Towards connectivities of random geometric complexes

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Joint work with:

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- $\mathcal{P}_n = \{X_1, \ldots, X_{N_n}\}$ X_i i.i.d. uniform and $N_n \sim Poi(n)$.
- ▶ Random geometric graph : $G(\mathcal{P}_n, r)$: Vertices, $V = \mathcal{P}_n$, Edges : $x_i \sim x_j$ if $0 < |x_i - x_j| \le 2r$, r > 0.

The first and last obstacle to connectivity

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Sharp connectivity threshold: (Penrose '97) :

$$\mathsf{P}(G(\mathcal{P}_n, r_n) \text{ is connected}) o egin{cases} 0 & ext{ if } n heta_d 2^d r_n^d = \log n - w(n) \ 1 & ext{ if } n heta_d 2^d r_n^d = \log n + w(n) \end{cases}$$

for $w(n) \to \infty$. θ_d - Vol. of unit ball.

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▶ Threshold for isolated nodes : $J_{n,0}$. For $w(n) \to \infty$,

$$\mathsf{P}(J_{n,0}=0) \rightarrow \begin{cases} 0 & \text{if } n\theta_d 2^d r_n^d = \log n - w(n) \\ 1 & \text{if } n\theta_d 2^d r_n^d = \log n + w(n) \end{cases}$$

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- ▶ G_0^U : Vertices $F^0 \subset V$. Edges $\subset F^1$ i.e., the usual graph.

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$$C(\mathcal{X},r) \subset R(\mathcal{X},r) \subset C(\mathcal{X},\sqrt{2}r).$$

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- Maximal faces in $R(\mathcal{X}, 1) = \{[1, 2], [2, 3, 4], [2, 4, 5]\}.$
- ▶ 1-faces are down-connected but have 2 up-connected components - [1, 2], {[2, 3], [3, 4], [2, 4], [4, 5], [2, 5]}.

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- Combinatorial structure matters for up/down connectivity !

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- Topological data analysis : Carlsson, 2014 ; Adler, 2015 ; Bobrowski-Kahle, 2017.

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$$G_k^*(X_n(r)) : * = U/D$$
 i.e., up / down.
 $X_n(r) := X(\mathcal{P}_n, r), X = C/R$ i.e., Čech / Vietoris-Rips.

• Bobrowski-Weinberger '17 : For $\epsilon \in (0, 1)$

$$\mathsf{P}(\beta_k(C_n(r_n)) = 0) \to \begin{cases} 0 & \text{if } n\theta_d r_n^d = (1 - \epsilon) \log n \\ 1 & \text{if } n\theta_d r_n^d = (1 + \epsilon) \log n \end{cases}$$

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- ► Also threshold for coverage ([P. Hall, 1988])

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- J_k^U Isolated k-faces in the up-connected graph.
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► No finite components exist above vanishing threshold !

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- Why not Connectivity thresholds ? Can there be two infinite components ?

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For fixed "r ∈ (log n − log log n, log n)", no isolated edge but infinitely many appear and disappear very quickly !

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▶ Rate of $c_n \rightarrow m_k \Rightarrow 2$ nd order term = $k \log \log n$ or $(k-2) \log \log n$ or $(k-1) \log \log n$.

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$$\mathsf{E}(J_k^U(X_n(r))) = \frac{n(nr^d)^k}{(k+1)!} \int_{U^{k+1}} h(x_0, \ldots, x_k) e^{-nr^d |Q(x_0, \ldots, x_k, r)|}.$$

► Palm calculus / Campbell-Mecke formula :

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- Lower bounds involve second-moments and some more Palm calculus.

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 Idea: Poisson approximation bound due to [Penrose16] and more second moment calculations.
Up-connectivity of Vietoris-Rips Complexes

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- Idea: Poisson approximation bound due to [Penrose16] and more second moment calculations.
- Key geometric Lemma: If x, y ∈ X^(k+1) are isolated k-faces ((k + 1)-cliques) in R(x ∪ y ∪ P, 1) then for some ε, β > 0, either |Q(x) ∨ Q(y)| ≥ m_k + ε or |Q(x) \ Q(y)| ≥ β.

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- ► "Bobrowski-D.Y." $\lambda_2(G(\mathcal{P}_n \cap B_1(O), 1)) \rightarrow 1/2$ a.s. !!!

References

- Srikanth K. Iyer and D.Y. (2018). Thresholds for vanishing of 'Isolated' faces in random Čech and Vietoris-Rips complexes. arXiv:1802.08224
- ▶ O. Bobrowski and S. Weinberger (2017), On the vanishing of homology in random Čech complexes. *Rand. Struct & Alg.*
- O. Bobrowski and M. Kahle (2017) Topology of random geometric complexes: A survey. J. Appl. & Comp. Topology
- ▶ M. D. Penrose. (2016) Inhomogeneous random graphs, isolated vertices, and Poisson approximation, *arXiv:1507.07132*
- C. Hoffmann, M. Kahle and E. Paquette (2016), Spectral gaps of random graphs and applications to random topology. arXiv:1201.0425