Digitization of the Beatty Odonata Collection at the Frost Entomological Museum (PSUC): the Terrain of Ecological Niche Modeling

Emily Sandall¹, Claire Jones², Briana Ezray³, Andy Deans¹

¹Frost Entomological Museum, Penn State University, University Park, PA

²Geographic Information Systems (GIS) Collaboratory, DePaul University, Chicago, IL

³Department of Entomology, Penn State University, University Park, PA

George H. & Alice F. Beatty Collection

- Dragonflies and damselflies
- Donated in 2005
- ~62,000 specimens
 - Northeastern US
 - Mexico
- 1940s to 1970s
- 900+ species



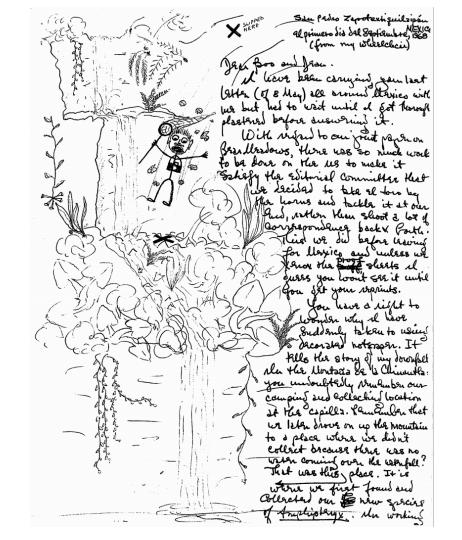


The Beattys

- Found over 20 undescribed species in Mexico
- Described 2 species
 - Arigomphus maxwelli (Gomphidae) (Ferguson 1950)
 - Enallagma basidens (Coenagrionidae) larvae
- Developed the papered storage standard used in Odonata collections today
- Published 14 papers in the Proceedings of the Pennsylvania Academy of Sciences



Extreme Collecting Events



Digitization Goals

- Image specimens & upgrade their storage
- Create database of images
- Associate collecting event data
- Utilize data to create ecological niche models
 - Locate any undescribed species in the collection



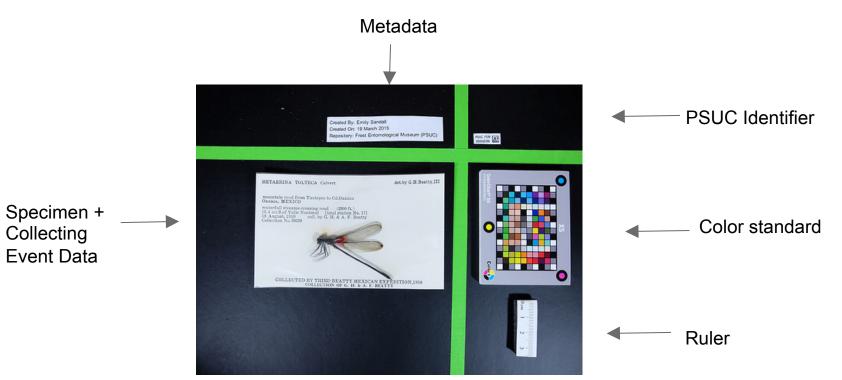




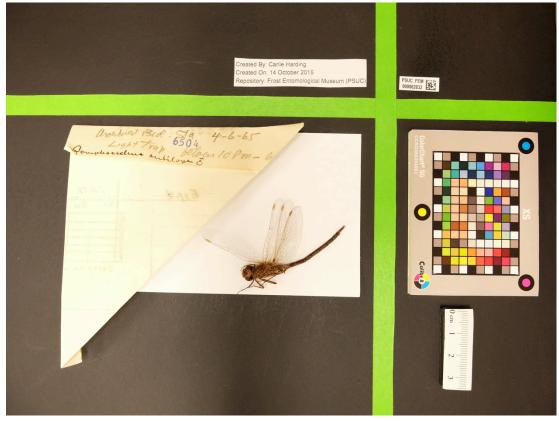
Workflow Niche Model Sort Develop specimens template Мар Image specimens Find Database collecting Georeference data

Specimen Imaging

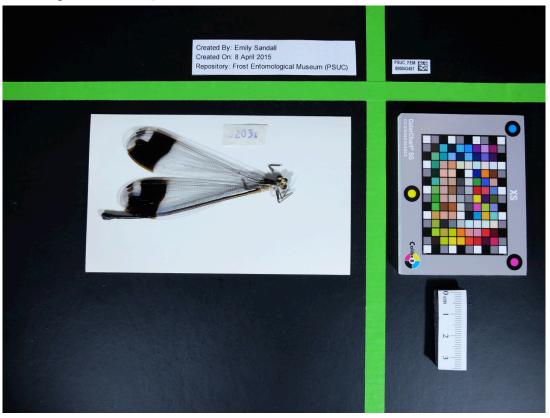
17,000+/60,000 specimens imaged



Variability in Specimen Data



Variability in Specimen Data



Associating Collecting Event Data

```
11.46. Roadside and stream at edge of Dismal Swamp about 10-11 mi S. of Suffolk Frum turs, ste. final list

150-53. L. deilleus: 487

154. L. vibraus: 187

155-57. L. incesto: 25, 19

403-7. P. londipennis: 38, 29
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63504 Rio Choapan, 14 mi. S. of Tuxtepec, OAX.
150' [GAZ.]
                                                                                                                                                                                                              I Rio Choadan, 14 mi. S. of Tuxtepec, OAX.

I upstream from bridge, for about 500 (a probably much more but not investigated) about 25 wide, entried feithed bed between between the struck ever with the point of the more fitted by about 50 for more) with. No percentific from less than the below but water in most places is 2-3 deep over a feature from bottom of sead & Charles is 2-3 deep over a feature from bottom of sead & Charles is a 1-3 deep over a feature from the bottom of sead & Charles is a 1-3 deep over a feature from the water's post of the search of the surface of the water's surface of the surface of the surface of the water's surface is beat of "Charles", in the surface of the water of the water is surface of the surface
                                                                                                                                                                                                                               * Temo. reached 118°F. about 3.00 P.M. - it end of collections period 1.00-3.00
                                                                                                                                                                                                                                                   no clouds; slight breeze
                                                                                                                                                                 ORTHEMIS FERRUGINEA - Seen (by AFB only)
                                                                                                                            PERITHEMIS "DOMITIA": 3d ) 3d of feintheum frequent on tryical "fertilleum" -

permile "the stream I often in the stude

1 P. "MOOMA": 1d School of the control of the cont
                                                                                                                         3 MICRATHYRIA ARQUALIS: 33 - Prepuent all blood upper part of stream (stopes bridge) especially where conteint penetration was musicust stituted on fleat within 1" of water (unusual), on well offices, step in the state (unusual), on well offices, step in the state (unusual).
                                                                                                                                                              MICRATHYRIA EP. - 2 Sp. langer than acqualis seen (DIDYMA?) HAGENI
                                                                                                                               1 ERYTHRODIPLAX CONNATA: 13 - 5 or 6 other 23 seem in place where tree-
trunks & branches nearly filled stream-bad.
                                                                                                                               HETAGRINA TITIA: 2314 - Scarce, most of the Hetaerina seen (6-8 st most) were conceived in a sume in viale overlanding they per view port we point discovered in the miles of the period of the period
                                                  ARGIA - Not seek Mas for before the point states the latter traces of present of the point of th
                                                                                                                      1 PROTONEURA (AURANTIARA): 13 (jun.)
                                                                                                              30 spmm. of 11 spp.
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TaxonWorks

sqed depiction: 334 | original image







Curator metadata Use [a]	Identifier	Use [s]
Created By: Emily Sandall Created On: 6 March 2015 Repository: Frost Entomological Museum (PSUC)		
Annotated specimen Use [d] SOMATOCHLORA WALSHI Scudder det-b-V G' H' Beatty'm Bear Meadows, Harris Twp. (1834') Centre County, PENNSYLVANIA coll. by G. H. Beatty, III \\ M (/(L/(7, /?¥,7 COLLECTION OF G.H. & A.F. BEATTY i'élgyiu'fl W^****** "I		
"MT		

Identifiers Taxon Determinations Namespace Identifier Name

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Bear Meadows, Harris (1834') Centre County, PENNS' coll. by G. H. Beatty, III	/LVANIA				Created By: Emily Sandall Created On: 6 March 2015	
					Repository: Frost Entomological Museum	1
Total 1 Note			Tag with	‡]		

Beginning of Niche Modeling in the Collection

- Temperature (1968)
- Edaphic factors (1969)
 - substrate characteristics
 - water quality
 - hydraulics
 - physiographic/glacial features
 - river basins

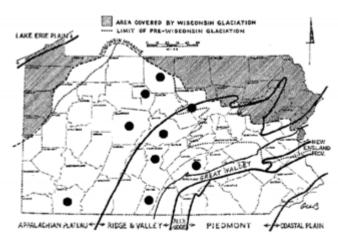


Figure 5. Distribution in Pennsylvania, by counties, of Boyeria grafiana.

Previous Methods

- Plot species by county
- Tabulate locality results
- Focus on species that seem to be confined to a particular province
- Overlay transparency of watersheds & drainage basins

116 Calopteryx aequabilis Sa	y			,	PENNSYLVA	IIA
PLACE	COUNTY	DATE	SPMNS.	COLLECTOR	COLL'N.	SOURCE
PENN CREEK, POE PADDY	MIFFLIN	14+15, VII.61.	19	HBW	HBW	HBW
"		24. VI. 63.	28,29	RAR	RAR	RAR
Mc CONNELL'S NARROWS	UNION	4. VI. 60.	58.19	"	"	"
". WEIKERT	11	4. VI.60.	28,19	HBW	HBW	HBU
PENN CR. AT POE PADDY	CENTRE		48,19,1PR.	11 TO T. WATS	DN° 11	11
"	11	25, VI.59	88,49	D	D	D
"	11	7. VI. 57.	18	B	B	B
Penn Cr.at McConnell's Narro	s Union	9.17.61.	18, 10L(R)	CHB	GHB	GHB
		1 111 69	LARVAF	B et al	В	В
1969; others in col	1 cns?		2º reared	, em.3 & 9.	IV.69.	
Penn Cr., 0.5 mi.S.of Coburn	CENTRE	7.VI.69.	18 SEEN			CNS
	1	The state of the s				177.00

Beattys' Proposed Factors

- Temperature (aquatic and air)
- Edaphic factors considered:
 - Lotic/ Lentic
 - Lake Erie Plain
 - Appalachian Plateau
 - Ridge and Valley
 - Piedmont
 - Coastal Plain
 - Ohio River Basin
 - Susquehanna River Basin
 - Delaware River Basin

Table 4. ANALYSIS OF DISTRIBUTION OF 97 SPECIES OF PENNSYLVANIA ODONATA WITH RESPECT TO EDAPHIC FACTORS OF PHYSIOGRAPHY AND RIVER BASINS.

ON ST (2)		io.	PH		APRIC I	PROVID	CES	RIVE	R BAST	
SPECIES # ON PA.CHECKLIST		LOTIC (F), LEMTIC (S)	LAKE BRIE PLAIN	APPALACHIAN PLATEAU	RIDGE AND VALLEY	PIEDWORT	COASTAL	OHIO R. BASIN	SUSQUEHANDA R.EASIN	DELAWARE R. BASIN
1.	Gomphaesohna antilope	S/F		AP			CP	0	_	D
2.	furcillata	S/F		AP+	RV	_	(CP)	0	5	(D)
3.	Bastasschna janata	F		AP+	RV	P	CP	0	s	D
4.	Boyeria grafiana	F		AP	RV RV	P	CP	0	5	D
7. 8.	Epiaesahna heros Asshna canadensis	S/F		AP+	RV+	P	CP	0	S	D
9.		S		AP+	B.VT	r			S	D
10.		S		AP+	(RV)		CP	0	S	D
11		5	LE	AFT	RV		O.E	(LE)	s	_
12.	- tuberoulifera	S	1,42	AP	RV+		CP	0	s .	D
14.	verticalio	s		AP+	RV+		CP	ō	S	D
16.	Anax longipes	s		AP+	RV	P	CP	-0	S	D
17.	Tachopteryx thorsy:	s		AP+	RV	P		0	S	D
18.	Progomphus obscurus	F		AP	RV			0	S	
19.	Hagemius brevistulus	F	LE	AP+	RV	P	CP	0	5	D
20.	Ophiogomphus carolus	F		AP+	RV+				S	D
22.	howei	F			R.V				S	
23.	mainensis	F		AP+	RV			0	S	D
24.	rupinsulensis	F		AP+	B.V			0	S	D
25.	Lanthus albistylus	ř.		AP+	RV	P		0	S	D
27.	Gomphue borealie	S		AP+	R.V			0	S	D
28.	descriptus	F		AP+	RV+	_			S	D.
31.	quadricolor	y		AP AP+	B.V	P		0	S	D
33.	epicatus abbreviatus	S	LE	V6+	RV	P		0	S	D
34.		y		AP+	RV+	P		0	S	D
35.	viridifrons	F		AP	EA.			o	3	
36.		F		AP	(RV)			ő	(S)	
37.	lineatifrane	F		ar	RV				8	
38.	rogersi	F		AP	RV			0	s	
39.	- vastus	F		AP	RV	P		ŏ	s	D
40.	ventriaosus	F			RV	p		-	S	-

Our Question

What factors are influencing odonate distribution?

- Climatic?
- Edaphic?



Our Target Taxa

% increase in available georeferenced data

Argia tibialis (Rambur, 1842) (Odonata: Coenagrionidae)17.1%Boyeria grafiana (Williamson, 1907) (Odonata: Aeshnidae)14.8%Calopteryx aequabilis (Say, 1839) (Odonata: Calopterygidae9.10%Erythrodiplax connata (Burmeister, 1839) (Odonata: Libellulidae) *194.7%Hetaerina cruentata (Morse, 1895) (Odonata: Calopterygidae) *160.4%



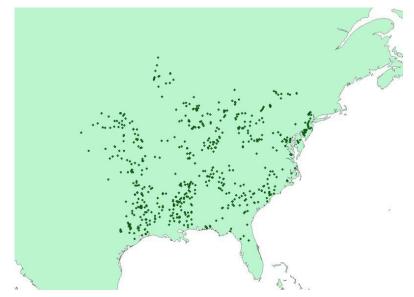
^{*=}not in Beatty publications

Preparing Coordinate Data/Data Cleaning

- GEOLocate latitudes & longitudes
- CSV files of PSUC, GBIF, & Odonata Central collecting event data
- Total *Argia tibialis* records = 2089
 - coarse localities -0
 - coordinates georeferenced to centroid of county 957
 - non-specific localities -126
- Resultant data = 1006

ArcGIS

- Shapefiles created based on specimen collecting event localities
 - BIOCLIM variables as ESRI grid files at 30' historical data from 1961-1990 layered over the specimen points enabled downloads of raster data at each locality



BIOCLIM Parameters-Original Variables

Variable Number	Variable	Minimum temp (°C)		Rainfall (mm month ⁻	Radiation (W m ⁻² d ⁻¹)	Pan evaporation (mm d ⁻¹)	Ref.
Bio01	Annual mean temperature (°C)	×	×				1
Bio02	Mean diurnal temperature range (mean(period max-min)) (°C)	×	×				1
Bio03	Isothermality (Bio02 ÷ Bio07)	×	×				1
Bio04	Temperature seasonality (C of V)	×	×				1
Bio05	Max temperature of warmest week (°C)		×				1
Bioo6	Min temperature of coldest week (°C)	×					1
Bio07	Temperature annual range (Bioo5-Bioo6) (°C)	×	×				1
Bioo8	Mean temperature of wettest quarter (°C)	×	×	×			1
Bio09	Mean temperature of driest quarter (°C)	×	×	×			1
Bio10	Mean temperature of warmest quarter (°C)	×	×				1
Bio11	Mean temperature of coldest quarter (°C)	×	×				1
Bio12	Annual precipitation (mm)			×			1
Bio13	Precipitation of wettest week (mm)			×			1
Bio14	Precipitation of driest week (mm)			×			1
Bio15	Precipitation seasonality (C of V)			×			1
Bio16	Precipitation of wettest quarter (mm)			×			1
Bio17	Precipitation of driest quarter (mm)			×			1
Bio18	Precipitation of warmest quarter (mm)	×	×	×			1
Bio19	Precipitation of coldest quarter (mm)	×	×	×			1
Bio20	Annual mean radiation (W m ⁻²)				×		1

Hutchinson et al. 2009

BIOCLIM Parameters-Added Variables

Bio20	Annual mean radiation (W m ⁻²)				×		1
Bio21	Highest weekly radiation (W m ⁻²)				×		1
Bio22	Lowest weekly radiation (W m ⁻²				×		1
Bio23	Radiation seasonality (C of V)				×		1
Bio24	Radiation of wettest quarter (W m ⁻²)			×	×		1
Bio25	Radiation of driest quarter (W m ⁻²)			×	×		1
Bio26	Radiation of warmest quarter (W m ⁻²)	×	×		×		1
Bio27	Radiation of coldest quarter (W m ⁻²)	×	×		×		1
Bio28	Annual mean moisture index			×		×	1
Bio29	Highest weekly moisture index			×		×	1
Bio30	Lowest weekly moisture index			×		×	1
Bio31	Moisture index seasonality (C of V)			×		×	1
Bio32	Mean moisture index of wettest quarter			×		×	1
Bio33	Mean moisture index of driest quarter			×		×	1
Bio34	Mean moisture index of warmest quarter	×	×	×		×	1
Bio35	Mean moisture index of coldest quarter	×	×	×		×	1
Bio36	First principal component of the first 35 Bioclim variables	×	×	×	×	×	2
Bio37	Second principal component of the first 35 Bioclim variables	×	×	×	×	×	2
Bio38	Third principal component of the first 35 Bioclim variables	×	×	×	×	×	2
Bio39	Fourth principal component of the first 35 Bioclim variables	×	×	×	×	×	2
Bio40	Fifth principal component of the first 35 Bioclim variables	×	×	×	×	×	2

Kriticos et al. 2014.

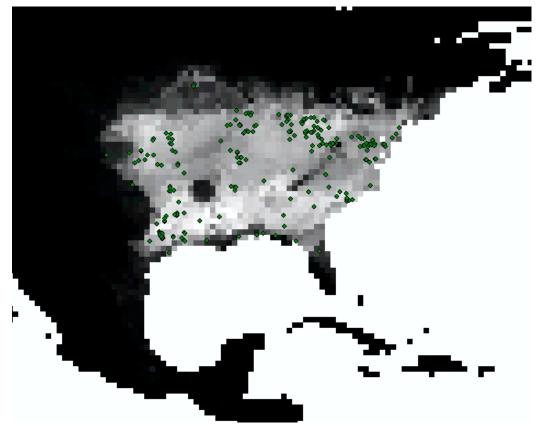
SDMToolbox

- Optimizes extracting data from each parameter in one step
- Enables testing for factor correlation prior to modeling
- Estimates biodiversity metrics
- Creates bias files to use as background points
- Chooses best model

MaxEnt

- Models with presence-only data
- CSV of species
- Utilize ASCII files of BIOCLIM variables at each set of coordinates as the parameters
- Output includes:
 - Omission & Predicted Area
 - Sensitivity vs Specificity
 - Analysis of Variable Contributions

MaxEnt-Map Representation



MaxEnt-Analysis of Variable Contributions

- Percent contribution-depends on path of the training algorithm to get to the model
- Permutation importance-depends on solely the final MaxEnt model
- Jackknifing examines each variable in isolation as well as the effect on the model without the isolated variable

Variable	Percent contribution	Permutation importance
bio10clip	42.4	11.7
bio16clip	10.8	0.7
bio20clip	7.4	6
bio01clip	6	6
bio12clip	5.1	0

Preliminary Results

• Temperature, solar radiation as major factors for all 5 species



Back to the Beattys

- Precipitation and temperature (climatic) factors play a greater role
- How can more collecting event data be incorporated?
- Would pinned specimen data enhance our understanding?



Adjusting Our Focus

- Prioritize digitization of specimens with easily associated collecting event data
- Transparency in collecting event data
 - Ensure that all uploaders understand best practices for georeferencing
 - · Vetting records for quality locality data
- Incorporate absence data (available for some species)
- Narrow parameters for modeling
 - add edaphic parameters



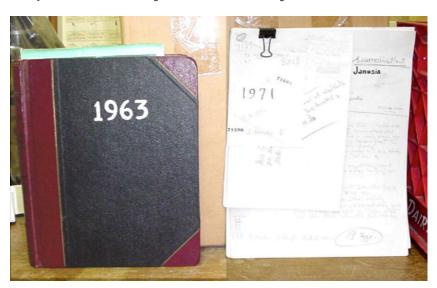
Future Projects

Digitizing field notes to free collecting event data

Resampling localities for spatiotemporal study of Pennsylvania

Odonata

Sampling bias in the collection



Opportunities

 Development of an internship to work on digitization and curation of the Beatty Collection-stay tuned!



Acknowledgments



http://dx.doi.org/10.6084/m9.figshare.1602235





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Marcus Thaw



István Mikó