## DISCUSSION OF "ESTIMATING THE HISTORICAL AND FUTURE PROBABILITIES OF LARGE TERRORIST EVENTS" BY AARON CLAUSET AND RYAN WOODARD

BY BRIAN J. REICH AND MICHAEL D. PORTER

North Carolina State University and University of Alabama

We congratulate the authors on this well-written and thought-provoking paper. They address the problem of estimating the probability of a large (and rare) terrorist attack by modeling the tail of the attack size distribution. Recognizing the importance of incorporating uncertainty, their approach uses bootstrap resampling to obtain a set of parameter estimates for the tail distribution from which estimates for the probability of a 9/11-sized attack (90% interval [0.182, 0.669]) illustrates the need to account for uncertainty in such a problem.

The authors also recognize that the choice of tail model can have a large impact on the probability estimates. Using multiple tail models (power law, stretched exponential and log-normal), they estimate that the probability of a 9/11-sized attack over a 40-year period (or, more specifically, in 13,274 events) ranges from around 11–35%. We thought it would be interesting to compare the results of the authors' analysis with a more classical extreme value analysis [Coles (2001), de Haan and Ferreira (2006)] using a generalized Pareto distribution (GPD). The GPD distribution has three parameters: lower bound  $\mu$ , scale  $\sigma$  and shape  $\xi$ . If  $Y \sim \text{GPD}(\mu, \sigma, \xi)$ , then Y's cumulative density function is

(1) 
$$F(y|\mu, \sigma, \xi) = 1 - \left(1 + \frac{\xi(y-\mu)}{\sigma}\right)^{-1/\xi}.$$

The shape parameter  $\xi$  determines the support of *Y*. If  $\xi < 0$ , then *Y* is bounded to the interval  $\mu < Y < \mu - \sigma/\xi$ ; if  $\xi > 0$ , then *Y* is unbounded with support  $Y > \mu$ . The shape parameter also determines the tail behavior. If  $\xi < 0.5$ , then the density has light tails and finite mean and variance. Large  $\xi$  gives heavy tails. If  $\xi > 0.5$ , the variance in infinite, and if  $\xi > 1$ , then the mean is also infinite. If  $\xi > 0$  and  $\sigma = \mu \cdot \xi$ , then the GPD reduces to the (continuous) power-law distribution.

Asymptotic theory suggests that the GPD provides a good approximation for the tail of a wide range of densities. The typical approach is to select a lower bound  $\mu$  based on exploratory analysis, discard the data below  $\mu$ , and estimate  $\sigma$  and  $\xi$  using maximum likelihood. A crucial step in this analysis is to select an

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