Geospatial Monitoring of Cropping System Dynamics and Production Footprints in Maine Sherri DeFauw¹, Bob Larkin², Patrick English³, Aaron Hoshide⁴, Andrew Plant⁵ and John Halloran² ¹Pennsylvania State University, Dept of Agricultural Economics, Sociology & Education, University Park PA²USDA, ARS, New England Plant, Soil & Water Lab, Orono ME ³Mississippi State University, Delta Research & Extension Center, Stoneville MS ⁴University of Maine, School of Economics ⁵UMaine Cooperative Extension, Houlton ME

INTRODUCTION Tracking the spatial interdependencies of cropping systems is an often overlooked component of agricultural sustainability. Geospatial frameworks help resolve patterns and trends in production environments at multiple scales that may enable improvements in adaptive management strategies which enhance yield, increase whole-farm profitability, and foster sustainable land and water use. The objectives of this investigation were to: (1) assess production footprints for Maine cropping systems using 2008-2011 Cropland Data Layer (CDL), Common Land Unit (CLU), digital elevation models (DEM) and National Agriculture Image Program (NAIP) datasets; (2) examine geospatial relationships of potato, small grains, corn, and broccoli; (3) interrelate production areas with agri-environmental indicators (Soil Survey Geographic – SSURGO 2.2); and (4) evaluate dominant crop sequences and potential economic impacts of select alternate crops across 3 yrs (2008-2010) using a 324-ha potato farm model. Gauging these relationships helps food system researchers assess economies of scale linked to



Table 1. Net farm income (NFI) ha⁻¹ for row and forage crop enterprises (listed by production scale) for a 324-ha Maine farm.

	Break-Even Yield with Potatoes ^e							NFI				
s		Yield	324-ha	229-ha	162-ha	94-ha	Price	324-ha	229-ha	162-ha	94-ha	
	Crop	(Mg ha ⁻¹)	(\$ Mg ⁻¹)	$($ ha^{-1})$	$($ ha^{-1})$	$($ ha^{-1})$	$($ ha^{-1})$					
S	Broccoli	8.97	8.42	8.26	8.09	7.75	\$551	\$1,226	\$1,010	\$794	\$362	
	Potato	31.66	-	-	-	-	\$187	\$927	\$618	\$310	-\$307	
es	Soybeans	2.81	3.54	3.16	2.77	2.00	\$474	\$583	\$456	\$329	\$74	
"raw"	Alfalfa, perennialª	14.11	18.66	17.57	16.48	14.29	\$101	\$501	\$294	\$88	-\$324	
d ha)	Cornsilage	36.48	47.19	45.34	43.50	39.81	\$51	\$426	\$204	-\$18	-\$463	
u na).	Canola	1.68	2.96	2.65	2.34	1.72	\$617	\$151	\$30	-\$91	-\$333	
OPN	Barley grain + straw ^b	6.31	12.02	10.91	9.81	7.60	\$171	\$71	-\$72	-\$215	-\$501	
	Wheat grain + straw ^b	7.16	13.12	11.94	10.76	8.40	\$171	\$51	-\$84	-\$220	-\$490	
	Clover, perennialª	7.49	20.25	18.46	16.68	13.12	\$83	-\$45	-\$218	-\$391	-\$736	
200 ha	Barley grain	3.39	7.87	7.08	6.29	4.71	\$225	- \$67	-\$200	-\$334	-\$601	
S	Pasture, perennialª	4.51	22.85	18.34	13.82	4.78	\$61	-\$101	-\$157	-\$212	-\$322	
	Wheat grain ^c	3.03	7.45	6.72	5.99	4.54	\$263	-\$185	-\$310	-\$436	-\$687	
	Corn grain	6.28	13.60	12.45	11.30	9.00	\$157	-\$222	-\$350	-\$478	-\$734	
	Haylage, perennialª	13.54	34.11	33.05	31.99	29.87	\$61	-\$226	-\$476	-\$725	-\$1,223	
C	Oat grain + straw ^b	6.63	18.92	17.19	15.46	12.01	\$111	-\$252	-\$395	-\$538	-\$824	
3	Clover, est.year ^{a,d}	5.45	21.11	19.33	17.55	13.98	\$83	-\$267	-\$440	-\$612	-\$958	
ioo do	Rye grain + straw ^b	4.83	15.00	13.63	12.25	9.50	\$137	-\$298	-\$441	-\$584	-\$869	
ies de-	Pasture, est.year ^{a,d}	3.11	25.48	20.97	16.45	7.41	\$61	-\$327	-\$383	-\$438	-\$548	
opland'	Alfalfa, est. year ^{a,d}	9.73	23.63	22.54	21.44	19.25	\$101	-\$372	-\$579	-\$785	-\$1,198	
s have	Dry hay, perennialª	5.76	20.79	19.55	18.30	15.80	\$91	- \$407	-\$605	-\$803	-\$1,198	
Shave	Rye grain	1.73	8.46	7.61	6.76	5.07	\$211	-\$466	-\$599	-\$732	-\$999	
-	Oat grain	2.56	13.14	11.82	10.50	7.87	\$141	-\$487	-\$621	-\$754	-\$1,021	
	Dry hay, est.year ^{a,d}	3.97	15.97	15.11	14.25	12.52	\$91	-\$617	-\$814	-\$1,012	-\$1,408	
dark	Haylage, est.year ^{a,d}	9.34	38.09	37.03	35.97	33.85	\$61	-\$686	-\$935	-\$1,184	-\$1,682	

agro-ecoregions, productive capacity pools, and land quality.



MATERIALS and METHODS Georeferenced data for cropland/land use patterns (based on CDL/NLCD classifiers), farmland delineations (CLU), soils (SSURGO – farmland and erodibility classifiers), topography (NED 10 m) and NAIP datasets were integrated in ArcGIS (v.10). Producers and users accuracies for remotely-sensed crops (56 m resolution CDLs, Fig. 1) varied from year to year depending on image acquisition dates, planting dates, row crop adjacencies, field boundary complexity, weed species incursions, use of cover crops and/or strip cropping. Crop areas extracted from CDLs were compared with county-level Census of Agriculture records (Fig. 2). Small grains (barley (B), oat (O), rye (R), spring and winter wheat) were aggregated to improve aerial extent assessments. CLUs were then used to constrain CDL classification errors. *Economic Analyses.* Crop sequences in potato production systems derived from the 2008-2010 CDL map products were used to assess the net farm income (NFI) for potatoes and the top 12 rotation crops. NFI was calculated in Excel spreadsheets for both individual crop enterprises as well as whole-farm scenarios. Representative enterprise and whole-farm budgets were constructed for potatoes and potato rotation crops. Sensitivity analyses were run to provide break-even yields for each potato rotation crop. In addition, "short-run" (S-R) and "long-run" (L-R) analyses were conducted in an attempt to account for potential yield impacts associated with rotation length. S-R assumed constant potato yields (31.66 Mg ha⁻¹); L-R assumed an increase 28.6% in 3-yr versus the traditional (or baseline) 2-yr rotations, whereas potato-potato-crop X (PPX) and continuous potatoes are expected to have potato yields that are 14.3% and 28.6% lower than potato-crop X two-year rotations (Myers et al. 2008; Mohr et al. 2011).

Figure 3. Four-year production footprints for potato brown pixels), "small grains" aggregation (purple - combines barley, oat, rye, spring and winter wheat), corn (amber), and broccoli (green).



Figure 6. Comparison of raster scenes including: a USDA, FSA, NAIP 18 June 2009 (1 m resolution); b CDL 2009 (56 m) with B=deep pink, Br=orange, P=brown, R=purple; **c** RGB composite showing crop sequence mosaic from 2008-10 CDLs with P-B-P (purple), P-Br-B (bright green), B-P-B (dark green), Br-R-P (bright red). Scale:1:24,000.



Figure 7. Production footprint '6-yr forecasts' derived from

^a Assumes perennial stand (years) for alfalfa, haylage, dry hay, and pasture (5), and clover (3). ^b Dry hay and straw harvested as round bales. For small grain+ straw, yield per hectare and price per metric ton for both straw and grain. ^cSpring wheat. ^dEstablishment year only. ^e Yield per hectare required to have NFI per hectare identical to potatoes at each of the four production scales evaluated

Table 2. NFI ha⁻¹ for potato rotations on a 324-ha Maine farm.

Percent hectares for NFI for all for	NFI for all
Cristian DTZ 11	DV
system potato in all crops PX all crops	crops PX
rotation PPX or PXY PPX	or PXY
$\frac{1}{1} \qquad \qquad$	(\$ ha ⁻¹)
Potato 100 324 Potato \$927\$713	-
Potato - 66.7 216 108 - Potato - Broccoli \$865 \$860 \$316	\$860
Potato - Potato - Soybean \$671 \$550 \$124	\$550
Crop X Potato - Alfalfa \$539 \$430 -\$8	\$430
(PPX) ^a Potato - Canola \$538 \$343 -\$9	\$343
or Potato - Corn silage \$517 \$400 -\$30	\$400
Potato - 50 162 162 - Potato - Wheat grain + strawd \$485 \$278 -\$62	\$278
Crop XPotato - Barley grain + strawd\$482\$281-\$65	\$281
(PX) ^b Potato - Barley \$449 \$222 -\$98	\$222
Potato - Wheat ^e \$419 \$170 -\$128	\$170
Potato - Pasture \$407 \$150 -\$140	\$150
Potato - Corn grain \$403 \$148 -\$144	\$148
Potato - Oat grain + straw ^d \$375 \$120 -\$172	\$120
Potato - Clover \$363 \$156 -\$183	\$156
Potato - Rye grain + straw ^d \$359 \$97 -\$187	\$97
Potato - Dry hay ^d \$326 \$60 -\$221	\$60
Potato - Haylage \$322 \$104 -\$225	\$104
Potato - Rye \$316 \$23 -\$231	\$23
Potato - Oat \$309 \$12 -\$238	\$12
Potato - 33.3 108 108 108 Potato - Soybean - Broccoli - \$587 -	\$1,139
Crop X - Potato - Barley - Broccoli - \$364 -	\$916
Crop Y Potato - Soybean - Canola - \$279 -	\$827
(PXY)° Potato - Alfalfa - Corn silage - \$262 -	\$809
Potato - Oat - Broccoli - \$224 -	\$776
Potato - Canola - Wheat grain	
+ straw ^d - \$93 -	\$640
Potato - Canola - Wheat grain - \$27 -	\$574
Potato - Barley - Clover \$109 -	\$438
Potato - Oat - Clover\$249 -	\$298

^a Two years of potatoes followed by a third year of rotation crop. ^b One year of potatoes followed by second year of rotation crop ^c One year of potatoes followed by two years of rotation crops. ^d Dry hay and straw harvested as round bales. ^e Spring wheat ssumes potato yields are impacted by rotation effects on potato yield. Three-year rotations assume 28.6% higher ns, while PPX and continuous potatoes have 14.3% and 28.6% lower yields than two-year rotations respectively (Myers et al. 2008, Mohr et al. 2011). Yields of other crops in rotation with potatoes are held constant.



Figure 1. Cropland data layer (CDL) time-series with inset (on right) showing 3-yr mosaic of potato fields (around Caribou and Presque Isle, Aroostook County, ME).

Figure 2. Crop-specific comparisons of county-level Census of Agriculture/Survey areas (on y-axis) with aerial extents extracted from CDLs (on x-axis) for all years throughout the US.

RESULTS Geospatial integration of CDL and CLU layers with soils revealed a 4-yr potato footprint estimated at 56,200 ha with 67% and 27% residing on 'prime farmland' (PF) and 'farmland of statewide importance' (FSI), respectively. Over 85% of potato production soils require the highest standards in conservation practices as they are classified 'potentially highly erodible land' (PHEL) or 'highly erodible land' (HEL) (DeFauw et al. 2012). Geospatial interdependency of potato-small grains (barley, rye, oat, spring and winter wheat) had an estimated 4-yr cropland overlap of 77% (Fig. 3-6). Broccoli (Br) was grown on 13% of the 4-yr potato cropping system land base (Fig. 3,5,6), whereas 6% was shared with corn (Fig. 3,5). Forecast models were developed to account for rotational complexity; the 6-yr land base estimate for sustaining Maine's potato systems is approx. 67,000 ha, small grains may occupy 65,000 ha, corn approx. 22,000 ha, and 10,000 ha for broccoli (Fig. 7). NFIs ha⁻¹ for enterprises & rotation crops are summarized in Table 1 & 2.

CDL datasets (2008-2011) and CLU delineations.

CONCLUDING REMARKS Agronomists and farmers are tasked with attempting to double food production over the next 30 years which may entail spatial reallocation and optimization of crop water and energy footprints to better comply with 'localized' soil and water resource constraints. Distinctive shifts in Maine agroecosystems occur from north to south with more intensively managed irrigated farms to the north undergirded by the southern "dairy belt". Over 25 years ago, Hepler and colleagues (1985) noted a shift toward increased dependence on PF soils in cropping systems (especially potato). Our latest findings indicate that 67% of the 4-yr potato production footprint (CDL-CLU derived) resides on prime farmland; ~50,000 ha require the highest standards in soil conservation (PHEL or HEL). Potato is in the top tier of crops with the highest erosion risk as harvest-related erosion rates are of the same order of magnitude (almost 10 Mg ha⁻¹ yr⁻¹) as water and tillage erosion on sloping land (Auerswald et al. 2006). Across 4 years, ~600 ha was detected in continuous potato. Potato systems in 2-year rotations involved ~14,000 ha (out of 22,000-23,000 ha planted yr⁻¹) suggesting farmers have diversified their operations and appear to be shifting to rotations of 3+ years. The geospatial methodologies developed also facilitate monitoring shifts in crop adjacencies and thus provide a basic framework to evaluate future finerscale dynamics of yield impacts as well as pest and/or pathogen pressures (and associated resistance issues) that may develop as a result of these configurations. Assessments linking land use, agri-environmental indicators and current crop sequences in key agroecosystems (such as potato or corn) serve to help producers, communities and policy makers begin to gauge land base requirements, spatio-temporal stability of productive capacity pools, natural resource use, land quality, farmscape economies and potential food systems security risks at multiple scales.

REFERENCES

Auerswald K, G Gerl and M Kainz. 2006. Influence of cropping system on harvest erosion under potato. Soil Till Res 89: 22-34. **DeFauw** SL, RP Larkin, PJ English, JM Halloran and AK Hoshide. 2012. Geospatial evaluations of potato production systems in Maine. Am J Potato Res DOI: 10.1007/s12230-012-9271-2 (6Oct2012)

Hepler PR, LH Long, KJ LaFlamme and JH Wenderoth. 1985. Field appraisal of resource management systems FARMS: Crop yield and quality relationships with soil erosion 1982. Maine Agricultural Experiment Station, Orono, Bulletin 811: 1-21. Mohr, RM, K Volkmar, DA Derksen, RB Irvine, M Khakbazan, DL McLaren, MA Monreal, AP Moulin and DJ Tomasiewicz. 2011. Effect of rotation on crop yield and quality in an irrigated potato system. Am J Potato Res 88: 346-359.

Myers P, CS McIntosh, PE Patterson, RG Taylor and BG Hopkins. 2008. Optimal crop rotation of Idaho potatoes. Am J Potato Res 85: 183-197.

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