Brief Anouncement: Tight Bounds for Repeated Balls-into-Bins

<u>Dimitrios Los</u>¹, Thomas Sauerwald¹

¹University of Cambridge, UK



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(ONE-CHOICE) Allocating each ball uniformly at random for $m = \Omega(n \log n)$ gives w.h.p. a maximum load of: $\frac{m}{n} + \Theta(\sqrt{\frac{m}{n} \cdot \log n})$.

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Starting with an unbalanced configuration, the process eventually stabilises in a balanced configuration.

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- ► For m = n, w.h.p. traversal time is $\Omega(n \log n)$ and $\mathcal{O}(n \log^2 n)$ [BCN⁺19].
- ▶ For m = poly(n), w.h.p. traversal time is $\Theta(m \log n)$.

Future work

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Explore the process in the graphical setting.

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Explore versions of the process with continuous loads.

Questions?

More visualisations: dimitrioslos.com/spaa22ba

Bibliography I

- L. Becchetti, A. E. F. Clementi, E. Natale, F. Pasquale, and G. Posta, *Self-stabilizing repeated balls-into-bins*, 27th International Symposium on Theoretical Aspects of Computer Science (STACS'15), ACM, 2015, pp. 332–339.
- ▶ _____, Self-stabilizing repeated balls-into-bins, Distributed Comput. **32** (2019), no. 1, 59–68.