

## Principles of Complex Systems, CSYS/MATH 300 University of Vermont, Fall 2017

Assignment 5 • code name: Beetlejuice, Beetlejuice, ... ✓

**Dispersed:** Thursday, September 28, 2017. **Due:** 11:59 pm, Friday, October 6, 2017.

Some useful reminders: **Deliverator:** Peter Dodds

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Office hours: 1:15 pm to 2:30 pm on Tuesday, 1:15 pm to 4:45 pm Thursday

Course website: http://www.uvm.edu/pdodds/teaching/courses/2017-08UVM-300

Bonus course notes: http://www.uvm.edu/pdodds/teaching/courses/2017-08UVM-

300/docs/dewhurst-pocs-notes.pdf

All parts are worth 3 points unless marked otherwise. Please show all your workingses clearly and list the names of others with whom you collaborated.

Please obey the basic life rule: Never use Excel.

Graduate students are requested to use LATEX (or related TEX variant).

**Email submission:** PDF only! Please name your file as follows (where the number is to be padded by a 0 if less than 10 and names are all lowercase): CSYS300assignment%02d\$firstname-\$lastname.pdf as in CSYS300assignment06michael-palin.pdf

**Please submit your project's current draft** in pdf format via email. Please use this file name format (all lowercase after CSYS):

CSYS300project-\$firstname-\$lastname-YYYY-MM-DD.pdf as in CSYS300project-lisa-simpson-1989-12-17.pdf where the date is the date of submission (and not, say, your birthdate).

1. (3+3+3+3+3+3) Generalized entropy and diversity:

For a probability distribution of  $i=1,\ldots,n$  entities with the ith entity having probability of being observed  $p_i$ , Shannon's entropy is defined as [2]:  $H=-\sum_{i=1}^n p_i \ln p_i$ . There are other kinds of entropies and we'll explore some aspects of them here.

Let's use the setting of words in a text (another meaningful framing is abundance of species in an ecology). So we have word i appearing with probability  $p_i$  and there are n words.

Now, a useful quantity associated with any kind of entropy is diversity, D [1]. Given a text T with entropy H, we define D to be the number of words in another hypothetical text T' which (1) has the same entropy, and (2) where all words appear with equal frequency 1/D. In text T', we have  $p_i = 1/D$  for  $i = 1, \ldots, D$ .

Diversity is thus a number, and behaves in number-like ways that are more intuitive to grasp than entropy. (Entropy is still the primary thing here.)

Determine the diversity D in terms of the probabilities  $\{p_i\}$  for the following:

(a) Simpson concentration:

$$S = \sum_{i=1}^{n} p_i^2.$$

(b) Gini index:

$$G \equiv 1 - S = 1 - \sum_{i=1}^{n} p_i^2.$$

Please note any connections between diversity for the Simpson and Gini indices.

(c) Shannon's entropy:

$$H = -\sum_{i=1}^{n} p_i \ln p_i.$$

(d) Renyi entropy:

$$H_q^{(R)} = \frac{1}{q-1} \left( -\ln \sum_{i=1}^n p_i^q \right),$$

where  $q \neq 1$ .

(e) The generalized Tsallis entropy:

$$H_q^{(T)} = \frac{1}{q-1} \left( 1 - \sum_{i=1}^n p_i^q \right),$$

where  $q \neq 1$ .

Please note any connections between diversity for Renyi and Tsallis.

- (f) Show that in the limit  $q \to 1$ , the diversity for the Tsallis entropy matches up with that of Shannon's entropy.
- 2. (3 + 3 points) Zipfarama via Optimization:

Complete the Mandelbrotian derivation of Zipf's law by minimizing the function

$$\Psi(p_1, p_2, \dots, p_n) = F(p_1, p_2, \dots, p_n) + \lambda G(p_1, p_2, \dots, p_n)$$

where the 'cost over information' function is

$$F(p_1, p_2, \dots, p_n) = \frac{C}{H} = \frac{\sum_{i=1}^n p_i \ln(i+a)}{-g \sum_{i=1}^n p_i \ln p_i}$$

and the constraint function is

$$G(p_1, p_2, \dots, p_n) = \sum_{i=1}^{n} p_i - 1 \quad (=0)$$

to find

$$p_{i} = e^{-1-\lambda H^{2}/gC}(j+a)^{-H/gC}.$$

Then use the constraint equation,  $\sum_{j=1}^{n} p_j = 1$  to show that

$$p_j = (j+a)^{-\alpha}.$$

where  $\alpha = H/gC$ .

3 points: When finding  $\lambda$ , find an expression connecting  $\lambda$ , g, C, and H.

Hint: one way may be to substitute the form you find for  $\ln p_i$  into H's definition (but do not replace  $p_i$ ).

Note: We have now allowed the cost factor to be (j + a) rather than (j + 1).

- 3. (3 + 3) Carrying on from the previous problem:
  - (a) For  $n\to\infty$ , use some computation tool (e.g., Matlab, an abacus, but not a clever friend who's really into computers) to determine that  $\alpha\simeq 1.73$  for a=1. (Recall: we expect  $\alpha<1$  for  $\gamma>2$ )
  - (b) For finite n, find an approximate estimate of a in terms of n that yields  $\alpha = 1$ .

(Hint: use an integral approximation for the relevant sum.)

What happens to a as  $n \to \infty$ ?

## References

- [1] L. Jost. Entropy and diversity. Oikos, 113:363-375, 2006. pdf
- [2] C. E. Shannon. A mathematical theory of communication. *The Bell System Tech. J.*, 27:379–423,623–656, 1948. pdf