

1 Signed motif analysis of the *Caenorhabditis elegans*
2 neuronal network reveals positive feedforward
3 and negative feedback loops

4 Short title: Signed motif analysis of the *Caenorhabditis elegans* connectome

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15
16 KEYWORDS: connectome, feedforward excitation, feedback inhibition, feedback

17 disinhibition, incoherent feedforward loop, biological switches, topology preserving

18 randomization

19
20 Abstract

21 Nervous systems are complex biological networks with largely unknown structural and
22 functional characteristics. Motif analysis is a robust tool that can reveal unique aspects of

23 connectivity of a complex network. An ideal candidate for motif analysis is the connectome
24 of the nematode *Caenorhabditis elegans* which is the only fully reconstructed nervous
25 system. Utilizing recent data on the connection signs of this network and a novel structure-
26 preserving randomization method, we performed signed motif analysis on the *C. elegans*
27 connectome for the first time, to our knowledge. We identified 56 significantly over- and 1
28 underrepresented three-node signed motifs and revealed that certain motifs (e.g. positive
29 feedforward, negative feedback, disinhibitory feedback, and incoherent feedforward loops)
30 are overabundant in the *C. elegans* connectome. We further distinguished (coloured) nodes
31 by corresponding neuron modalities (e.g. sensory vs. motor neurons) and found that there is
32 characteristic neuronal layout for each significant feedforward and feedback loop. Our
33 findings demonstrate the importance and potential of signed motif analysis in understanding
34 biological networks. Our motif enumerating tool and definition system can be utilized in
35 signed motif analysis of other complex networks.

36

37 Introduction

38 Nervous systems are complex biological networks that generate behaviour *via* complex
39 neural activity over the synaptic connectivity structure. Biological networks share common
40 global (e.g. small-worldness, cost-efficient wiring) and local (e.g. clustering, modularization)
41 properties that allow optimal information processing (1–4). Importantly, detailed structural
42 characteristics can be revealed by investigating a network’s composition from smaller
43 building blocks, called motifs (Fig 1A). Motifs are frequently occurring subgraphs that
44 correspond to different biological functions (3). A subgraph is a graph whose nodes and
45 edges are subsets of another graph. There are two main types: induced and partial (5). A
46 subgraph is induced if it has a subset of nodes of a network and all edges that connect those
47 nodes. On the other hand, partial subgraphs only have some edges connecting the chosen

48 nodes (Fig 1B). The classical concept is that if a specific subgraph occurs in a network more
49 frequently than expected then that subgraph might possess a crucial role in the network,
50 hence is called a motif. Motifs have been examined in a variety of real-world and more
51 importantly, brain networks (3,4,6). Similar to the networks themselves, motifs are primarily
52 characterized by their nodes and edges.

53

54 **Fig 1. Overview of motif definitions.** A) Three-node motif structures with directed edges. B)
55 Induced and partial motifs. Partial motifs are subgraphs of their corresponding induced motif.
56 For example, induced motif E contains five different partial motifs. Similar concept is
57 discussed in McDonnell *et al.* (2014) and Sporns & Kötter (2004). C) Definition of signed
58 motifs by colouring the edges (of motif G in the example). An edge can be either excitatory
59 or inhibitory.

60 Particularly in brain networks edges can be labelled ('coloured') by the polarity of the
61 connection they represent – i.e. excitatory or inhibitory (Fig 1C). This is important as
62 structurally identical motifs with different polarity patterns can have completely different
63 biological functions. However, edge polarity-labelled (i.e. signed) motif analysis has only
64 been performed in recent years (7,8) in social networks and partial connectomes, and has not
65 been performed on a complete neuronal network yet. This is because large-scale polarity data
66 has been lacking in most species.

67

68 The neuronal network of the nematode *Caenorhabditis elegans* is currently the only
69 completely reconstructed connectome of a living organism's nervous system (9,10)
70 consisting of 302 neurons and ~5000 connections in a hermaphrodite. In previous work on
71 truncated and partial worm connectomes, some network motifs of three and four nodes were
72 found to be overrepresented (3,9). More functional analyses have been performed in recent

73 studies which coloured the nodes based on neuronal function and neurotransmitter expression
74 or labelled the edges by synapse type (11–13).

75

76 In a recent work we published a comprehensive dataset of synaptic polarities for the *C.*
77 *elegans* chemical synapse connectome (14). Using presynaptic neurotransmitter and
78 postsynaptic receptor expression data we predicted the polarities (excitatory, inhibitory, or
79 complex) of more than 15,000 chemical synapses.

80

81 In this study we analyzed signed motif distributions in the *C. elegans* connectome using the
82 connectome-scale synaptic polarity data published previously. We developed a novel method
83 and computational tool to allow edge-labelled motif analysis and implemented it on the
84 signed chemical synapse neuronal network of *C. elegans*. We carried out structure-preserving
85 network randomization to generate null-models for motif analysis. We showed that some of
86 the signed three-node motifs (most importantly negative feedback and positive feed-forward
87 loops) are significantly overrepresented in the *C. elegans* connectome.

88 Results

89 Induced subgraph analysis

90 The chemical synapse connectome of *C. elegans* consists of 3,638 connections of which
91 1,555, 553, and 1,530 were labeled as excitatory, inhibitory, or unknown, respectively, based
92 on our previous work (14) and labelling detailed in Methods (Supplementary Data S1). In this
93 network, we identified 64,962 individual three-node subgraphs (Supplementary Data S3).
94 These subgraphs were categorized by their wiring structure and edge labelling into one of 710
95 unique motif types (Supplementary Data S2). To establish a null model, we generated a set of
96 1,000 networks by randomizing the neurotransmitter expression of the neurons. This resulted

97 in a varying ratio of excitatory and inhibitory connections amongst the random networks (Fig
98 S1), but the total number and structure of edges remained the same across all networks. This
99 set of random networks had on average fewer positive connections and more unknown
100 connections than the original *C. elegans* connectome (Fig S1). We counted the occurrence of
101 these motifs in the connectome and in the set of random networks and calculated Z-scores for
102 each motif to determine over- or underrepresentation (Supplementary Data S4). We found 65
103 over- and 21 underrepresented motifs, respectively. Six motifs were absent both in the *C.*
104 *elegans* connectome and in the null model, thus no Z-score was calculated. 184 motifs were
105 only absent from the connectome. 38 of the overrepresented and 1 of the underrepresented
106 motifs had no unknown edge, respectively (Fig S2).

107

108 **Fig S1: Distribution of different edge polarities among the connectome (crosses) and the**
109 **generated 1 000 random networks (violin plots).** Random networks were generated by
110 randomising the neurotransmitter expression of the neurons in the connectome, therefore only
111 edge polarities have changed, the number of edges and nodes remained the same.

112

113 **Fig S2: Induced motif analysis of the connectome.** Using 1,000 random networks as a null-
114 model, induced motif analysis revealed 38 significantly over- and 1 underrepresented motifs
115 that have no unknown edge.

116

117 [Partial subgraph analysis](#)

118 Partial subgraph analysis can provide a deeper and more functional understanding of
119 information processing networks (4,5). Therefore, we translated our findings of induced
120 motifs to partial motif counts (Methods) and described 193,487 partial motifs in the
121 connectome. We identified 92 significantly over- and 32 underrepresented partial motifs (Fig

122 2A, Supplementary Data S5). One motif (Motif A16) was absent both in the *C. elegans*
123 connectome and in the null model, thus no Z-score was calculated. On the other hand, 22
124 motifs were only absent from the connectome. 40% of the identified partial motifs only had
125 excitatory and inhibitory edges (Fig 2B). 56 of the significantly overrepresented and 1 of the
126 significantly underrepresented motifs had no unknown edge, respectively (Fig 2C). Partial
127 motifs with the highest Z-scores were characteristic for having one (but only one) inhibitory
128 connection that provided negative feedback function in the motif.

129

130 **Fig 2. Results of partial motif analysis.** A) Distribution of all possible 710 signed three-
131 node motifs. Over- and underrepresentation was determined in comparison to 1,000 random
132 networks by using Z-score as quantitative measure. B) Distribution partial motifs of the
133 connectome by the presence or absence of unknown edges. C) Significantly over- and
134 underrepresented partial motifs (without unknown edge), and their respective Z-scores.

135

136 Previous studies (15) have shown the overrepresentation of symmetrical three-node motifs
137 with a bidirectional edge (labelled in our work as motifs E and G). We found that only 8 of
138 the possible 20 colourings of these motifs are significantly overrepresented (Fig 2C).
139 Surprisingly, even though the structure of motifs E and G are symmetrical, 5 of the 8
140 overrepresented motifs are found to be asymmetrical in colouring.

141

142 [Feedforward and feedback loops](#)

143 We analyzed feedforward and feedback motifs in detail since they are known to be important
144 in signalling networks (Table 1, references (16–23)). We differentiated eight types of
145 feedforward and four types of feedback loops (Fig 3A), following previously published
146 concepts (6,21).

148

149 Table 1.

	Motif	Type	Function	References
F e e d b a c k	D1	Positive	Amplification, information processing	18
	D2	Negative	Oscillator, stabilizing	18
	D3	Disinhibitory (positive)	Amplification, creating a dense response	19, 20
	D4	Oscillatory (negative)	Biological repressilator, oscillator	18, 21
F e e d f o r w a r d	F1	Coherent positive	Sign-sensitive delay / persistence detector / learning; overrepresented in many systems	22, 23
	F2	Incoherent	Pulse generator, sign-sensitive accelerator.	23
	F3	Incoherent	Pulse generator, sign-sensitive accelerator.	23
	F4	Coherent negative	Sign-sensitive delay	23
	F5	Incoherent	Pulse generator, response accelerator, fold-change detection in sensory systems, input normalization; overrepresented in many systems	23, 24
	F6	Coherent disinhibitory	Sign-sensitive delay, epileptic seizures	23, 25
	F7	Coherent negative	Sign-sensitive delay	23
	F8	Incoherent	Pulse generator, sign-sensitive accelerator	23

150 **Table 1. Feedback and feedforward signed motifs.** Motifs in **bold** are significantly

151 overrepresented in the *C. elegans* connectome.

152

153 **Fig 3. Feedforward and feedback motifs.** A) Feedforward and feedback motif counts in the

154 connectome (red X) compared to the null model of random networks (boxplot). Positive

155 feedback (Pos.), negative feedback (Neg.), disinhibitory feedback (Disinh.), oscillatory

156 feedback (Oscil.), positive feedforward, negative feedforward and incoherent feedforward

157 loops are shown. The threshold of Z-score for significance was 1.96. B) Distribution of

158 significant feedback and feedforward motifs by neuron modality layouts. Neuron modalities

159 were abbreviated as S (sensory neuron), I (interneuron), and M (motor neuron). Layouts

160 containing at least one polymodal neuron (i.e. neuron without one specific modality) were
161 combined and labelled as P.

162

163 Addressing feedforward loops (Fig 3B), we found that the F1 coherent positive feedforward
164 and the F2 and F5 incoherent feedforward loops were overrepresented (Z-scores 3.09, 3.09,
165 and 4.18, respectively). The F1 motif was also the most abundant feedforward loop (2,167
166 occurrences). Meanwhile, the D2 negative feedback (Z-score = 5.14) and the D3 feedback
167 disinhibition (Z-score = 4.54) loops were also highly overrepresented. Positive feedback (D1)
168 and coherent negative feedforward (F4, F7) loops were not overrepresented.

169 In the next step, we further analyzed the neuron modality (i.e. sensory, motor, inter,
170 polymodal) distributions amongst the significant feedforward and feedback loops. We found
171 a pattern that specific modality layouts (numbered 1 to 27, excluding polymodal-containing
172 motifs) dominated each feedforward motif (Fig 3D). In case of the F1 coherent positive
173 feedforward loop, the most common modality layout was #21, which represents inter->motor
174 and motor->motor excitation. For the F2 ('incoherent') motif the dominant modality layout
175 was #10 which represents inter->inter inhibition and inter->motor excitation pattern. For the
176 F5 (also 'incoherent') motif the dominant layout was #15 which is a sensory->inter excitatory
177 and inter->inter inhibitory layout. We observed that the interneuron-only layout (#3) was
178 equally the second most frequent layout amongst all three overrepresented feedforward
179 motifs.

180

181 In case of feedback loops (Fig 3C, both the D2 negative feedback and the D3 disinhibitory
182 loops were highly present in the interneuron-only layout (#3). On the other hand, the D3
183 feedback loop was also found to be dominant in modality layout #21 (which is representing
184 inter->motor excitation, motor->motor inhibition, and motor->inter inhibition), while the D2

185 was not. Surprisingly, we did not observe a single occurrence of an archetypical three-layer
186 negative feedback loop (i.e. layout #22: sensory->inter and inter->motor excitation, and
187 motor->sensory inhibition). Modality layouts having at least one polymodal neuron were
188 highly frequent in the case of all motifs but were presented as a single layout to simplify
189 interpretation.

190

191 Discussion

192 The neuronal network of *C. elegans* is yet the only fully reconstructed connectome (10)
193 which allows detailed analysis to comprehend the structural characteristics such as network
194 motif abundance of a nervous system. Utilizing the previously published signed connectome
195 of *C. elegans* we conducted signed motif analysis for the first time, to our knowledge. We
196 found that the previously reported high number of feedforward loops (15) is
197 disproportionately distributed among the different edge colouring patterns. The coherent
198 excitatory feedforward loop and two types of incoherent feedforward loops are
199 overrepresented compared to random networks. The incoherent feedforward loops are
200 overrepresented in many systems (3,24) and function as sign-sensitive accelerators which
201 have key roles in information processing of networks (21). The role of the negative feedback
202 loop is also highly overrepresented in the *C. elegans* connectome and is well-known in
203 various networks (25,26). We also found overrepresentation of the disinhibitory feedback
204 motif which has a more complex function: it plays an important role in balancing excitation
205 and inhibition in a signed network. It can lead to novelty response amplification and a dense
206 population response (18). It was found in the primary visual cortex (27) and in the nucleus
207 accumbens regulating aversion and reward (17). Having two different steady states (6), a
208 disinhibitory feedback motif can act as a biological switch (28).

209

210 There are several limitations of our study. Because of the limited data available, we were
211 only able to analyze 40% of all three-node motifs of the connectome (graphlets having only
212 excitatory or inhibitory function in the network). New connectivity data of the worm are still
213 emerging (29,30) and there are recent experimental results of synaptic polarity and gene
214 expression as well (31). However, the relatively high number of complex connections (14)
215 implies that our results can be complemented once the role of those synapses is better
216 understood.

217

218 Overall, to our knowledge, our study provides the first comprehensive analysis of signed
219 motifs in a fully mapped connectome, revealing insights into the functional architecture of the
220 *C. elegans* neuronal network. The overrepresentation of certain motif types, particularly
221 positive feedforward and negative feedback loops, suggests that these motifs likely contribute
222 significantly to the network's information processing and homeostatic functions. Future work
223 that incorporates emerging synaptic polarity data and expands beyond three-node motifs
224 could yield even deeper insights into the organizational principles of neural networks. As
225 motif analysis techniques evolve and are applied to larger-scale connectomes, our findings
226 offer a foundation for exploring how distinct motif configurations support the complex
227 functions of diverse nervous systems.

228 **Materials and Methods**

229 *Description of the C. elegans connectome data*

230 The WormWiring connectome reconstruction (<http://wormwiring.org>) of the adult
231 hermaphrodite worm consists of 3,638 chemical connections (20,589 synapses) connecting
232 297 neurons (CANL, CANR, PLML, PLMR, and M5 neurons are not connected by chemical
233 connections hence were excluded from the analysis). We utilized the signed neuronal

234 network published previously in which synaptic signs were predicted based on cellular level
235 neurotransmitter and receptor expression data (14). In the original work synapses were
236 predicted as excitatory, inhibitory, complex, or unknown. In the current work complex
237 synapses were re-labelled as excitatory, inhibitory, or unknown, based on the balance of
238 postsynaptic receptor expression (e.g. connections that had excitatory>inhibitory postsynaptic
239 receptors were defined as positive) to reduce combinatorial complexity, similarly to a method
240 used previously (32). Hence, in this work a network edge was coloured with one of three
241 labels (Supplementary Data S1). We extracted neuron modalities (i.e. sensory, inter, motor,
242 or polymodal) from Wornatlas (<http://wornatlas.org>). Neurons with more than one
243 functional modality (e.g. inter and motor), were labelled as polymodal.

244

245 [Definition and search of signed motifs](#)

246 A definition system of directed and edge-coloured motifs consisting of three nodes was
247 established. Edges were signed as either excitatory, inhibitory or unknown, resulting in 710
248 motifs (Supplementary Data S2). Rotational and reflectional symmetries were considered as
249 the same motif. Motif search was performed by a self-developed algorithm
250 (<https://github.com/bank-fenyves/CeConn-ColorMotifs>) that seeks for induced subgraphs,
251 identifies all three-node, edge-coloured motifs in the target network, and categorizes them as
252 one of the 710 motif types. Our algorithm was further used to convert induced motif counts to
253 partial motif counts.

254

255 [Randomization and statistical analysis](#)

256 Generation of random networks was performed by shuffling neurotransmitter expression of
257 the neurons and then predicting synaptic polarities repeatedly. Thus, the structural hard-
258 wiring of the random networks were preserved. This allowed us to use absolute motif counts

259 for analysis. 1,000 random networks were generated which were used as a null model. In
260 formal analysis we tested the alternative hypothesis that a coloured motif in the *C. elegans*
261 neuronal network is significantly over- or underrepresented compared to the null model, as
262 established previously (13). As an established method to assess statistical significance of
263 individual motifs (3,33). Z-score was computed, using a threshold of $|Z\text{-score}| = 1.96$,
264 corresponding to a 95% confidence interval ($\alpha=0.05$). For each motif Z-score was
265 calculated using the formula:

266

$$267 \quad Z = \frac{f_{conn} - f_{rand}}{std(f_{rand})}$$

268

269 where f_{conn} is the frequency of the motif in the connectome, f_{rand} is the average frequency of
270 the motif in the random networks, while $std(f_{rand})$ stands for the standard deviation of the
271 motifs occurrence in random networks.

272

273 Software

274 The motif search algorithm was developed in Python (3.10.11). Randomization of the
275 network and polarity prediction was performed in R (4.2.2). Statistical tests were performed
276 in R (4.2.2) and Microsoft Excel (16.84). All scripts are available at [https://github.com/bank-](https://github.com/bank-fenyves/CeConn-ColorMotifs)
277 [fenyves/CeConn-ColorMotifs](https://github.com/bank-fenyves/CeConn-ColorMotifs).

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282

283 **References**

- 284 1. Bassett DS, Bullmore ET. Small-world brain networks revisited. Vol. 23,
285 *Neuroscientist*. SAGE Publications Inc.; 2017. p. 499–516.
- 286 2. Bullmore E, Sporns O. Complex brain networks: graph theoretical analysis of
287 structural and functional systems. *Nat Rev Neurosci*. 2009 Mar 4;10(3):186–98.
- 288 3. Milo R, Shen-Orr S, Itzkovitz S, Kashtan N, Chklovskii D, Alon U. Network Motifs:
289 Simple building blocks of complex networks. *Science* (1979). 2002 Oct
290 25;298(5594):824–7.
- 291 4. Sporns O, Kötter R. Motifs in brain networks. *PLoS Biol*. 2004 Oct 26;2(11):e369.
- 292 5. McDonnell MD, Yaveroğlu ÖN, Schmerl BA, Iannella N, Ward LM. Motif-Role-
293 Fingerprints: The building-blocks of motifs, clustering-coefficients and transitivities in
294 directed networks. *PLoS One*. 2014 Dec 8;9(12):e114503.
- 295 6. Alon U. Network motifs: theory and experimental approaches. *Nat Rev Genet*. 2007
296 Jun;8(6):450–61.
- 297 7. Mason MJ, Valente TW, Coatsworth JD, Mennis J, Lawrence F, Zelenak P.
298 Place-based social network quality and correlates of substance use among urban
299 adolescents. *J Adolesc*. 2010 Jun 8;33(3):419–27.
- 300 8. Park B yong, Hong SJ, Valk SL, Paquola C, Benkarim O, Bethlehem RAI, et al.
301 Differences in subcortico-cortical interactions identified from connectome and
302 microcircuit models in autism. *Nat Commun*. 2021 Apr 13;12(1):2225.
- 303 9. Varshney LR, Chen BL, Paniagua E, Hall DH, Chklovskii DB. Structural properties of
304 the *Caenorhabditis elegans* neuronal network. *PLoS Comput Biol*. 2011 Feb
305 3;7(2):e1001066.

- 306 10. White JG, Southgate E, Thomson JN, Brenner S. The structure of the nervous system
307 of the nematode *Caenorhabditis elegans*. Philosophical Transactions of the Royal
308 Society of London B, Biological Sciences 1986 Nov 12;314(1165):1–340.
- 309 11. Matejek B, Wei D, Chen T, Tsourakakis CE, Mitzenmacher M, Pfister H. Edge-
310 colored directed subgraph enumeration on the connectome. Sci Rep. 2022 Jul
311 5;12(1):11349.
- 312 12. Pereira L, Kratsios P, Serrano-Saiz E, Sheftel H, Mayo AE, Hall DH, et al. A cellular
313 and regulatory map of the cholinergic nervous system of *C. elegans*. Elife. 2015 Dec
314 25;4:e12432.
- 315 13. Qian J, Hintze A, Adami C. Colored motifs reveal computational building blocks in
316 the *C. elegans* brain. PLoS One. 2011 Mar 7;6(3):e17013.
- 317 14. Fenyves BG, Szilágyi GS, Vassy Z, Söti C, Csermely P. Synaptic polarity and sign-
318 balance prediction using gene expression data in the *Caenorhabditis elegans* chemical
319 synapse neuronal connectome network. PLoS Comput Biol. 2020 Dec
320 21;16(12):e1007974.
- 321 15. Reigl M, Alon U, Chklovskii DB. Search for computational modules in the *C. elegans*
322 brain. BMC Biol. 2004;2(1):25.
- 323 16. Cinquin O, Demongeot J. Positive and negative feedback: Striking a balance between
324 necessary antagonists. J Theor Biol. 2002;216(2):229–41.
- 325 17. Liu Z, Le Q, Lv Y, Chen X, Cui J, Zhou Y, et al. A distinct D1-MSN subpopulation
326 down-regulates dopamine to promote negative emotional state. Cell Res. 2022 Feb
327 1;32(2):139–56.
- 328 18. Schulz A, Miehl C, Berry MJ, Gjorgjieva J. The generation of cortical novelty
329 responses through inhibitory plasticity. Elife. 2021 Oct 1;10.

- 330 19. Elowitz MB, Leibler S. A synthetic oscillatory network of transcriptional regulators.
331 Nature. 2000 Jan;403(6767):335–8.
- 332 20. Keifer J, Houk JC. Modeling Signal Transduction in classical conditioning with
333 network motifs. Front Mol Neurosci. 2011;4.
- 334 21. Mangan S, Alon U. Structure and function of the feed-forward loop network motif.
335 Proceedings of the National Academy of Sciences. 2003 Oct 14;100(21):11980–5.
- 336 22. Goentoro L, Shoval O, Kirschner MW, Alon U. The incoherent feedforward loop can
337 provide fold-change detection in gene regulation. Mol Cell. 2009 Dec 11;36(5):894–9.
- 338 23. Birjandian Z, Narla C, Poulter MO. Gain control of γ frequency activation by a novel
339 feed forward disinhibitory loop: Implications for normal and epileptic neural activity.
340 Front Neural Circuits. 2013 Nov 19;7(NOV).
- 341 24. Shen-Orr SS, Milo R, Mangan S, Alon U. Network motifs in the transcriptional
342 regulation network of *Escherichia coli*. Nat Genet. 2002 May 22;31(1):64–8.
- 343 25. Krishna S. Structure and function of negative feedback loops at the interface of genetic
344 and metabolic networks. Nucleic Acids Res. 2006 Apr 28;34(8):2455–62.
- 345 26. Yan Q, Zhu K, Zhang L, Fu Q, Chen Z, Liu S, et al. A negative feedback loop between
346 JNK-associated leucine zipper protein and TGF- β 1 regulates kidney fibrosis. Commun
347 Biol. 2020 Dec 1;3(1).
- 348 27. Keller AJ, Dipoppa M, Roth MM, Caudill MS, Ingrosso A, Miller KD, et al. A
349 disinhibitory circuit for contextual modulation in primary visual cortex. Neuron. 2020
350 Dec;108(6):1181-1193.e8.
- 351 28. Gardner TS, Cantor CR, Collins JJ. Construction of a genetic toggle switch in
352 *Escherichia coli*. Nature. 2000 Jan;403(6767):339–42.

- 353 29. Witvliet D, Mulcahy B, Mitchell JK, Meirovitch Y, Berger DR, Wu Y, et al.
354 Connectomes across development reveal principles of brain maturation. *Nature*. 2021
355 Aug 12;596(7871):257–61.
- 356 30. Emmons SW. Comprehensive analysis of the *C. elegans* connectome reveals novel
357 circuits and functions of previously unstudied neurons. *PLoS Biol* 22(12): e3002939.
- 358 31. Zhang G, Roberto NM, Lee D, Hahnel SR, Andersen EC. The impact of species-wide
359 gene expression variation on *Caenorhabditis elegans* complex traits. *Nat Commun*.
360 2022 Jun 16;13(1):3462.
- 361 32. Hardege I, Morud J, Courtney A, Schafer WR. A novel and functionally diverse class
362 of acetylcholine-gated ion channels. *Journal of Neuroscience*. 2023 Feb
363 15;43(7):1111–24.
- 364 33. Xia F, Wei H, Yu S, Zhang D, Xu B. A survey of measures for network motifs. *IEEE*
365 *Access*. 2019;7:106576–87.

366

367 **Competing interests**

368 The authors declare no competing interests.

369 **Author contribution**

370 G.S.S contributed to conception, design, developing the algorithm, analysis and wrote the
371 manuscript; A.G. contributed to conception and analysis, Z.V. contributed to the
372 interpretation of data; P.C. contributed to conception, interpretation of data, and to the
373 manuscript. B.G.F. contributed to conception, data analysis, and to the manuscript.

374

375 **Description of supplementary data**

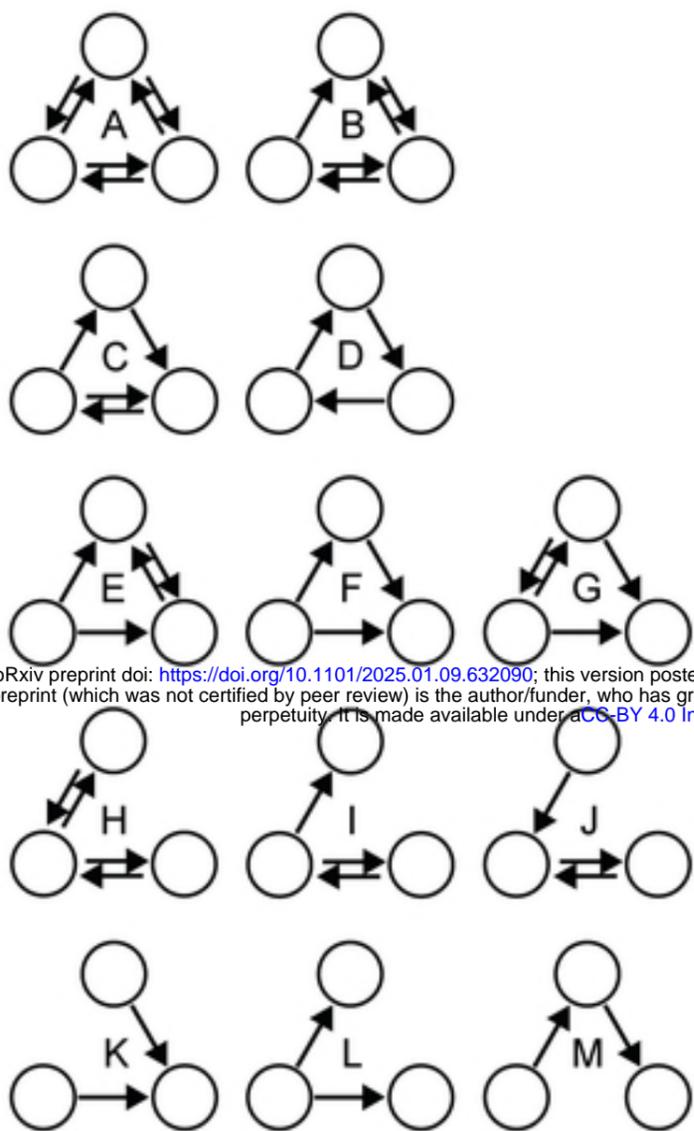
376 **Supplementary Data S1: Polarity of edges in the connectome and random networks**

377 **Supplementary Data S2: Motif codes and dictionary**

378 **Supplementary Data S3: Motifs in the connectome**

379 **Supplementary Data S4: Induced motif counts and Z-scores in the connectome and in**
380 **the null model**

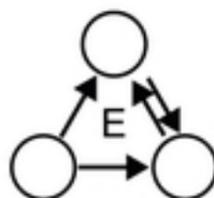
381 **Supplementary Data S5: Partial motif counts and Z-scores in the connectome and in the**
382 **null model**

A

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B

Induced motif



Partial motifs

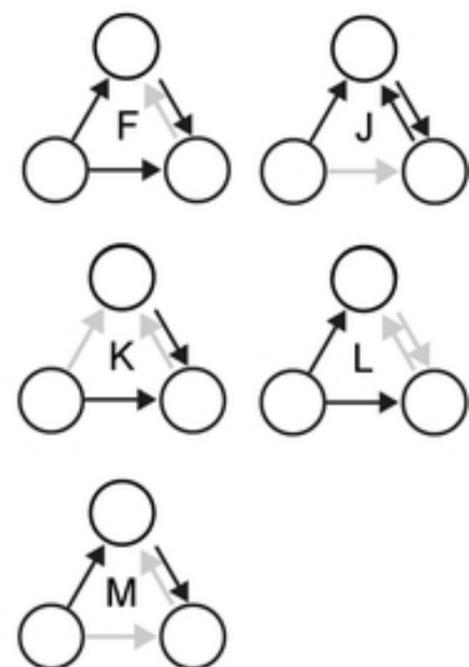
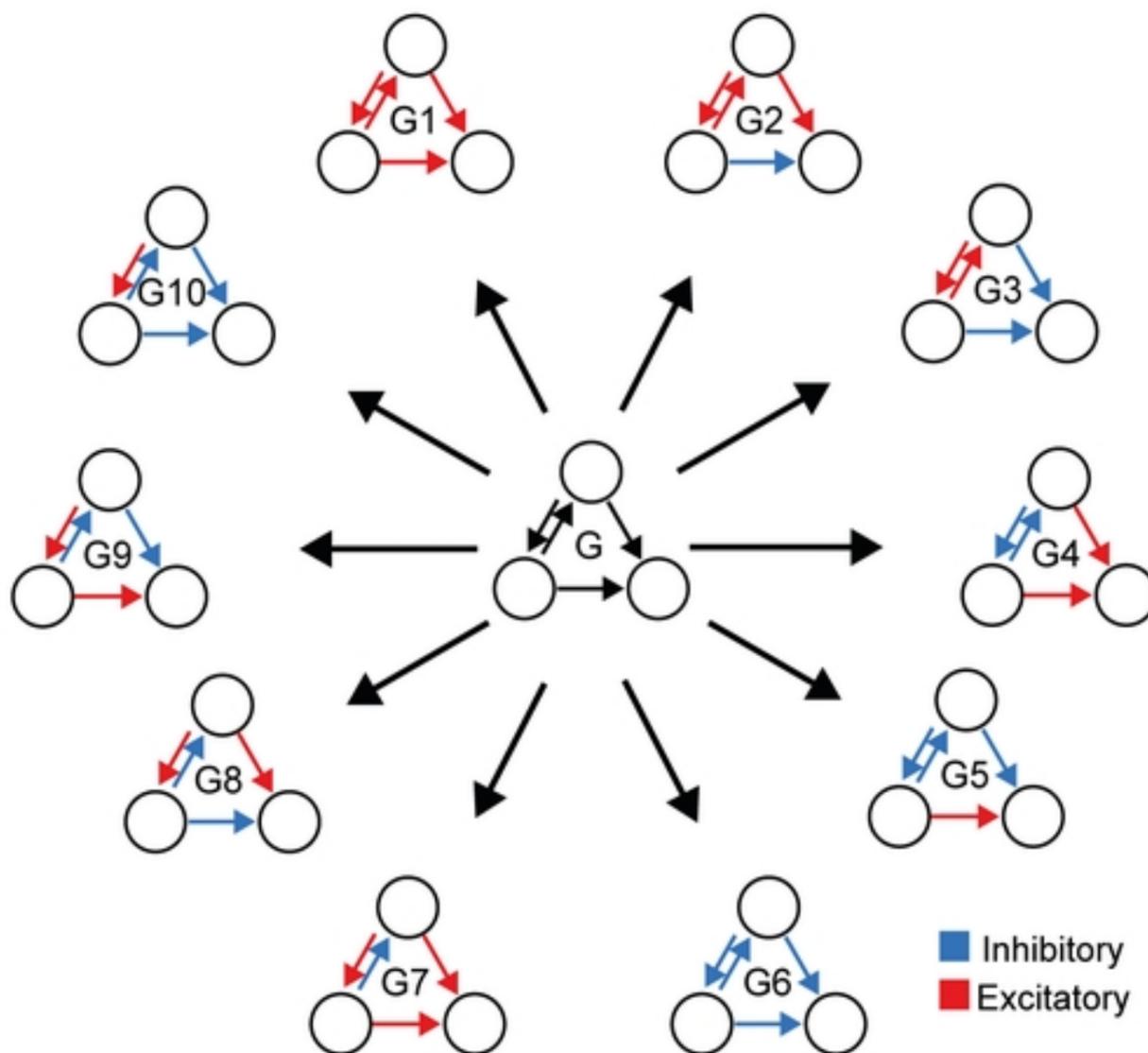
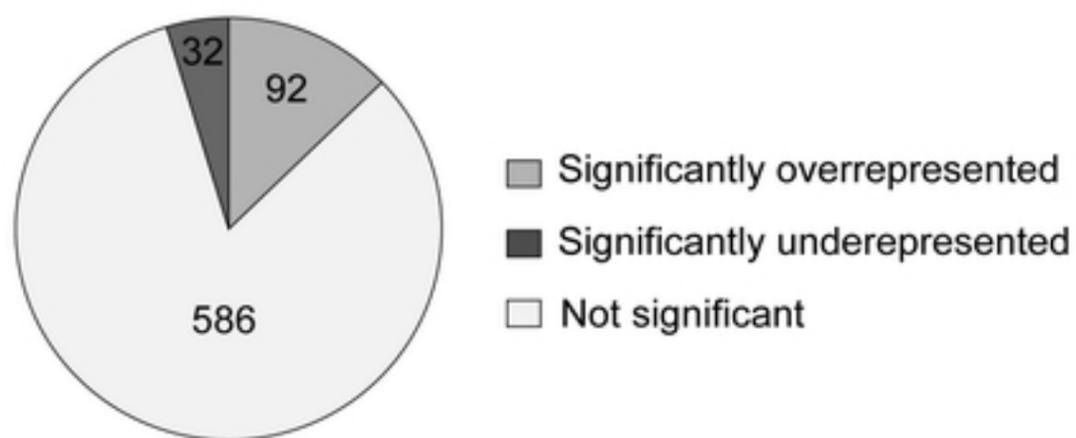
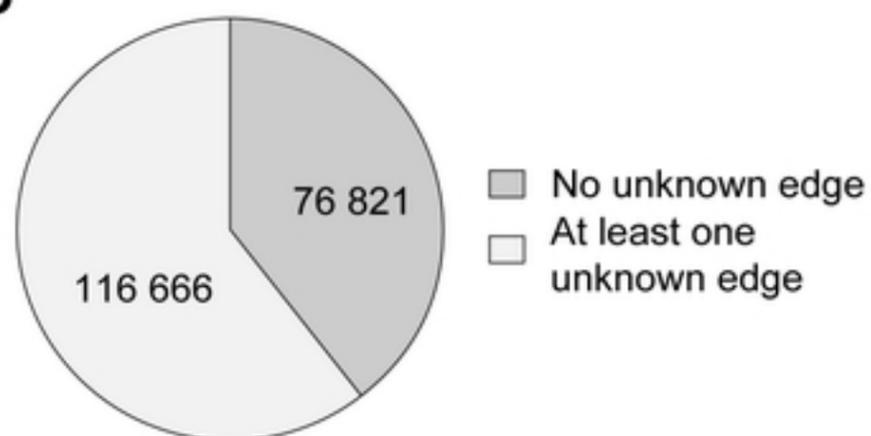
**C**

Figure 1

A



B



C

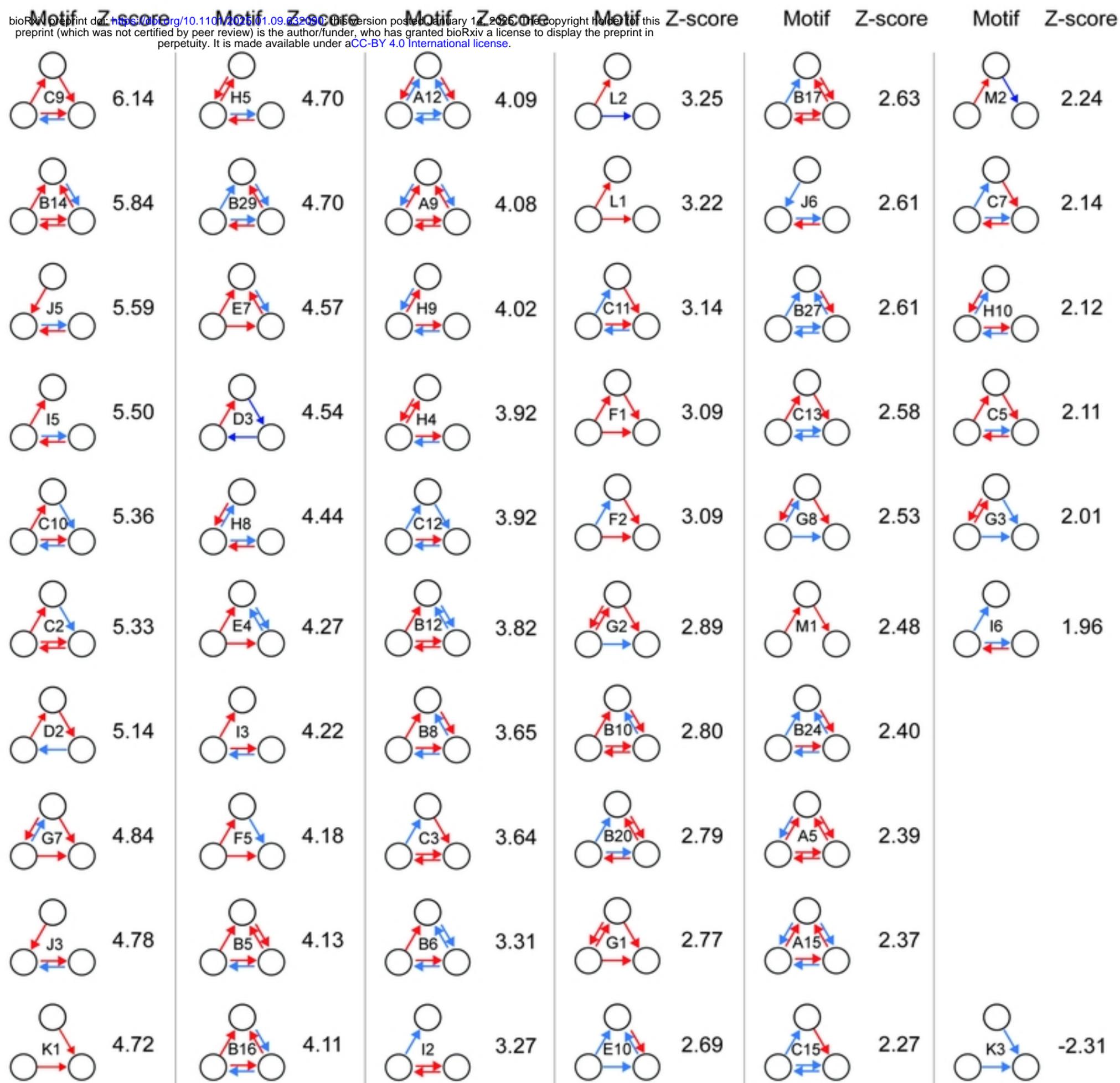
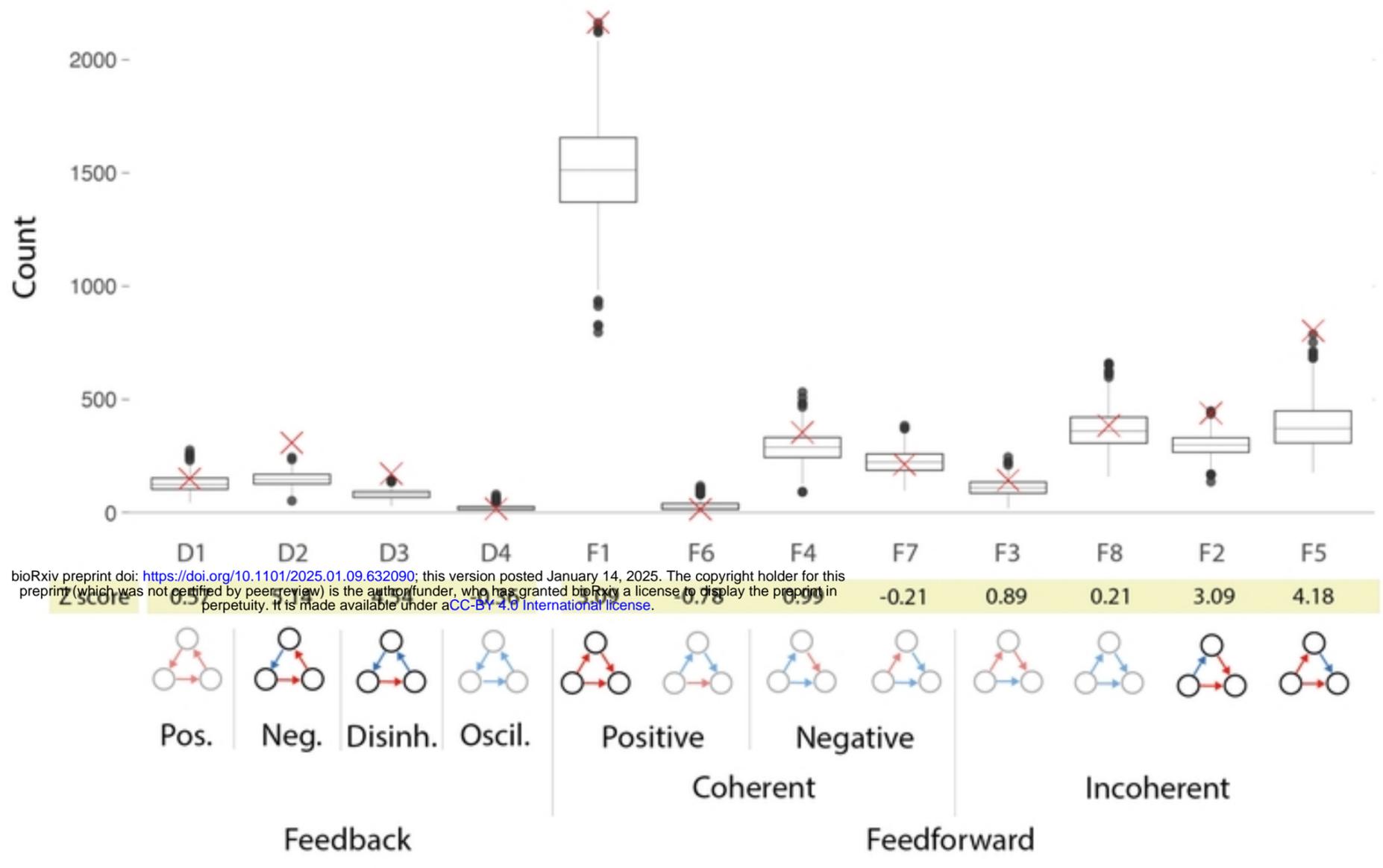
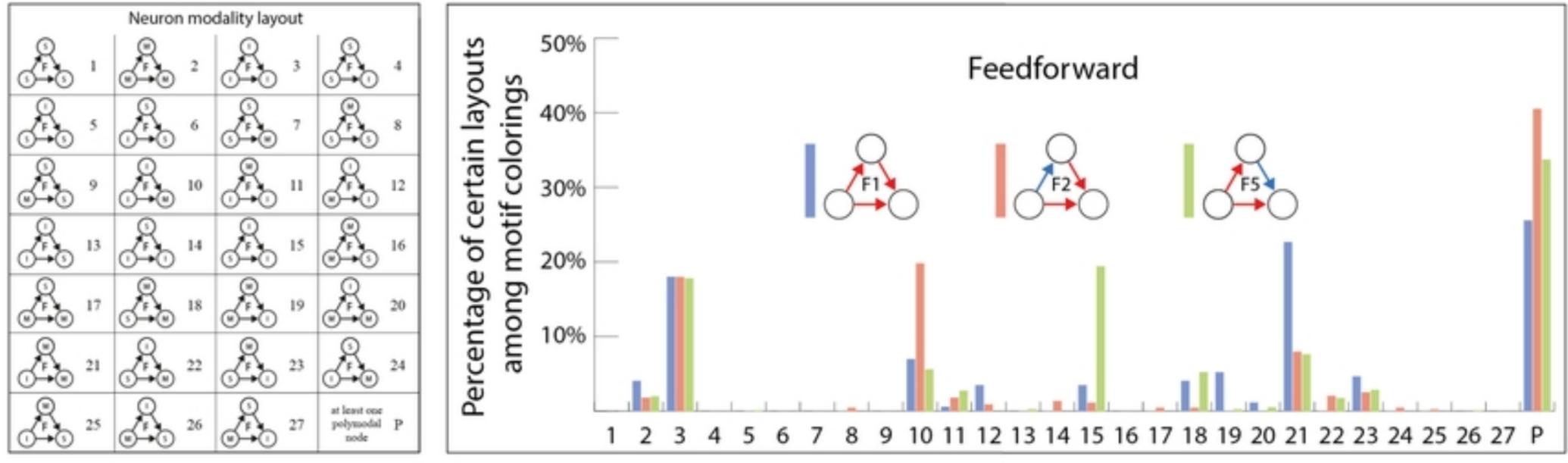


Figure 2

A



B



C

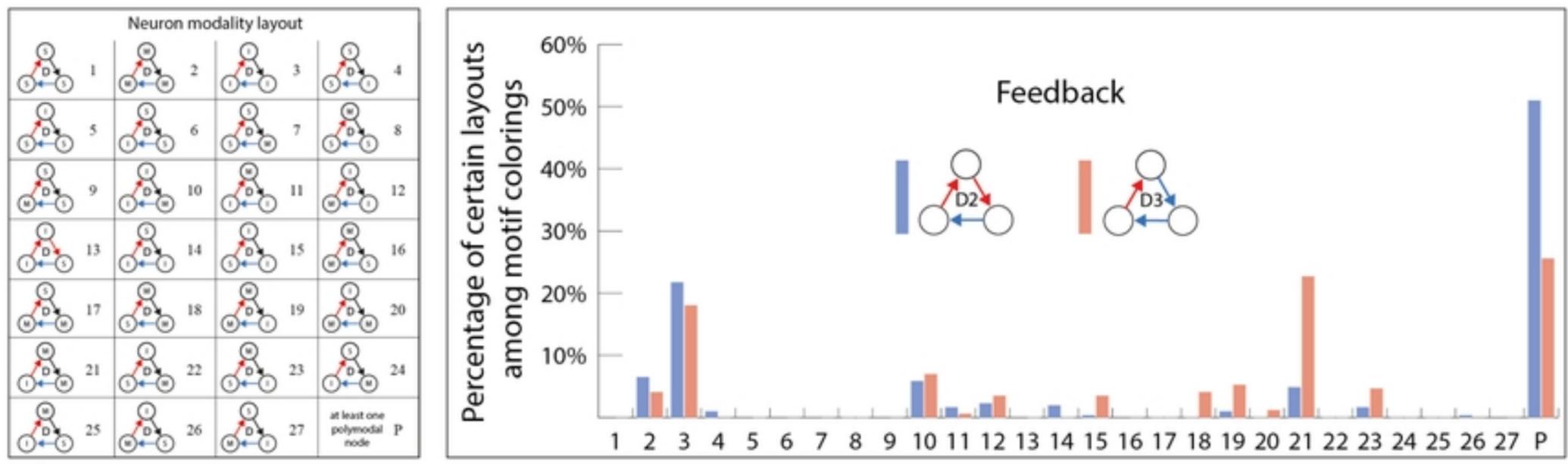


Figure 3

Connection count

1600

1200

800

Connection type

- Positive
- Negative
- Unknown

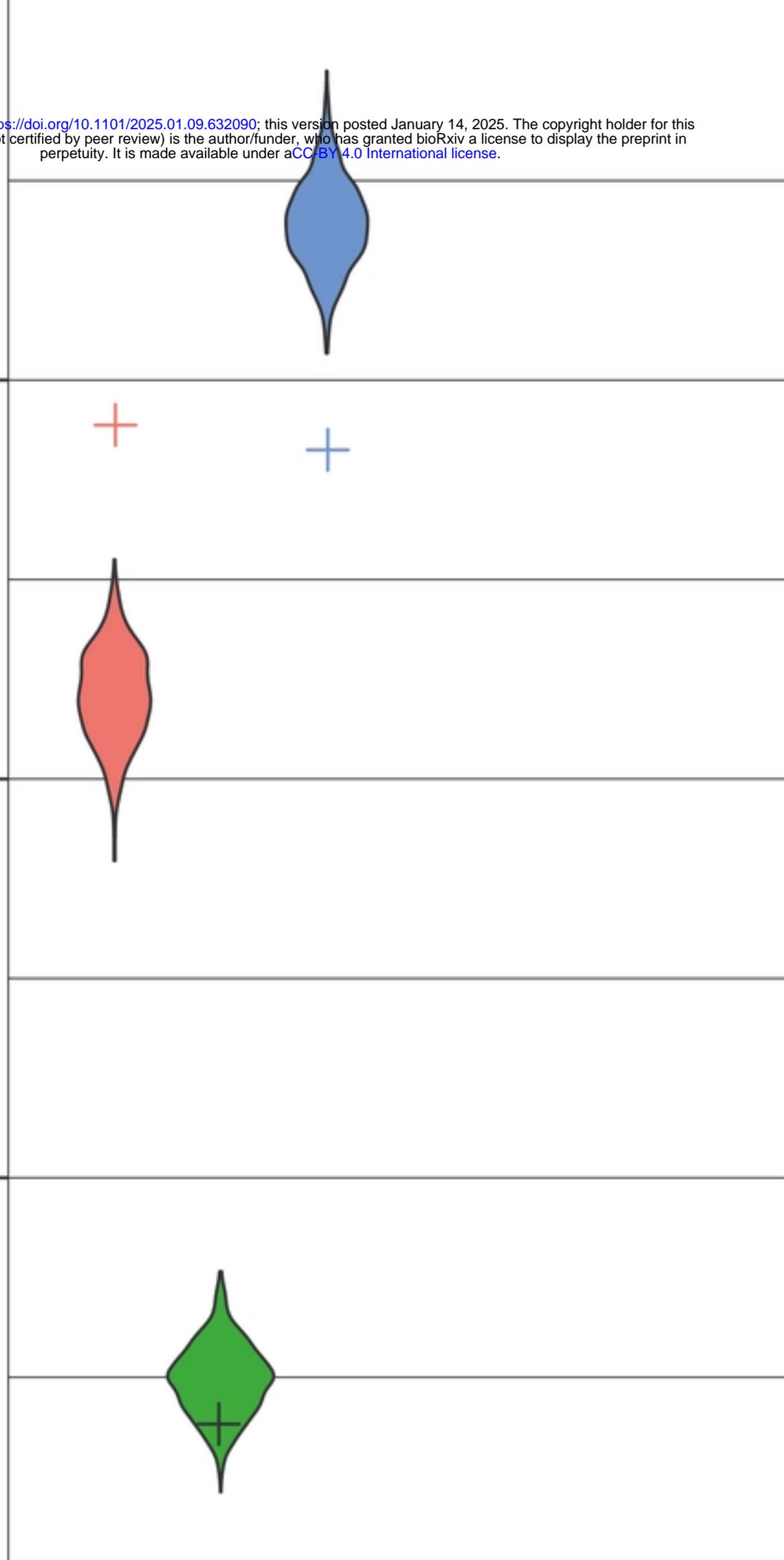
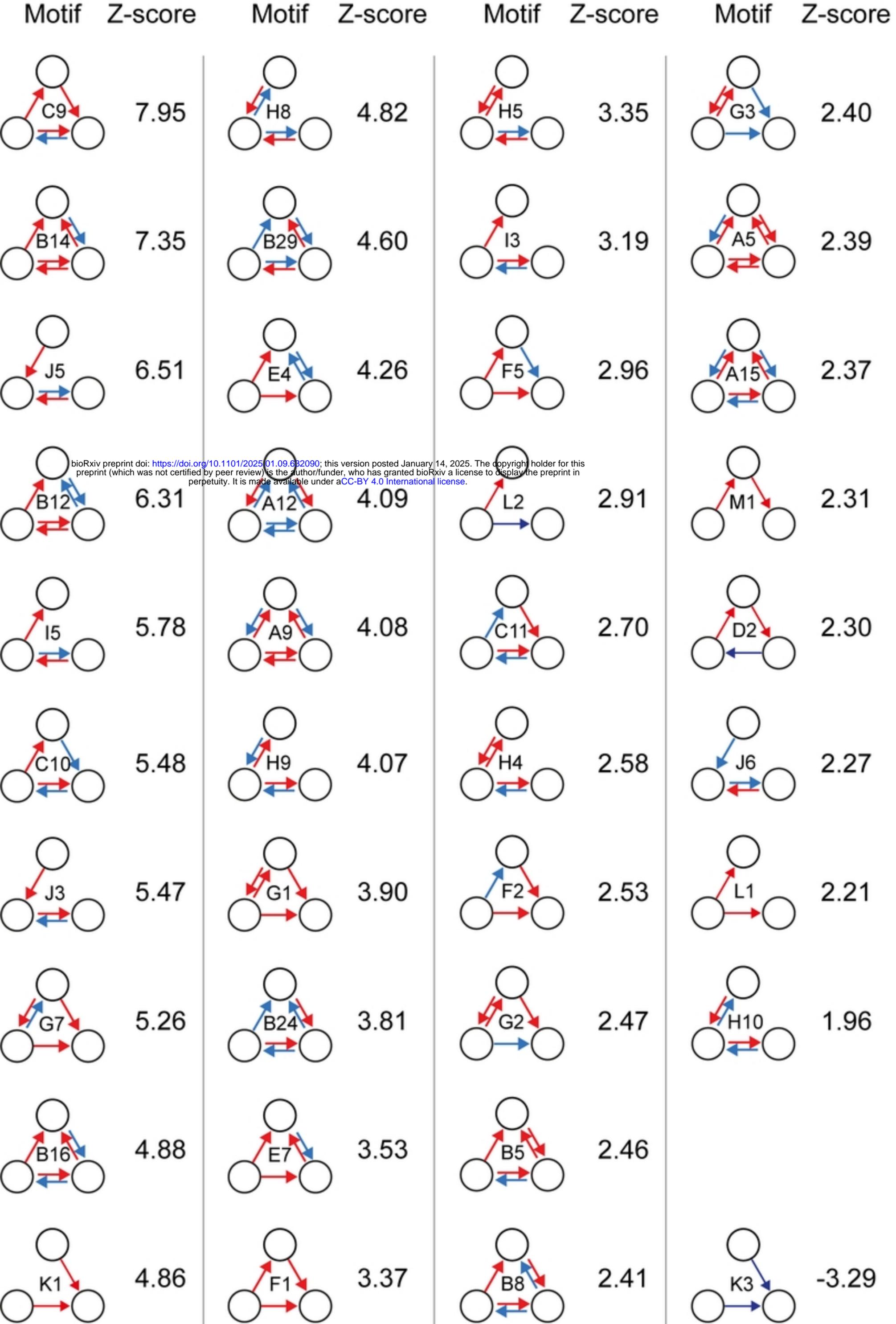


Figure S1



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Figure S2