

DISCUSSION OF ‘SPARSE GRAPHS USING
EXCHANGEABLE RANDOM MEASURES’
BY F. CARON AND E. B. FOX

Benjamin Bloem-Reddy

<http://www.columbia.edu/~bmr2136/>

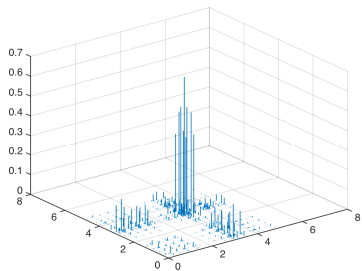
Columbia University

Royal Statistical Society, London

May 10, 2017

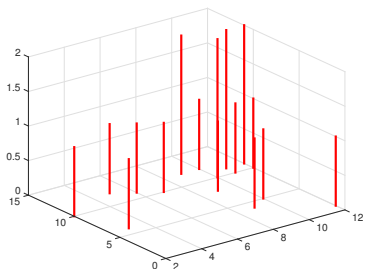
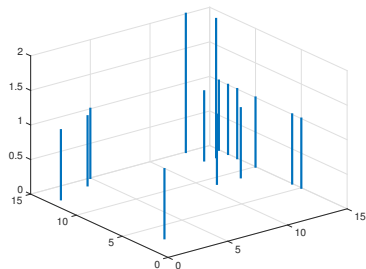
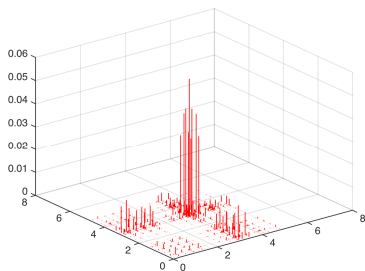
Exchangeable random measure

$$D_\alpha \sim \text{CRM}(\rho, \lambda_\alpha)$$



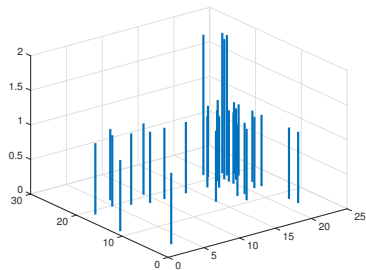
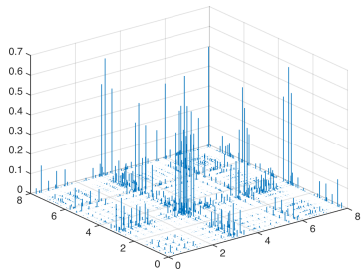
Edge exchangeable

$$\mathcal{E}_{D_\alpha^*} \sim \text{NCRM}(\rho, \lambda_\alpha)$$



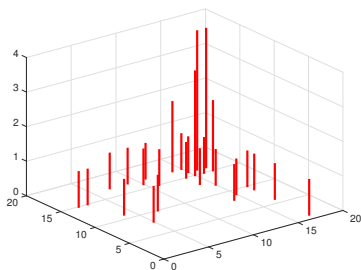
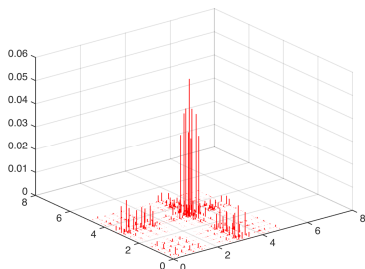
Exchangeable random measure

$$D_{\alpha+\epsilon} \mid D_{\alpha} \sim \text{CRM}(\rho, \lambda_{[\alpha, \alpha+\epsilon]})$$



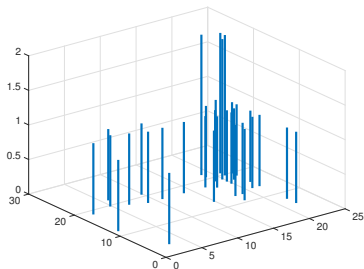
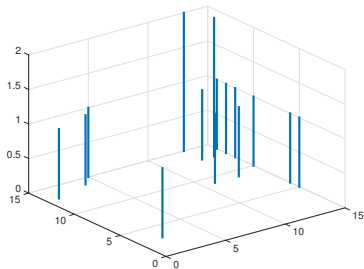
Edge exchangeable

$$\mathcal{E}_{D_{\alpha+\epsilon}^*} \mid \mathcal{E}_{D_{\alpha}^*} \sim \text{NCRM}(\rho, \lambda_{\alpha})$$



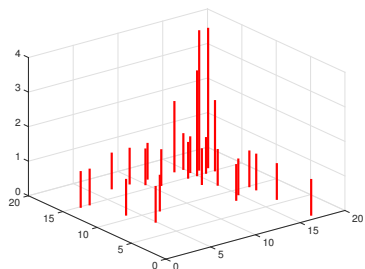
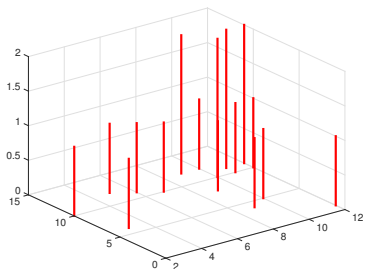
Exchangeable random measure

$$D_{\alpha+\epsilon} \mid D_{\alpha} \sim \text{CRM}(\rho, \lambda_{[\alpha, \alpha+\epsilon]})$$



Edge exchangeable

$$\mathcal{E}_{D_{\alpha+\epsilon}^*} \mid \mathcal{E}_{D_{\alpha}^*} \sim \text{NCRM}(\rho, \lambda_{\alpha})$$



Exchangeable random measure

- ▶ Growth: by a random number of edges and vertices as α increases.
- ▶ Population of possible edges: grows with α .
- ▶ Inserts **no** additional edges between observed vertices w.p. 1.
- ▶ Caron and Fox (2017), Veitch and Roy (2015, 2016), Borgs et al. (2016), Janson (2016).

Edge exchangeable

- ▶ Growth: one edge at a time.
- ▶ Population of possible edges: fixed (possibly infinite).
- ▶ Inserts additional edges between observed vertices w.p. 1.
- ▶ Crane and Dempsey (2015, 2016), Williamson (2016), Cai et al. (2016), Janson (2017)

- Borgs, Christian, Jennifer T. Chayes, Henry Cohn, and Nina Holden (2016). “Sparse exchangeable graphs and their limits via graphon processes”. In: arXiv: 1601.07134 [math.PR]. URL: <http://arxiv.org/abs/1601.07134>.
- Cai, Diana, Trevor Campbell, and Tamara Broderick (2016). “Edge-exchangeable graphs and sparsity”. In: *Advances in Neural Information Processing Systems 29*. Ed. by D. D. Lee, M. Sugiyama, U. V. Luxburg, I. Guyon, and R. Garnett. Curran Associates, Inc., pp. 4242–4250.
- Crane, Harry and Walter Dempsey (2015). “A framework for statistical network modeling”. In: arXiv: 1509.08185 [math.ST]. URL: <https://arxiv.org/abs/1509.08185>.
- (2016). “Edge exchangeable models for network data”. In: arXiv: 1603.04571 [math.ST]. URL: <https://arxiv.org/abs/1603.04571>.
- Janson, Svante (2016). “Graphons and cut metric on sigma-finite measure spaces”. In: arXiv: 1608.01833 [math.CO]. URL: <https://arxiv.org/abs/1608.01833>.
- (2017). “On edge exchangeable random graphs”. In: eprint: 1702.06396. URL: <https://arxiv.org/abs/1702.06396>.
- Veitch, Victor and Daniel M. Roy (2015). “The Class of Random Graphs Arising from Exchangeable Random Measures”. In: arXiv: 1512.03099 [math.ST]. URL: <http://arxiv.org/abs/1512.03099>.
- (2016). “Sampling and Estimation for (Sparse) Exchangeable Graphs”. In: arXiv: 1611.00843 [math.ST]. URL: <https://arxiv.org/abs/1611.00843>.
- Williamson, Sinead A. (2016). “Nonparametric Network Models for Link Prediction”. In: *Journal of Machine Learning Research* 17.202, pp. 1–21.