

The Butterfly Effect: Do Farms Do Harm?

Braeden Van Deynze, Scott M. Swinton, Leslie Reis
Dept. of Agricultural, Food, and Resource Economics
Michigan State University
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KBS LTER
Kellogg Biological Station
Long-term Ecological Research



Michigan State University
AgBioResearch



Butterfly Populations On the Decline

- Butterflies are a highly-valued group of insects
 - Pollination, aesthetic, cultural value
 - US households' existence value monarchs at **\$4.78-\$6.65 bill.** per 2012 contingent valuation survey (Diffendorfer et al., 2014)
- Butterfly populations in decline, globally and domestically (Sánchez-Bayo & Wyckhuys, 2019; Wepprich et al., 2019)
 - 53% of species in decline; 1.8% more species in decline annually
 - Ohio populations reduced by 1/3rd in last two decades
- **Pesticide exposure** potentially a driver of butterfly decline (Agrawal & Inamine, 2018; Thomas, 2016)

Sparse Evidence of Pesticide-Pop. Connection

Specific evidence for negative pesticide impacts on butterfly populations for some groups:

Neonicotinoid insecticides

Forister et al., 2016

- Sacramento Valley
- Many Species
- Data from 3 counties since mid-1990s

Gilburn et al., 2015

- United Kingdom
- Many Species
- Data from 1984-2012

Glyphosate herbicides

Saunders et al., 2018

- Illinois
- Monarchs only
- Data from 1994-2013

But past studies have only examined single pesticide groups at a time

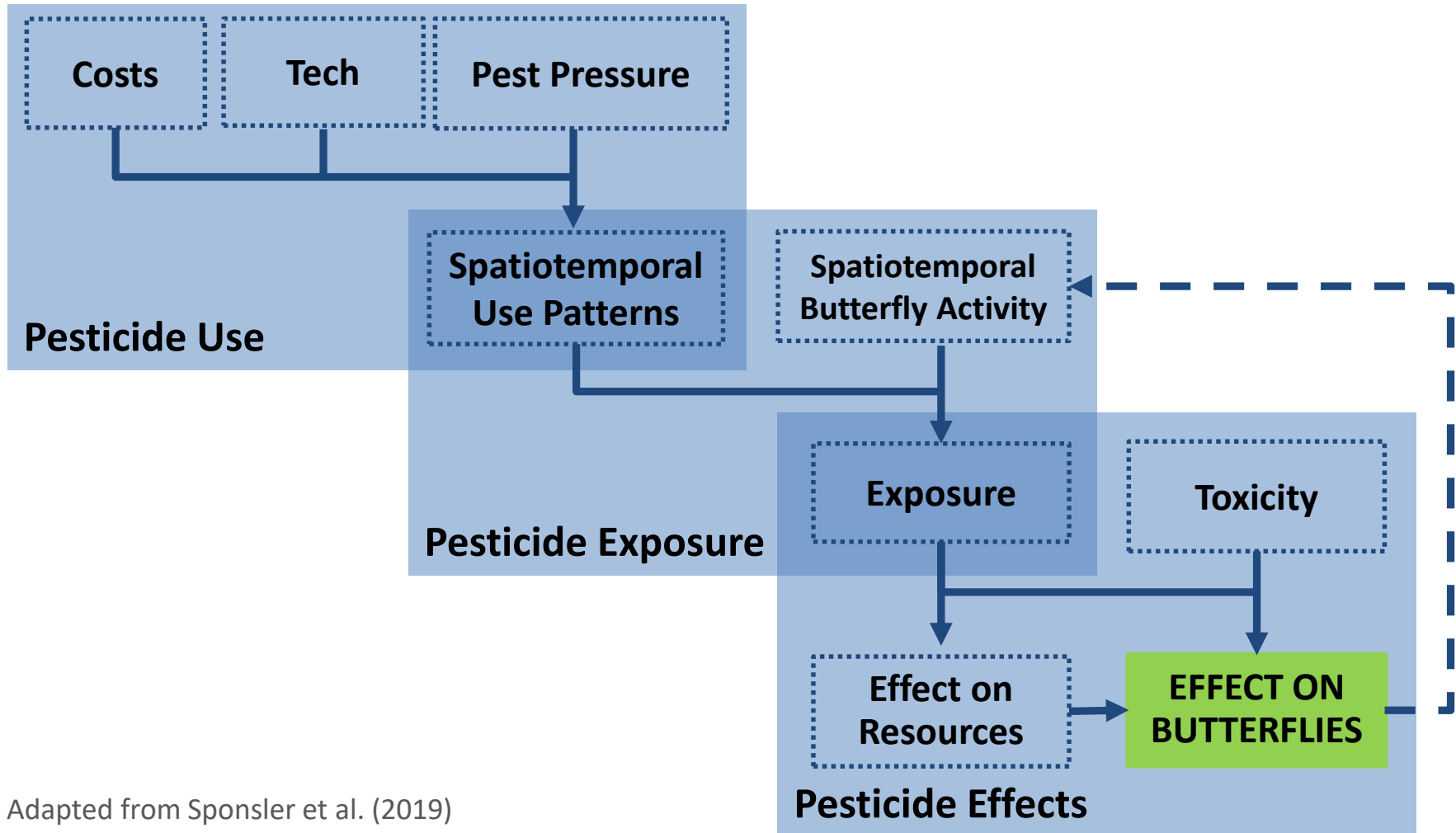
Simultaneously Examining Multiple Pesticides

RQ: How have changes in pesticide use affected Midwestern butterfly abundance?

Contributions

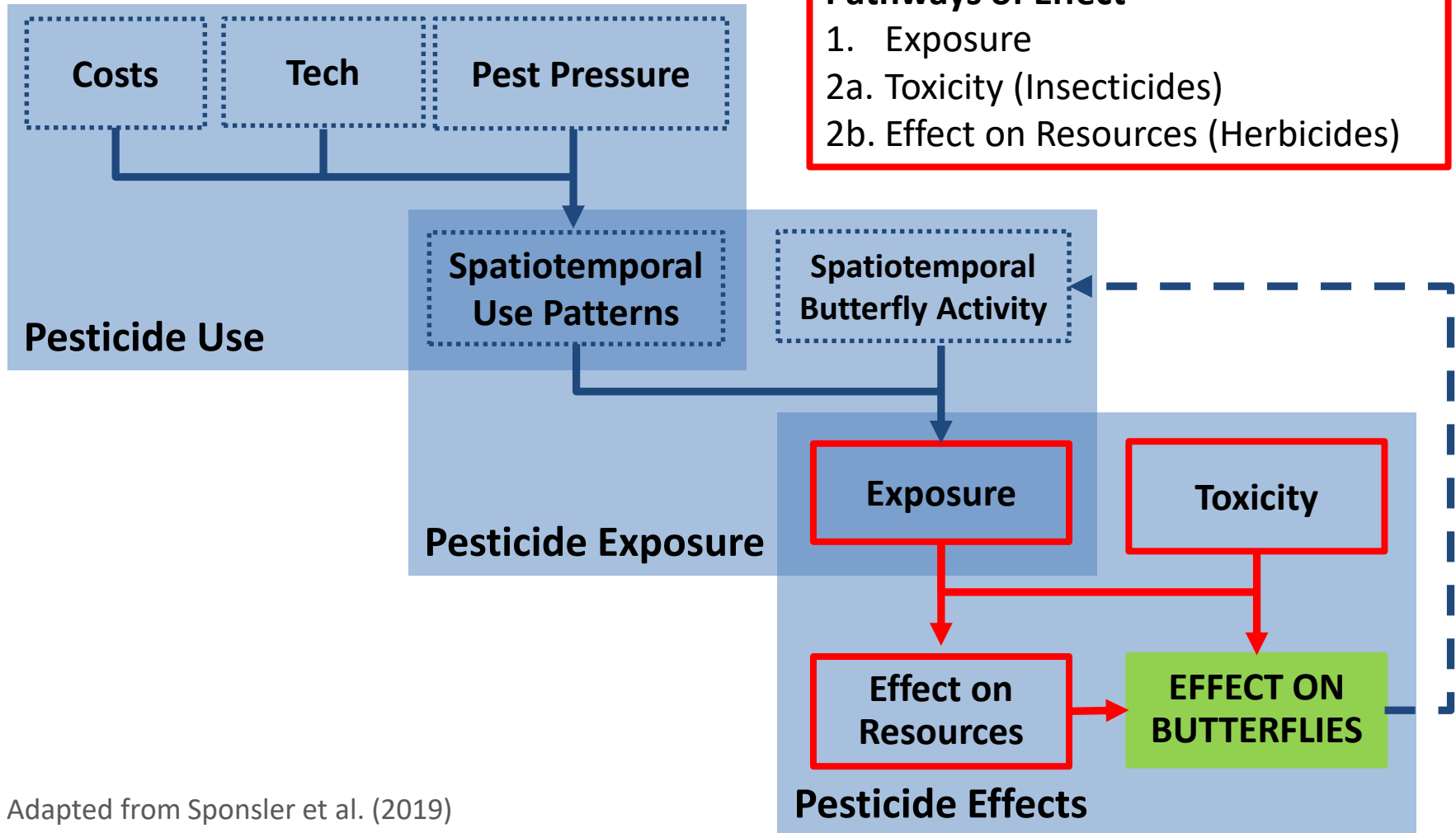
- Use knowledge of substitution effects between pesticides to better inform population models
- Address concerns of omitted variable bias in previous work
- Develop models that can better inform potential policy impacts
 - Substitution under taxes/subsidies

Butterfly-Pesticide System



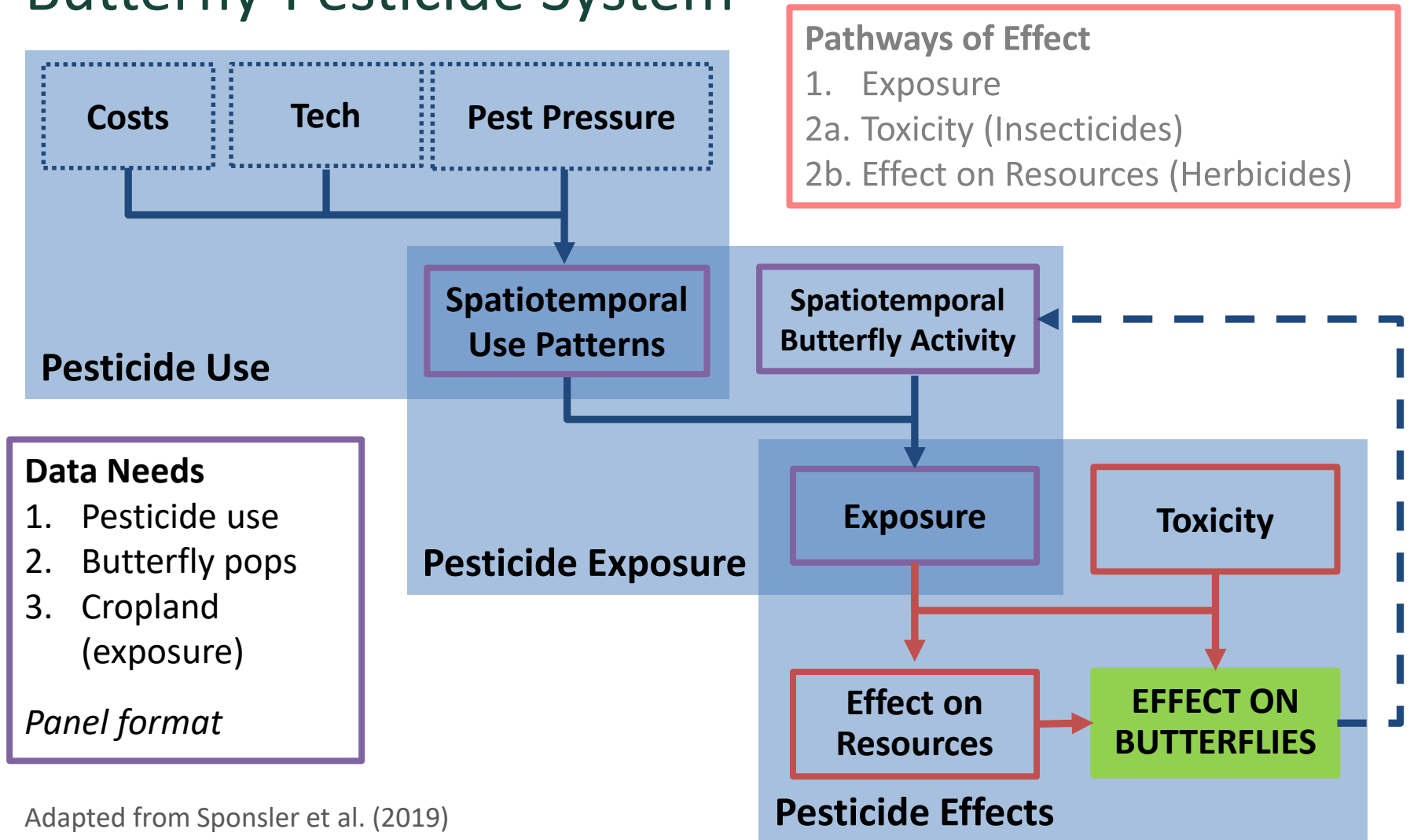
Adapted from Sponsler et al. (2019)

Butterfly-Pesticide System



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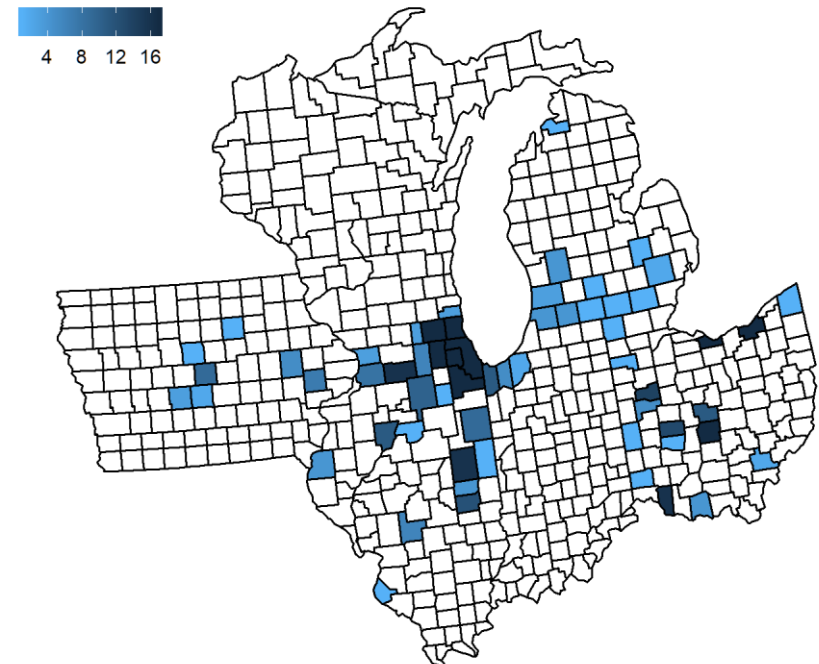
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Butterfly Population Data

North American Butterfly Monitoring Network – Butterfly Population Data

- Transact surveys conducted by citizen scientist volunteers
- **56 counties** in Iowa, Illinois, Indiana, Michigan, Ohio, and Wisconsin
- **23 species** including **Monarch**
- Aggregated across summer months to **county x year x species** counts

Butterfly Data Availability
Years Surveys Contributed



Pesticide Use Data

Kynetec AgroTrak®

- Field-level application data for **corn** and **soybean** via extensive farmer phone surveys
- Includes sprayed, seed-treated pesticides, and seed traits for every sampled field
- Measured by **acre-treatments**: number of applications per field
 - Preferred over volume measures because of large differences in application rates
- Aggregated to **county x year x class**

Herbicides

- Glyphosate
- Non-Glyphosate

Insecticides

Sprayed

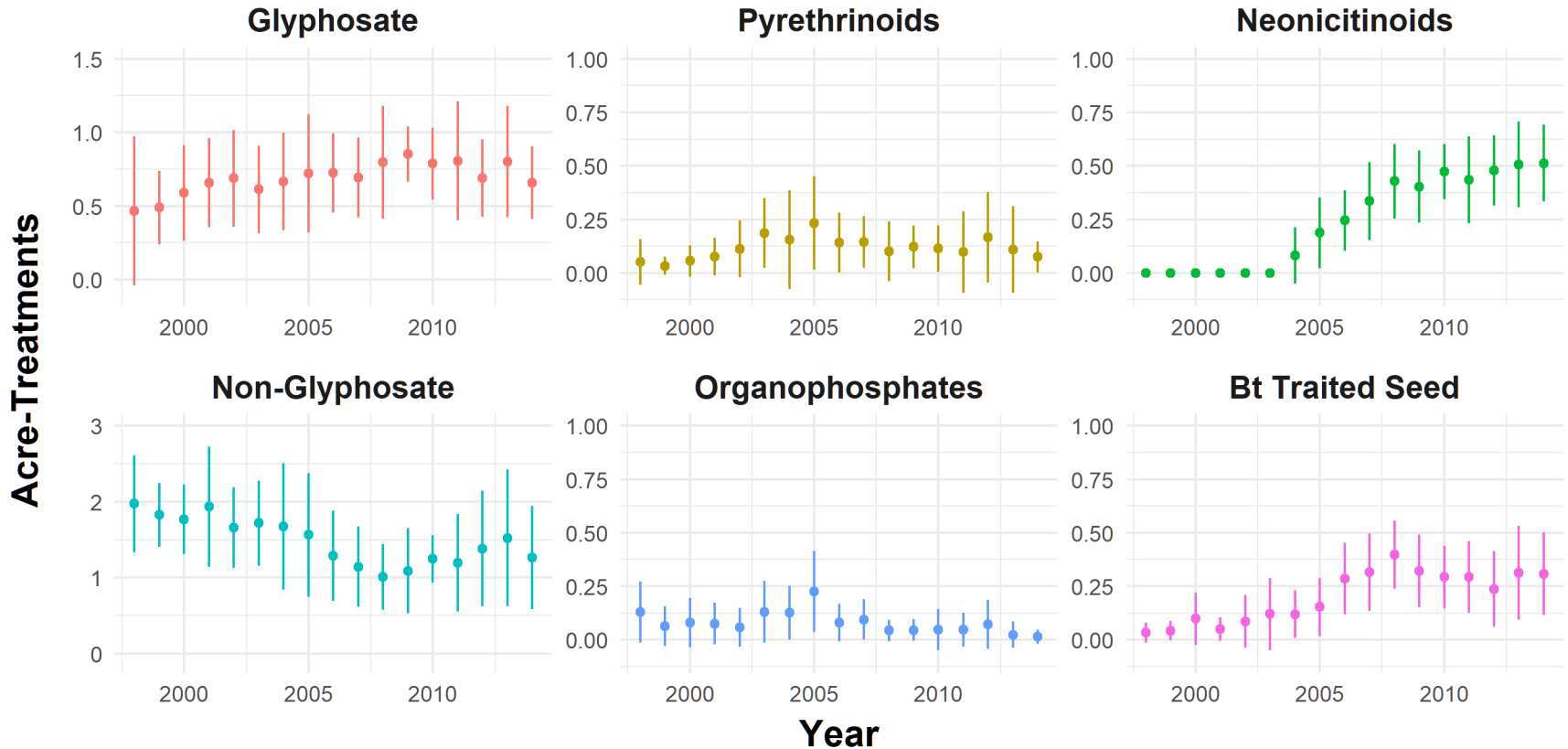
- Pyrethroids
- Organophosphates

Systemic

- Neonicotinoids
- BT Seed

Contemporaneous Changes in Pesticide Use

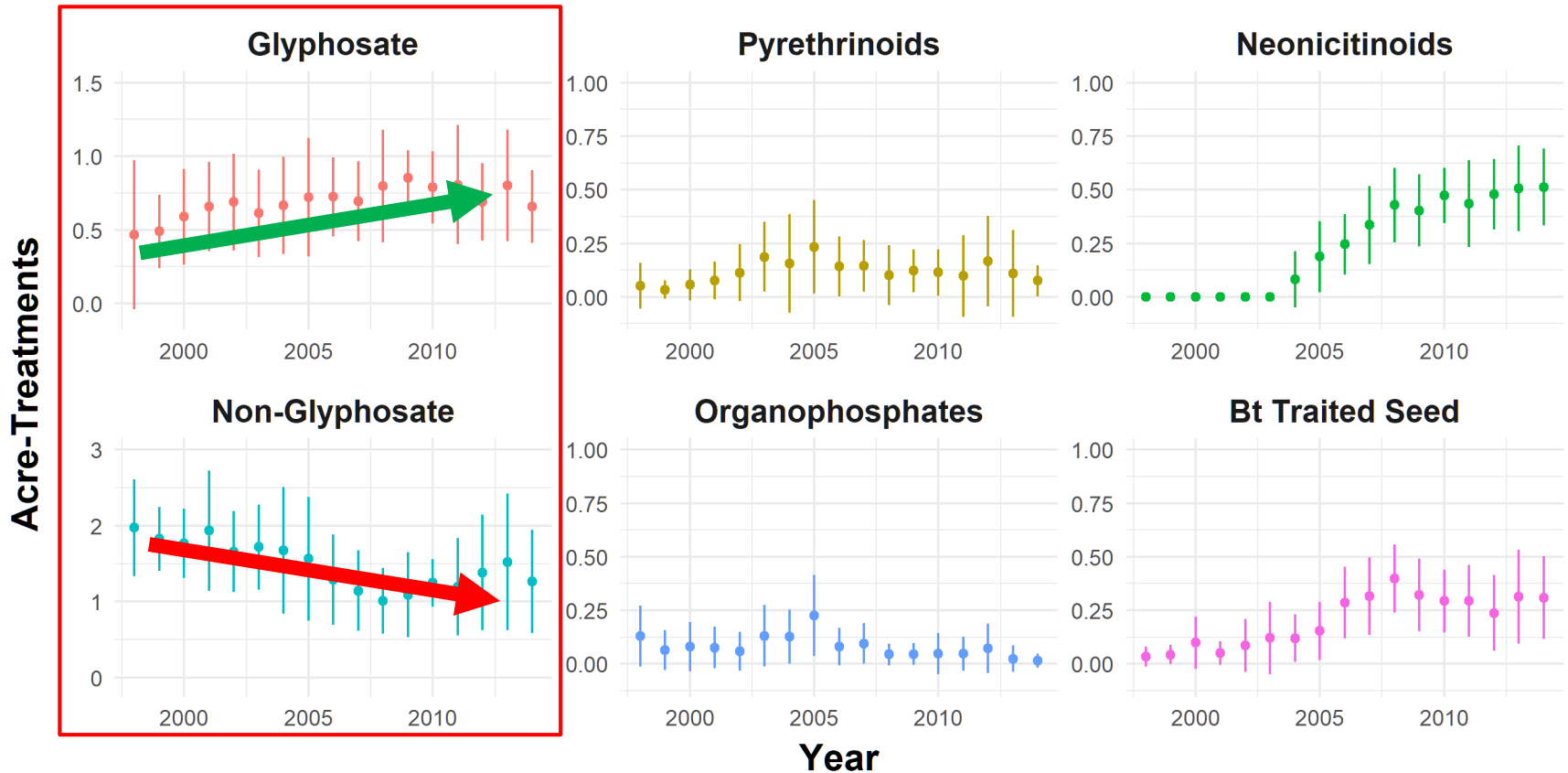
Pesticide Use in Sampled Counties



Vertical lines represent standard deviations.

Contemporaneous Changes in Pesticide Use

Pesticide Use in Sampled Counties

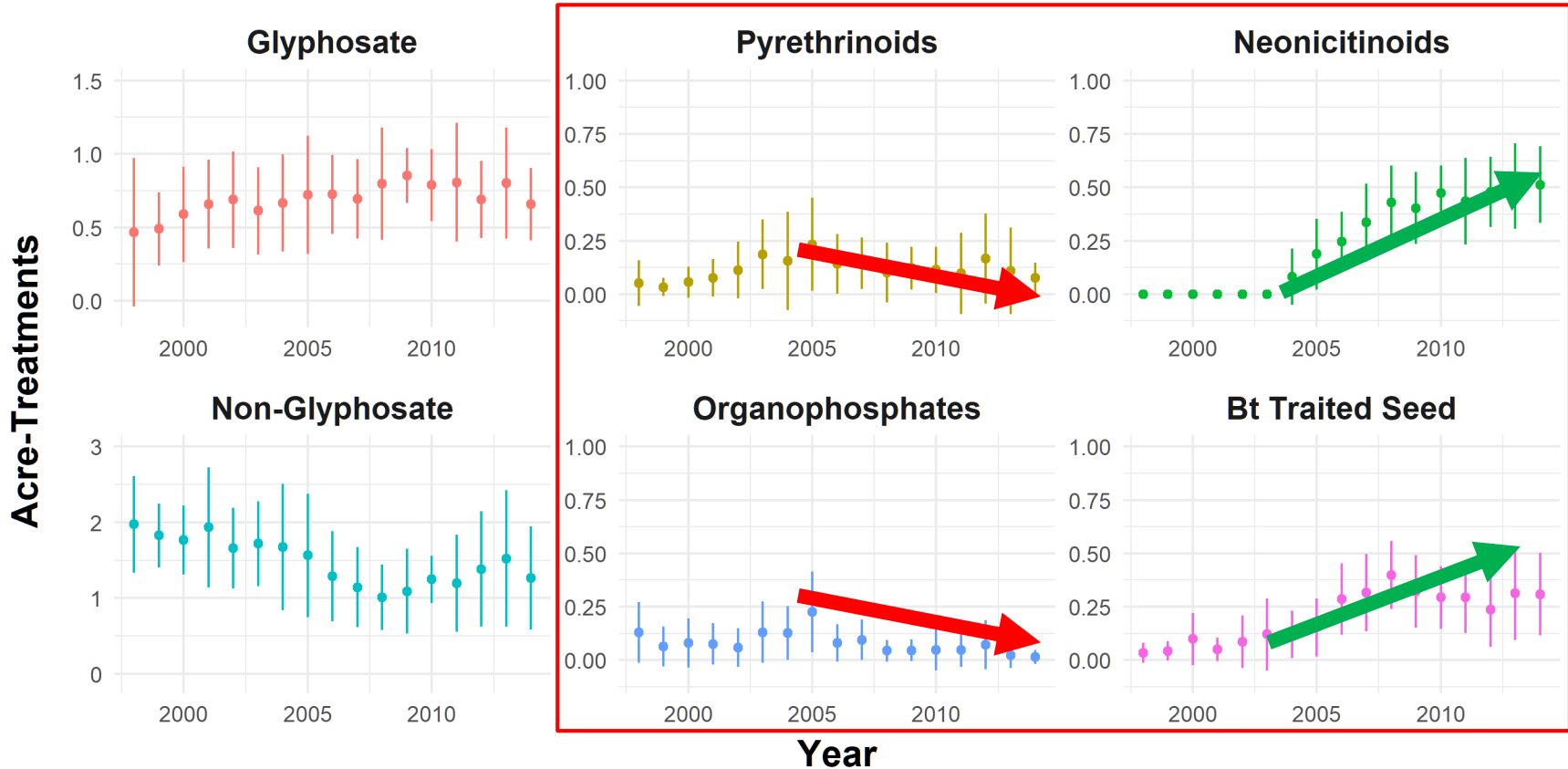


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Glyphosate substitutes for Non-Glyphosate

Contemporaneous Changes in Pesticide Use

Pesticide Use in Sampled Counties



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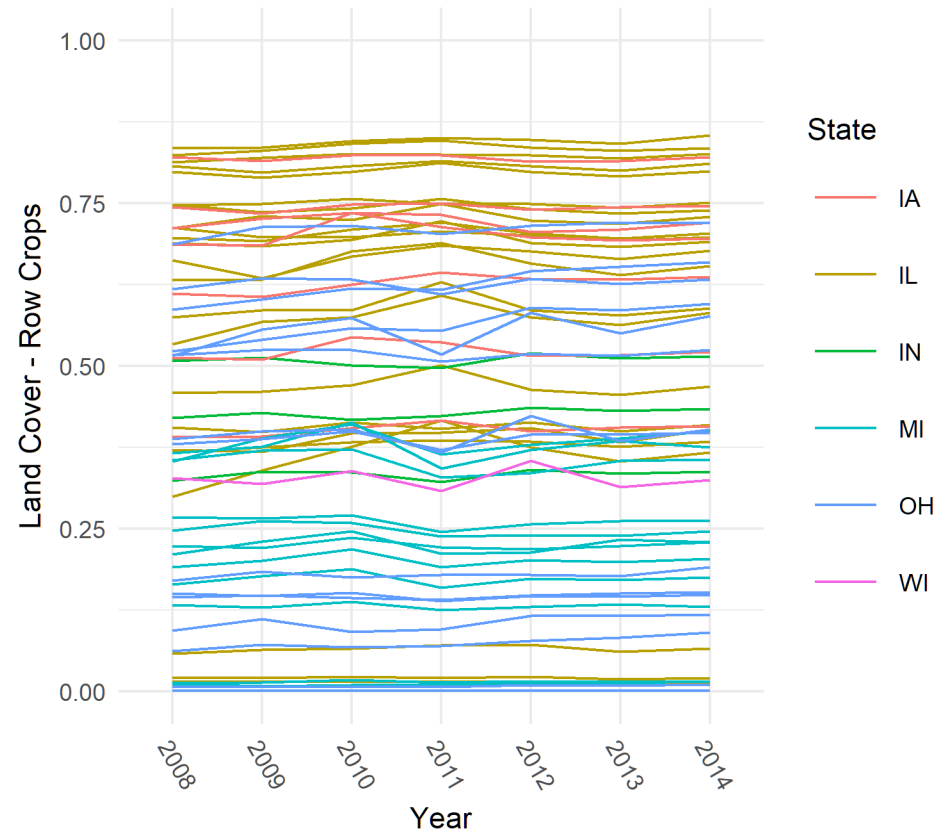
Systemic Insecticides substitute for Sprayed Insecticides

Land Use Data

Cropland Data Layer

- Land cover at **30m resolution** across region based on satellite data
- Available consistently **since 2008**
- Calculate *share* of land under **corn** and **soybeans** for each county
- Very little interannual variation within county
 - Average over available years to create static measure and apply to county-years where CDL is unavailable

Land cover proportion over time by county
Each line represents a county in the sample



Modeling Counts as a Function of Pesticides

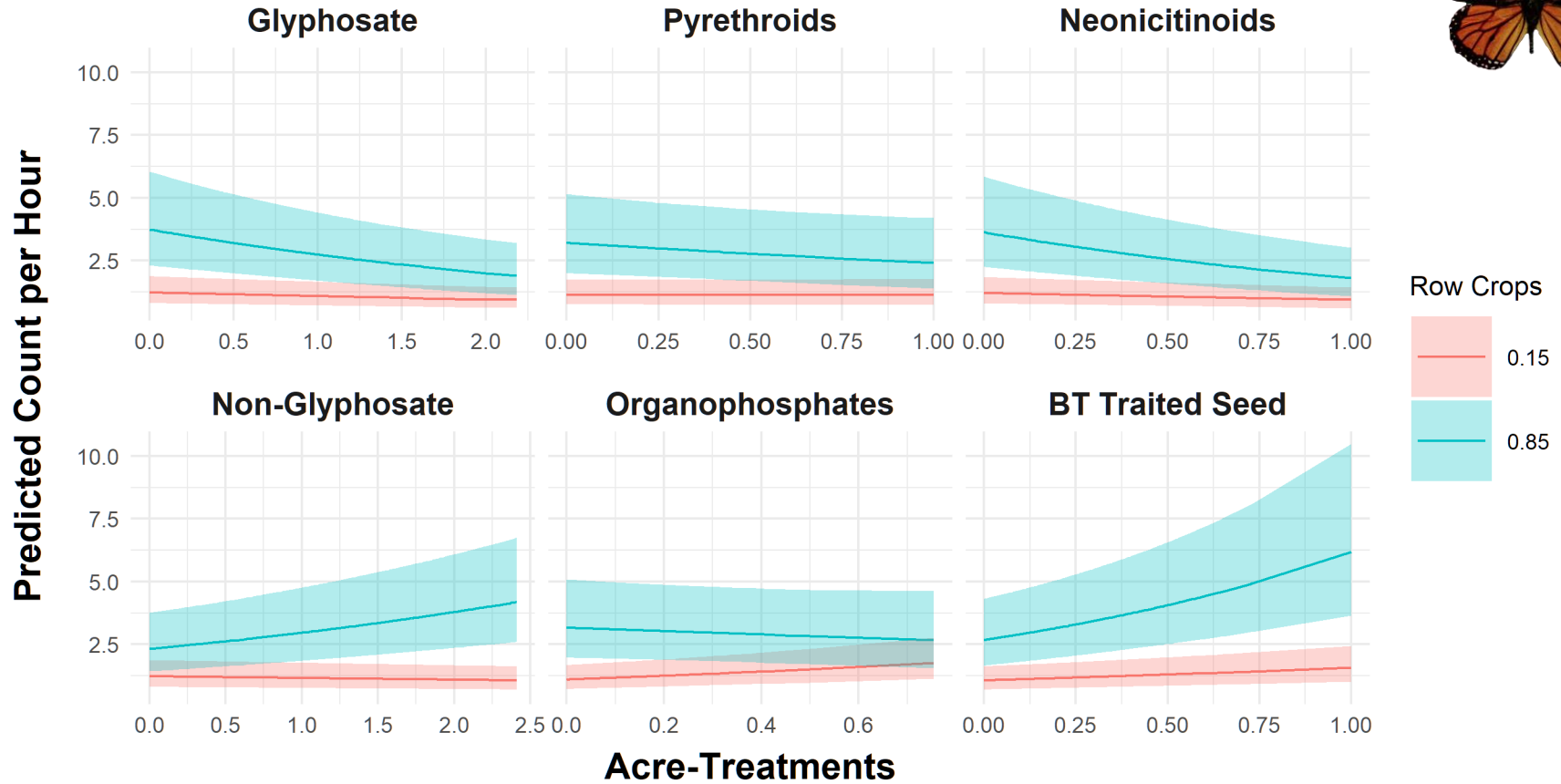
Poisson model with crossed random intercepts

- Dependent variable: # of **monarchs** observed
 - Offset for sampling effort (minutes) so interpreted as rate
- Covariates include...
 1. Pesticide measures
 2. Row crop land cover
 3. Pesticide measures **X** row crop land cover
 4. Climate variables (early, mid, and late season)
 - Temperature (butterfly growing degree days)
 - Precipitation (mm)
- Random intercepts for **county** and **year**
- **370 county-year** observations

Preliminary Results Suggest Possible Impacts



Predicted Butterfly Counts - Monarchs

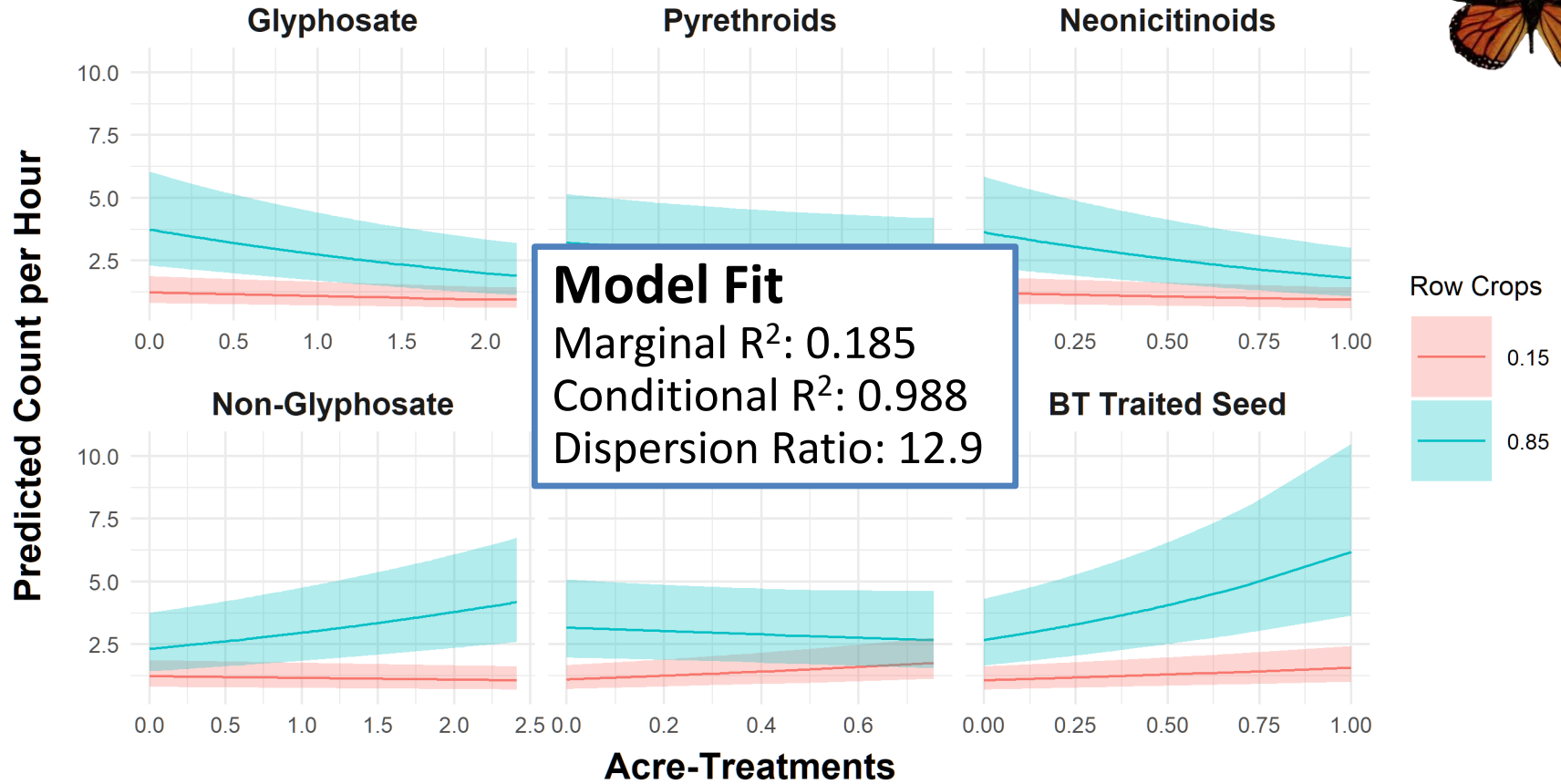


Shaded regions indicate 95% c.i.'s based on sandwich s.e.'s.

Preliminary Results Suggest Possible Impacts



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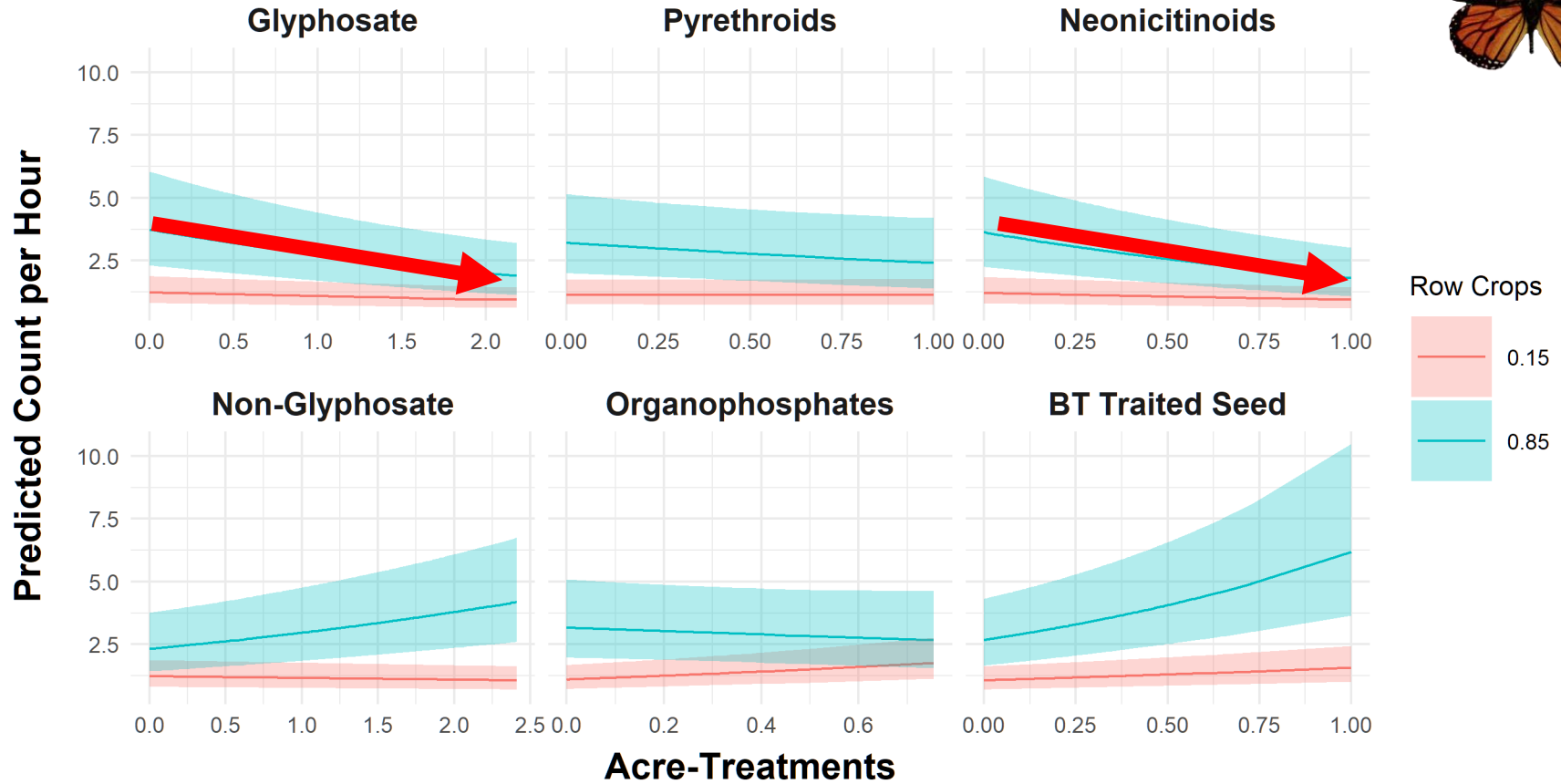


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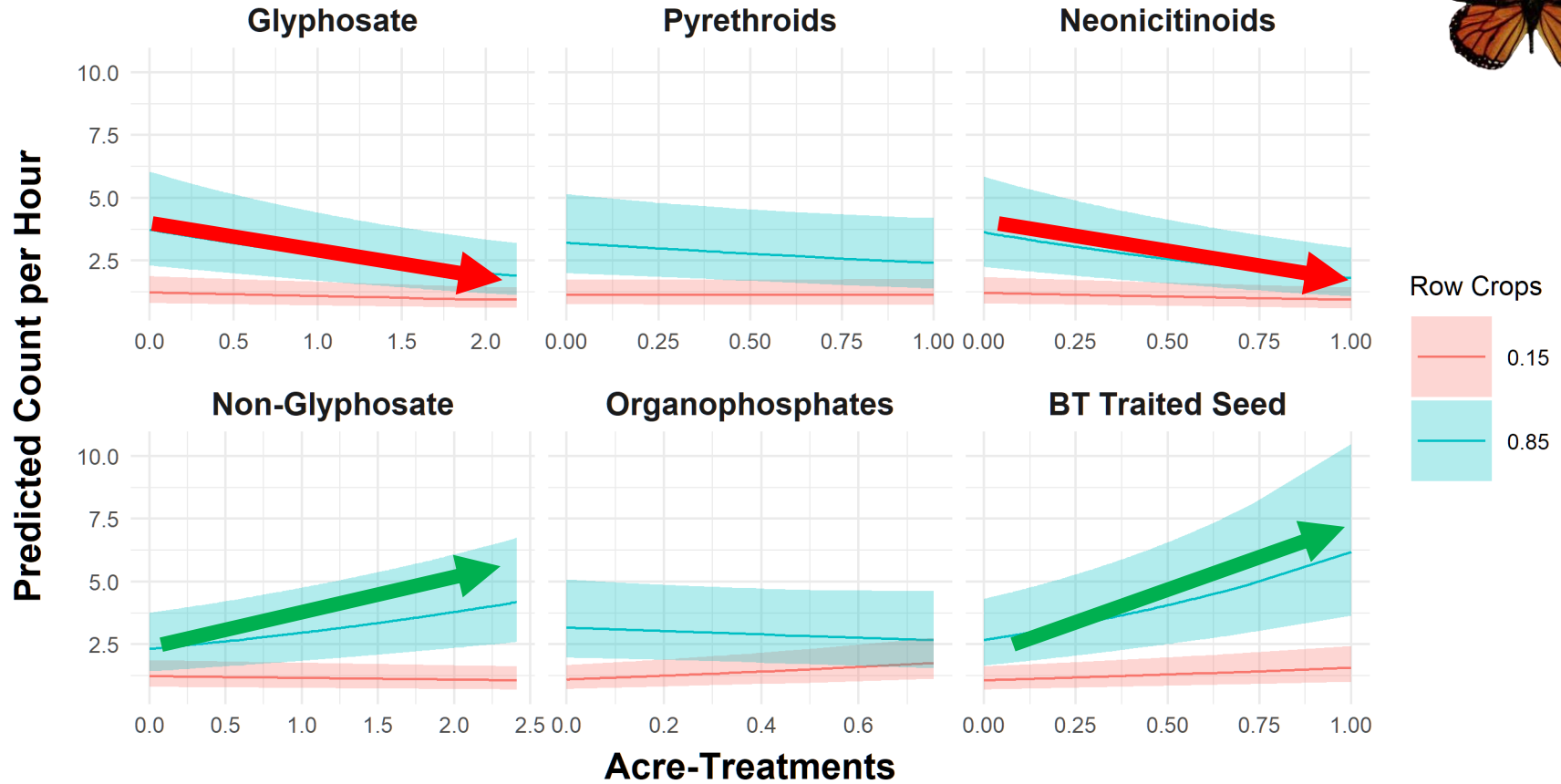


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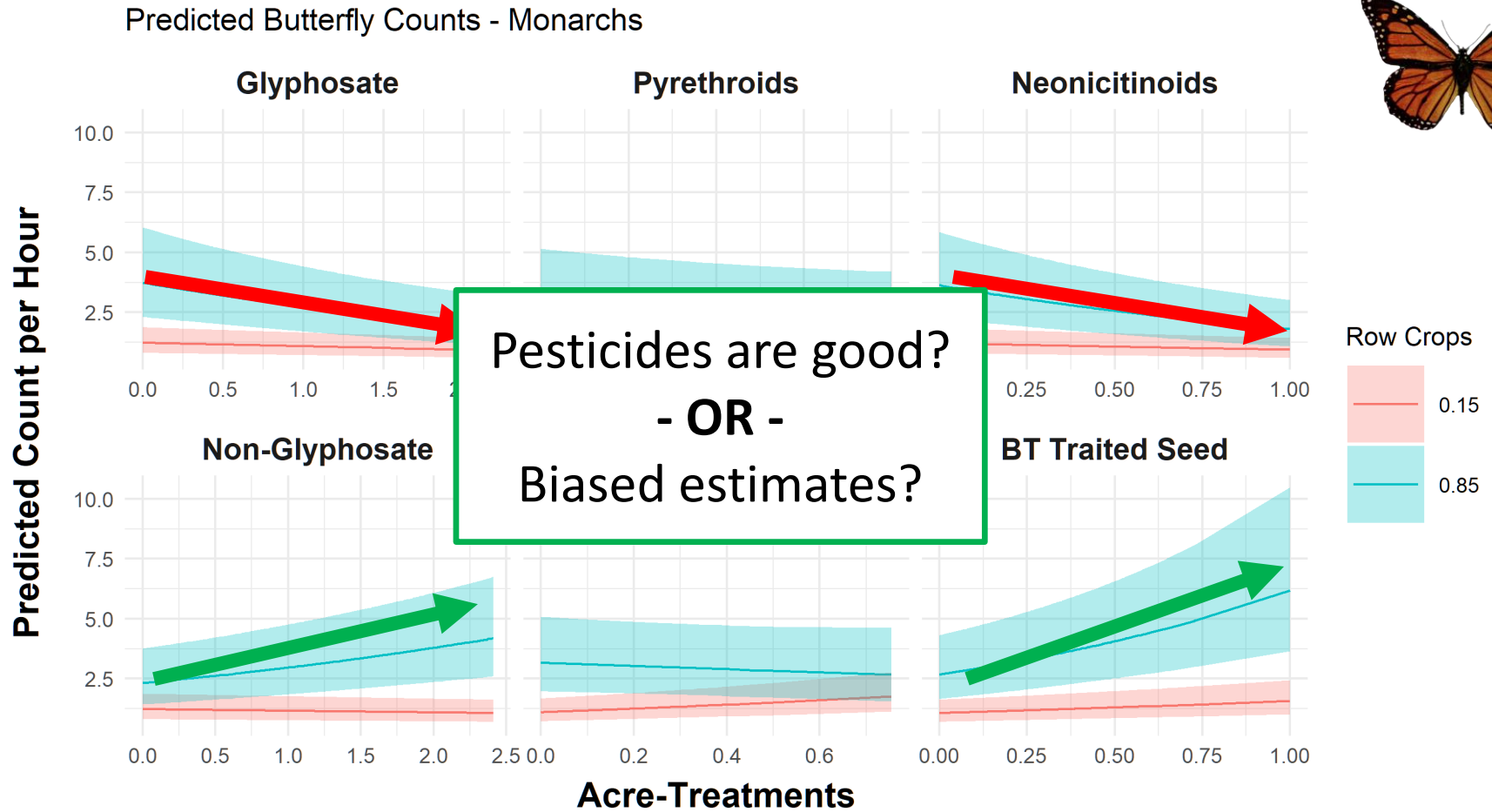


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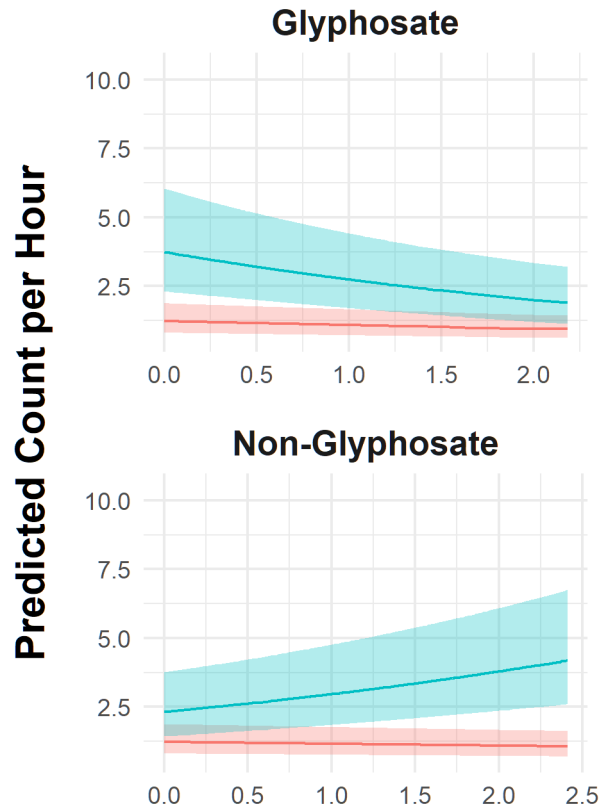
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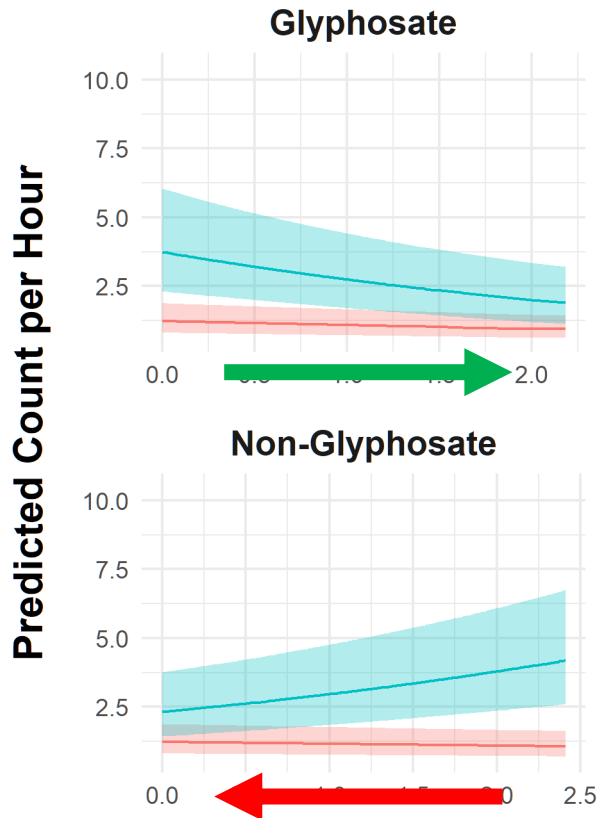
Possible Interpretation of Biased Estimates?

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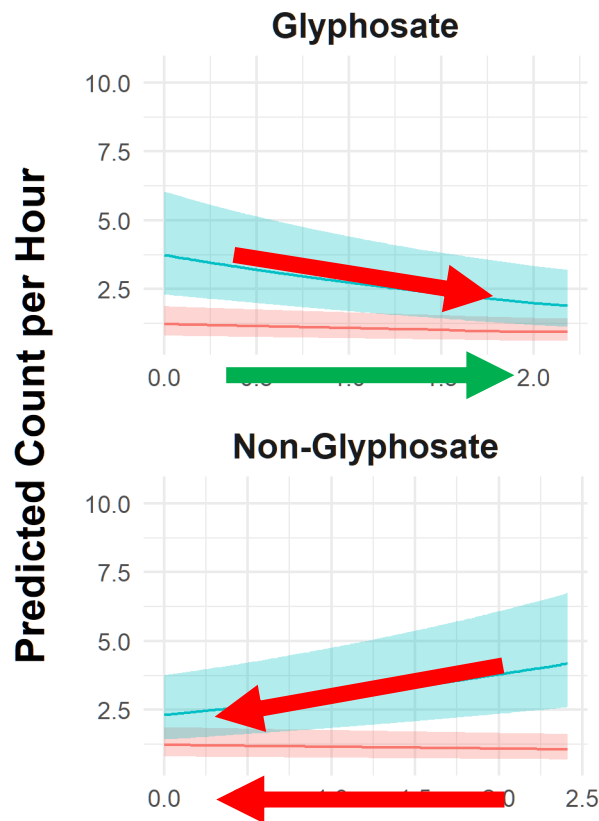


- Between 1998-2011 GT seed adopters used on average...
 - ↑ 0.9 lbs/ac **more** glyphosate
 - ↓ 0.6 lbs/ac **less** non-glyphosate

(Perry et al., 2016)

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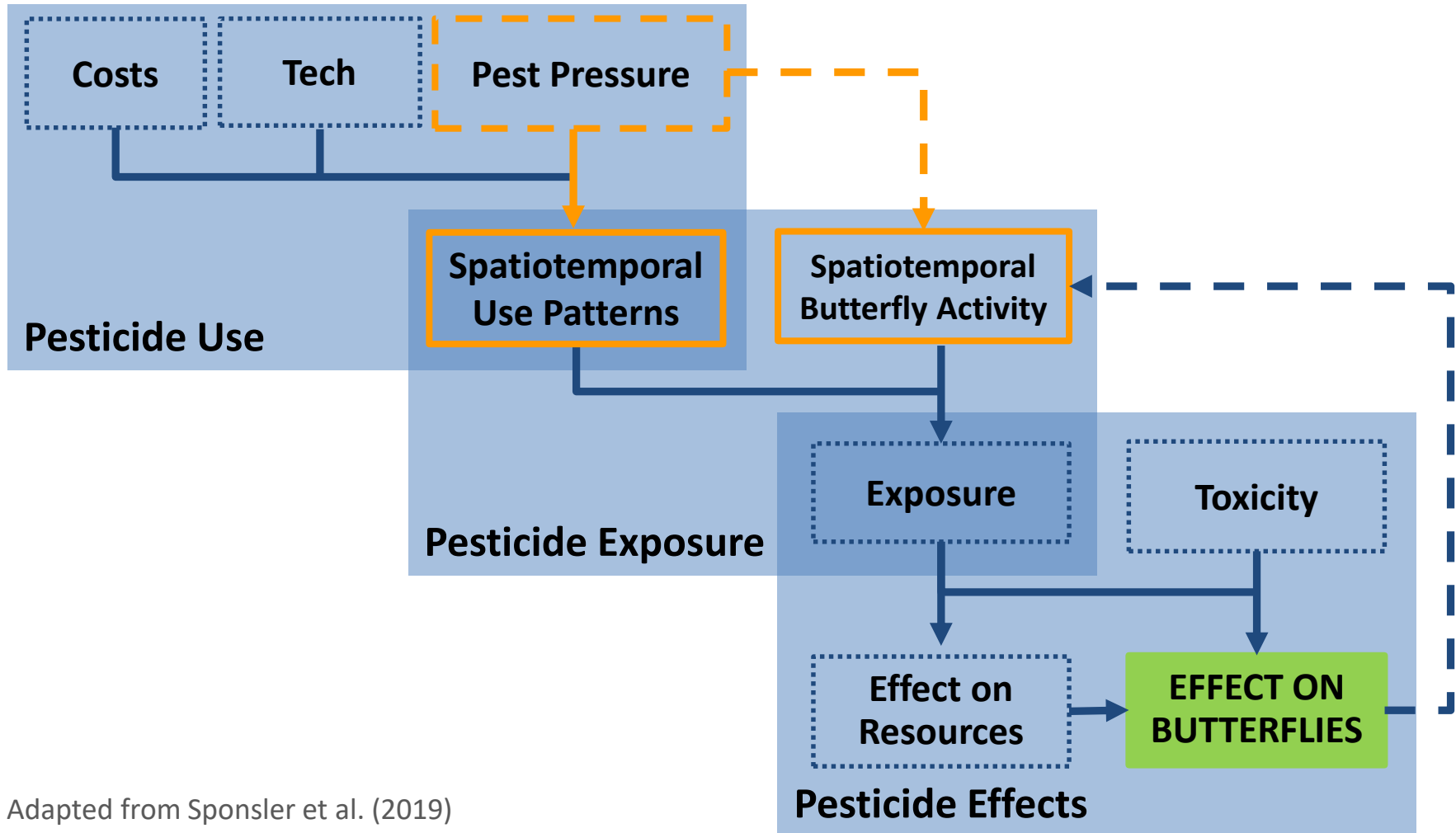


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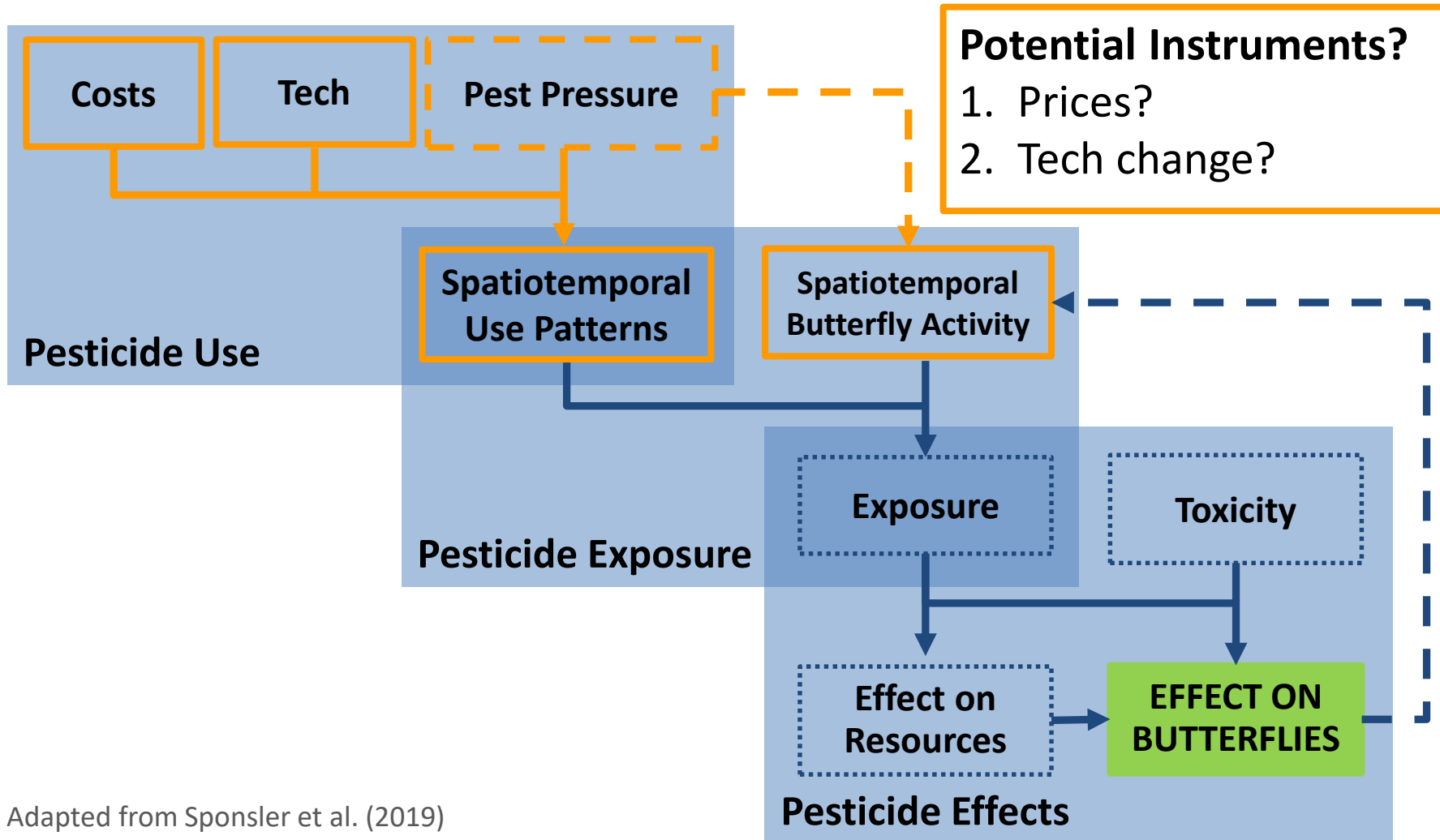
- Net effect is **negative**
- Similar argument for insecticides
- Consistent with upward bias of all pesticide estimates

Next Steps: Possible Source of Endogeneity?



Adapted from Sponsler et al. (2019)

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Next Steps: Model Site-Level Data

- Avoid information loss from aggregation for more precise estimation
- Localized cropland measures possible for more accurate accounting for exposure

Ohio Transect Locations

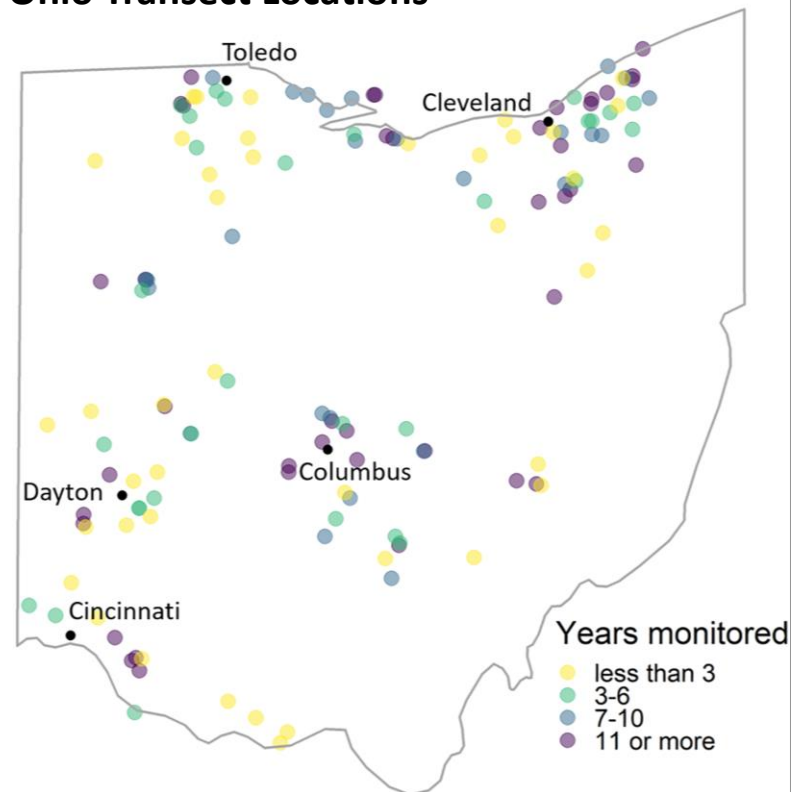


Figure from Wepprich et al. (2019)

Next Steps: And More...

- Adapt to models more robust to overdispersion
 - Negative binomial
 - Observation-level random effects
 - Quasi-poisson
- Model more species
 - Do effects differ by functional traits?
 - Migratory vs. non-migratory
 - Generalist vs. specialist
 - Number of generations per season

Comments? Suggestions? Questions?



Braeden Van Deynze

vandeynz@msu.edu

@BVanDeynze on Twitter