

Land use in the Northern Great Plains region of the U.S. influences the survival and productivity of honey bee colonies

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1 **Abstract**

2 The Northern Great Plains region of the US annually hosts a large portion of commercially
3 managed U.S. honey bee colonies each summer. Changing land use patterns over the last several
4 decades have contributed to declines in the availability of bee forage across the region, and the
5 future sustainability of the region to support honey bee colonies is unclear. We examined the
6 influence of varying land use on the survivorship and productivity of honey bee colonies located
7 in six apiaries within the Northern Great Plains state of North Dakota, an area of intensive
8 agriculture and high density of beekeeping operations. Land use surrounding the apiaries was
9 quantified over three years, 2010-2012, and survival and productivity of honey bee colonies were
10 determined in response to the amount of bee forage land within a 3.2-km radius of each apiary.
11 The area of uncultivated forage land (including pasture, USDA conservation program fields,
12 fallow land, flowering woody plants, grassland, hay land, and roadside ditches) exerted a
13 positive impact on annual apiary survival and honey production. Taxonomic diversity of bee-
14 collected pollen and pesticide residues contained therein varied seasonally among apiaries, but
15 overall were not correlated to large-scale land use patterns or survival and honey production.
16 The predominant flowering plants utilized by honey bee colonies for pollen were volunteer
17 species present in unmanaged (for honey bees), and often ephemeral, lands; thus placing honey
18 bee colonies in a precarious situation for acquiring forage and nutrients over the entire growing
19 season. We discuss the implications for land management, conservation, and beekeeper site
20 selection in the Northern Great Plains to adequately support honey bee colonies and insure long
21 term security for pollinator-dependent crops across the entire country.

22 **Keywords** agriculture, land use, *Apis mellifera*, colony survival, honey bee, honey production,
23 pesticide exposure, pollen collection

24 **1. Introduction**

25 The phenomenon of sustained and elevated annual losses of honey bee colonies continues
26 to severely impact the US beekeeping industry (Steinhauer et al. 2014; Lee et al. 2015). Such
27 losses have been mainly confined to North America and parts of Europe (NRC 2007;
28 vanEngelsdorp et al. 2008; Potts et al. 2010), and specifically, annual losses for commercial
29 beekeepers in the US have hovered around 30% since 2006-07, with a low of 22% in 2011-12
30 and a high of 40% in 2012-13 (vanEngelsdorp et al. 2007, 2008, 2010, 2011, 2012; Spleen et al.
31 2013; Steinhauer et al. 2014; Lee et al. 2015). Numerous pests, diseases, and pesticides have
32 been implicated in potentiating colony failure, both alone and in combination (Cox-Foster et al.
33 2007; vanEngelsdorp et al. 2009; vanEngelsdorp et al. 2013).

34 Because of these continued, and seemingly ubiquitous annual losses, more attention has
35 turned toward how landscapes and land use influence factors related to colony health that may
36 ultimately differentially impact the productivity and survival of honey bee colonies. For
37 example, pollen is primarily required to raise brood and contribute to sustained colony
38 population growth throughout the growing season, but critically, protein nutrition also moderates
39 the impacts of honey bee pathogens, parasites, overall resistance and resilience to stress factors,
40 and foraging behavior (Alaux et al. 2011; Huang 2012; Scofield and Mattila 2015). High quality
41 and abundant pollen contributes to increased nutritional stores and an overall decreased (quieter)
42 immune status in individual bees (Alaux et al. 2010; Smart et al. 2016). Further, honey bees
43 maintained on a high quality pollen diet exhibit increased longevity when infected with a fungal
44 parasite (Di Pasquale et al. 2013), and honey bees exhibit lower viral levels when maintained on
45 pollen versus sugar syrup or pollen substitute (DeGrandi-Hoffman et al. 2010). The potential
46 impacts of land use via differential nutrition are wide-ranging, including the effects of adequate

47 and sustained floral resource availability and diversity and interactions with environmental
48 pesticide exposure which may influence the nutrition, immune systems, and survival of honey
49 bee colonies (e.g. Naug 2009; Pettis et al. 2013; Smart et al. 2016).

50 The Northern Great Plains (NGP) region, including North Dakota, South Dakota,
51 Montana, and Minnesota, has acted as an unofficial “bee refuge” for a large proportion of the
52 managed, commercial honey bee colonies throughout the growing season. Colonies transported
53 to this area of the country for the summer by migratory beekeepers have done well due, in large
54 part, to the presence of an abundance of nectar and pollen-producing flowers. Historically, this
55 region has had less extensive monocultural agriculture compared to regions farther south (e.g.
56 the Midwestern corn belt). This region hosts around 1 million honey bee colonies from May-
57 October every year, representing approximately 40% of the total US managed, commercial pool
58 of honey bee colonies (USDA 2014b). Critical regional blooms include perennial clovers and
59 alfalfa, canola, sunflowers, wildflowers, and, more broadly, contributions from volunteer plant
60 species located in certain land use types such as livestock-grazed pastures and grasslands. Other
61 important types of land use containing forbs are USDA conservation program fields, such as the
62 Conservation Reserve Program (CRP), which is a government program incentivizing landowners
63 to set aside highly-erodible and other sensitive lands into long term conservation covers (Gallant,
64 Euliss and Browning 2014).

65 In recent years, increasing numbers of colonies have been transported to California to
66 pollinate a single crop, almonds. The approximately 1 million bearing acres of almonds in CA
67 are 100% dependent on the pollination that they receive from honey bees. Currently,
68 approximately 1.5 million of the 2.5 million available colonies nationwide undertake the journey

69 to the central valleys (San Joaquin and Sacramento) of California, many originating from the
70 NGP.

71 Surprisingly, implications of land use on resource quality, honey bee health, and survival
72 have been considered in relatively few (and recent) studies (e.g. Naug 2009; Odoux et al. 2012;
73 Clermont et al. 2015; Requier et al. 2015; Smart et al. 2016). Other research has focused on
74 spatial foraging patterns of honey bee colonies, and distances of various crops and land use
75 features relative to colony position (e.g., Beekman and Ratnieks 2000; Steffan-Dewenter and
76 Kuhn 2003; Couvillon, Schurch and Ratnieks 2014). Recent studies tracking survival of colonies
77 in US migratory beekeeping operations (e.g. Runckel et al., 2011; vanEngelsdorp et al., 2013)
78 did not quantify the health and survival of colonies in relation to specific landscape patterns or
79 features to which the colonies were exposed.

80 The overarching objective of this study was to quantify the relationship between land use
81 composition and honey bee productivity and survival in the Northern Great Plains region of the
82 US. We followed colonies positioned in six apiaries over three years and hypothesized that
83 survival and honey production would be higher for apiary sites surrounded by a greater amount
84 of land use in potential bee forage (uncultivated forage land, cultivated forage land, and wetlands,
85 Fig. 1) due to a greater presence of nectar and pollen-producing forbs and woody plants in those
86 areas of the landscape. Row crops did not dominate such areas and thus colonies were predicted
87 to experience a greater abundance and diversity of floral resources and overall reduced exposure
88 to agricultural pesticides. Our specific objectives were to 1) identify land use within the larger
89 agricultural matrix associated with higher colony survival and productivity among apiary sites,
90 2) build a predictive statistical model relating land use to survival and honey production of
91 apiaries, and 3) identify taxonomic origin of bee-collected pollen, identify pesticide residues

92 within the pollen, and describe and compare overall pollen diversity among study sites against
93 the backdrop of varying land use.

94 **2. Materials and methods**

95 **2.1 Land use assessments**

96 For each of three years (2010-2012), land use in North Dakota was extensively surveyed
97 on the ground within a 3.2-km (2-mile) radius around each of six sites (apiaries) (Fig. A.1). We
98 chose this scale as a realistic total area (approx. 32 km²) over which bee colonies at a given site
99 would be expected to forage (Visscher and Seeley 1982; Beekman and Ratnieks 2000). We also
100 analyzed more localized foraging radii (500m, 1000m, and 2000m). The average distance
101 between sites was 40 km (9-68 km range). Broad land use categories included: CRP, ditch,
102 fallow land, flowering woody plants and shrubs, grassland, hay land, pasture, alfalfa, canola,
103 sunflower, wetlands, corn, oats, soybeans, and wheat (Table A.1). These broad land categories
104 were subsequently combined into five groups for statistical analyses, including: 1) Uncultivated
105 forage land (CRP, ditch, fallow, flowering woody plants, grassland, hay land, pasture); 2)
106 Cultivated forage land (alfalfa, canola, sunflower); 3) Wetlands; and 4) Non-forage (corn, oats,
107 soybeans, wheat). Sites were lettered (A-F) in descending order of land area in uncultivated and
108 cultivated forage land, i.e. a gradient from high to low expected usefulness to honey bees (Fig. 1).

109 A surveyor visited each site three times (once each spring in May-June, summer in July-
110 early August, and autumn in late August-September) each year to verify land use in the field and
111 this data, in addition to data from the National Agricultural Statistics Survey (NASS), were
112 entered into ArcGIS v.10 for final quantifications of the area of various types of land use within
113 the 3.2-km radius around each site. Additionally, during each visit the surveyor visually assessed

114 and estimated floral cover of the most commonly occurring flowers within each land category
115 around each site including, sweet clover *Melilotus* spp.; alfalfa *Medicago sativa*; gumweed
116 *Grindelia squarrosa*; native sunflower *Helianthus* spp.; sow thistle *Sonchus* spp.; and goldenrod
117 *Solidago* spp.). The percent floral cover estimates were then converted to a summed total area of
118 each species occurring within the 3.2-km around each site over three years (Table 1).

119 Proprietary CRP data was accessed via an FSA/USGS Interagency Agreement. One site,
120 Site B, was located inside the Arrowwood National Wildlife Refuge; approximately 75,000 acres
121 of U.S. Fish and Wildlife Service (FWS) land composed primarily of grassland. A special use
122 permit was granted to allow honey bee colonies access to this site. Colonies positioned in this
123 area had access to FWS lands to the west and north but were adjacent to agriculturally managed
124 private lands to the east, outside the refuge.

125 **2.2 Colony health monitoring**

126 Initiation of colonies occurred each spring (May), comprised of a freshly mated *Apis*
127 *mellifera ligustica* queen and approximately 10,000 workers per colony. Honey bee colonies
128 owned and managed by a local commercial beekeeper were positioned among the six apiaries in
129 North Dakota from 2010 through 2013 (common apiary size for this beekeeper is 48 colonies per
130 site; we assessed 24 (half) for survival and honey production). Colonies were maintained in a
131 typical US commercial beekeeping configuration consisting of four colonies per pallet and 12
132 pallets per apiary, facilitating movement of colonies into and out of the apiary via forklift. Each
133 colony was tagged with a unique number for identification. Colonies remained in North Dakota
134 from May-September each year. In autumn (October), colonies were loaded onto trucks and
135 shipped to California where the colonies were temporarily placed in holding yards (until moved
136 into almonds). Starting in mid-February, the colonies were transported from holding yards into

137 almond orchards for pollination. Colonies that died each year were replaced by the beekeeper
138 with new colonies (and queens) before they returned to North Dakota each May.

139 Colony health was monitored in each of the 24 colonies per site every 6 weeks year-
140 round for a variety of health metrics (Smart et al. 2016). *Varroa destructor* mites and *Nosema*
141 spp. were controlled in all colonies according to the beekeeper's management regimes and
142 overall infestation levels were low (Smart et al. 2016). Honey production was determined by
143 weight of honey boxes removed from each colony and calculated as the annual average weight
144 (kg) per site.

145 Annual apiary survival was determined as the number of surviving colonies out of 24 per
146 apiary from May of each year (in North Dakota) through March of the following year (almond
147 bloom in California). March was chosen as the cut-off point for survival because this was when
148 the beekeeper made a decision as to which colonies were suitable to be moved into almonds to
149 fulfill pollination contracts; culling dead colonies in the process. Additionally, 90% of colonies
150 that survived to almond pollination were alive and healthy by the end of the almond bloom.

151

152 **2.3 Collection and taxonomic identification of pollen**

153 Three colonies were maintained at each of the six locations in North Dakota for pollen
154 collection each year; these colonies were not included in the regularly assessed 24 colonies.
155 These colonies were fitted with pollen traps that, when opened, forced returning foraging bees to
156 walk through screens upon entering the hive, which dislodged pollen loads from the hind tibiae
157 into a pollen collection drawer. Traps were open for a 24-hour period 3-6 times per summer (six
158 in 2010, five in 2011, three in 2012), and pollen was collected into a plastic bag and placed in a
159 cooler containing dry ice for shipping. There was no pollen recovered on certain sample dates

160 and sites. Upon arrival at the USDA-ARS-Bee Research Lab in Beltsville, Maryland, samples
161 were stored at -20°C until analyzed. A randomly chosen, mixed 3-gram pollen subsample from
162 each site and date was sorted first by color to narrow down taxonomic diversity within a sample
163 and then the proportional make-up of each color was subsequently identified to taxonomic plant
164 of origin using light microscopy. The proportion of each taxon in the total 3g mixed sample
165 from a given apiary and date was then back calculated to arrive at the proportion of each taxa
166 from each specific apiary and date. The pollen diversity index was calculated based on all taxa
167 detected in each year, 2010-2012. Attempts were made to identify pollen to the lowest
168 taxonomic level possible, though in many cases certain pollens could only be identified to genus
169 or family, or remained ‘undetermined’ (Table A.2).

170 **2.4 Pesticide residue analysis of pollen samples**

171 An additional separate 3-gram subsample of fresh pollen from each site and date was sent
172 to USDA-AMS-National Science Laboratory in Gastonia, NC for pesticide residue analysis.
173 Results were reported in parts per billion (ppb) for 174 commonly used insecticides, fungicides,
174 herbicides and metabolites. The amount of each residue in ppb detected from May through
175 September was averaged from each site, and was used to calculate a pollen hazard quotient (HQ),
176 defined as the ppb of a given pesticide divided by its contact LD₅₀ (Stoner and Eitzer 2013).
177 Hazard quotients were averaged annually to analyze their relationship with land use, survival,
178 and honey production among apiary sites. Contact LD₅₀ values may be a conservative estimate
179 of exposure because they are often less toxic (higher LD₅₀) compared to oral LD₅₀ values for the
180 same pesticide (Stoner and Eitzer 2013; Sanchez-Bayo and Goka 2014). Contact LD₅₀ values
181 used for calculating HQ were determined by averaging reported values from 4 sources (Mullin et
182 al. 2010; Stoner and Eitzer 2013; Sanchez-Bayo and Goka 2014; and the EPA Office of Pesticide

183 Programs Ecotoxicity Database USEPA 2014). Importantly, pollen hazard quotients fail to
184 account for synergistic or inhibitory interactions between and among pesticides. However the
185 HQs do allow for a comparison of the relative overall pesticide exposure among sites in a more
186 biologically relevant manner compared to strictly summing and comparing ppb, which does not
187 take into account the variable toxicities of different chemicals.

188 **2.5 Statistical analysis**

189 Statistical analyses were carried out using R version 3.1.1 (R core team, 2014-07-10).
190 For objective 1, simple linear regression and ANOVA analyses of land use data by site and year
191 were first conducted to evaluate the effects of land use on survival and honey production. For
192 objective 2, data were then analyzed using lme4 (Bates, Maechler and Bolker 2014) linear mixed
193 effects modeling to examine the relationship between the predictor (area of bee forage land (log-
194 transformed m^2)) and two main responses: 1) annual apiary survival (number of colonies
195 surviving out of 24 at each site and year); and 2) apiary honey production (mean kg per year).
196 Site and year were specified as random effects. Akaike's Information Criterion corrected for
197 small sample size (AICc) was used to rank the multiple competing models of land use on
198 survival or honey production. We calculated AICc weights (w) and evaluated 95% confidence
199 intervals to determine the relative importance of model parameters. Finally, diversity (objective
200 3) was analyzed via determination of the Shannon-Weiner Diversity Index (land use and pollen
201 taxonomy) by site using the vegan package 2.2.1 in R and Pearson correlation analyses were
202 conducted relating pollen diversity and pesticide HQ to land use, survival and honey production.

203 3. Results

204 3.1 Objective 1: Relationships among land use, honey production, and colony

205 survival

206
207 There were differences in the type of land use (m^2) within the 3.2-km area across the land
208 use gradient (Fig. 1). In the uncultivated forage land category, the availability of floral resources
209 varied widely (Table 1). For example, despite similar total areas of land in CRP over the three
210 years near sites A and F (summed total of approximately 9 million m^2), the estimated total floral
211 cover was vastly different (84% and 20%, respectively). The land use categories shown in Table
212 1 contained the majority of floral resources (and other taxa not listed in Table 1) as determined
213 by on-the-ground surveys within the 3.2-km radius of each site, and thus represent the most
214 likely targets for honey bee foraging.

215 There was a strong positive linear relationship between the area of uncultivated forage
216 land surrounding an apiary and annual apiary survival ($F_{1,16}=15.69$, $r^2=0.50$, $p=0.001$, Fig. 2a).
217 Similarly, there was a positive, though not statistically significant, relationship between the
218 amount of uncultivated forage land and honey production and ($F_{1,16}=2.14$, $r^2=0.12$, $p=0.16$, Fig.
219 2b). Annual survival and honey production were significantly positively related ($F_{1,16}=12.11$,
220 $r^2=0.43$, $p=0.003$, Fig 2c). This relationship was primarily driven by the low survival and
221 productivity of colonies at site F.

222 ANOVA of survival indicated a significant impact of site (i.e. varying land use across a
223 gradient) on the number of colonies surviving each year ($F_{5,12}=6.6$, $p=0.003$), with significantly
224 more colonies surviving at sites A and D compared to site F (Fig. 2d). ANOVA for honey
225 production (Fig. 2e) indicated that site was not a significant contributor ($F_{5,10}=1.73$, $p=0.22$) but

226 year did have a significant effect ($F_{2,10}=5.71$, $p=0.02$) wherein honey production in 2011 was
227 lower compared to 2012, but not different from 2010.

228 Because sites A and F represented the extremes of apiary survival, we investigated the
229 impact of removing the data points from those two sites. Removal of all data from either site
230 alone still resulted in statistically significant linear models (Remove site A: $F_{1,13}=6.30$, $r^2=0.33$,
231 $p=0.03$; Remove site F: $F_{1,13}=6.18$, $r^2=0.32$, $p=0.03$), while removing both sites resulted in a non-
232 significant relationship ($F_{1,10}=0.31$, $r^2=0.03$, $p=0.59$) between uncultivated forage land and
233 survival.

234

235 **3.2 Objective 2: Linear mixed modeling of land use on survival and honey** 236 **production**

237 Linear mixed effect modeling indicated that the area of uncultivated forage land was the
238 best statistical predictor of apiary survival (Table 2), better describing the variation in survival
239 than cultivated forage land, wetlands, or any additive combination of predictor variables.
240 Examination of the evidence ratios for the best models of survival indicated the model including
241 only uncultivated forage land was greater than 6 times more predictive of colony survival than
242 the model with wetlands added (Evidence ratio (E) = $0.729/0.117$), and approximately 7.5 times
243 more predictive than the model including cultivated forage land ($E = 0.729/0.096$). The 95%
244 confidence intervals for wetlands and cultivated forage land coefficients overlapped zero (Table
245 2), further indicating that the presence of uncultivated forage land was the main land use driver
246 of apiary survival. The area of wetlands varied little among sites, but surprisingly had an overall
247 negative effect on survival and honey production.

248 Similarly, total area of uncultivated forage land best predicted honey production (Table
249 2) however, other competing models including wetlands and cultivated forage land areas could
250 not be ruled out (i.e. $< 2 \Delta AICc$, low evidence ratios, Table 2). While the dependence of
251 uncultivated forage land area on an apiary's survival was well supported by our data, the
252 dependence of uncultivated forage land for honey production was only weakly supported
253 compared to other models that included wetlands and cultivated forage land area.

254 We also investigated the impact of land use on survival and honey production at more
255 localized spatial scales (Table A.3). At decreased spatial scales (500m, 1000m, 2000m radii) the
256 area of cultivated forage land continued to be the land use feature most predictive of apiary
257 survival, though our 3.2-km radius models maintained lower AICc and values greater weights
258 comparatively. For honey production at more localized spatial scales, cultivated forage land
259 (alfalfa, canola, sunflower) emerged as the most indicative land use feature, compared to
260 cultivated forage land at the 3.2-km radius (Table A.3).

261 **3.3 Objective 3. Pollen: identification and pesticide residue analysis**

262 A total of 18 different plant families including 33 genera (Fig. 3a) were detected from
263 pollen traps over the three years of the study. Three families (Asteraceae, Brassicaceae, and
264 Fabaceae) together made up the majority of bee-collected pollen in these landscapes, providing
265 up to 57%, 26%, and 81%, respectively (39-94% overall) of the total pollen collected over the
266 three years. Cultivated plant genera including alfalfa (*Medicago*), field bean (*Phaseolus*), canola
267 (certain *Brassica*), sunflower (certain *Helianthus*), and soybean (*Glycine*) made up relatively
268 little of the total collected pollen (Fig. 3a), site A: 17%, site B: 12%, site C: 8%, site D: 10%, site
269 E: 8%, site F: 3%). Soybean pollen specifically, though detected, was relatively rare, occurring

270 only at site B (0.4% in 2010), and site F (2% in 2010). No corn pollen was detected in any
271 samples in any year.

272 Fabaceae and Brassicaceae pollen were represented in the late spring through mid-
273 summer, while Asteraceae became more predominant mid-summer through early autumn (Fig.
274 3a). One genus of Fabaceae, *Melilotus* spp., was particularly persistent in bloom time (pollen
275 present in samples from late June through early September) and dominant in proportion of the
276 total pollen collected by the bees (Fig 3a, site A: 2-39%, site B: 13-66%, site C: 7-47%, site D:
277 2-29%, site E: 9-45%, site F: 18-35%) over the three years. In fact, many of the most commonly
278 collected genera/species of plants identified in this study were non-native to the U.S., including
279 *Centaurea* spp., *Cichorium* spp., *Cirsium* spp., *Medicago sativa* (cultivated), *Melilotus* spp.,
280 *Silene latifolia*, *Sonchus* spp., *Taraxacum officinale*, and *Tragopogon* spp. Several native
281 species, and other potential natives depending on the species within the genera identified, were
282 also found including *Grindelia squarrosa*, *Helianthus* spp. (cultivated or wild), *Lathyrus* spp.,
283 *Lupinus* spp., *Phaseolus* spp. (cultivated), *Solidago* spp., *Trifolium* spp., and *Vicia* spp. (Fig. 3a).

284 The Shannon-Weiner diversity index of large-scale land use (3.2-km radius) showed that
285 the highest diversity was present around sites A-D (Fig. 4). Bee-collected pollen from sites A
286 and F exhibited the highest, and sites B-E the lowest, annualized taxonomic diversity (Fig. 4).
287 The diversity of bee-collected pollen was not correlated with annual survival ($t = -0.59$, $df = 16$, $r =$
288 -0.15 , $p = 0.56$, 95% CI: -0.57 , 0.34), or honey production ($t = -0.29$, $df = 16$, $r = -0.07$, $p = 0.78$, 95%
289 CI: -0.52 , 0.41). Additionally, no significant statistical relationships were found between pollen
290 diversity and land use diversity or the amount of uncultivated forage land, i.e. greater land use
291 diversity or amount of uncultivated forage land surrounding an apiary did not equate to greater

292 diversity of collected pollen, and further, this lack of a relationship was conserved when
293 examined at more localized spatial scales.

294 Pesticide residues from agricultural and beekeeper applications were detected in the fresh
295 pollen collected throughout the growing season among all sites and years (Fig. 3b, Table A.4).
296 Although colonies were exposed to a number of pesticides over the three years, no statistically
297 significant impacts of pesticide exposure on colony survivorship or honey production were found
298 (impact of pollen pesticide hazard quotient on survival: $F_{1,16}=0.75$, $p=0.40$, and honey
299 production: $F_{1,16}=0.03$, $p=0.86$) and, further, we did not find any correlative relationship between
300 total annual pollen pesticide residue and the area of land use surrounding apiaries in non-forage
301 crops ($t= -0.25$, $df=16$, $r= -0.06$, $p=0.81$) or land diversity ($t=0.004$, $df=16$, $r=0.001$, $p=0.99$) .
302 This pattern held when considering land use at more localized spatial scales (500m, 1000m,
303 2000m radius from apiaries). In terms of overall hazard quotient, sites A and E had the highest,
304 while sites B, D, and F had reduced HQ (Fig. 3b). However, nearly 80% of the elevated HQ
305 determined at site A was due to a single detection of deltamethrin (Fig. 3b). Generally, the most
306 toxic agricultural chemicals that were found (e.g. bifenthrin, chlorpyrifos, cyhalothrin,
307 deltamethrin) occurred in the latter portion of the summer, presumably used as sprays for
308 managing crop pest populations that built up over the season.

309 Notably, no neonicotinoid insecticides were detected in pollen at any sites over the three
310 years. Nine insecticides with high toxicity to bees were detected, two organophosphates (OPs),
311 six pyrethroids, and one partial systemic (Table A.4). Of the two OPs, chlorpyrifos was most
312 commonly found, detected in pollen from all sites throughout the season (Fig. 3b). Of the seven
313 pyrethroids detected (six of which have high toxicity to honey bees), cyhalothrin was most
314 commonly found variably from all sites. Four of the other pyrethroids: bifenthrin, cyfluthrin,

315 cypermethrin, and esfenvalerate were found sporadically across the sites and years.

316 Deltamethrin was detected only once at site A on 08/17/2010.

317 In addition to the aforementioned insecticides, agriculturally-applied fungicides and
318 herbicides were also detected. Overall, five fungicides (all with low honey bee toxicity) were
319 detected but the most commonly found fungicide was carbendazim. Chloranthlonil has low
320 toxicity to honey bees, and was detected in the early season at all sites except F (Fig. 3b). The
321 other four fungicides: pyraclostrobin, tebuconazole, and vinclozolin were each only detected on
322 one sample date and site each. Finally, four detections of three herbicides were found:
323 oxyfluorfen, pendimethalin, and trifluralin.

324 Residues of six beekeeper-utilized pesticides (and metabolites) were among the most
325 commonly detected chemicals across all sites and years and included coumaphos, coumaphos
326 oxon, fluvalinate, fenpyroximate, thymol, and 2,4 Dimethylphenyl formamide (DMPF) a
327 breakdown product of the miticide, Amitraz. Paradichlorobenzene, a chemical used as a
328 fumigant to deter stored beekeeping equipment pests, such as wax moths, was detected at all
329 sites only in 2011. The toxicities of thymol, DMPF, and paradichlorobenzene are not known.
330 The other detected products have low or moderate toxicity to bees (Table A.4).

331 **4. Discussion**

332 This study demonstrated the influence of land use on the survival and honey production
333 of colonies in a US commercial beekeeping operation. We found strong support for the amount
334 of uncultivated forage land during the summer on the ultimate survival of colonies over the
335 winter. Importantly, we previously showed that pests, parasites, and diseases did not vary among
336 the six apiaries (Smart et al. 2016) and here, we observed a lack of significant differences in
337 overall pesticide exposure among apiaries related to land use and survival. Therefore, we

338 provide strong quantitative evidence that land use alone significantly impacts the annual survival
339 of commercial honey bee colonies in the NGP.

340 The 12-17% annual mortality over the three years at site A fell within the “acceptable
341 range” of beekeeper expected losses (Steinhauer et al. 2014), and was much closer to annual
342 losses prior to the establishment of the *V. destructor* mite to the US in the 1980s (D.
343 vanEngelsdorp, pers. comm.). Site A also possessed the greatest area of uncultivated forage land
344 (approx. 70%) in the surrounding land over the three study years. Conversely, the 50% annual
345 mortality at site F was well above the national average of around 30% (Lee et al. 2015), and this
346 site was the least diverse in overall land use, and further, possessed the least amount of
347 uncultivated forage land (around 10% of the total area), most of which was not florally
348 productive.

349 **4.1 Pollen and land use diversity**

350 Our previous work suggested that the quantity of pollen collected, brood quantity, *Varroa*
351 mite levels, and physiological measures of nutrition and immunity were significant metrics of
352 annual colony survival (Smart et al. 2016). The quantity of pollen, rather than the diversity of
353 pollen, collected among apiaries was more related to survival, which we show here, is a function
354 of land use. The amount of pollen collected, related to the abundance of pollen available in the
355 landscape, may be more critical for generalist-foraging honey bee colonies than highly diverse
356 floral resources. However, because we averaged pollen diversity annually we caution that
357 diversity of pollen may be critical at particular times of the season. Further, honey bees located
358 in landscapes not dominated by intensive mono-cultural agriculture like those in our study region
359 may display different foraging patterns relative to the availability of floral resources in the
360 surrounding landscape.

361 Site A, with moderate land use diversity at the 3.2-km radius, was comprised of land
362 where a lot of flowers *could* grow (e.g. CRP, grassland, hayland, pasture), and was relatively
363 abundant in commonly occurring floral resources in those areas. This contributed to moderate to
364 high overall pollen taxonomic diversity and greater total pollen collection at site A (Smart et al.
365 2016). Additionally, a large component of the uncultivated forage land surrounding site A was
366 pasture, where volunteer species utilized by honey bees were commonly found growing in
367 abundance. In contrast, sites E and F had moderate to low land use diversity and the types of
368 land use where flowers *could* grow en masse (e.g. CRP, grassland, hayland) were relatively
369 absent or devoid of floral coverage. Sites E and F also had a large proportion of flowers in
370 ditches (a landscape feature that is widely distributed and ephemeral due to mowing and spraying
371 regimes). Interestingly, honey bee colonies lowest on the gradient (site F), along with site A,
372 collected a relatively high diversity of pollen, both at the family and genus levels.

373 Characteristics of low gradient sites, such as smaller flower patches or widely distributed
374 resources like those in roadside ditches, require more time to trigger recruitment (Dornhaus and
375 Chittka 2004; Beekman and Lew 2008). As a result, foragers in landscapes characterized by
376 such features may actively search for, and come into contact with, a greater overall diversity of
377 flowers. An optimal foraging pattern could partially explain the trends we observed given the
378 overall availability of floral resources near our apiaries, wherein colonies increased diet breadth
379 in low resource landscapes and decreased diet breadth in relatively higher resource landscapes
380 (Kunin and Iwasa 1996; Fontaine, Collin and Dajoz 2008). Site F, specifically, had a large
381 amount of conservation (CRP) land nearby that may have provided the colonies with a greater
382 diversity of floral resources compared to other low gradient sites without appreciable
383 conservation lands nearby.

384 Pollen from one plant genus, *Melilotus* spp., was identified in all years and sites (except
385 site E in 2012), highlighting the relative preference for this copious nectar- and pollen-producing
386 biennial volunteer plant. Experimental colonies fed *Melilotus* spp. pollen have been shown to
387 produce more brood compared to several other single source and blends of pollen, and sweet
388 clover was most preferred by the bees (Campana and Moeller 1977). Aside from *Melilotus* spp.,
389 most of the other plants from which pollen was collected were those that were not actively
390 cultivated, as has been reported in other cropping systems (Pettis et al. 2013; Requier et al. 2015).
391 In addition to pollen resources, many of these plants are also abundant nectar sources for honey
392 production, including the genus, *Melilotus*. In the current study, cultivated bee forage plants
393 (sunflower, alfalfa, canola, beans) comprised, on average, only 10% of the total pollen collected
394 across all sites and years, and further, occurred as relatively brief, punctuated mass blooms over
395 the summer. The lack of cultivated flowering plants puts into perspective the heavy reliance of
396 honey bee colonies on volunteer, and often non-native, flowering resources in these highly bee-
397 populated agricultural lands that are susceptible to loss through herbicide use, mowing and
398 degradation over time.

399 We chose a 3.2-km radius around each site as a reasonable foraging range for honey bee
400 colonies. This radius encompassed approximately 32-km² of surrounding agricultural land. We
401 also considered relationships between land use and survival, and land use and honey production
402 at more localized spatial scales and found that in both cases, the relationship was most significant
403 at the largest scale (3.2-km radius). Interestingly, despite a minimal amount of cultivated forage
404 crop land (e.g. alfalfa, canola, sunflower) near our study apiaries, we found that such crops were
405 important for honey production at smaller, localized scales. Given honey bees forage over a
406 potentially vast area, future work should consider the appropriate spatial scale at which land use

407 most exerts its influence on the health, productivity, and survival of honey bees colonies. Such
408 an understanding would assist beekeepers, policy makers and land managers in gaining the most
409 reward out of the limited amount of land available for pollinator forage and habitat enhancement
410 efforts.

411 **4.2 Pesticide exposure**

412 The relatively high diversity of pollen collected within and among apiaries, coupled with
413 the presence of unidentified pollen on every date, made it impossible to associate certain pollen
414 taxa with pesticide exposure. However, the general lack of agricultural crop-derived pollen
415 indicated that pesticide drift from target fields during or after application onto flowers growing in
416 surrounding areas was the most likely route for such agricultural pesticide exposure by honey
417 bee colonies. Exposure of foraging bees to contaminated pollen was relatively ubiquitous across
418 the study apiaries. Overall, no clear relationships were observed between pesticide exposure and
419 colony health and survival in our study, but we were not necessarily able to detect sub-lethal or
420 interaction effects (Yang et al. 2008; Aliouane et al. 2009; Wu, Anelli and Sheppard 2011; Wu et
421 al. 2012; Pettis et al. 2013).

422 Several of the most toxic insecticides detected among all sites were prescribed for use on
423 corn and soybean, including chlorpyrifos, cyhalothrin, bifenthrin, and esfenvalerate. Casual
424 observation of soybeans during bloom indicated that honey bees did not visit soybean flowers,
425 although we did identify a small amount of soybean pollen from two sites (no corn pollen was
426 detected) and, further, honey bees and wild bees have been documented visiting soybeans (e.g.
427 Erickson 1975; Gill and O’Neal 2015). As further evidence of drift, we detected chlorpyrifos
428 most prevalently (50%, 80%, and 63% of pollen samples, respectively) at sites D, E and F; the
429 three sites with the most non-forage (primarily corn and soybeans) surrounding them.

430 Beekeeper-applied chemicals were some of the most prevalent chemicals detected in the
431 pollen. This is somewhat surprising considering several of the chemicals (e.g. coumaphos,
432 fluvalinate) have not been used by the beekeeper for over 5 years, and the beekeeper had a
433 regular comb-replacement regime. Several of the compounds used in the past by beekeepers are
434 lipophilic and tend to remain in wax comb for indefinite amounts of time (Wu, Anelli and
435 Sheppard 2011). The detection of many in-hive miticides in forager pollen loads is likely due to
436 these residues being present on the cuticles of most of the bees in the hives. This type of chronic
437 exposure to pesticide residues can have myriad detrimental effects on bees (e.g. Haarmann et al.
438 2002; Pettis et al. 2004; Burley, Fell and Saacke 2008), and, further, has resulted in resistant
439 populations of *Varroa* mites to many of the miticides in the beekeeper toolkit (Elzen et al. 1998;
440 Pettis 2004).

441 **4.3. Model utility and implications for future research**

442 Our model indicates that if a beekeeper sought to achieve 80% survival based on
443 uncultivated forage land alone, (s)he would require approximately 32,000-m² (32 hectares) of
444 uncultivated forage land per hive (assuming pathogens and parasites are effectively controlled).
445 This amounts to a total of approximately 15-km² of uncultivated forage land for an apiary
446 consisting of 48 colonies. We observed survival of 75-88% occurring across a range of 9-47
447 hectares per hive. Further, if we consider that most uncultivated forage land is not completely
448 covered in flowers (from our floral surveys of all sites and years, on average approximately 28%
449 of uncultivated land contained flowers), the beekeeper would require a considerably smaller area
450 of actual flowers over the entire growing season to achieve 80% survival based on land use alone.

451 Tools for long-term monitoring of honey bee colonies related to landscape factors have
452 been developed in Western Europe (Odoux et al. 2014), and similar monitoring techniques

453 considering colony level dynamics given land use trends over time and encompassing a large
454 geographic region would provide valuable insight for beekeepers, researchers, and the future
455 sustainability of bee-utilized landscapes in the US. Additionally, such land use quantification
456 could be incorporated into existing efforts (e.g. national beekeeping survey, Bee Informed
457 Partnership monitoring, National Pollinator Strategy) to better understand the role of land use,
458 and changes in land use over time, in driving beekeeper apiary selection and colony health,
459 productivity, and survival outcomes.

460 Further research is needed that hones in on targeted landscape and habitat enhancement
461 effects, including cover types such as crop borders, restored prairies, alternative conservation
462 program seed mixes, organic farms, cover crops, etc. Such research will contribute to greater
463 resolution for beekeepers, thus affording them the ability to conduct “precision beekeeping” with
464 respect to site selection and expected apiary performance based on land use. Here we have
465 shown that selection of apiary sites based on land use by a beekeeper has value on predicting
466 productivity and survival of colonies among apiaries. Therefore site selection is one critical
467 factor that beekeepers, importantly, have control over to improve the productivity and survival of
468 colonies in their operations.

469 **5. Conclusions**

470 We focused on the large-scale land use features of intensively-managed lands that are
471 most utilized by honey bees to support colony productivity and, more importantly, colony
472 survival to ultimately meet pollination contracts the following spring. We found that honey bee
473 colonies positioned in agricultural lands utilize a high proportion of non-native, volunteer plants,
474 as also shown by Requier et al. (2015) in France. However, unlike in the French system, there
475 were relatively few areas of mass-flowering bee forage crops (i.e. rapeseed, sunflower) in our

476 study area. Therefore, we suggest that bees in the NGP of the US are even more dependent on
477 volunteer species of flowers present in uncultivated parts of the landscape than other more
478 diverse cropping systems in the US or abroad. The nutritional demands of honey bee colonies
479 during a pollinator crisis must be considered and weighed against the potential future ecological
480 impacts of allowing certain non-native plants to grow in specific areas of the landscape. If such
481 species are not allowed to be seeded or persist in critical regions for honey bees, then greater
482 efforts are needed to identify and seed-in viable alternative, acceptable flowering plants on the
483 landscape to support honey bee colonies.

484 Previous work has demonstrated the effects of land use on honey bee colonies under
485 varying and alternative land use and beekeeping conditions. For example, Naug (2009) was one
486 of the first to correlate coarse, large-scale land use to differences in colony losses by US state.
487 Since that time, others have produced additional evidence suggesting that honey bees have a
488 preference for, or most benefit from, agricultural lands compared to urban, forested, or mature
489 grass lands (Clermont et al. 2015; Sponsler and Johnson 2015), or areas containing pollinator-
490 conscious practices such as agri-environment schemes (programs incentivizing farmers) in the
491 European Union (Couvillon et al. 2014).

492 Related, USDA conservation lands (voluntary landowner incentive programs) were
493 prevalent near several of our apiary sites, and differences in observed floral coverage on such
494 lands could have been due to several factors, including differences in program seed mixes, time
495 the land was in the conservation program, weed and land management, and differences resulting
496 from soil nutrients and water availability. Intriguingly, colonies from the three apiary sites with
497 the highest amount of CRP lands nearby (A, C, and F) also collected the highest overall
498 taxonomic diversity of pollen. However, care should be taken in assuming such federal

499 programs are an automatic net gain for honey bee colony health and survival. Seed mixes should
500 be utilized that are maximally beneficial to honey bees and other pollinators (and maintained to
501 protect continued growth of forbs so as not to be outcompeted by grasses) if the goal is to
502 significantly increase pollinator forage on the landscape.

503 Our focus here was on a large number of commercial honey bee colonies solely
504 embedded in intensive agricultural lands for summer foraging, thus highlighting the delicate
505 balance between high agro-ecosystem productivity and the availability of habitat for honey bee
506 colonies required to meet national pollination service demands. In such landscapes, disparate
507 sectors of the agricultural industry must coexist to provide healthy, reliable, and productive
508 systems. Overall, this work provides an additional novel piece of evidence for the strong
509 influence of land use within agricultural environments and the importance of the NGP for the
510 performance and final outcomes of honey bee colonies that are part of the US commercial
511 beekeeping industry. Recent land use and land use change in the NGP (Wright and Wimberly
512 2013), then, require closer attention to ensure habitat is available to a sustain large proportion of
513 the commercial honey bee and pollination industry.

514

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685

TABLES

686 Table 1. Ground survey estimates of floral resources within land use categories.

Land use	Site	Sum total area (m ² x10 ³) land use 2010-12	Sum total area flower type (m ² x10 ³), 2010-12					Proportion flower coverage	
			Sweet Clover, <i>Melilotus</i> spp.	Alfalfa, <i>Medicago sativa</i>	Gum-weed, <i>Grindelia</i> spp.	Native Sunflower, <i>Helianthus</i> spp.	Sow-thistle, <i>Sonchus</i> spp.		Golden-rod, <i>Solidago</i> spp.
CRP	A	9627	1949	4172	117	487	672	664	0.837
	B	1950	-	975	-	-	-	-	0.500
	C	14093	463	892	162	1179	546	1282	0.321
	D	1058	143	413	36	71	-	36	0.660
	E	1264	322	64	64	44	-	193	0.545
	F	9210	683	56	136	287	574	126	0.202
Roadside Ditches	A	1477	261	109	108	85	43	233	0.567
	B	657	21	56	40	29	10	34	0.289
	C	1664	299	147	147	124	49	130	0.538
	D	1598	-	315	-	-	-	-	0.197
	E	2153	283	204	57	351	57	351	0.605
	F	1067	181	85	172	59	118	59	0.632
Fallow Land	A	1289	212	-	106	-	-	-	0.247
	B	1340	-	366	-	-	-	-	0.273
	C	-	-	-	-	-	-	-	-
	D	1706	-	132	-	-	-	-	0.078
	E	2524	22	-	11	-	11	-	0.017
	F	-	-	-	-	-	-	-	-
Grassland	A	2674	326	82	81	124	81	292	0.369
	B	33654	1652	720	637	417	332	1169	0.146
	C	883	-	31	31	31	31	31	0.177
	D	3637	-	-	-	-	-	-	0.000
	E	237	-	-	-	-	-	-	0.000
	F	323	-	-	-	-	-	16	0.075
Hayland	A	7062	1043	3539	102	53	54	-	0.678
	B	2994	-	2283	32	-	-	-	0.773
	C	3080	212	1805	97	203	97	97	0.816

Land use	Site	Sum total area (m ² x10 ³) land use 2010-12	Sum total area flower type (m ² x10 ³), 2010-12					Proportion flower coverage	
			Sweet Clover, <i>Melilotus</i> spp.	Alfalfa, <i>Medicago</i> <i>sativa</i>	Gum- weed, <i>Grindelia</i> spp.	Native Sunflower, <i>Helianthus</i> spp.	Sow- thistle, <i>Sonchus</i> spp.		Golden- rod, <i>Solidago</i> spp.
	D	2854	542	1248	-	-	57	-	0.647
	E	5918	51	308	179	78	-	-	0.104
	F	362	14	44	-	-	-	-	0.159
Pasture	A	43594	10664	562	4822	3708	1825	7204	0.660
	B	7631	86	21	106	21	3	137	0.049
	C	7761	0	115	639	262	-	703	0.221
	D	14874	-	5	97	-	-	-	0.007
	E	3451	231	252	527	-	-	371	0.401
	F	-	-	-	-	-	-	-	-

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706 Table 2. Linear mixed effect models relating annual number of colonies surviving and honey yields across varying agricultural land
 707 use in North Dakota, 2010-2012.

Response	Model (log transformed m ²); Random effects: site and year	K	AICc	ΔAICc	w	Coefficients (95% C.I.)
Number of surviving colonies per apiary (3.2- km buffer)	Uncultivated forage	5	84.19	0.00	0.729	Intercept: -24.88 Uncultivated forage: 2.65 (1.20, 4.07)
	Uncultivated forage + Wetlands	6	87.85	3.66	0.117	Intercept: -19.14 Uncultivated forage: 2.75 (1.40, 4.16) Wetlands: -0.51 (-1.51, 0.49)
	Uncultivated + Cultivated forage	6	88.25	4.06	0.096	Intercept: -22.00 Uncultivated forage: 2.43 (0.82, 3.91) Cultivated forage: 0.06 (-0.10, 0.22)
	Cultivated forage	5	90.44	6.25	0.032	Intercept: 17.01 Cultivated forage: 0.07 (-0.11, 0.24)
	Wetlands	5	90.87	6.68	0.026	Intercept: 21.36 Wetlands: -0.26 (-2.18, 1.32)
	Uncultivated + Cultivated forage + Wetlands	7	93.09	8.9	0.009	Intercept: -17.83 Uncultivated forage: 2.57 (1.10, 4.09) Cultivated forage: 0.04 (-0.11, 0.20) Wetlands: -0.43 (-1.42, 0.53)
	Cultivated forage + Wetlands	6	95.03	10.84	0.003	Intercept: 19.50 Cultivated forage: 0.06 (-0.12, 0.23) Wetlands: -0.17 (-1.89, 1.42)
Honey production (3.2-km (buffer)	Uncultivated forage	5	152.32	0.00	0.389	Intercept: -99.66 Uncultivated forage: 8.44 (1.51, 16.15)
	Uncultivated forage + Wetlands	6	152.96	0.64	0.283	Intercept: -42.42 Uncultivated forage: 9.36 (3.17, 15.74) Wetlands: -4.96 (-9.69, -0.10)
	Wetlands	5	154.68	2.36	0.120	Intercept: 95.48 Wetlands: -4.11 (-9.61, 2.36)

Response	Model (log transformed m ²); Random effects: site and year	K	AICc	ΔAICc	w	Coefficients (95% C.I.)
	Cultivated forage	5	154.71	2.39	0.118	Intercept: 29.97 Cultivated forage: 0.64 (-0.30, 1.43)
	Uncultivated + Cultivated forage	6	156.44	4.12	0.050	Intercept: -82.47 Uncultivated forage: 7.19 (-0.67, 15.30) Cultivated forage: 0.32 (-0.63, 1.11)
	Cultivated forage + Wetlands	6	157.97	5.65	0.023	Intercept: 79.59 Cultivated forage: 0.53 (-0.31, 1.44) Wetlands: -3.35 (-8.51, 2.45)
	Uncultivated + Cultivated forage + Wetlands	7	158.49	6.12	0.018	Intercept: -40.10 Uncultivated forage: 9.05 (1.89, 15.90) Cultivated forage: 0.07 (-0.78, 0.95) Wetlands: -4.82 (-9.66, -0.19)

708 K represents the number of parameters; ΔAICc represents the difference between AICc values of each model and the top-ranking
709 model; w is the AICc model weight.
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7. Figure Captions

Fig. 1. Proportion of land use area within 3.2-km radius of each apiary, 2010-2012. Categories include (from bottom to top): 1) Uncultivated forage land use: CRP, pasture, fallow, grassland, hay land, roadside ditch (green), 2) Cultivated forage land use: Canola, sunflower, alfalfa (orange), 3) Wetlands (blue), and 4) Non-forage: Corn, soybeans, wheat, and oats (grey).

Fig. 2. Linear regression of area (m^2) uncultivated forage land on annual apiary survival (2a) and honey production (2b), and linear regression of annual honey production on survival (2c). ANOVA analysis of survival (2d) and honey production (2e) by site.

Fig.3. Pollen taxa and pesticide residues detected seasonally among the six study apiaries, 2010-2012. Pollen taxa are reported as the proportion (including unidentified pollen = undetermined) from each apiary on each sample date. Pesticide residues are reported as the $\log_{10}(x+1)$ hazard quotient values (ppb for each chemical/contact LD_{50}).

Fig. 4. Shannon-Weiner diversity index of land use (circles) surrounding apiaries and pollen taxa (triangles) identified in returning forager pollen loads, 2010-2012.

8. Appendix

Additional Supporting Information may be found in the online version of this article.

Table A.1. Land use areas quantified ($m^2 \times 10^3$) among the six study apiaries over three years, 2010-2012, in North Dakota. These raw categories were subsequently grouped into 1) Uncultivated forage land use: CRP, pasture, fallow, grassland, hay land, roadside ditch, 2) Cultivated forage land use: Canola, sunflower, alfalfa, 3) Wetlands, and 4) Non-forage: Corn, soybeans, wheat, and oats.

Table A.2. Pollen identification and proportion of taxa of detected pollen by site (A-F) and year (2010-2012).

Table A.3. Linear mixed effect modeling of survival and honey production relative to land use at alternative spatial scales.

Table A.4. Pesticides detected in forager pollen loads, 2010-12.

Fig. A.1. Map of apiary locations. Colonies were located in North Dakota from May-September and transported to California in October to overwinter and for almond pollination in February-March.

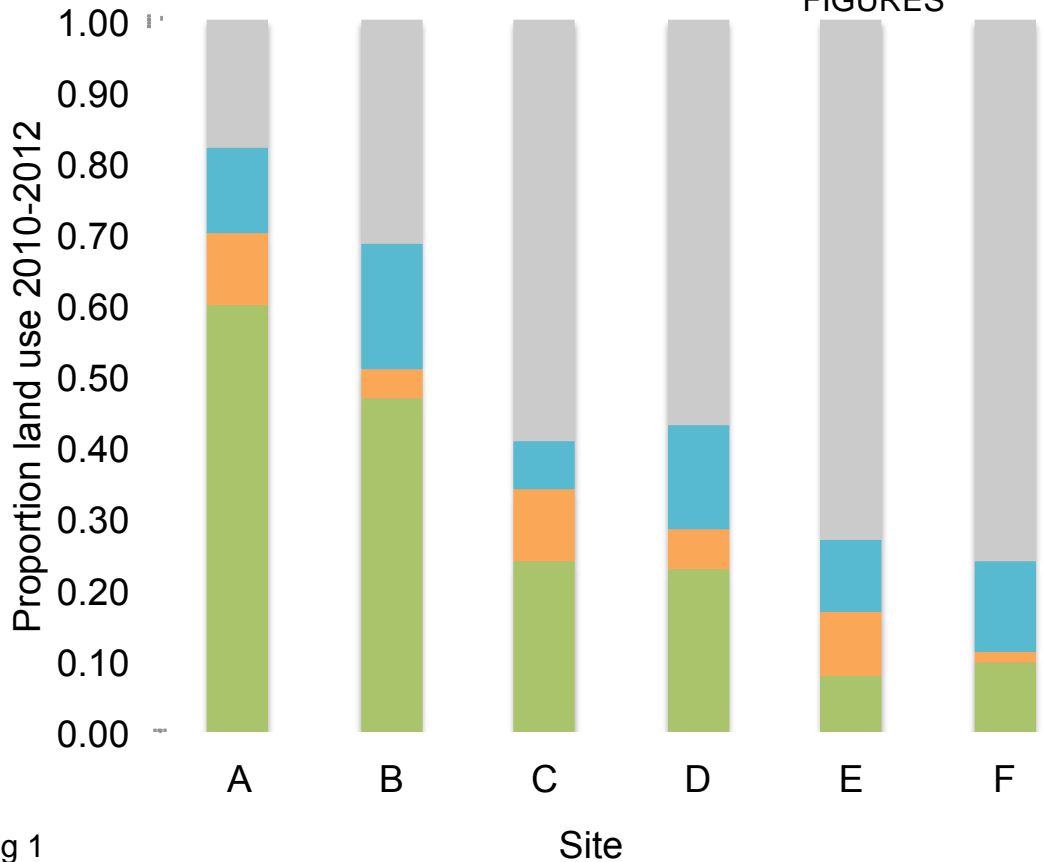
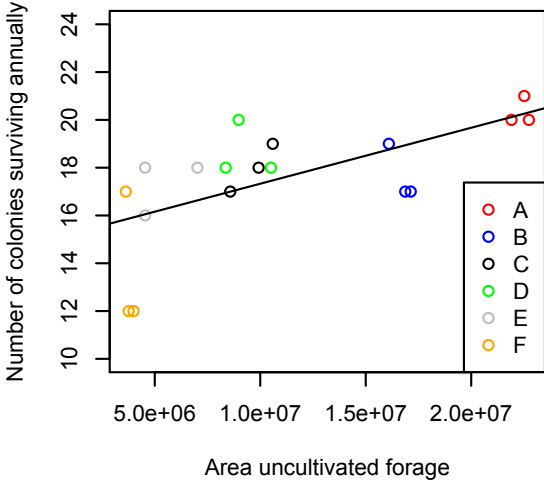
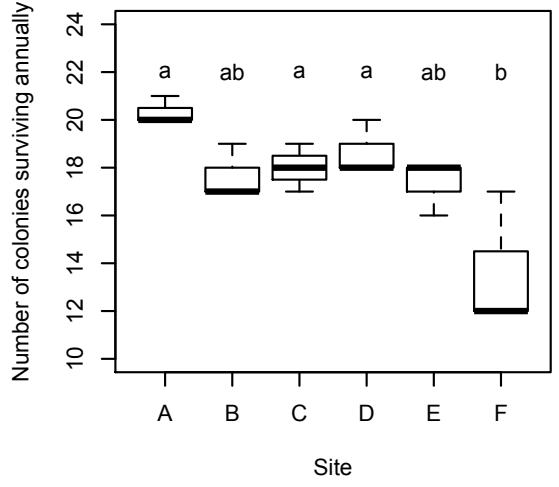


fig 1

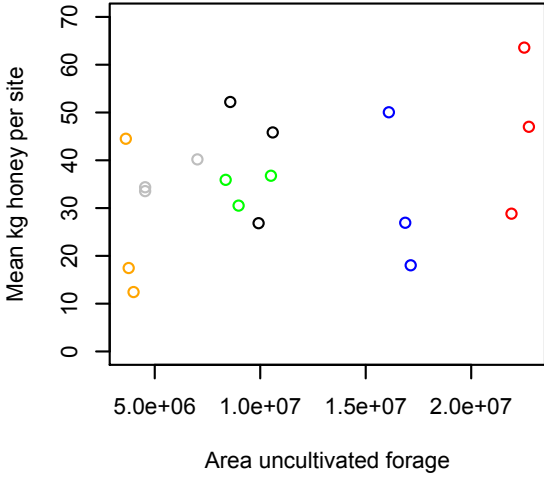
a Bee forage and survival



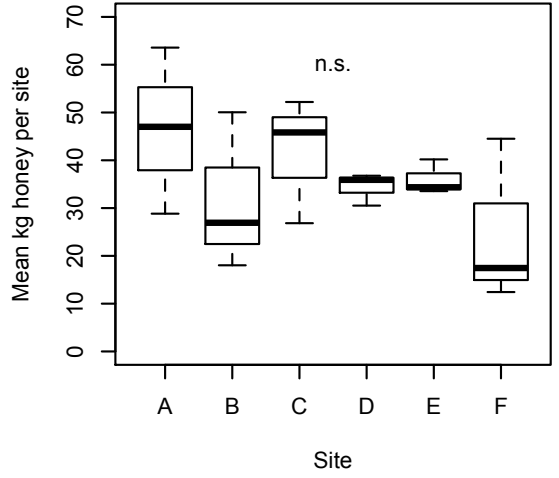
d Survival by site 2010-2013



b Bee forage and honey production



e Honey production by site 2010-2012



c honey production and survival

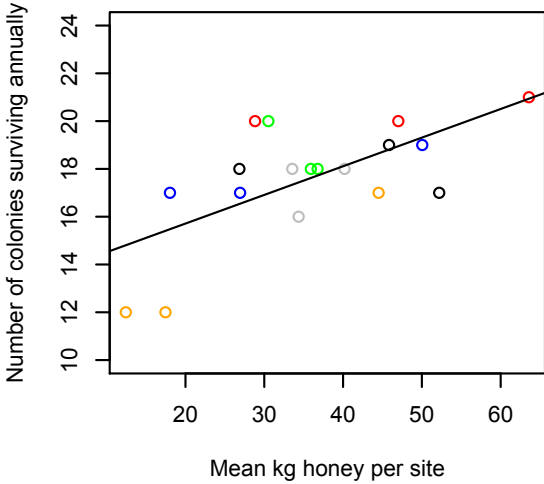
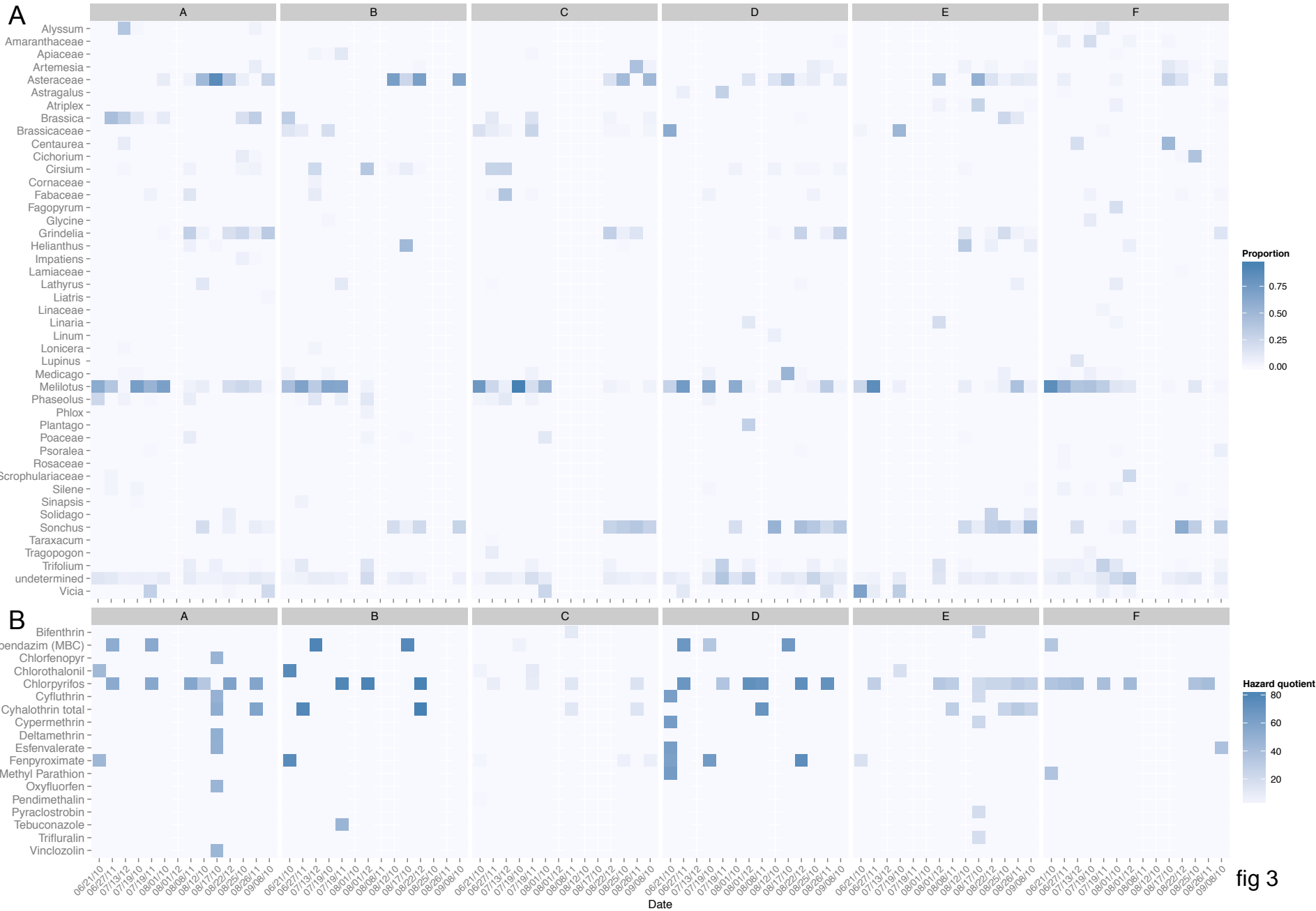
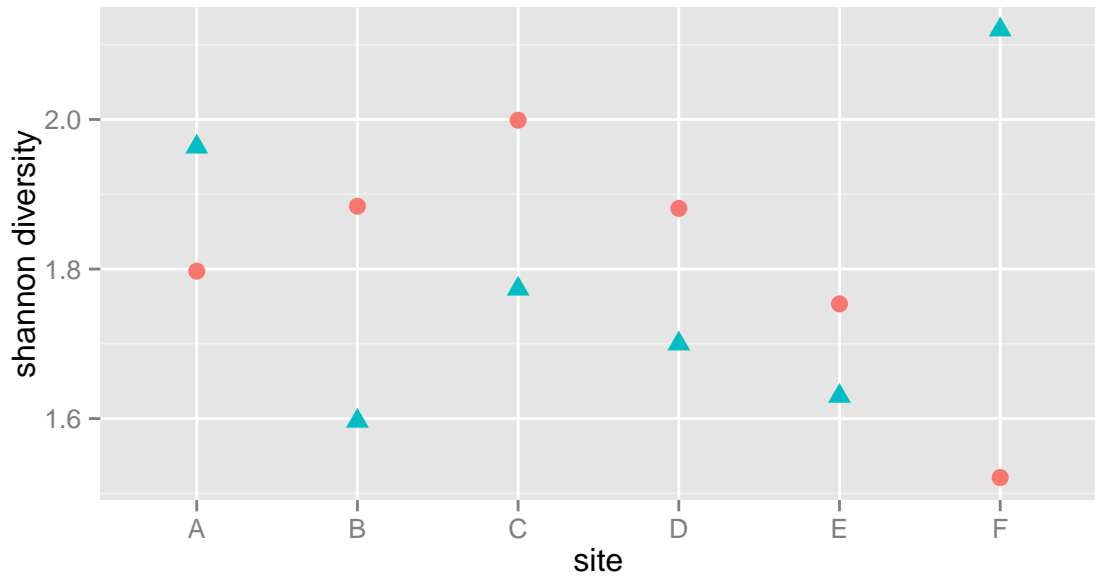


fig 2





land.diversity



all.taxa.pollen.diversity

fig 4