Soil Organic Carbon Distribution and Isotope Composition Response to Erosion in Cropland under Soybean/Maize Production

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Study area in Iowa, USA

Cropland field under cultivation for corn and soybean

Field was sampled to 30 cm depth using a 25 m grid sampling pattern

Samples were analyses for organic soil carbon, ¹³C and ¹³⁷Cs contents as well as soil texture

Maps of soil properties isotope tracers were developed from lidar DEMs using topographic principal component regression (TPCR).



Various soil maps were generated using topographic regression or kriging models

Metrics used to construct topographic models

| Variables | Definition | Significance |
|--------------------------------------|--|--|
| Slope (radian) | An angle between a tangent and a horizontal planes at a given point | Runoff velocity, soil water content (Afshar et al., 2010; Li et al., 2014) |
| Profile Curvature (m ⁻¹) | Curvature of the surface in the direction of the steepest slope | Flow acceleration, soil erosion, deposition rate (Troch et al., 2002; Ritchie et al., 2007) |
| Plan Curvature (m ⁻¹) | Curvature in a horizontal plane | Flow convergence and divergence, soil water content (Troch et al., 2002) |
| General Curvature (m ⁻¹) | Curvature of the surface itself | Runoff velocity, soil erosion, deposition (Li et al., 2014) |
| Flow Accumulation | Upslope number of grid cells | Soil water content, runoff volume (Gessler et al., 2000) |
| Topographic Relief (m) | Difference between the highest point over an area (h _{max}) and a given location (h _i) | Landscape drainage characteristics, runoff velocity and acceleration (Tucker and Bras, 1998; Montgomery and Brandon, 2002) |
| Positive Openness | An angular measure of the relation between surface relief and horizontal distance | Landscape drainage characteristics , soil water content (Seijmonsbergen et al., 2011) |
| Upslope Slope (m) | Mean slope of upslope area | Runoff velocity (Moore et al., 1991; Kirkby, 2014) |
| Flow Path Length (m) | Maximum distance of water flow to a point in the catchment | Sediment yield, erosion rate (Sharpley and Kleinman, 2003) |
| Downslope Index (radian) | Head differences along flow path | Soil water content (Hjerdt, 2004) |
| Catchment Area (m ²) | Area draining to catchment outlet | Runoff velocity and volume (Moore et al., 1991; Kasai et al., 2001) |
| Topographic Wetness Index | Frequencies and duration of saturated conditions | Soil moisture distribution (Afshar et al., 2010; Lang et al., 2013) |
| Stream Power Index | Erosive power of overland flow | Soil erosion, Convergence of flow (Conforti et al., 2011) |

Advantage of using Principal Component Regression

- Large collinearities often exist between these topographic metrics (Table 1) for a given landscape with two main causes for the correlations;
 - One being these metrics quantify the properties of a self-organized landscape whose properties would be expected to be correlated;
 - Another being that various metrics are derived from mathematical equations containing common elements which induce correlations between the resulting metrics;
- Principal Component Analysis (PCA) is a common approach to generate sets of orthogonal factors from correlated metrics and thereby reduce the dimension of parameters;
- These PCA factors, in turn, can be used as a set of orthogonal parameters in prediction models;
- This is the approach we have used in developing more robust topographic models using information contained within 13 topographic metrics with reduced dimensionality.

First four principal components used in prediction models

| | TPC1(38%) | TPC2(24%) | TPC3(14%) | TPC4(7%) |
|--------|-----------|-----------|-----------|----------|
| Slope | -0.267 | 0.378 | 0.041 | -0.137 |
| P_Cur | -0.259 | -0.248 | 0.365 | 0.253 |
| Pl_Cur | -0.269 | -0.032 | -0.403 | 0.360 |
| G_Cur | -0.286 | -0.276 | 0.264 | 0.320 |
| FA | 0.238 | 0.012 | 0.467 | -0.048 |
| LsRe | 0.395 | 0.040 | -0.222 | 0.182 |
| SsRe | -0.031 | 0.487 | -0.004 | -0.120 |
| РОР | -0.364 | -0.054 | 0.175 | -0.058 |
| Upsl | -0.066 | 0.482 | 0.029 | 0.154 |
| FPL | 0.295 | 0.030 | 0.081 | 0.515 |
| DI | 0.232 | -0.193 | 0.079 | -0.493 |
| CA | 0.238 | 0.011 | 0.463 | 0.013 |
| TWI | 0.367 | -0.198 | -0.210 | 0.162 |
| SPI | 0.156 | 0.408 | 0.250 | 0.270 |

TPCs 1–4 were highly associated with runoff velocity, flow acceleration, runoff volume, flow convergence and divergence, and

Topographic Principal Component Regression (TPCR) models for map generation

| | Model | R_{adj}^2 | NSE | RSR |
|-------------------------------|---|-------------|-------|-------|
| ¹³⁷ C _s | 2447.251-342.099TPC1+303.280TPC5† | 0.622 | 0.628 | 0.609 |
| δ ¹³ C | -20.399+0.683TPC1+0.286TPC3+0.140TPC2-0.305TPC6 | 0.591 | 0.603 | 0.630 |
| | 2.946-0.063TPC1-0.018TPC3+0.012TPC2+ | | | |
| logSOC | 0.030TPC5+0.020TPC4 | 0.692 | 0.704 | 0.544 |

[†] The order of TPCs is based on the stepwise selection steps

 R_{adj}^2 is adjusted coefficient of determination; NSE is Nash-Sutcliffe efficiency; RSR is ratio of the root mean square error (RMSE) to the standard deviation of measured data.

Measured cesium (¹³⁷Cs) inventory, soil redistribution (SR) rate, soil organic carbon (SOC) density, and isotopic ratio of δ^{13} C in the study area.

| | Ν | ¹³⁷ Cs | SR rate | SOC | δ ¹³ C |
|------------|-----|-----------------------|--|-----------------------|---------------------|
| | | (Bq m ⁻²) | (kg m ⁻² yr ⁻¹) | (kg m ⁻²) | (‰) |
| Erosion | 81 | 1791 | -1.719 | 759.3 | -19.55 |
| | | (531.7) ^{b†} | (1.383) ^b | (245.8) ^b | (2.05) ^a |
| Deposition | 47 | 3547 | 1.571 | 1292 | -21.85 |
| | | (768.7) ^a | (1.324) ^a | (258.6) ^a | (1.52) ^b |
| All | 128 | 2435 | -0.511 | 956.4 | -20.40 |
| + | | (1056) | (2.091) | (357.7) | (2.16) |

' Mean and standard deviation (in parentheses); Letters estimate based on Duncan's multiple range tests. There are no significant (P < 0.05) differences for a parameter with the same letter.

Prediction maps for 137 Cs, SOC and δ^{13} C



Relationship between SOC and δ^{13} C densities versus ¹³⁷Cs inventory



¹³⁷Cs was positively correlated to SOC and negatively correlated to δ^{13} C indicating that soil erosion redistributed SOC with a strong C3 signature.

Modeled soil erosion and deposition based on ¹³⁷Cs inventories



Soil texture associations with erosional and depositional sites

| | Number of Sample | Fractional sand content (g g ⁻¹) | Fractional silt content (g g ⁻¹) | Fractional clay content (g g ⁻¹) |
|------------|---------------------|--|---|---|
| Erosion | 81 | 0.480 (0.084)a ⁺ | 0.297 (0.054)b | 0.223 (0.070)b |
| Deposition | 47 | 0.391 (0.101)b | 0.356 (0.059)a | 0.252 (0.066)a |
| All | 128 | 0.447 (0.100) | 0.319 (0.063) | 0.233 (0.070) |

+ Mean values and standard deviation (in parentheses)

- The relative enrichments of silt and clay likely increases stability of SOC at sites of deposition.
- These findings are consistent with preferential movement of silt and clay by erosional processes.

Anthropogenic erosion as a soil forming process

- The mollic soils in Iowa have been subject to enhanced redistribution processes (erosion) since the prairie sod was broken after 1860's.
- The black mollic epipedon was redistributed from upslopes which is readily apparent as early as the 1930's bare soil image.
- Remarkably the patterns of redistribution after the event of early 1960's ¹³⁷Cs fallout and subsequently measured in 2003 (depicted in isolines) is very similar to the pattern of mollic epipedon redistribution.
- This substantiates the influence of soil distribution in current soil classification.
- The mollic epidedon is more depleted of ¹³C which is indicative of prairie vegetation with C3 signature.



Topographic Principal Component Regression (TPCR) models for C3 and C4

map generation

| | Model | R_{adj}^2 | NSE | RSR | | | |
|--|--|-------------|-------|-------|--|--|--|
| Average value combination | | | | | | | |
| C3 (27‰) | 564.985-109.143TPC1+63.381TPC5+30.207TPC4+29.345TPC6 | 0.733 | 0.741 | 0.509 | | | |
| logC4 (12‰) | 2.565+0.021TPC2-0.016TPC1+0.029TPC5 | 0.134 | 0.154 | 0.920 | | | |
| Combination scenario 1 | | | | | | | |
| C3 (-27‰) | 630.222-111.082TPC1+67.068TPC5+31.479TPC4 | 0.735 | 0.741 | 0.509 | | | |
| logC4 (-9‰) | 2.486+0.021TPC2-0.016TPC1+0.029TPC5 | 0.134 | 0.154 | 0.919 | | | |
| Combination scenario 2 | | | | | | | |
| C3 (-32‰) | 493.217-86.934TPC1+52.488TPC5+24.636TPC4 | 0.735 | 0.741 | 0.509 | | | |
| logC4 (-9‰) | 2.641-0.037TPC1+0.017TPC2+0.029TPC5+0.017TPC4 | 0.340 | 0.409 | 0.769 | | | |
| Combination scenario 3 | | | | | | | |
| C3 (-32‰) | 364.554-77.532TPC1+43.317TPC5+20.968TPC4+23.963TPC6 | | 0.731 | 0.518 | | | |
| logC4 (-13‰) | 2.748-0.037TPC1+0.017TPC2+0.029TPC5+0.017TPC4 | 0.390 | 0.409 | 0.769 | | | |
| Different ranges in isotope discrimination for C3 and C4 photosynthesis were | | | | | | | |

used to test uncertainty

Maps of C3 and C4 carbon pools based on 27‰ and 12‰ discrimination respectively.



Stronger topographic influence on spatial variation of C3- than C4-derived SOC

- Photosynthetic discrimination;
- Relative chemical stability in 13C-depleted compounds with C3 signature;
- Preferential sorption of 13C-depleted compounds.
- Midslope accumulation in C4-derived SOC
 - Preferential decomposition;
 - Preferential movement.

Soil texture association with C3 and C4 densities



Soil texture along with elevation



Discussion of Results

- More detailed information on the mollic epipedon distribution relative to soil redistribution is needed for a better understanding of soil movement;
- There can be wide variation within the δ¹³C_{C3} and δ¹³C_{C4} values, resulting in variability in the estimates C3- and C4-derived SOC density;
- The studies on soil redistribution and SOC dynamics could benefit from combining topography and transport processes of C3- and C4-derived SOC with process-based soil erosion models.

Conclusions

- Topographic heterogeneity significantly impact the spatial variability in soil redistribution and SOC dynamics;
- Topographic models are feasible to simulate soil properties and processes and advanced in large-scale soil variable prediction;
- Mollic epipedon distribution can be a tracer for larger scale soil redistribution studies;
- Use of C isotopes exemplified how differences in the distribution of native and recently sequestered SOC occurred in response to erosion.