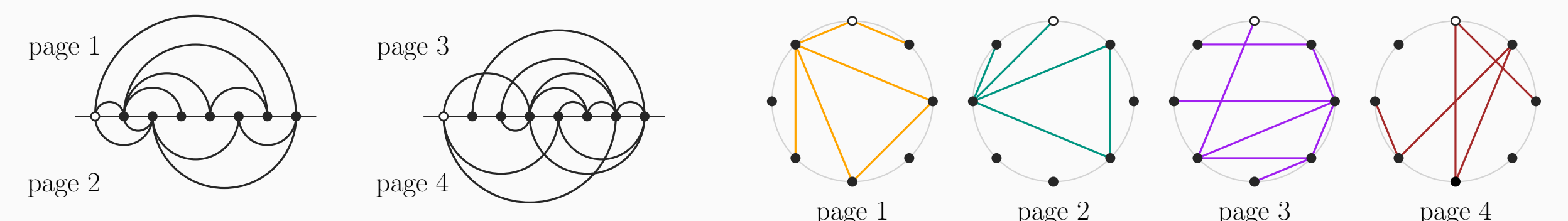


Heuristic Picker for Book Drawings

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Abstract The problem of crossing minimization in k -page book drawings is in general \mathcal{NP} -hard [1]. Thus, it is common to use heuristics. Among those, simple heuristics presented in literature, compute a vertex order and an edge distribution for a book drawing independently.

We present several new simple heuristics, including *full drawing heuristics*, that compute vertex order and edge distribution at the same time, and their experimental evaluation together with the most promising simple heuristics from the literature. Simple heuristics not considered in this poster were outperformed by the presented ones. More complex heuristics, based on neural networks [7,11,13,16], simulated annealing and evolutionary techniques [2,5,8,14,15], are out of the focus of this poster.



Four page book drawing illustrated with *linear* spine.

Four page book drawing illustrated with *circular* spine.

Vertex order heuristics (operate in one page)

conCro: Builds the vertex order step by step. At each step it selects the vertex with the most already placed neighbours (connectivity \rightarrow **con**) and places it on one of the two ends of the current spine where it introduces fewer crossings with unplaced edges (\rightarrow **Cro**) [3].

conGreedy: Like **conCro** it builds the vertex order step by step. At each step it selects the vertex with the most already placed neighbours, however, it places the vertex on the position of the current spine where it introduces fewer crossings with already placed edges.

randDFS: The vertices are ordered based on a DFS traversal of the graph that starts at a random vertex and randomly selects the next vertex to visit [2].

sm1DgrDFS: Similarly to **randDFS**, the vertices are ordered based on DFS traversal, but it starts at the vertex of the smallest degree and selects the next vertices by increasing degree [6].

treeBFS: Orders vertices based on a crossing-free 1-page book drawing of a BFS spanning tree.

Edge distribution heuristics

slope: Distributes edges based on their slope in a circular drawing [10]. Performs well on dense and perfect on complete graphs in some cases [12].

ceilFloor: Distributes edges greedily in the order of descending length in a circular drawing [15].

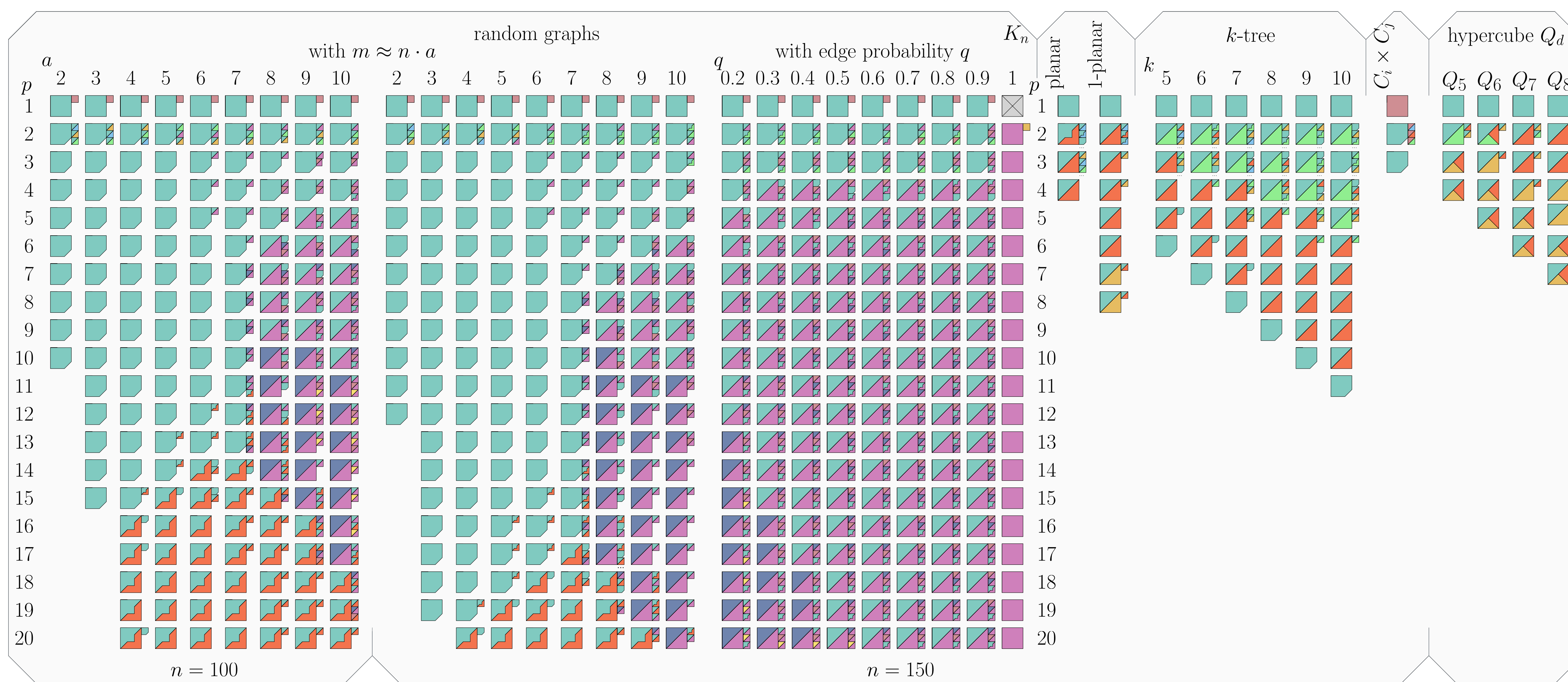
eLen: Like **ceilFloor**, it distributes the edges greedily in the order of descending distance of their endpoints on the linear spine [4]. The original motivation was to place first the edges with highest probability to create crossings achieved instead by **ceilFloor**.

circ: Distributes edges greedily in the order that produces book embeddings of complete graphs on their pagenumbers [15]. The order is a set of paths, zig-zagging on a circular spine.

earDecomp: Constructs the conflict graph of the edges in a circular drawing, and an ear decomposition of this conflict graph, and then alternate the vertices of each ear (edges of the original graph) between two or three pages.

Full drawing heuristics Full drawing heuristics compute vertex order and edge distribution at the same time. For example, following the idea by He et al. [9] **sm1DgrDFS**, **randDFS** and **conGreedy** can be extended to distribute an edge to the best page greedily as soon as it gets *closed*, i.e. at the moment its second end-vertex appears on the spine. The corresponding full heuristics are called **sm1DgrDFS+**, **randDFS+** and **conGreedy+**.

conGreedy+: This full drawing heuristic works like **conGreedy**, but distributes an edge to the best page greedily as soon as it gets *closed*. In contrast to **sm1DgrDFS+** and **randDFS+**, this directly affects the computation of the rest of the vertex order. Thus it can also be used as improved vertex order heuristic by discarding the edge distribution afterwards.



The figure on the left illustrates the evaluation of the heuristics on different graph classes and different number of pages p . The maximal used number of pages was determined either by the pagenumbers of the graph, or when the best heuristic produced no more than 1 crossing on average.

Big tiles represent the heuristic combination or full drawing heuristic that performed best in terms of average number of crossings, computed for 200 instances for the specific case. The upper-left part of a tile is coloured according to vertex order heuristic, and the bottom-right according to edge distribution heuristic; it is subdivided into two parts if two heuristics perform equally.

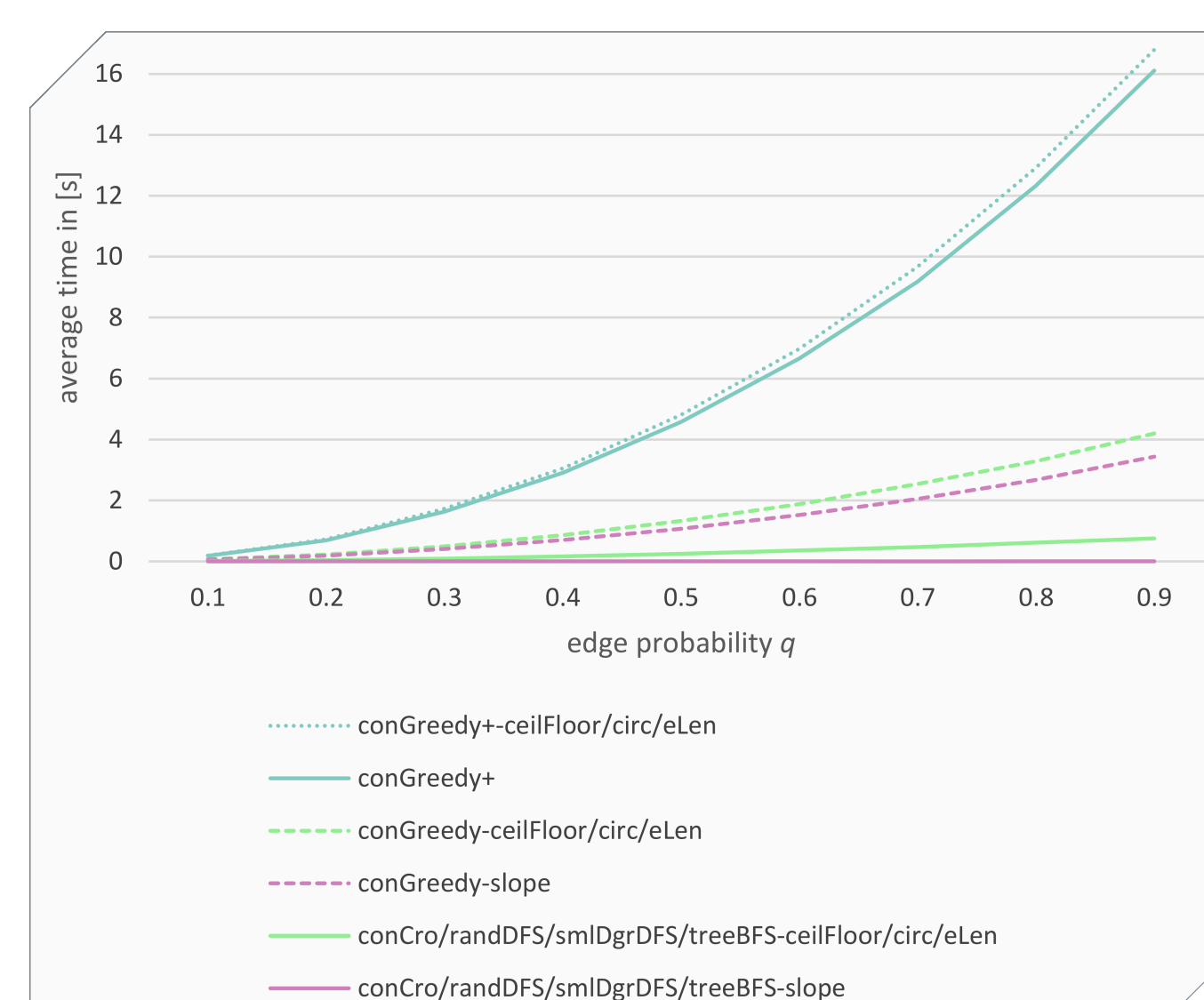
The small tiles on the right of a big tile represent heuristics following in the performance, from top to bottom, if their performance is within 10% of the winning one.

Our test suite contained among others two sets of random graphs: with a linear number of edges, $m \approx na$, and with a quadratic number of edges (given by edge probability q in the Erdős-Rényi model), as well as planar, 1-planar, k -tree, cartesian cycle product ($C_i \times C_j$, $i, j \approx n$) and hypercubes. See [12] for the complete results of the experiment.

Discussion The best heuristic combination depends not only on the number of pages and the density of the graphs, but remarkably also on their structural properties. E.g., the combination **conGreedy+ceilFloor** performs best on planar and 1-planar graphs, while **conGreedy+**, as full drawing heuristic, performs best on random graphs with the same density.

We observe that our first extension of the vertex order heuristic **conCro** to **conGreedy**, produces results with fewer crossings. The second extension of **conGreedy** to the full drawing heuristic **conGreedy+** sometimes achieves even fewer crossings. However, both these extensions come with the cost of higher running time, which was clearly noticeable in the experiments (e.g., see figure on the right).

Furthermore, we could observe that **conGreedy+ceilFloor/eLen** achieved crossing-free book drawings of hypercubes Q_d when $p = \text{pagenumber}$ (tested up to $d = 10$).



Average running time as a function of the density, for random graphs with quadratic number of edges, $n = 150$ and four pages.

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