

Species distribution models for investigating changes in floodplain vegetation in large flood-pulsed tropical wetlands



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VARIABLE ANNUAL INFLOWS AT MOHEMBO (1933 - 2010)









- In large, open wetland ecosystems, the distribution of floodplain macrophytes has uptrophic effects on whole-system ecology.
- Understanding how distribution may change in response to hydrological change is essential for sustainable management.
- In Botswana, the ability to evaluate such changes is critical for policy formulation and management decision support – the Okavango Delta is a Ramsar Site and potentially a World Heritage Site.



Methods



Sampling

•30 Sample sites, stratified by flooding frequency into 5 groups, 6 from each group.

•At each site, 1 or more transects orthogonal to floodplain long axis

- •1m² plots at 20m intervals until >30m²
- •Modifed Braun-Blanquet cover scale, all species in each plot.

Analysis

Canonical Correspondence Analysis (CCA)

•Constrains ordination of species-site matrix by regression on variable(s) in the environmental matrix.

•Used to investigate species and site relationships with specific hydrological variables, and to

develop GLMs for spatial model.

Non-metric multi-dimensional scaling (NMS)

•No assumption of linear relationships among variables

•Used to investigate species inter-relationships to aid in interpretation of cluster analysis





Monthly Duration: MODIS 250m Red & Infrared SR 8-day composite











Monthly Flood Extent Maps for 2000-2007





Relationships between habitat and hydrology

Correlations of hydrology

with NMDS axis 1 of

floodplain plant species

(Pearson's r):

•Flood Frequency over 18

years: 0.934

Flood Duration for

preceding 3 years: 0.859

•Time since last flood: 0.767

Mean depth of wet

quadrats: 0.678

Okavango - flood frequency, duration and depth co-vary: Coefficients (r)

Variable	Average	Average Duration	Years since last flood	Average	
Average	1	Duration	noou		
Average Duration	0.909	1			
Years since last flood	-0.617	-0.706	1		
Average depth	0.727	0.609	-0.335	1	



How do we link species distribution with hydrology? Generalized linear species distribution models.





Fitted Generalized Linear Model 🛛 🛛 🗙								
Response variable	:			OK	Skip			
Predictor(s)	:	D3_min					y I	
Distribution:	Poisso	n	l	.ink functi	ion:	Log		
Null model de Fitted model de	viance: 6.6 viance: 3.4		62 41	with with	24 22	residual (residual (DFs DFs	
Model significance: F = 11.02 P = 0.000485 AIC = 4.283								
Optimum: 3.	88 S.E.: 1.047 Conf. interval: Cannot estimate					timate		
Tolerance: 1.	48 S.I	E.: 0.	528 Max. value:			0.308		
Regression coefficients								
Model Term	В	B		9.P		Т		
(Intercept) D3_min (D3_min)^2	-4.62 1.77 -0.22	-4.62348 1.77742 -0.229218		3.68723 1.78266 0.20264		-1.25392 0.997061 -1.13116		

Gaussian logistic regression, with log link function and Poisson error distribution

$$\log\left(\frac{p(x)}{1-p(x)}\right) = b_0 + b_1 x + b_2 x^2 = a - \frac{(x-u)^2}{2t^2}, \text{ (ter Braak and Prentice 1988)}.$$





Examples of GLSDM curves





Modeled distribution curves for selected species representing low (*Eragrostis cylindriflora, Cynodon dactylon*), intermediate (*Nicolasia costata, Panicum repens*), and high (*Eleocharis variegata, Leersia hexandra*) flood duration communities



Simulated 2007 distributions of species typical of DFG (a), SFG (b), SFS (c) and SAC (d). Darker shades indicate higher probability of occurrence.



Species distribution models performance



Site	M	C	TS	SW	K	IR	K	DA	XI	HA
Species	Obs	Pred								
Chloris virgata	0	0	0	0	0	0	0.53	0.01	0	0.01
Cynodon dactylon	0	0	0	0.13	0.22	0.24	0.73	0.22	1	0.22
Cyperus denudatus	0.09	0.26	0.5	0.23	0.61	0.09	0	0.03	0	0.03
Cyperus longus	0	0	0.82	0.08	0.11	0.04	0	0	0.48	0.01
Cyperus sphaerospermus	0	0	0.5	0.17	0.28	0	0	0	0.04	0
Leersia hexandra	0.73	0.43	0.09	0.04	0	0	0	0	0	0
Urochloa mosambicensis	0	0	0	0	0	0.13	0.27	0.53	0.3	0.53
Present	12	18	16	20	9	12	6	10	8	11
Correctly predicted										
presence	100%		88%		89%		83%		75%	
Correctly predicted absence	60)%	54	4%	79	9%	77	7%	76	5%



Floodplain Classes

Flood Duration Optima

Dendrogram of species assemblages based on species occurring in more than 5 sites (n=53).

Mean duration optima (months) characterize 4 distinct assemblages.







Simulated 2050 Floodplain Community Distributions under different Global Circulation Models of climate change





Reference

Situation







Simulated 2025 Floodplain Community Distributions under Basin Development Scenarios







SFS SAC PC



Maximum development of potential irrigation





All potential dams constructed

Combination of all dams, maximum irrigation and other withdrawals



Changes in extent of floodplain communities from simulations of different climate change scenarios for 2020-2050



GC Model 1 – GFDL, GC Model 2 – CCCma GCM2; GC Model 3 – HadCM3.





Some generalisations about flooding tolerances





•Based on Gaussian logistic regression modelling from CCA against mean monthly duration

•Most species are either flood intolerant, tolerant of a few months inundation, or primarily aquatic.

•Few species fall in the 6-7 month optima range