find more 520 521 suitable pollen resources (Génissel et al. 2002; Rasmont and Dehon 2015).

522

534

523 4.4. Direct and indirect interactions

Motif analysis indicated that plant and pollinator species positions changed significantly through 524 time and space along the urbanization gradient, highlighting changes in the frequency of direct and 525 526 indirect interactions. Low-urbanization sites showed higher temporal variability than medium- and especially high-urbanization sites, likely due to the asymmetric shifts in plant phenology occurred 527 along the gradient (Fisogni et al. 2020). The advanced flowering in urban areas reduced the 528 529 presence of short-flowering species early in the season while increasing long-flowering species throughout the study period, leading to more homogeneous interaction dynamics between plants 530 and pollinators over the season (Olesen et al. 2008). By contrast, the higher temporal species 531 turnover in sites at low urbanization led to greater differences in species roles within motifs 532 between spring and summer. 533

23

Plants mostly acted as generalists hosting specialist pollinators and were mainly involved in direct 535 536 interactions in April at medium and low urbanization. The limited floral resources available to pollinators have likely increased specialist interactions, even though none of the pollinators were 537 true oligolectic species (Table A1). However, plants acted as both generalists and specialists and 538 were connected to other plant species through several indirect interactions at high-urbanization sites 539 in April, as well as throughout the gradient in May and June. Differences in species positions along 540 541 the gradient early in the season imply potentially different vulnerabilities among sites under different urban pressures. The loss of super-generalist plants hosting specialist pollinators can 542 potentially disrupt entire networks in less urbanized areas (Memmott et al. 2004; Martín González 543 544 et al. 2010). Conversely, an increase in complex interactions in more urbanized areas can partially 545 buffer the loss of some species and increase robustness of networks, especially if species are able to switch interaction partners (Kaiser-Bunbury et al. 2010b; Burkle et al. 2013). 546

547

548 4.5. Species and interaction diversity

We did not observe marked variations in species or interaction α -diversity among urban classes 549 throughout the whole sampling period. However, we detected variations in both species and 550 551 interaction α -diversity when considering temporal variability. At low urbanization, both species and 552 interaction α-diversity were lowest in April and highest in May. A similar trend was observed for interaction α -diversity in medium and high urbanization sites, while species α -diversity was 553 constant throughout the study period. This pattern was mainly driven by the advanced flowering in 554 555 urban areas (Fisogni et al. 2020), that increased the availability of floral resources early in the season. The temporal variation of interacting partners highlighted by bipartite networks and species 556 clustering indicates that rewiring of species interactions played a major role in defining temporal 557 interaction diversity. 558

559

Both species and interaction dissimilarity showed similar temporal trajectories. Low-urbanization 560 sites were more dissimilar to medium- and high-urbanization sites in April and May, and more 561 similar in June. These results are in accordance with changes in species positions within network 562 motifs. As for motifs, asymmetric shifts of plant flowering phenology have likely influenced the 563 temporal dynamics of species and interaction dissimilarity throughout the gradient. The marked 564 differences in the availability of interacting partners and the consequent rewiring of interactions in 565 566 April increased the spatial dissimilarity early in the season, while the presence of more homogeneous communities increased species and interaction similarity later in the season. 567

568

569 4.6. Conservation perspectives

570 We found only two oligolectic bee species. Hoplitis adunca (Family Megachilidae) collects pollen only from species in the genus Echium (Family Boraginaceae), while Hylaeus signatus (Family 571 572 Colletidae) collects pollen from the two related species Reseda lutea and R. luteola (Family Resedaceae). Not surprisingly, these bee species were found at the only sites where the host plants 573 were present. This simple result shows how managing green areas by planting target species can be 574 a key factor in facilitating the presence of specialist bees. Moreover, both H. adunca and E. vulgare 575 576 are thermophilic species that could be favoured by higher temperatures in urban environments 577 (Hofmann et al. 2018), further ensuring their persistence and potentially their dispersal.

578

Our results add to the growing evidence underscoring the importance of *Taraxacum* as a foraging resource for pollinators (e.g., Lázaro and Totland 2010; Larson et al. 2014). *Taraxacum* is a good nectar and pollen resource (Hicks et al. 2016). In our study *Taraxacum* was a key host plant for early flying pollinators in low and medium urbanization sites, when other flowering species were scarce, while its scarcity together with increased plant diversity caused major interaction rewiring in high urbanization sites. Maintaining and promoting the presence of *Taraxacum*, for example by avoiding mowing at the beginning of the flowering season, can be important to support pollinator communities throughout the urban gradient, and to increase the robustness of plant-pollinatorinteraction networks (Baldock et al. 2019).

588

Typically, gardens composed by standard seed mixes are dominated by a few species and lack 589 590 early-flowering plants, even if species composition can vary regionally (Hicks et al. 2016). These few species usually contribute the most to nectar and pollen production, and are the most important 591 592 to attract pollinators (Hicks et al. 2016; Warzecha et al. 2018). We found that the abundant and 593 resource-rich plants L. vulgare and C. jacea (Rusterholz and Erhardt 1998; Hicks et al. 2016) were the most visited across the whole urbanization gradient by bees and hoverflies. However, both 594 595 species flowered later in the season, leaving a gap in floral resource availability in April, especially 596 at low urbanization. While plants in the surrounding areas likely play an important role in providing nectar and pollen, there is certainly room for improvement in the design of seed mixes by including 597 598 more early-flowering native species to support the early-flying pollinators.

599

600 *4.7. Limitations of the study*

This study only includes data for one habitat type in April, May and June, therefore missing other 601 urban habitats potentially available to pollinators and part of the summer and fall seasons. The 602 603 temporal limitation was due to management practices aimed at promoting further flowering of native plants while reducing weeds. Consequently, we lack the overall picture of plant-pollinator 604 interactions throughout the season. We expect pollinators to use floral resources present in the areas 605 606 surrounding the study sites throughout their activity period, especially after sites are mown in July and native flowers are scarce or no longer available. Residential and community gardens in 607 particular (Baldock et al. 2019), in addition to other green areas, can play key roles in supporting 608 insect communities throughout the season, with a large contribution given by exotic and ornamental 609 species beyond the study period (Lowenstein et al. 2019; Staab et al. 2020). Exotic ornamental 610 611 plants, if resource-rich and with accessible flowers (Comba et al. 1999; Corbet et al. 2001), might

be useful next to patches displaying native plant species (Salisbury et al. 2015; Rollings and
Goulson 2019). However, given the already large use of exotic species in gardens (Garbuzov and
Ratnieks 2014; Erickson et al. 2020), we encourage sowing native plant mixes to increase plant
diversity and support pollinators in urban environments throughout their activity period.

616

Our study is focused only on one urban area. This may limit the generalization of our results to other contexts, especially in the presence of marked historical and socio-cultural differences. However, given the historical background of the metropolitan area of Lille, characterized by a large industrial sector surrounded by intensive agriculture, our results could be compared to many urban contexts under similar conditions, especially in Western Europe. Indeed, regional differences in land management and in the composition of plant and pollinator communities may lead to changes in the responses of species interactions along different urban gradients.

624

Changes in species interactions among habitats can be simply driven by changes in species 625 abundance (i.e., random encounters), or can result from interaction preferences related to specific 626 behaviour (Staniczenko et al. 2017). Species preferences can be important to define how 627 interactions are partitioned within networks (Staniczenko et al. 2013). In this article we have not 628 629 explicitly tested models that take into account random encounters vs interaction preferences. Because we have aggregated sites within urbanization levels, local differences driven by changes in 630 species abundance may have occurred, although these were likely limited by the low species 631 632 turnover detected between sites. The spatial and temporal changes observed among urbanization levels and months may be partially related to changes in species abundance. However, our results 633 indicate that some interaction rewiring observed along the gradient was related to species 634 behaviour. For example, the bees B. pascuorum and A. plumipes switched to diverse and more 635 suitable floral resources (Fig. 4) when available in urban sites. 636

637

638 **5. Conclusion**

Our results highlight the importance of considering the temporal variability in plant-pollinator 639 networks in addition to the spatial scale. Although limited to one season, we observed significant 640 changes in network structure in time and space along an urbanization gradient. Including the 641 temporal dimension allowed us to detect fine-scale variations that were otherwise hidden when 642 considering the whole season together. Moreover, combining classic network-level metrics with 643 more detailed methodologies to investigate modifications in species roles and interaction patterns 644 proved quite useful. For example, the use of latent block models and network motifs allowed to 645 646 better understand the environmental effects on the structure of interactions between species. Although difficult to apply, especially at the community level, it would be important to link changes 647 in the network structure with measures of pollination efficiency. Finally, our results can be useful 648 for the future management of urban green areas, aimed at preserving the diversity and functionality 649 of interaction networks in potentially hostile environments. The use of local plants with different 650 flowering phenology and the preservation of wild species can be an efficient solution to support a 651 substantial part of the bee and hoverfly pollinator diversity in cities as well as in peri-urban 652 653 environments.

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Tables

Table 1 Overall proportion (%) of pollinator visits received by the most visited (> 5% of the visits) plant species in the three urbanization classes throughout the study period. The number of pollinator species (followed by the percentage of total pollinator species) hosted by these plant species in each urbanization class is also reported.

Urbanization class	Centaurea jacea	Leucanthemum vulgare	Lotus corniculatus	Trifolium repens	Taraxacum section ruderalia	Geranium pyrenaicum	Achillea millefolium	Total visits	N of pollinator species (%)
Low	22.2	12.2	15.3	7.2	7.8	< 5	< 5	> 64.7	65 (77.4)
Medium	33.9	15.4	< 5	< 5	5.3	8.9	< 5	> 63.5	64 (79.0)
High	25.5	18.4	< 5	< 5	< 5	7.5	9.1	> 60.5	45 (66.2)

Figure legends

Fig.1. Map of the 12 study sites along an urbanization gradient in the metropolitan area of Lille, France.

Fig. 2. Number of plant-pollinator interactions recorded along the urbanization gradient and the sampling season.

Fig. 3. Network-level metrics calculated along the urbanization gradient and the sampling season. For each metric, different capital letters (A, B) indicate significant differences between urban classes within each month, while lowercase coloured letters (x, y, z) indicate significant differences between months within a same urban class. Lack of letters indicates no significant differences. H2' indicates network level specialization (0: complete generalization, 1: complete specialization). All values are given in Tables A5-6.

Fig. 4. Representation of bipartite plant-pollinator interaction networks (lower bars = plants, upper bars = pollinators), latent block models (rows = pollinators, columns = plants) and eigenvector centrality scores (x-axes: species ordered by decreasing score) obtained in the three urbanization classes during the month of April. Exemplifying species (*Taraxacum* sect. *ruderalia*, *Anthophora plumipes*, *Bombus pascuorum*) and their interactions are highlighted by specific colours. Black indicates all other plant and pollinator species. Red lines separate homogeneous clusters of interactions. See Fig. A4–14 for complete figures with species labels.

Fig. 5. Principal Component Analysis (PCA) plot of (a) plant and (b) pollinator positions within motifs in the three urbanization classes and in the three time periods considered. Labels indicate the centroid for each time × urbanization level category. Full point distributions and ellipses are shown in Fig. A15.

Fig. 6. Principal Coordinate Analysis (PCoA) plot of pairwise dissimilarities for (a) species and (b) interactions in the three urbanization classes and in the three time periods considered.

Figures

Fig. 1.









Fig. 4.













