# 1 Drosophila models of pathogenic copy-number variant genes show global and

# 2 non-neuronal defects during development

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### 24 ABSTRACT

While rare pathogenic CNVs are associated with both neuronal and non-neuronal phenotypes, 25 functional studies evaluating these regions have focused on the molecular basis of neuronal 26 27 defects. We report a systematic functional analysis of non-neuronal phenotypes for 59 homologs of genes within ten CNVs and 20 neurodevelopmental genes in Drosophila. Using wing-specific 28 knockdown of 136 RNA interference lines, we identify phenotypes in 72/79 homologs including 29 six lines with lethality and 21 lines with severe phenotypes. We find no correlation between 30 severity of these phenotypes and neuronal defects due to eye-specific knockdown. We observe 31 disruptions in cell proliferation and apoptosis for 23/27 homologs, and altered Wnt, Hedgehog 32 and Notch signaling for 9/14 homologs, including AATF/Aatf, PPP4C/Pp4-19C, and 33 *KIF11/Klp61F*, validated with differences in human tissue-specific expression and network 34 35 connectivity. Our findings suggest that multiple genes within each CNV differentially affect both global and tissue-specific developmental processes, contributing to non-neuronal phenotypes of 36 CNV disorders. 37 38

#### 40 INTRODUCTION

Rare copy-number variants (CNVs), or deletions and duplications in the genome, are associated 41 with neurodevelopmental disorders such as autism, intellectual disability (ID), and 42 schizophrenia<sup>1,2</sup>. While dosage alteration of CNV regions contribute predominantly to defects in 43 nervous system development, several CNV disorders also lead to early developmental features 44 involving other organ systems<sup>3,4</sup>, including cardiac defects<sup>5,6</sup>, kidney malformations<sup>7</sup>, 45 craniofacial features<sup>3</sup>, and skeletal abnormalities<sup>8</sup>. In fact, an overall survey of ten rare disease-46 associated CNVs among individuals within the DECIPHER database<sup>9</sup> showed a wide range of 47 non-neuronal phenotypes across multiple organ systems for each CNV disorder (Fig. 1). For 48 example, the 1q21.1 deletion causes variable expression of multiple neuronal and non-neuronal 49 phenotypes, including developmental delay, autism, and schizophrenia as well as craniofacial 50 features, cataracts, cardiac defects, and skeletal abnormalities<sup>10–12</sup>. Additionally, while the 51 7q11.23 deletion associated with Williams-Beuren syndrome (WBS) causes neuropsychiatric and 52 behavioral features, other non-neuronal phenotypes, including supravalvular aortic stenosis, 53 auditory defects, hypertension, diabetes mellitus, and musculoskeletal and connective tissue 54 anomalies, are also observed among the deletion carriers<sup>13</sup>. In fact, individual genes within the 55 WBS region are associated with specific features of the deletion, such as ELN and supravalvular 56 aortic stenosis<sup>14</sup>, STX1A and impaired glucose tolerance<sup>15</sup>, LIMK1 and impaired visuospatial 57 abilities<sup>16</sup>, and *GTF2IRD1* and craniofacial abnormalities<sup>17</sup>. Furthermore, *TBX1* was identified to 58 59 cause the pharyngeal arch cardiac defects associated with the 22q11.2 deletion (DiGeorge syndrome)<sup>18</sup>, while *HNF1B* within the 17q12 deletion region was identified as the causative gene 60 for kidney defects associated with the deletion<sup>19,20</sup>. However, candidate genes for a majority of 61 62 non-neuronal phenotypes have not been identified for several rare CNV disorders, in particular

63 for CNVs associated with variably-expressive phenotypes such as the 1g21.1 deletion and the 16p11.2 deletion<sup>21,22</sup>. Additionally, affected individuals who carry disruptive mutations in 64 neurodevelopmental genes from recent sequencing studies have also been documented to 65 66 manifest non-neuronal phenotypes. For example, individuals with loss-of-function mutations in the autism-associated gene CHD8 present with gastrointestinal problems, tall stature, and 67 craniofacial features in addition to neuropsychiatric features<sup>23</sup>, while mutations in the 68 microcephaly-associated gene KIF11 also lead to congenital lymphedema and retinopathy<sup>24</sup>. 69 Despite the importance of identifying genes within CNVs that contribute towards non-70 neuronal phenotypes, functional studies of CNV genes have primarily focused on detailed 71 assessments of neuronal phenotypes in model systems. For example, mouse models generated for 72 the 16p11.2 deletion exhibited post-natal lethality, reduced brain size and neural progenitor cell 73 count, motor and habituation defects, synaptic defects, and behavioral defects<sup>25–27</sup>. Similarly, 74 mouse models for the 3q29 deletion showed decreased weight and brain size, increased 75 locomotor activity and startle response, and decreased spatial learning and memory<sup>28,29</sup>. 76 However, fewer studies have focused on detailed evaluation of non-neuronal phenotypes in 77 functional models of CNV disorders. For example, Arbogast and colleagues evaluated obesity 78 and metabolic changes in 16p11.2 deletion mice, which showed reduced weight and impaired 79 adipogenesis<sup>30</sup>. While Haller and colleagues showed that mice with knockdown of MAZ, a gene 80 within the 16p11.2 deletion region, contribute to the genitourinary defects observed in 81 individuals with the deletion<sup>31</sup>, mouse studies on other homologs of 16p11.2 genes, including 82 *TAOK2*, *KCTD13*, and *MAPK3*, have only focused on assessing neuronal defects  $^{32-36}$ . 83 Furthermore, Dickinson and colleagues reported a high-throughput analysis of essential genes in 84 85 mice and identified both neuronal and non-neuronal phenotypes for individual gene knockouts,

including more than 400 genes that lead to lethality<sup>37</sup>. While these efforts aided in implicating
novel genes with human disease, our understanding of how genes associated with
neurodevelopmental disorders contribute towards non-neuronal phenotypes is still limited.
Therefore, a large-scale analysis of non-neuronal phenotypes is necessary to identify specific
candidate genes within CNV regions and associated biological mechanisms that contribute
towards these phenotypes.

Drosophila melanogaster is an excellent model system to evaluate homologs of 92 neurodevelopmental genes, as many developmental processes and signaling pathways are 93 conserved between humans and flies<sup>38</sup>. In fact, over 75% of human disease genes have homologs 94 in *Drosophila*, including many genes involved in cellular signaling processes<sup>39,40</sup>. We recently 95 examined the contributions of individual Drosophila homologs of 28 genes within the 16p11.2 96 and 3q29 deletion regions towards specific neurodevelopmental phenotypes, including rough eye 97 phenotypes and defects in climbing ability, axon targeting, neuromuscular junction, and dendritic 98 arborization<sup>41,42</sup>. While these findings implicated multiple genes within each CNV region 99 100 towards neuronal phenotypes, the conserved role of these genes towards non-neuronal 101 phenotypes is not well understood. The Drosophila wing is an effective model system to evaluate such developmental phenotypes, as key components of conserved signaling pathways, 102 such as Notch, epidermal growth factor receptor (EGFR), Hegdehog, and Wnt pathways, were 103 identified using fly wing models<sup>43–49</sup>. For example, Wu and colleagues showed that 104 105 overexpression of the *Drosophila* homolog for *UBE3A*, associated with Angelman syndrome, leads to abnormal wing and eye morphology defects<sup>50</sup>. Furthermore, *Drosophila* mutant screens 106 for developmental phenotypes, including wing defects, were used to identify conserved genes for 107 108 several human genetic diseases, including Charcot-Marie-Tooth disease and syndromic

microcephaly<sup>51</sup>. Kochinke and colleagues also recently performed a large-scale screening of IDassociated genes, and found an enrichment of wing trichome density and missing vein
phenotypes in ID genes compared to control gene sets<sup>52</sup>. Hence, the fly wing provides a model
system that is ideal for evaluating the contributions of individual homologs of CNV genes
towards cellular and developmental phenotypes.

In this study, we tested the non-neuronal phenotypes of 79 fly homologs of human genes 114 within ten pathogenic CNV regions and genes associated with neurodevelopmental disorders. 115 We observed a wide range of robust qualitative and quantitative adult wing phenotypes among 116 117 the 136 RNA interference (RNAi) lines tested in our study, including size defects, ectopic and missing veins, severe wrinkling, and lethality. Further analysis of cellular phenotypes revealed 118 disruptions in conserved developmental processes in the larval imaginal wing disc, including 119 120 altered levels of cell proliferation and apoptosis as well as altered expression patterns in the Wnt, Hedgehog, and Notch signaling pathways. However, we found no correlation in the severity of 121 phenotypes observed with wing and eye-specific knockdown. Our findings were further 122 supported by differences in expression patterns and network connectivity of human CNV genes 123 across different tissues. Our analysis emphasizes the importance of multiple genes within each 124 CNV region towards both global and tissue-specific developmental processes, potentially 125 accounting for the non-neuronal phenotypes associated with pathogenic CNVs. 126

#### 128 **RESULTS**

### Wing-specific knockdown of fly homologs of CNV genes show non-neuronal phenotypes 129 Using an RNAi based analysis driven by the $bx^{MS1096}$ -GAL4 wing-specific driver, we tested a 130 131 total of 136 RNAi lines for 59 homologs of genes within pathogenic CNV regions (chromosomal locations 1q21.1, 3q29, 7q11.23, 15q11.2, 15q13.3, 16p11.2, distal 16p11.2, 16p12.1, 16p13.11, 132 and 17q12) and 20 homologs of genes associated with neurodevelopmental disorders (Supp. 133 Data 1). Fly homologs of these genes were identified using the DIOPT orthology prediction 134 $tool^{53}$ . We list both the human gene name and the fly gene name for each tested gene as HUMAN 135 136 GENE/Fly gene (i.e. KCTD13/CG10465) as well as the human CNV region for context at first instance. We scored 20-25 adult wings for five distinct wing phenotypes in each non-lethal 137 RNAi line, including wrinkled wing, discoloration, ectopic veins, missing veins, and bristle 138 139 planar polarity phenotypes (Fig. 2A; Supp. Data 2). We first categorized each wing phenotype based on their severity and performed k-means clustering analysis to categorize each RNAi line 140 by their overall phenotype severity (Fig. 2B-C). We observed four clusters of RNAi lines: 75 141 lines with no observable qualitative phenotypes (55.2%), 24 lines with mild phenotypes (17.7%), 142 10 lines with moderate phenotypes (7.4%), 21 lines with severe phenotypes (15.4%), and 6 lines 143 with lethal phenotypes (4.4%), including ACACA/ACC within 17q12, DLG1/dlg1 within 3q29, 144 and STX1A/Syx1A within 7q11.23 (Fig. 2B-D; Supp. Data 2). We observed severe wrinkled 145 wing phenotypes for 13/79 fly homologs, including PPP4C/Pp4-19C within 16p11.2, 146 147 ATXN2L/Atx2 within distal 16p11.2, AATF/Aatf within 17q12, and MFI2/Tsf2 within 3q29 (Fig. 3A-B, Supp. Data 3). Interestingly, seven out of ten CNV regions contained at least one 148 homolog that showed lethality or severe wing phenotypes, and five CNV regions (3q29, 16p11.2, 149 150 distal 16p11.2, 16p12.1, and 17q12) had multiple homologs showing lethality or severe wing

phenotypes (Fig. 3A, Supp. Data 3). For example, RNAi lines for both UQCRC2/UQCR-C2 and

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POLR3E/Sin within 16p12.1 showed lethality. Within the 3q29 region, NCBP2/Cbp20 and 152 MFI2/Tsf2 showed severe phenotypes while DLG1/dlg1 showed lethality. In contrast, 12/20 153 154 known neurodevelopmental genes showed no observable wing phenotypes, suggesting that these genes could be responsible for neuronal-specific phenotypes (Fig. 3B, Supp. Data 3). We note 155 that 18/79 fly homologs showed discordant phenotypes between two or more RNAi lines for the 156 same gene, which could be due to differences in expression of the RNAi construct among these 157 lines (Supp. Data 3). 158 Certain qualitative phenotypes exhibited higher frequency in males compared to females. 159 For example, discoloration (87 lines in males compared to 56 lines in females;  $p=1.315\times10^{-4}$ , 160 two-tailed Fisher's exact test) and missing vein phenotypes (92 lines in males compared to 29 161 lines in females;  $p=2.848 \times 10^{-16}$ , two-tailed Fisher's exact test) at any degree of severity were 162 more commonly observed in males than females (Supp. Data 2). In particular, 25/92 lines in 163 males (compared to 1/29 in females) showed a total loss of the anterior crossvein (ACV) (Supp. 164 Data 2). We further identified 17 RNAi lines that were lethal in males with wing-specific 165 knockdown of fly homologs. While higher frequencies of wing phenotypes in males could be 166 due to a sex-specific bias of developmental phenotypes, the increased severity we observed in 167 males is most likely due to a stronger RNAi knockdown caused by an X-linked dosage 168 compensation, as the  $bx^{MS1096}$ -GAL4 driver is inserted on the fly X chromosome<sup>54,55</sup>. 169 170 Next, we measured the total adult wing area and the lengths of six veins (longitudinal L2, L3, L4, L5, ACV, and posterior crossvein or PCV) in the adult wing for each of the tested RNAi 171 lines that did not show lethality (or severe wrinkled phenotypes for vein length measurements) 172 173 (Fig. 4A). Overall, we identified significant wing measurement changes for 89 RNAi lines

174	compared to controls, which included lines that did not have an observable qualitative wing
175	phenotype (Fig. 2D). A summary of L3 vein lengths is presented in Fig. 4B, and the
176	measurements for the remaining five veins are presented in Supp. Figure 1 and Supp. Data. 2.
177	We found that 33/61 of the homologs (54%) showed significant changes in L3 vein length,
178	including 20 homologs with longer vein lengths and 13 homologs with shorter vein lengths
179	(Supp. Data 3). Additionally, 41/74 of the fly homologs (55%) showed changes in wing area
180	(Supp. Data 3), including 36 homologs which showed smaller wing areas and five homologs
181	showed larger wing areas compared to controls (Supp. Data 3). For example, both homologs of
182	genes within 1q21.1 region, BCL9/lgs and FMO5/Fmo-2, showed decreased wing area and vein
183	length, potentially mirroring the reduced body length phenotype observed in mouse models of
184	the deletion <sup>56</sup> (Fig. 4B-C). In addition, <i>PAK2/Pak</i> within 3q29, <i>TBX1/org-1</i> within 22q11.2,
185	autism-associated CHD8/kis, and microcephaly-associated ASPM/asp also showed smaller wing
186	areas and vein lengths (Fig. 4B-C). In contrast, TRPM1/Trpm within 15q13.3 and the cell
187	proliferation gene <i>PTEN/Pten</i> <sup>57</sup> both showed larger wing areas and vein lengths (Fig. 4B-C).
188	Furthermore, we identified eight homologs that showed no qualitative wing phenotypes but had
189	significant changes in wing areas and vein lengths (Supp. Data 3), including CCDC101/Sgf29 in
190	distal 16p11.2, FMO5/Fmo-2, TRPM1/Trpm, DHRS11/CG9150 in 17q12, and NSUN5/Nsun5 in
191	7q11.23 (Fig. 4B-C; Supp. Data 3). These results indicate that homologs of certain CNV genes
192	may influence variations in size without causing adverse wing phenotypes, and may be
193	specifically implicated towards cellular growth mechanisms.

#### 197 Homologs of CNV genes show global and tissue-specific effects during development

We previously showed that many of the same fly homologs of CNV genes that showed wing 198 defects in the current study also contributed towards neuronal phenotypes in the fly  $eye^{41,42}$ , 199 200 suggesting a role for these genes in global development. We therefore performed ubiquitous and eye-specific knockdown of fly homologs to assess tissue-specific effects in comparison to the 201 wing phenotypes. First, we used the *da-GAL4* driver at 25°C to drive ubiquitous knockdown of 202 RNAi lines for 31 homologs of CNV genes, including 19 that were previously published<sup>41,42</sup>, and 203 observed complete or partial lethality at larval and pupal stages with knockdown of 10/31 204 205 homologs (32.3%) (Fig. 5A). Lethal phenotypes have also been documented for 43/130 knockout mouse models of individual CNV genes as well as for the entire deletion (Supp. Data 206 4). For example, mouse models heterozygous for the 16p11.2 deletion showed partial neonatal 207 208 lethality, while knockout mouse models of four individual genes within the 16p11.2 region, including *Ppp4C<sup>-/-</sup>* and *Kif22<sup>-/-</sup>*, showed embryonic lethality<sup>25,58,59</sup>. In our study, the *DLG1/dlg1* 209 210 line that showed lethality with wing-specific knockdown also exhibited larval lethality with 211 ubiquitous knockdown, indicating its role in global development (Fig. 5A). In addition, six homologs that showed severe wing phenotypes also showed larval or pupal lethality with 212 ubiquitous knockdown, including ALDOA/Ald and PPP4C/Pp4-19C within 16p11.2 and 213 ATXN2L/Atx2 and TUFM/mEFTu1 within distal 16p11.2 (Fig. 5A). The remaining homologs 214 that showed lethality with ubiquitous knockdown showed at least a mild qualitative or 215 216 quantitative wing phenotype.

We next compared the phenotypes observed with wing-specific knockdown of fly homologs to their corresponding eye-specific knockdowns to evaluate neuronal versus nonneuronal effects. To quantitatively assess the phenotypic severity of cellular defects with eye-

specific knockdown of fly homologs, we developed a tool called *Flynotyper*<sup>60</sup> that determines the 220 degree of disorganization among the ommatidia in the adult eye. We analyzed phenotypic scores 221 obtained from *Flynotyper* for 66 RNAi lines of 45 fly homologs, including from previously-222 published datasets<sup>41,42,60</sup>. We found that 37/45 homologs (82.2%) exhibited both eye and wing-223 specific defects (Fig. 5B, Supp. Fig. 2, Supp. Data 5). Two homologs with significant eve 224 phenotypes did not show any wing phenotypes, including SPNS1/spin within distal 16p11.2 and 225 microcephaly-associated SLC25A19/Tpc1<sup>61</sup>, while five homologs only showed wing-specific 226 phenotypes, including CDIPT/Pis and YPEL3/CG15309 within 16p11.2, FBXO45/Fsn and 227 OSTalpha/CG6836 within 3q29, and UOCRC2/UOCR-C2 (Fig. 5B, Supp. Fig. 2). In particular, 228 UQCRC2/UQCR-C2 showed lethality with wing-specific knockdown, suggesting potential 229 tissue-specific effects of this gene in non-neuronal cells (Fig. 5B). While most homologs 230 231 contributed towards both eye and wing-specific phenotypes, we observed a wide range of severity in eye phenotypes that did not correlate with the severity of quantitative or qualitative 232 wing phenotypes (Fig. 5C). For example, TUFM/mEFTul showed a severe wing phenotype but 233 234 only a mild increase in eye phenotypic score, while SH2B1/Lnk, also within the distal 16p11.2 region, showed severe rough eye phenotypes but only a mild increase in wing size (Fig. 5D). 235 Similarly, BCL9/lgs also showed opposing tissue-specific effects with mild qualitative wing 236 phenotype and severe eye phenotype, suggesting that the role of these homologs towards 237 development differs across tissue types. 238

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#### 240 CNV genes show variable expression across different tissues in flies and humans

241 To assess how expression levels of CNV genes vary across different tissues, we first examined

the expression patterns of fly homologs in larval and adult tissues using the FlyAtlas Anatomical

243	Microarray dataset <sup>62</sup> . We found that 76/77 homologs with available data were expressed in at
244	least one larval and adult tissue (Supp. Fig. 3, Supp. Data 6). In general, we did not observe a
245	correlation between wing phenotype severity and expression patterns of homologs in larval or
246	adult tissues (Fig. 6A). For example, 58/77 homologs (75.3%) showed ubiquitous larval
247	expression, including both fly homologs that showed no qualitative wing phenotypes, such as
248	KCTD13/CG10465 within 16p11.2 and FBXO45/Fsn, and those with severe wing phenotypes,
249	such as PPP4C/Pp4-19C and NCBP2/Cbp20 (Fig. 6A, Supp. Fig. 3). Furthermore, 30/39
250	homologs (76.9%) that showed eye phenotypes also had ubiquitous larval expression, providing
251	further support to the observation that genes causing neuronal phenotypes may also contribute to
252	developmental phenotypes in other tissues (Supp. Data 5). Of note, 9/77 homologs (11.7%) did
253	not have any expression in the larval central nervous system, including FMO5/Fmo-2,
254	BDH1/CG8888 within 3q29, and TBX6/Doc2 within 16p11.2 (Fig. 6A, Supp. Fig. 3). However,
255	we observed wing phenotypes for 8/9 of these homologs, suggesting that they may contribute to
256	tissue-specific phenotypes outside of the nervous system. Except for the epilepsy-associated
257	SCN1A/para <sup>63</sup> , which was exclusively expressed in both the larval central nervous system (CNS)
258	and adult brain tissues, other tested neurodevelopmental genes were also expressed in non-
259	neuronal tissues (Fig. 6A).
260	We further used the GTEx Consortium dataset <sup>64</sup> to examine tissue-specific expression of

261 150 human CNV and known neurodevelopmental genes across six tissues including brain, heart,

kidney, lung, liver, and muscle. We found 121 genes that were expressed in at least one adult

tissue, including 49 genes (32.7%) that showed ubiquitous expression across all six tissues

(Supp. Data 6). Of the 112 genes expressed in non-neuronal tissues, 34 did not have any

neuronal expression, including *TBX1*, *FMO5* and *GJA5* within 1q21.1, and *ATP2A1* within distal

16p11.2 (Fig. 6B, Supp. Data 6). *FMO5* and *TBX1* also showed non-neuronal expression in *Drosophila* tissues, suggesting that their tissue-specific expression is highly conserved (Fig. 6A).
Other genes showing ubiquitous expression also had preferentially high expression for specific
non-neuronal tissues, including *ALDOA* and *UQCRC2* for muscle and heart for (Fig. 6B). In
contrast, we found nine genes that were expressed only in the adult brain, including *FAM57B*and *DOC2A* within 16p11.2, as well as *SCN1A*, which showed similar CNS-only expression in

- 272 *Drosophila* tissues (Fig. 6B, Supp. Data 6).
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#### 274 Knockdown of fly homologs of CNV genes lead to disruption of basic cellular processes

The disruption of basic cellular processes in neuronal cells, such as cell proliferation and
apoptosis, have been implicated in neurodevelopmental disorders<sup>65–67</sup>. We previously identified
defects in cell proliferation among photoreceptors neurons in larval eve discs with knockdown of

16p11.2 homologs, as well as increased apoptosis with knockdown of a subset of 3q29

homologs<sup>41,42</sup>. Here, we explored how these basic cellular processes are altered in non-neuronal

cells, specifically in the developing wing disc. We targeted 27 fly homologs that showed a range

of adult wing phenotypes for changes in cell proliferation and apoptosis, using anti-phospho-

Histone H3 Ser10 (pH3) and anti-*Drosophila* caspase-1 (dcp1), respectively, in the third instar

larval wing discs. We identified 23/27 homologs that showed significant increases in apoptotic

cells compared to controls, including seven homologs, such as *PPP4C/Pp4-19C*, *ATXN2L/Atx2*,

and AATF/Aatf, which showed dcp1 staining across the entire larval wing pouch (Fig. 7A-B,

Supp. Figs. 4-5, Supp. Data 7). In addition, 16/27 genes showed decreased levels of

287 proliferation, including eight homologs which also showed apoptosis defects, such as

288 *CYFIP1/Sra-1* within 15q11.2, *SH2B1/Lnk*, and the microcephaly gene *KIF11/Klp61F* (Fig. 7A

289	and 7C, Supp. Figs. 4-5, Supp. Data 7). All six of the tested homologs with severe adult wing
290	phenotypes showed both increased apoptosis and decreased proliferation (Supp. Data 7).
291	Similarly, 3/4 homologs of genes showing lethality with wing-specific knockdown also showed
292	defects in apoptosis or proliferation, with the exception of ACACA/ACC (Supp. Figure 4, Supp.
293	<b>Data 7</b> ). As $bx^{MS1096}$ -GAL4 is located on the X-chromosome, we expected to see more severe
294	defects in males compared with females with knockdown of homologs due to the X-linked
295	dosage compensation <sup>54,55</sup> . However, knockdown of 3/11 tested homologs with sex-specific
296	differences in adult wing phenotypes, including BCL9/lgs, CYFIP1/Sra-1, and
297	DNAJC30/CG11035 within 7q11.23, showed significantly decreased levels of cell proliferation
298	in females but no change for males compared to their respective controls, suggesting a sex-
299	specific effect of these genes for cell proliferation (Supp. Fig. 5, Supp. Data 7). Overall, our
300	results suggest that cell proliferation and apoptosis play an important role towards development
301	in both neuronal and non-neuronal tissues.

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#### **303** Homologs of candidate CNV genes disrupt conserved signaling pathways

Several conserved signaling pathways that are active in a spatial and temporal manner in the 304 larval wing disc, such as Wnt, Hedgehog, BMP, and Notch signaling, regulate the anterior-305 306 posterior (A/P) and dorsal-ventral (D/V) boundaries to determine accurate morphology and vein patterning in the adult wing<sup>48,49,68–70</sup>. For example, Wnt and Notch signaling pathways both act 307 along the D/V boundary to determine cell fate<sup>71,72</sup>, while Hedgehog signaling is dependent upon 308 expression of both engrailed in the posterior compartment and patched along the A/P border<sup>73,74</sup>. 309 Furthermore, O'Roak and colleagues showed that genes identified from de novo mutations in 310 patients with autism are linked to β-catenin/Wnt pathway<sup>75</sup>. In addition, familial loss-of-function 311

mutations in the human hedgehog signaling pathway gene *PTCH1* are implicated in basal cell
 nevus syndrome, leading to basal cell carcinoma<sup>76,77</sup>.

Based on adult wing phenotypes and disruptions to cellular processes, we next tested 314 whether knockdown of 14 fly homologs disrupt conserved signaling pathways in the third instar 315 larval wing disc (Supp. Data 7). In particular, we evaluated the role of Wnt, Hedgehog, and 316 Notch signaling pathways by testing the expression patterns of four key proteins within these 317 pathways, including wingless (Wnt), patched (Hedgehog), engrailed (Hedgehog), and delta 318 (Notch). We found that 9/14 homologs, including 8/10 homologs showing severe wing 319 320 phenotypes or lethality, exhibited disruptions in at least one signaling pathway. For example, five 321 homologs with severe or lethal phenotypes showed disruptions of all four signaling pathways, including AATF/Aatf, NCBP2/Cbp20, POLR3E/Sin, PPP4C/Pp4-19C, and KIF11/Klp61F (Fig. 322 323 8, Supp. Data 7). Our observations are in concordance with previous findings by Swarup and colleagues, who showed that PPP4C/Pp4-19C is a candidate regulator of Wnt and Notch 324 signaling pathways in *Drosophila* larval wing discs<sup>78</sup>. Furthermore, two genes from the 3q29 325 326 region, *DLG1/dlg1* and *MFI2/Tsf2*, showed altered expression patterns for delta and patched but not for engrailed, indicating that they selectively interact with the Hedgehog as well as Notch 327 signaling pathway (Supp. Fig. 6). In fact, Six and colleagues showed that Dlg1 directly binds to 328 the PDZ-binding domain of Delta179. In contrast, ACACA/ACC and UOCRC2/UOCR-C2 showed 329 no changes in expression patterns for any of the four signaling proteins tested, suggesting that the 330 331 observed lethality could be due to other cellular mechanisms (Supp. Fig. 6). We conclude that a subset of homologs disrupt the expression of key proteins in signaling pathways, potentially 332 accounting for the developmental phenotypes observed in the adult wings. 333

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#### 335 Connectivity patterns of candidate genes vary across human tissue-specific networks

We examined patterns of connectivity for the nine candidate genes which showed disruptions of 336 signaling pathways within the context of human brain, heart, and kidney-specific gene 337 interaction networks<sup>80</sup>. These tissue-specific networks were constructed using Bayesian 338 classifier-generated probabilities for pairwise genetic interactions based on co-expression data<sup>80</sup>. 339 We calculated the lengths of the shortest paths between each candidate gene and 267 Wnt, 340 Notch, and Hedgehog pathway genes in each network as a proxy for connectivity (Supp. Data 341 8). In all three networks, each of the candidate genes were connected to a majority of the tested 342 343 signaling pathway genes, suggesting that our results have translational relevance towards human developmental pathways (Fig. 9A, Supp. Fig. 7). Interestingly, we observed a higher 344 connectivity (i.e. shorter path distances) between candidate genes and Wnt and Hedgehog 345 pathway genes in the brain-specific network compared to the heart and kidney-specific networks 346 (Fig. 9B). We further identified enrichments for genes involved in specific biological processes 347 among the connector genes that were located in the shortest paths within neuronal and non-348 neuronal tissue-specific networks (Fig. 9C, Supp. Data 8). For example, axon-dendrite 349 transport, dopaminergic signaling, and signal transduction functions were enriched among 350 connector genes only for the brain-specific network, while organelle organization and protein 351 ubiquitination were enriched among connector genes only for kidney and heart networks (Fig. 352 **9C**). However, several core biological processes, such as cell cycle, protein metabolism, 353 354 transcriptional regulation, and RNA processing/splicing, were enriched among connector genes within all three tissue-specific networks (Fig. 9C). Our analysis highlights that human CNV 355 genes potentially interact with developmental signaling pathways in an ubiquitous manner, but 356 357 may affect different biological processes in neuronal and non-neuronal tissues.

#### 358 **DISCUSSION**

We used the *Drosophila* wing as a model to identify key CNV genes involved in non-neuronal phenotypes associated with CNV disorders. We tested fly homologs of 79 genes and identified multiple homologs within each CNV region that exhibited strong phenotypes indicative of developmental disruptions. Several themes have emerged from our study highlighting the importance of fly homologs of CNV genes towards both global and tissue-specific phenotypes associated with human CNV disorders.

First, we found that homologs of CNV genes contribute towards developmental 365 366 phenotypes through ubiquitous roles in neuronal and non-neuronal tissues. Although we did not study models for the entire CNV, nearly all individual fly homologs of CNV genes contribute to 367 wing-specific developmental phenotypes. It is likely that these genes may also contribute to 368 additional phenotypes in other tissues that we did not assess. In fact, a subset of these genes also 369 showed early lethality with ubiquitous knockdown in addition to severe or lethal wing-specific 370 phenotypes. However, we found no correlation between the severity of the eye and wing 371 phenotypes, suggesting tissue-specific effects of these homologs towards developmental 372 phenotypes. In contrast, fly homologs of known neurodevelopmental genes generally showed 373 milder wing phenotypes compared with eye phenotypes, indicating a more neuronal role for 374 these genes. While our study only examined a subset of CNV genes with Drosophila homologs, 375 phenotypic data from knockout mouse models also support a global developmental role for 376 377 individual CNV genes. In fact, 44/130 knockout models of CNV genes within the Mouse Genome Informatics (MGI) database<sup>81</sup> exhibited non-neuronal phenotypes, including 20 378 homologs of CNV genes that showed both neuronal and non-neuronal phenotypes (Supp. Data 379 4). For example, knockout mouse models of  $Dlg I^{-/-}$  show defects in dendritic growth and 380

branching in the developing nervous system, in addition to craniofacial features and multiple kidney and urinary tract defects<sup>82–85</sup>. Furthermore, Chapman and colleagues showed that knockout of  $Tbx6^{-/-}$  caused defects in mesodermal and neuronal differentiation early in development, leading to abnormal vascular, tail bud, and neural tube morphology<sup>86</sup>. These observations further support our findings that most fly homologs of CNV genes have a global role in development that could account for the observed non-neuronal phenotypes.

Second, based on tissue-specific phenotypes, we identified fly homologs of CNV genes 387 that are key regulators of conserved cellular processes important for development. For example, 388 389 9/10 homologs with severe or lethal adult wing phenotypes also exhibited defects in cell proliferation and apoptosis during development. In fact, we found concordance between cellular 390 processes affected by wing and eye-specific knockdown of homologs of genes within 16p11.2 391 392 and 3q29 regions, including decreased proliferation for MAPK3/rl and increased apoptosis for NCBP2/Cbp20 and DLG1/dlg1<sup>41,42</sup>. While eye-specific knockdown of BDH1/CG8888 showed 393 decreased cell proliferation in larval eye discs<sup>42</sup>, we found increased cell proliferation with wing-394 specific knockdown, suggesting a tissue-specific effect for this gene. Notably, at least one fly 395 homolog per CNV region showed defects in cell proliferation or apoptosis, suggesting that these 396 conserved cellular processes may be relevant to CNV pathogenicity. For example, ATXN2L/Atx2, 397 SH2B1/Lnk, and CCDC101/Sgf29 each showed decreased proliferation and increased apoptosis, 398 suggesting an underlying common conserved cellular mechanism for the distal 16p11.2 deletion. 399 400 Furthermore, a subset of these genes also disrupted multiple signaling pathways, indicating a potential role for these genes as key regulators of developmental processes. We specifically 401 identified five genes whose knockdown caused disruptions of Wnt, Notch, and hedgehog 402 403 signaling pathways. Each of these genes have important roles in cell cycle regulation, apoptosis,

404	transcription, or RNA processing, based on Gene Ontology annotations <sup>87,88</sup> . In fact, we found
405	that the RNA transport protein $NCBP2/Cbp20^{89}$ , which we recently identified as a key modifier
406	gene for the 3q29 deletion <sup>42</sup> , interfaced with all three signaling pathways. Furthermore, $AATF$
407	disrupts apoptosis and promotes cell cycle progression through displacement of HDAC190-92,
408	while <i>PPP4C</i> promotes spindle organization at the centromeres during mitosis <sup>93</sup> . While we only
409	evaluated the role of these genes towards development in a single fly tissue, our additional
410	analysis of human gene interaction networks showed strong connectivity between the CNV
411	genes and signaling pathways in multiple neuronal and non-neuronal human tissues. In fact, cell
412	cycle genes were enriched among the connector genes in all three tissue-specific networks,
413	further emphasizing the role of cell cycle processes towards developmental phenotypes. Notably,
414	we also observed certain biological processes enriched among connector genes that were specific
415	to neuronal or non-neuronal tissues, indicating that haploinsufficiency of genes within CNV
416	regions may disrupt different biological processes in a tissue-specific manner.
417	Overall, we show that fly homologs of most CNV genes contribute towards global
418	developmental phenotypes, although exactly how they contribute toward such phenotypes varies
419	between neuronal and non-neuronal tissues. Previous functional studies for CNV disorders have
420	focused primarily on identifying candidate genes for the observed neuronal phenotypes. In this
421	study, we identified several homologs of CNV genes that are responsible for non-neuronal
422	phenotypes, as well as novel associations between these genes and conserved biological
423	processes and pathways. We therefore propose that multiple genes within each CNV disrupt
424	global and tissue-specific processes during development and contribute to the wide range of non-
425	neuronal phenotypes associated with CNV disorders (Fig. 10). This multigenic model for non-
426	neuronal phenotypes in CNV disorders is in line with our previous model for neuronal

427	phenotypes of these disorders, as opposed to models where individual causative genes are
428	responsible for specific phenotypes <sup>41,42,94</sup> . Our study further exemplifies the utility of evaluating
429	non-neuronal phenotypes in addition to neuronal phenotypes in models of individual genes and
430	CNV regions associated with developmental disorders, including future studies in mammalian or
431	cellular model systems. Further studies exploring how CNV genes interact with each other and
432	with other developmental pathways could more fully explain the conserved mechanisms
433	underlying global developmental defects and identify potential therapeutic targets for these
434	disorders.

#### 435 METHODS

450

#### 436 Fly stocks and genetics

437 We tested 59 *Drosophila* homologs for 130 human genes that span across 10 pathogenic CNV

- regions associated with neurodevelopmental disorders (1q21.1, 3q29, 7q11.23, 15q11.2, 15q13.3,
- 439 16p11.2, distal 16p11.2, 16p12.1, 16p13.11, and 17q12)<sup>22</sup> (**Supp. Data 1**). In addition, we
- evaluated fly homologs of 20 human genes known to be in involved in neurodevelopmental
- 441 disorders<sup>60,95</sup> (**Supp. Data 1**). These include genes involved in beta-catenin signaling pathway (5
- genes), core genes implicated in neurodevelopmental disorders (8 genes), and genes associated
- 443 with microcephaly (7 genes)<sup>96</sup>. We used the DRSC Integrative Ortholog Prediction Tool
- 444 (DIOPT, v.7.1) to identify the fly homologs for each human gene<sup>53</sup> (Supp. Data 1).

445 To knockdown individual genes in specific tissues, we used RNA interference (RNAi)

and the UAS-GAL4 system (Fig. 2A), a well-established tool that allows for tissue-specific

447 expression of a gene of interest<sup>97</sup>. RNAi lines were obtained from Vienna *Drosophila* Resource

448 Center (VDRC) that include both GD and KK lines. We tested a total of 136 lines in our final

data analysis (Supp. Data 9), after eliminating KK lines with additional insertion that drives the

overexpression of the Tiptop (tio) transcription factor<sup>98,99</sup>. A complete list of stock numbers and

451 full genotypes for all RNAi lines used in this study is presented in **Supp. Data 9**. We used the

452  $bx^{MS1096}$ -GAL4/FM7c;; UAS-Dicer2/TM6B driver for wing-specific knockdown and  $w^{1118}$ ; GMR-

453 *GAL4;UAS-Dicer2* driver (Claire Thomas, Penn State University) for eye-specific knockdown of

- 454 RNAi lines. Ubiquitous knockdown experiments were performed using the *w;da-GAL4;+* driver
- 455 (Scott Selleck, Penn State University). For all experiments, we used appropriate GD ( $w^{1118}$ ,

456 VDRC# 60000) or KK ( $y, w^{1118}$ ;  $P\{attP, y^+, w^3\}$ , VDRC# 60100) lines as controls to compare

457 against lines with knockdown of individual homologs. All fly lines were reared on standard yeast

- 458 *Drosophila* medium at room temperature. All crosses were set and maintained at 25°C, except 459 for the eye knockdown experiments which were maintained at 30°C.
- 460

#### 461 Phenotypic analysis of adult wing images

Adult progeny were isolated from crosses between RNAi lines and  $bx^{MS1096}$ -GAL4 driver shortly 462 after eclosion, and kept at 25°C until day 2-5 (Fig. 2A). At that point, the progeny were frozen at 463 -80°C, and were then moved to -20°C prior to imaging and storage. Approximately 20-25 464 progeny, both male and female, were collected for each RNAi line tested. The adult wings were 465 plucked from frozen flies and mounted on a glass slide. The slides were covered with a coverslip 466 and sealed using clear nail polish. Adult wing images were captured using a Zeiss Discovery 467 V20 stereoscope (Zeiss, Thornwood, NY, USA), with a ProgRes Speed XT Core 3 camera and 468 469 CapturePro v.2.8.8 software (Jenoptik AG, Jena, Germany) at 40X magnification. For each non-lethal RNAi line, we scored the adult wing images for five qualitative 470 phenotypes, including wrinkled wing, discoloration, missing veins, ectopic veins, and bristle 471 planar polarity defects, on a scale of 1 (no phenotype) to 5 (lethal) (Fig. 3C). Lines showing 472 severely wrinkled wings or lethality were scored as 4 (severe) or 5 (lethal) for all five 473 phenotypes. We calculated the frequency of each phenotypic score (i.e. mild bristle polarity, 474 moderate discoloration) across all of the wing images for each line (Fig. 3A-B), and then 475 performed k-means clustering of these values to generate five clusters for overall wing 476 477 phenotypes (Fig. 2C). For quantitative analysis of wing phenotypes, we used the Fiji ImageJ software<sup>100</sup> to calculate the wing area using the Measure Area tool, and calculated the lengths of 478 longitudinal veins L2, L3, L4, and L5 as well as the anterior and posterior crossveins (ACV and 479 480 PCV), by tracing individual veins using the Segmented Line tool (Fig. 4A, Supp. Data 2). We

determined discordant homologs when RNAi lines for the same homologs showed inconsistent
wing phenotypes. For each homolog with multiple RNAi lines, we checked discordance among
RNAi lines for no phenotype versus any qualitative or quantitative phenotypes, followed by
discordance for small or large wing measurement phenotypes (Supp. Data 3).

485

#### 486 Phenotypic analysis of adult eye images

We crossed RNAi lines with GMR-GAL4 to achieve eye-specific knockdown of homologs of 487 CNV and known neurodevelopmental genes. Adult 2-3-day old female progenies from the 488 crosses were collected, immobilized by freezing at -80°C, and then moved to -20°C prior to 489 490 imaging and storage. Flies were mounted on Blu-tac (Bostik Inc, Wauwatosa, WI, USA) and imaged using an Olympus BX53 compound microscope with LMPLan N 20X air objective using 491 492 a DP73 c-mount camera at 0.5X magnification (Olympus Corporation, Tokyo, Japan). CellSens Dimension software (Olympus Corporation, Tokyo, Japan) was used to capture the eye images, 493 which were then stacked using the Zerene Stacker software (Zerene Systems LLC, Richland, 494 WA, USA). All eye images presented in this study are maximum projections of 20 consecutive 495 optical z-sections, at a z-step size of 12.1µm. Finally. we used our computational method called 496 *Flynotyper* (https://flynotyper.sourceforge.net) to quantify the degree of rough eye phenotypes 497 present due to knockdown of homologs of CNV or neurodevelopmental genes<sup>60</sup>. *Flynotyper* 498 scores for homologs of 16p11.2 and 3q29, as well as select core neurodevelopmental genes, were 499 derived from our previous studies<sup>41,42,60</sup>. 500

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502

#### 504 Immunohistochemistry

Wing imaginal discs from third instar larvae were dissected in 1X PBS. The tissues were fixed 505 using 4% paraformaldehyde and blocked using 1% bovine serum albumin (BSA). The wing discs 506 507 were incubated with primary antibodies using appropriate dilutions overnight at 4°C. We used the following primary antibodies: mouse monoclonal anti-pHistone3 (S10) (1:100 dilutions, Cell 508 Signaling 9706L), rabbit polyclonal anti-cleaved Drosophila Dcp1 (Asp216) (1:100 dilutions, 509 Cell Signaling 9578S), mouse monoclonal anti-Wingless (1:200 dilutions, DSHB, 4D4), mouse 510 monoclonal anti-Patched (1:50 dilutions, DSHB, Drosophila Ptc/APA1), mouse monoclonal 511 anti-Engrailed (1:50 dilutions, DSHB, 4D9), and mouse monoclonal anti-Delta (1:50 dilutions, 512 DSHB, C594.9B). Following incubation with primary antibodies, the wing discs were washed 513 and incubated with secondary antibodies at 1:200 dilution for two hours at room temperature. 514 We used the following secondary antibodies: Alexa Fluor 647 dye goat anti-mouse (A21235, 515 Molecular Probes by Invitrogen/Life Technologies), Alexa Fluor 568 dye goat anti-rabbit 516 (A11036, Molecular Probes by Invitrogen/Life Technologies), and Alexa Fluor 568 dye goat 517 anti-mouse (A11031, Molecular Probes by Invitrogen/Life Technologies). All washes and 518 antibody dilutions were made using 0.3% PBS with Triton-X. 519 520 Third instar larvae wing imaginal discs were mounted in Prolong Gold antifade reagent with DAPI (Thermo Fisher Scientific, P36930) for imaging using an Olympus Fluoview FV1000 521 laser scanning confocal microscope (Olympus America, Lake Success, NY). Images were 522 523 acquired using FV10-ASW 2.1 software (Olympus, Waltham, MA, USA). Composite z-stack images were analyzed using the Fiji ImageJ software<sup>100</sup>. To calculate the number of pH3 positive 524 cells within the wing pouch area of the wing discs, we used the AnalyzeParticles function in 525 526 ImageJ, while manual counting was used to quantify Dcp1 positive cells. We note that cell

- 527 proliferation and apoptosis staining for *NCBP2/Cbp20*, *DLG1/dlg1*, *BDH1/CG8888*, and
- 528 FBXO45/Fsn were previously published<sup>42</sup>.
- 529

#### 530 Statistical analysis

- 531 Significance for the wing area and vein length measurements, cell counts for proliferation and
- apoptosis, and *Flynotyper* scores were compared to appropriate GD or KK controls using one-
- tailed or two-tailed Mann-Whitney tests. P-values for each set of experiments were corrected for
- 534 multiple testing using Benjamini-Hochberg correction. All statistical and clustering analysis was
- performed using R v.3.6.1 (R Center for Statistical Computing, Vienna, Austria). Details for the
- statistical tests performed for each dataset are provided in **Supp. Data 10**.
- 537

#### 538 Expression data analysis

We obtained tissue-specific expression data for fly homologs of CNV genes from the FlyAtlas 539 Anatomical Microarray dataset<sup>62</sup>. Raw FPKM (fragments per kilobase of transcript per million 540 reads) expression values for each tissue were categorized as follows: <10, no expression; 10-100, 541 low expression; 100-500, moderate expression; 500-1000, high expression; and >1000, very high 542 expression (Supp. Data 6). The median expression among midgut, hindgut, Malpighian tube, 543 and (for adult only) crop tissues was used to represent the overall gut expression. We similarly 544 obtained human tissue-specific expression data for CNV genes from the GTEx Consortium v.1.2 545 RNA-Seq datasets<sup>64</sup>. Median TPM (transcripts per million reads) expression values for each 546 tissue were categorized as follows: <3, no expression; 3-10, low expression; 10-25, moderate 547 expression; 25-100, high expression; and >100, very high expression (Supp. Data 6). The 548 549 median expression among all brain and heart sub-tissues was used to represent brain and heart

555	webtool ( <u>http://bioinfogp.cnb.csic.es/tools/venny</u> ) (Supp. Fig. 3).
554	gene, plus 1.5 times the interquartile range. Venn diagrams were generated using the Venny
553	values for that tissue were greater than the third quartile of all tissue expression values for that
552	expression for a particular tissue within the GTEx dataset was determined if the expression
551	stomach sub-tissues was used to represent digestive tract expression. Preferential gene
550	expression, while the median expression among all colon, esophagus, small intestine, and

556

#### 557 Network analysis

We obtained human tissue-specific gene interaction networks for brain, heart, and kidney tissues 558 from the GIANT network database<sup>80</sup> within HumanBase (https://hb.flatironinstitute.org). These 559 networks were built by training a Bayesian classifier based on tissue-specific gene co-expression 560 561 datasets, which then assigned a posterior probability for interactions between each pair of genes within the genome for a particular tissue. We downloaded the "Top edge" version of each tissue-562 specific network, and extracted all gene pairs with posterior probabilities >0.2 to create sub-563 networks containing the top  $\sim 0.5\%$  tissue-specific interactions. Next, we identified the shortest 564 paths in each sub-network between human CNV genes whose fly homologs disrupted signaling 565 pathways in the larval wing disc and human genes within each disrupted pathway, using the 566 inverse of the posterior probability as weights for each edge in the network. Gene sets from the 567 human Notch (KEGG:map04330), Wnt (KEGG:map04310) and Hedgehog pathways 568 (KEGG:map04340) were curated from the Kyoto Encyclopedia of Genes and Genomes (KEGG) 569 pathway database<sup>101</sup>. Using the NetworkX Python package<sup>102</sup>, we calculated the shortest distance 570 between each CNV gene and pathway gene, and identified connecting genes that were within 571 572 each of the shortest paths for the three tissue-specific networks. We further tested for enrichment

573	of Gene Ontology (GO) terms (PantherDB GO-Slim) among the connector genes using the
574	PantherDB Gene List Analysis tool <sup>103</sup> . Lists of the shortest paths and connector genes in each
575	tissue-specific network, as well as enriched GO terms for sets of connector genes, are provided
576	in Supp. Data 8. Gene networks were visualized using Cytoscape v.3.7.2 <sup>104</sup> using an edge-
577	weighted spring embedded layout.
578	
579	Mouse and human phenotypic data analysis
580	Phenotypic data for mouse models of CNV gene homologs, categorized using top-level
581	Mammalian Phenotype Ontology terms, were obtained from the Mouse Genome Informatics
582	(MGI) database <sup>81</sup> (Supp. Data 4). Phenotypic data for human carriers of pathogenic CNVs were
583	obtained from the DECIPHER public database9. Clinical phenotypes for each CNV carrier were
584	categorized by top-level Human Phenotype Ontology terms <sup>105</sup> using the Orange3 Bioinformatics
585	software library (https://orange-bioinformatics.readthedocs.io), and the frequency of individuals
586	carrying each top-level phenotype term was calculated for each of the ten tested pathogenic
587	CNVs.

#### 589 DATA AVAILABILITY

- All data supporting the findings of this study are available within the paper and its
- 591 supplementary information files.
- 592

#### 593 CODE AVAILABILITY

- All source code for data analysis in this manuscript, including scripts for k-means clustering of
- fly phenotypes, network connectivity of CNV and developmental pathway genes, and extraction
- of top-level human phenotype terms, are available on the Girirajan lab GitHub page at
- 597 <u>https://github.com/girirajanlab/CNV\_wing\_project.</u>
- 598

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606

#### 607 CONTRIBUTIONS

- 608 T.Y., M.J., S.Y., and S.G. designed the study. T.Y., S.Y., L.P., S.K., D.J.G., A.S., Y.M., J.I., and
- 609 Z.C.L. performed the functional experiments. T.Y. and M.J. performed the expression and
- 610 network experiments. T.Y., M.J., and S.G. analyzed the data and wrote the manuscript with input
- 611 from all authors.

### 612 COMPETING OF INTERESTS

613 The authors declare that they have no competing interests.

#### 614 **REFERENCES**

- Girirajan, S., Campbell, C. D. & Eichler, E. E. Human Copy Number Variation and Complex Genetic Disease. *Annu. Rev. Genet.* 45, 203–226 (2011).
- 618 2. Malhotra, D. & Sebat, J. CNVs: harbingers of a rare variant revolution in psychiatric
  619 genetics. *Cell* 148, 1223–1241 (2012).
- 620 3. Cooper, G. M. *et al.* A copy number variation morbidity map of developmental delay. *Nat.*621 *Genet.* 43, 838–846 (2011).
- 4. Zhang, F., Gu, W., Hurles, M. E. & Lupski, J. R. Copy Number Variation in Human
  Health, Disease, and Evolution. *Annu. Rev. Genomics Hum. Genet.* 10, 451–481 (2009).
- 5. Greenway, S. C. *et al.* De novo copy number variants identify new genes and loci in isolated sporadic tetralogy of Fallot. *Nat. Genet.* **41**, 931–935 (2009).
- 6. Glessner, J.T. *et al.* Increased Frequency of De Novo Copy Number Variations in
  627 Congenital Heart Disease by Integrative Analysis of SNP Array and Exome Sequence
  628 Data. *Circ Res.* 115, 884–896 (2014).
- Sanna-Cherchi, S. *et al.* Copy-number disorders are a common cause of congenital kidney malformations. *Am. J. Hum. Genet.* **91**, 987–997 (2012).
- 8. Zahnleiter, D. *et al.* Rare copy number variants are a common cause of short stature. *PLoS Genet.* 9, e1003365 (2013).
- Firth, H. V. *et al.* DECIPHER: Database of Chromosomal Imbalance and Phenotype in
  Humans Using Ensembl Resources. *Am. J. Hum. Genet.* 84, 524–533 (2009).
- Mefford, H. C. *et al.* Recurrent rearrangements of chromosome 1q21.1 and variable
  pediatric phenotypes. *N. Engl. J. Med.* 359, 1685–99 (2008).
- Brunetti-Pierri, N. *et al.* Recurrent reciprocal 1q21.1 deletions and duplications associated
   with microcephaly or macrocephaly and developmental and behavioral abnormalities. *Nat. Genet.* 40, 1466–1471 (2008).
- 640 12. Christiansen, J. *et al.* Chromosome 1q21.1 contiguous gene deletion is associated with congenital heart disease. *Circ. Res.* 94, 1429–35 (2004).
- 642 13. Pober, B. R. Williams-Beuren syndrome. N. Engl. J. Med. 362, 239–52 (2010).
- Ewart, A. K. *et al.* A human vascular disorder, supravalvular aortic stenosis, maps to chromosome 7. *Proc. Natl. Acad. Sci. U. S. A.* 90, 3226–30 (1993).
- Romeo, S. *et al.* Search for genetic variants of the SYNTAXIN 1A (STX1A) gene: The 352 A>T variant in the STX1A promoter associates with impaired glucose metabolism in
  an Italian obese population. *Int. J. Obes.* 32, 413–420 (2008).
- Frangiskakis, J. M. *et al.* LIM-kinase1 hemizygosity implicated in impaired visuospatial
  constructive cognition. *Cell* 86, 59–69 (1996).
- Tassabehji, M. *et al.* GTF2IRD1 in craniofacial development of humans mice. *Science* **310**, 1184–1187 (2005).
- 18. Lindsay, E. A. *et al.* Tbx1 haploinsufficiency in the DiGeorge syndrome region causes aortic arch defects in mice. *Nature* 410, 97–101 (2001).
- Mefford, H. C. *et al.* Recurrent reciprocal genomic rearrangements of 17q12 are
  associated with renal disease, diabetes, and epilepsy. *Am. J. Hum. Genet.* 81, 1057–1069 (2007).
- Clissold, R. L. *et al.* Chromosome 17q12 microdeletions but not intragenic HNF1B
  mutations link developmental kidney disease and psychiatric disorder. *Kidney Int.* 90, 203–11 (2016).

- 660 21. Weiss, L. A. *et al.* Association between Microdeletion and Microduplication at 16p11.2 and Autism. N. Engl. J. Med. 358, 667–675 (2008). 661 Girirajan, S. et al. Phenotypic Heterogeneity of Genomic Disorders and Rare Copy-22. 662 663 Number Variants. N. Engl. J. Med. 367, 1321–1331 (2012). 23. Bernier, R. et al. Disruptive CHD8 Mutations Define a Subtype of Autism Early in 664 Development. Cell 158, 263-276 (2014). 665 24. Ostergaard, P. et al. Mutations in KIF11 cause autosomal-dominant microcephaly variably 666 associated with congenital lymphedema and chorioretinopathy. Am. J. Hum. Genet. 90, 667 356-62 (2012). 668 25. Horev, G. et al. Dosage-dependent phenotypes in models of 16p11.2 lesions found in 669 autism. Proc. Natl. Acad. Sci. 108, 17076-17081 (2011). 670 Pucilowska, J. et al. The 16p11.2 Deletion Mouse Model of Autism Exhibits Altered 671 26. Cortical Progenitor Proliferation and Brain Cytoarchitecture Linked to the ERK MAPK 672 Pathway. J. Neurosci. 35, 3190-3200 (2015). 673 27. Portmann, T. et al. Behavioral abnormalities and circuit defects in the basal ganglia of a 674 mouse model of 16p11.2 deletion syndrome. Cell Rep. 7, 1077–1092 (2014). 675 676 28. Rutkowski, T. P. et al. Behavioral changes and growth deficits in a CRISPR engineered mouse model of the schizophrenia-associated 3q29 deletion. Mol. Psychiatry (2019) 677 doi:10.1038/s41380-019-0413-5. 678 Baba, M. et al. Psychiatric-disorder-related behavioral phenotypes and cortical 679 29. hyperactivity in a mouse model of 3q29 deletion syndrome. *Neuropsychopharmacology* 680 44, 2125-2135 (2019). 681 30. Arbogast, T. et al. Reciprocal Effects on Neurocognitive and Metabolic Phenotypes in 682 Mouse Models of 16p11.2 Deletion and Duplication Syndromes. PLoS Genet. 12, 683 e1005709 (2016). 684 685 31. Haller, M., Au, J., O'Neill, M. & Lamb, D. J. 16p11.2 transcription factor MAZ is a dosage-sensitive regulator of genitourinary development. Proc. Natl. Acad. Sci. 115, 686 E1849-E1858 (2018). 687 32. Yadav, S. et al. TAOK2 Kinase Mediates PSD95 Stability and Dendritic Spine Maturation 688 through Septin7 Phosphorylation. Neuron 93, 379-393 (2017). 689 Richter, M. et al. Altered TAOK2 activity causes autism-related neurodevelopmental and 33. 690 691 cognitive abnormalities through RhoA signaling. Mol. Psychiatry 24, 1329–1350 (2019). Golzio, C. et al. KCTD13 is a major driver of mirrored neuroanatomical phenotypes of the 692 34. 16p11.2 copy number variant. Nature 485, 363-367 (2012). 693 35. Escamilla, C. O. et al. Kctd13 deletion reduces synaptic transmission via increased RhoA. 694 Nature 551, 227–231 (2017). 695 Ip, J. P. K. et al. Major vault protein, a candidate gene in 16p11.2 microdeletion 696 36. syndrome, is required for the homeostatic regulation of visual cortical plasticity. J. 697 698 Neurosci. 38, 2017–2034 (2018). Dickinson, M. E. et al. High-throughput discovery of novel developmental phenotypes. 699 37. *Nature* **537**, 508–514 (2016). 700 Wangler, M. F., Yamamoto, S. & Bellen, H. J. Fruit flies in biomedical research. Genetics 701 38. 702 **199**, 639–653 (2015). Chien, S. Homophila: human disease gene cognates in Drosophila. Nucleic Acids Res. 30, 703 39. 704 149–151 (2002).
  - 40. Reiter, L. T., Potocki, L., Chien, S., Gribskov, M. & Bier, E. A systematic analysis of

706		human disease-associated gene sequences in Drosophila melanogaster. Genome Res. 11,
707		1114–1125 (2001).
708	41.	Iyer, J. et al. Pervasive genetic interactions modulate neurodevelopmental defects of the
709		autism-associated 16p11.2 deletion in Drosophila melanogaster. Nat. Commun. 9, 2548
710		(2018).
711	42.	Singh, M. D. et al. NCBP2 modulates neurodevelopmental defects of the 3q29 deletion in
712		Drosophila and X. laevis models. <i>bioRxiv</i> 614750 (2019) doi:10.1101/614750.
713	43.	Molnar, C. et al. Signalling Pathways in Development and Human Disease: A Drosophila
714		Wing Perspective. in Human Genetic Diseases (InTech, 2011). doi:10.5772/23858.
715	44.	Dworkin, I. & Gibson, G. Epidermal growth factor receptor and transforming growth
716		factor- $\beta$ signaling contributes to variation for wing shape in Drosophila melanogaster.
717		<i>Genetics</i> <b>173</b> , 1417–1431 (2006).
718	45.	Testa, N. D. & Dworkin, I. The sex-limited effects of mutations in the EGFR and TGF- $\beta$
719		signaling pathways on shape and size sexual dimorphism and allometry in the Drosophila
720		wing. Dev. Genes Evol. 226, 159–171 (2016).
721	46.	Yan, S. J., Gu, Y., Li, W. X. & Fleming, R. J. Multiple signaling pathways and a selector
722		protein sequentially regulate Drosophila wing development. Development 131, 285-298
723		(2004).
724	47.	Strigini, M. & Cohen, S. M. A Hedgehog activity gradient contributes to AP axial
725		patterning of the Drosophila wing. Development 124, 4697-4705 (1997).
726	48.	Diaz de la Loza, M. C. & Thompson, B. J. Forces shaping the Drosophila wing. Mech.
727		<i>Dev.</i> <b>144</b> , 23–32 (2017).
728	49.	Bier, E. Drosophila, the golden bug, emerges as a tool for human genetics. Nat. Rev.
729		<i>Genet.</i> <b>6</b> , 9–23 (2005).
730	50.	Wu, Y. et al. A Drosophila model for Angelman syndrome. Proc. Natl. Acad. Sci. 105,
731		12399–12404 (2008).
732	51.	Yamamoto, S. et al. A Drosophila genetic resource of mutants to study mechanisms
733		underlying human genetic diseases. Cell 159, 200–214 (2014).
734	52.	Kochinke, K. et al. Systematic Phenomics Analysis Deconvolutes Genes Mutated in
735		Intellectual Disability into Biologically Coherent Modules. Am. J. Hum. Genet. 98, 149-
736		164 (2016).
737	53.	Hu, Y. et al. An integrative approach to ortholog prediction for disease-focused and other
738		functional studies. BMC Bioinformatics 12, 357 (2011).
739	54.	Capdevila, J. & Guerrero, I. Targeted expression of the signaling molecule
740		decapentaplegic induces pattern duplications and growth alterations in Drosophila wings.
741		<i>EMBO J.</i> <b>13</b> , 4459–4468 (1994).
742	55.	Lindström, R., Lindholm, P., Palgi, M., Saarma, M. & Heino, T. I. In vivo screening
743		reveals interactions between Drosophila Manf and genes involved in the mitochondria and
744		the ubiquinone synthesis pathway. BMC Genet. 18, 52 (2017).
745	56.	Nielsen, J. et al. A mouse model of the schizophrenia-associated 1q21.1 microdeletion
746		syndrome exhibits altered mesolimbic dopamine transmission. Transl. Psychiatry 7, 1261
747		(2017).
748	57.	Huang, H. et al. PTEN affects cell size, cell proliferation and apoptosis during Drosophila
749		eye development. Development 126, 5365-5372 (1999).
750	58.	Toyo-oka, K. et al. Protein phosphatase 4 catalytic subunit regulates Cdk1 activity and
751		microtubule organization via NDEL1 dephosphorylation. J. Cell Biol. 180, 1133–1147

752		(2008).
753	59.	Ohsugi, M. et al. Kid-Mediated Chromosome Compaction Ensures Proper Nuclear
754		Envelope Formation. <i>Cell</i> <b>132</b> , 771–782 (2008).
755	60.	Iyer, J. et al. Quantitative assessment of eye phenotypes for functional genetic studies
756		using Drosophila melanogaster. G3 Genes, Genomes, Genet. 6, 1427–1437 (2016).
757	61.	Rosenberg, M. J. et al. Mutant deoxynucleotide carrier is associated with congenital
758		microcephaly. <i>Nat. Genet.</i> <b>32</b> , 175–179 (2002).
759	62.	Chintapalli, V. R., Wang, J. & Dow, J. A. T. Using FlyAtlas to identify better Drosophila
760	0_1	melanogaster models of human disease. <i>Nat. Genet.</i> <b>39</b> , 715–720 (2007).
761	63.	Claes, L. <i>et al.</i> De novo mutations in the sodium-channel gene SCN1A cause severe
762		myoclonic epilepsy of infancy. Am. J. Hum. Genet. 68, 1327–1332 (2001).
763	64.	Ardlie, K. G. <i>et al.</i> The Genotype-Tissue Expression (GTEx) pilot analysis: Multitissue
764	0	gene regulation in humans. Science 348, 648–660 (2015).
765	65.	Ernst, C. Proliferation and Differentiation Deficits are a Major Convergence Point for
766	00.	Neurodevelopmental Disorders. <i>Trends Neurosci.</i> <b>39</b> , 290–299 (2016).
767	66.	Marchetto, M. C. <i>et al.</i> Altered proliferation and networks in neural cells derived from
768	00.	idiopathic autistic individuals. <i>Mol. Psychiatry</i> <b>22</b> , 820–835 (2017).
769	67.	Wei, H., Alberts, I. & Li, X. The apoptotic perspective of autism. <i>Int. J. Dev. Neurosci.</i>
770	07.	<b>36</b> , 13–18 (2014).
771	68.	Hartl, T. A. & Scott, M. P. Wing tips: The wing disc as a platform for studying Hedgehog
772	00.	signaling. <i>Methods</i> <b>68</b> , 199–206 (2014).
773	69.	de Celis, J. F. & García-Bellido, A. Roles of the Notch gene in Drosophila wing
774	0,,,,	morphogenesis. <i>Mech. Dev.</i> <b>46</b> , 109–122 (1994).
775	70.	Raftery, L. A. & Umulis, D. M. Regulation of BMP activity and range in Drosophila wing
776	,	development. <i>Curr. Opin. Cell Biol.</i> <b>24</b> , 158–65 (2012).
777	71.	Diaz-Benjumea, F. J. & Cohen, S. M. Serrate signals through Notch to establish a
778		Wingless-dependent organizer at the dorsal/ventral compartment boundary of the
779		Drosophila wing. Development 121, 4215–4225 (1995).
780	72.	Becam, I. & Milán, M. A permissive role of Notch in maintaining the DV affinity
781		boundary of the Drosophila wing. Dev. Biol. 322, 190-8 (2008).
782	73.	Zecca, M., Basler, K. & Struhl, G. Sequential organizing activities of engrailed, hedgehog
783		and decapentaplegic in the Drosophila wing. Development 121, 2265–2278 (1995).
784	74.	Tabata, T. & Kornberg, T. B. Hedgehog is a signaling protein with a key role in patterning
785		Drosophila imaginal discs. Cell 76, 89–102 (1994).
786	75.	O'Roak, B. J. et al. Sporadic autism exomes reveal a highly interconnected protein
787		network of de novo mutations. Nature 485, 246–250 (2012).
788	76.	Hahn, H. et al. Mutations of the human homolog of Drosophila patched in the nevoid
789		basal cell carcinoma syndrome. Cell 85, 841–851 (1996).
790	77.	Johnson, R. L. et al. Human homolog of patched, a candidate gene for the basal cell nevus
791		syndrome. Science 272, 1668–1671 (1996).
792	78.	Swarup, S., Pradhan-Sundd, T. & Verheyen, E. M. Genome-wide identification of
793		phospho-regulators of Wnt signaling in Drosophila. <i>Development</i> <b>142</b> , 1502–1515 (2015).
794	79.	Six, E. M. <i>et al.</i> The Notch ligand Delta1 recruits Dlg1 at cell-cell contacts and regulates
795		cell migration. J. Biol. Chem. 279, 55818–55826 (2004).
796	80.	Greene, C. S. et al. Understanding multicellular function and disease with human tissue-
797		specific networks. Nat. Genet. 47, 569-576 (2015).
		-

798 81. Bult, C. J. et al. Mouse Genome Database (MGD) 2019. Nucleic Acids Res. 47, D801-799 D806 (2019). 82. Zhou, W. et al. GluR1 controls dendrite growth through its binding partner, SAP97. J. 800 801 Neurosci. 28, 10220–10233 (2008). Iizuka-Kogo, A., Ishidao, T., Akiyama, T. & Senda, T. Abnormal development of 83. 802 urogenital organs in Dlgh1-deficient mice. Development 134, 1799–1807 (2007). 803 84. Mahoney, Z. X. et al. Discs-large homolog 1 regulates smooth muscle orientation in the 804 mouse ureter. Proc. Natl. Acad. Sci. 103, 19872-19877 (2006). 805 Caruana, G. & Bernstein, A. Craniofacial dysmorphogenesis including cleft palate in mice 85. 806 807 with an insertional mutation in the discs large gene. Mol. Cell. Biol. 21, 1475-83 (2001). Chapman, D. L. & Papaioannou, V. E. Three neural tubes in mouse embryos with 808 86. mutations in the T-box gene Tbx6. Nature 391, 695-697 (1998). 809 Ashburner, M. et al. Gene ontology: Tool for the unification of biology. Nat. Genet. 25, 810 87. 25-29 (2000). 811 The Gene Ontology Consortium. The Gene Ontology Resource: 20 years and still GOing 812 88. strong. Nucleic Acids Res. 47, D330-D338 (2019). 813 Pabis, M., Neufeld, N., Shav-Tal, Y. & Neugebauer, K. M. Binding properties and 814 89. dynamic localization of an alternative isoform of the cap-binding complex subunit CBP20. 815 Nucleus 1, 412–421 (2010). 816 Di Padova, M. et al. Che-1 arrests human colon carcinoma cell proliferation by displacing 817 90. HDAC1 from the p21WAF1/CIP1 promoter. J. Biol. Chem. 278, 36496–504 (2003). 818 91. Bruno, T. et al. Che-1 affects cell growth by interfering with the recruitment of HDAC1 819 by Rb. Cancer Cell 2, 387–399 (2002). 820 Page, G., Lödige, I., Kögel, D. & Scheidtmann, K. H. AATF, a novel transcription factor 92. 821 that interacts with Dlk/ZIP kinase and interferes with apoptosis. FEBS Lett. 462, 187–91 822 823 (1999). 93. Sumiyoshi, E., Sugimoto, A. & Yamamoto, M. Protein phosphatase 4 is required for 824 centrosome maturation in mitosis and sperm meiosis in C. elegans. J. Cell Sci. 115, 1403– 825 1410 (2002). 826 94. Jensen, M. & Girirajan, S. An interaction-based model for neuropsychiatric features of 827 copy-number variants. PLoS Genet. 15, e1007879 (2019). 828 829 95. Coe, B. P., Girirajan, S. & Eichler, E. E. A genetic model for neurodevelopmental disease. 830 *Curr. Opin. Neurobiol.* **22**, 829–836 (2012). Nicholas, A. K. et al. The molecular landscape of ASPM mutations in primary 96. 831 microcephaly. J. Med. Genet. 46, 249-253 (2009). 832 97. Brand, A. H. & Perrimon, N. Targeted gene expression as a means of altering cell fates 833 and generating dominant phenotypes. Development 118, 401–15 (1993). 834 98. Green, E. W., Fedele, G., Giorgini, F. & Kyriacou, C. P. A Drosophila RNAi collection is 835 836 subject to dominant phenotypic effects. Nat. Methods 11, 222-223 (2014). 99. Vissers, J. H. A., Manning, S. A., Kulkarni, A. & Harvey, K. F. A Drosophila RNAi 837 library modulates Hippo pathway-dependent tissue growth. Nat. Commun. 7, 10368 838 839 (2016).Schindelin, J. et al. Fiji: An open-source platform for biological-image analysis. Nat. 840 100. Methods 9, 676–682 (2012). 841 842 101. Kanehisa, M., Sato, Y., Furumichi, M., Morishima, K. & Tanabe, M. New approach for understanding genome variations in KEGG. Nucleic Acids Res. 47, D590-D595 (2019). 843

844	102.	Hagberg, A. A., Schult, D. A. & Swart, P. J. Exploring network structure, dynamics, and
845		function using NetworkX. in 7th Python in Science Conference (SciPy 2008) 11-15
846		(2008).
847	103.	Mi, H. et al. PANTHER version 11: Expanded annotation data from Gene Ontology and
848		Reactome pathways, and data analysis tool enhancements. <i>Nucleic Acids Res.</i> 45, D183–
849		D189 (2017).
850	104.	Shannon, P. et al. Cytoscape: A software Environment for integrated models of
851		biomolecular interaction networks. Genome Res. 13, 2498-2504 (2003).

- Köhler, S. *et al.* Expansion of the Human Phenotype Ontology (HPO) knowledge base and resources. *Nucleic Acids Res.* 47, D1018–D1027 (2019).
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#### 855 FIGURE LEGENDS

Figure 1. Phenotypic expression of CNV carriers across tissues. Heatmap with frequencies of
non-neuronal developmental phenotypes observed in 1,225 human carriers of 10 pathogenic
CNV deletions, curated from the DECIPHER database, is shown. CNV carriers show a variety of
phenotypes that manifest across different tissues, including eye, limbs, muscle, and skeleton.

860

Figure 2. Targeted analysis to identify global developmental phenotypes with knockdown 861 of homologs of CNV genes. (A) Strategy for identifying non-neuronal phenotypes and 862 863 underlying cellular mechanisms for homologs of CNV and known neurodevelopmental genes using the fly wing as a model system. We evaluated 59 Drosophila homologs of genes within 10 864 CNV regions and 20 known neurodevelopmental genes (79 total homologs). Using the UAS-865 *GAL4* system with wing-specific  $bx^{MS1096}$  driver, we knocked down 136 individual RNAi lines 866 for the CNV and neurodevelopmental homologs, and evaluated qualitative and quantitative 867 phenotypes. We next clustered RNAi lines based on severity of qualitative phenotypes, and 868 compared adult wing phenotypes to phenotypes observed with ubiquitous and eye-specific 869 knockdown of homologs. Furthermore, we evaluated underlying cellular mechanisms for the 870 observed wing-specific phenotypes, and examined the connectivity patterns of candidate 871 homologs for developmental phenotypes in multiple human tissue-specific networks. (B) 872 Representative brightfield images of adult wing phenotype severity observed with knockdown of 873 874 homologs of CNV genes, based on clustering analysis, are shown. (C) Heatmap with k-means clustering of qualitative phenotypes in adult female wings across 136 RNAi lines is shown. The 875 color of each cell represents the frequency of individual fly wings (n=20-25 adult wings) for 876 877 each RNAi line (x-axis) that show a specific severity (no phenotype, mild, moderate, severe,

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878	lethal) for the five qualitative phenotypes assessed (y-axis; wrinkled wings, ectopic veins,
879	missing veins, discoloration, bristle planar polarity), as detailed in Supp. Data 2. Based on these
880	data, we identified clusters for no phenotype (n=75 lines), mild (n=24 lines), moderate (n=10
881	lines), severe (n=21 lines), and lethal (n=6 lines). (D) Summary table of qualitative and
882	quantitative adult wing phenotypes for all tested RNAi lines of homologs of CNV and
883	neurodevelopmental genes. Quantitative phenotype totals do not include lethal RNAi lines for
884	both area and vein length. In addition, L3 vein length totals do not include severe RNAi lines.
885	
886	Figure 3. Qualitative adult wing phenotypes of <i>Drosophila</i> homologs of CNV and
887	neurodevelopmental genes. Heatmaps representing the five qualitative adult wing phenotypes
888	for all 136 RNAi lines, with (A) all 59 tested homologs for 10 CNV regions and (B) 20
889	homologs for neurodevelopmental genes ( $\beta$ -catenin, core neurodevelopmental genes, and
890	microcephaly genes), are shown. The color of each cell represents the frequency of each of the
891	five qualitative phenotypes by severity (wrinkled wings, WR; ectopic veins, EV; missing veins,
892	MV; discoloration, DC; bristle planar polarity, BP), ranging from no phenotype to lethal. (C)
893	Representative brightfield images of adult fly wings (scale bar = $500\mu$ m) with wing-specific
894	knockdown of homologs of CNV and neurodevelopmental genes showing the five assessed
895	qualitative phenotypes, including discoloration, wrinkled wings, bristle polarity, ectopic veins,
896	and missing veins are shown. The panels in the $bx^{MS1096}$ -GAL4 control and C6836 <sup>KK112485</sup> images
897	highlight bristle planar polarity phenotypes for the representative images. Black arrowheads
898	highlight ectopic veins and white arrowheads highlight missing veins. Genotypes for the images
899	are: w <sup>1118</sup> /bx <sup>MS1096</sup> -GAL4;+; UAS-Dicer2/+, w <sup>1118</sup> /bx <sup>MS1096</sup> -GAL4; UAS-Rph <sup>GD7330</sup> RNAi/+; UAS-
900	Dicer2/+, w <sup>1118</sup> /bx <sup>MS1096</sup> -GAL4; UAS-CG15528 <sup>KK107736</sup> RNAi/+; UAS-Dicer2/+, w <sup>1118</sup> /bx <sup>MS1096</sup> -

901	GAL4;UAS-CG6836 <sup>KK112485</sup>	RNAi/+:	UAS-Dicer2/+.	$w^{1118}/bx^{MS109}$	<sup>6</sup> -GAL4:+:UAS-
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902  $CG14182^{GD2738}$  RNAi/UAS-Dicer2, and  $w^{1118}/bx^{MS1096}$ -GAL4;UAS-kis<sup>KK100890</sup> RNAi/+; UAS-

904

903

Dicer2/+.

#### 905 Figure 4. Quantitative adult wing phenotypes of *Drosophila* homologs of CNV and

906 neurodevelopmental genes. (A) Representative brightfield images of adult fly wings (scale bar

 $907 = 500 \mu$ m) with wing-specific knockdown of homologs of CNV and neurodevelopmental genes

908 with size defects are shown. The  $bx^{MS1096}$ -GAL4 control image highlights the six veins, including

longitudinal veins L2, L3, L4, and L5 as well as the anterior and posterior crossveins (ACV and

910 PCV), that were measured for quantitative analysis. The dotted line in the control image

911 represents the total wing area calculated for each RNAi line. Genotypes for the images are:

912  $w^{1118}/bx^{MS1096}$ -GAL4;+; UAS-Dicer2/+,  $w^{1118}/bx^{MS1096}$ -GAL4;UAS-Fmo-2<sup>KK109203</sup> RNAi/+; UAS-

913 Dicer2/+, and  $w^{1118}/bx^{MS1096}$ -GAL4; +; UAS-Trpm<sup>GD4541</sup> RNAi/UAS-Dicer2. (B) Boxplot of L3

vein lengths for knockdown of select homologs in adult fly wings (n = 9-91, \*p < 0.05, two-

tailed Mann–Whitney test with Benjamini-Hochberg correction). Vein measurements for all

other longitudinal veins and crossveins (ACV and PCV) for these lines are represented in **Supp** 

**Fig. 2.** (C) Boxplot of wing areas for knockdown of select homologs in adult fly wings (n = 9-

91, \*p < 0.05, two-tailed Mann–Whitney test with Benjamini-Hochberg correction). All boxplots

919 indicate median (center line), 25th and 75th percentiles (bounds of box), and minimum and

920 maximum (whiskers), with red dotted lines representing the control median.

921

#### 922 Figure 5. Comparison of wing-specific, eye-specific, and ubiquitous knockdown of

homologs of CNV and known neurodevelopmental genes. (A) Heatmap with the penetrance

924	of phenotypes with ubiquitous knockdown (da-GAL4) of select homologs of CNV genes,					
925	compared to their adult wing-specific ( $bx^{MS1096}$ –GAL4) phenotypic severity is shown. (B)					
926	Boxplots of Flynotyper-derived phenotypic scores for adult eyes with eye-specific knockdown					
927	(GMR-GAL4) of select homologs of CNV and neurodevelopmental genes, normalized as fold-					
928	change (FC) to control values ( $n = 7-40$ , * $p < 0.05$ , one-tailed Mann–Whitney test with					
929	Benjamini-Hochberg correction). The boxplots are arranged by severity of adult wing					
930	phenotypes observed for each RNAi line, while the Flynotyper phenotypic scores are categorized					
931	into four severity categories: no change (0-1.1 FC), mild (1.1-1.5 FC), moderate (1.5-2.0 FC),					
932	and severe (>2.0 FC). (C) Boxplot showing the average eye phenotypic scores for 66 RNAi lines					
933	of select homologs of CNV and neurodevelopmental genes, normalized as fold-change (FC) to					
934	control values, by wing phenotypic category (n=4-30 RNAi lines per group). We did not observe					
935	any significant changes in eye phenotype severity across the five wing phenotypic categories					
936	(Kruskal-Wallis rank sum test, p=0.567, df = 5, $\chi^2$ = 3.881). Examples of average eye phenotypic					
937	scores for RNAi lines with no phenotype ( $para^{GD3392}$ ), mild ( $rl^{KK115768}$ ), and lethal ( $dlg1^{GD4689}$ )					
938	wing phenotype severity are highlighted in the graph. All boxplots indicate median (center line),					
939	25th and 75th percentiles (bounds of box), and minimum and maximum (whiskers), with red					
940	dotted lines representing the control median. (D) Representative brightfield adult eye (scale					
941	$bar = 100 \ \mu m$ ) and adult wing (scale $bar = 500 \ \mu m$ ) images with tissue-specific knockdown of					
942	homologs of CNV genes are shown. Genotypes for the eye images are: w <sup>1118</sup> ;GMR-GAL4/+;					
943	UAS-Dicer2/+, w <sup>1118</sup> ;GMR-GAL4/UAS-Lnk <sup>KK105731</sup> RNAi; UAS-Dicer2/+, w <sup>1118</sup> ;GMR-					
944	GAL4/UAS-mEFTu1 <sup>GD16961</sup> RNAi; UAS-Dicer2/+. Genotypes for the wing images are:					
945	$w^{1118}/bx^{MS1096}$ -GAL4;+; UAS-Dicer2/+, $w^{1118}/bx^{MS1096}$ -GAL4; UAS-Lnk <sup>KK105731</sup> RNAi/+; UAS-					
946	Dicer2/+, and w <sup>1118</sup> /bx <sup>MS1096</sup> -GAL4; UAS-mEFTu1 <sup>GD16961</sup> RNAi/+; UAS-Dicer2/+.					

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#### 947 Figure 6. Expression patterns of *Drosophila* homologs and human CNV and

- 948 neurodevelopmental genes across multiple tissues. (A) Heatmap with expression of fly
- homologs of select CNV and neurodevelopmental genes in multiple *Drosophila* larval and adult
- 950 tissues, derived from the FlyAtlas Anatomical Microarray dataset, compared with adult wing
- 951 phenotype severity, is shown. Expression values are grouped into no expression (<10 fragments
- 952 per kilobase of transcript per million reads, or FPKM), low (10–100 FPKM), moderate (100–500
- 953 FPKM), high (500–1000 FPKM), and very high (>1000 FPKM) expression categories. (B)
- Heatmap with expression of select human CNV and neurodevelopmental genes in multiple adult
- tissues, derived from the Genotype-Tissue Expression (GTEx) dataset v.1.2, is shown.
- Expression values are grouped into no expression (<3 transcripts per million reads, or TPM), low

957 (3–10 TPM), moderate (10–25 TPM), high (25–100 TPM), and very high (>100 TPM)

- 958 expression categories. X symbols denote preferential expression in a particular tissue (see
- 959 Methods). Expression data for all CNV and neurodevelopmental genes are provided in **Supp.**

960 **Data 6**.

961

Figure 7. Drosophila homologs of CNV and neurodevelopmental genes show altered levels 962 of apoptosis and proliferation. (A) Larval imaginal wing discs (scale bar =  $50 \mu m$ ) stained with 963 nuclear marker DAPI, apoptosis marker dcp1, and cell proliferation marker pH3 illustrate altered 964 levels of apoptosis and cell proliferation due to wing-specific knockdown of select fly homologs 965 966 of CNV genes. We quantified the number of stained cells within the wing pouch of the wing disc (white box), which becomes the adult wing. Additional representative images of select homologs 967 are presented in Supp Fig. 5. Genotypes for the wing images are:  $w^{1118}/bx^{MS1096}$ -GAL4;+; UAS-968 Dicer2/+, w<sup>1118</sup>/bx<sup>MS1096</sup>-GAL4;+; UAS-Aatf<sup>GD7229</sup> RNAi/UAS-Dicer2, w<sup>1118</sup>/bx<sup>MS1096</sup>-GAL4; UAS-969

970	$Pp4-19C^{GD9561}/+; UAS-Dicer2/+, w^{1118}/bx^{MS1096}-GAL4;+; UAS-Atx2^{GD11562} RNAi/UAS-Dicer2,$
971	and w <sup>1118</sup> /bx <sup>MS1096</sup> -GAL4;+; UAS-Sin <sup>GD7027</sup> RNAi/UAS-Dicer2. (B) Box plot of dcp1-positive
972	cells in larval wing discs with knockdown of select fly homologs of CNV and
973	neurodevelopmental genes, normalized to controls ( $n = 7-18$ , * $p < 0.05$ , two-tailed Mann-
974	Whitney test with Benjamini-Hochberg correction). We note that several RNAi lines showed
975	severe dcp1 staining across the entire wing disc and could not be quantified. The number of dcp1
976	positive cells were calculated manually. (C) Box plot of pH3-positive cells in the larval wing
977	discs with knockdown of select fly homologs of CNV and neurodevelopmental genes,
978	normalized to controls (n = 6–18, *p < 0.05, two-tailed Mann–Whitney test with Benjamini-
979	Hochberg correction). The number of pH3 positive cells were calculated using the
980	AnalyzeParticles function in ImageJ. All boxplots indicate median (center line), 25th and 75th
981	percentiles (bounds of box), and minimum and maximum (whiskers), with red dotted lines
982	representing the control median.
983	

#### Figure 8. Candidate *Drosophila* homologs of genes within CNV regions interact with

conserved signaling pathways. Larval imaginal wing discs (scale bar =  $50 \,\mu\text{m}$ ) stained with (A) 985 wingless, (B) patched, (C) engrailed, and (D) delta illustrate disrupted expression patterns for 986 987 proteins located within the Wnt (wingless), Hedgehog (patched and engrailed), and Notch (delta) signaling pathways due to wing-specific knockdown of select fly homologs of CNV and 988 neurodevelopmental genes. Dotted yellow boxes represent expected expression patterns for 989 signaling proteins in  $bx^{MS1096}$ -GAL4 control images. White arrowheads and dotted white boxes 990 highlight disruptions in expression patterns of signaling proteins with knockdown of CNV or 991 992 neurodevelopmental genes. Additional representative images of select homologs are presented in

993	Supp Fig. 7	. Genotypes for the	he wing images	are: w <sup>1118</sup> /bx <sup>MS1096</sup> -GAL4;+;	· UAS-Dicer2/+,
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994 
$$w^{1118}/bx^{MS1096}$$
-GAL4; UAS-Pp4-19C<sup>GD9561</sup>/+; UAS-Dicer2/+,  $w^{1118}/bx^{MS1096}$ -GAL4; UAS-

995  $Cbp20^{KK109448}/+; UAS-Dicer2/+, w^{1118}/bx^{MS1096}-GAL4;+; UAS-Sin^{GD7027} RNAi/UAS-Dicer2,$ 

996  $w^{1118}/bx^{MS1096}$ -GAL4;+; UAS-Aatf<sup>GD7229</sup> RNAi/UAS-Dicer2, and  $w^{1118}/bx^{MS1096}$ -GAL4;UAS-

997 *Klp61F<sup>GD14149</sup>/+; UAS-Dicer2/+.* 

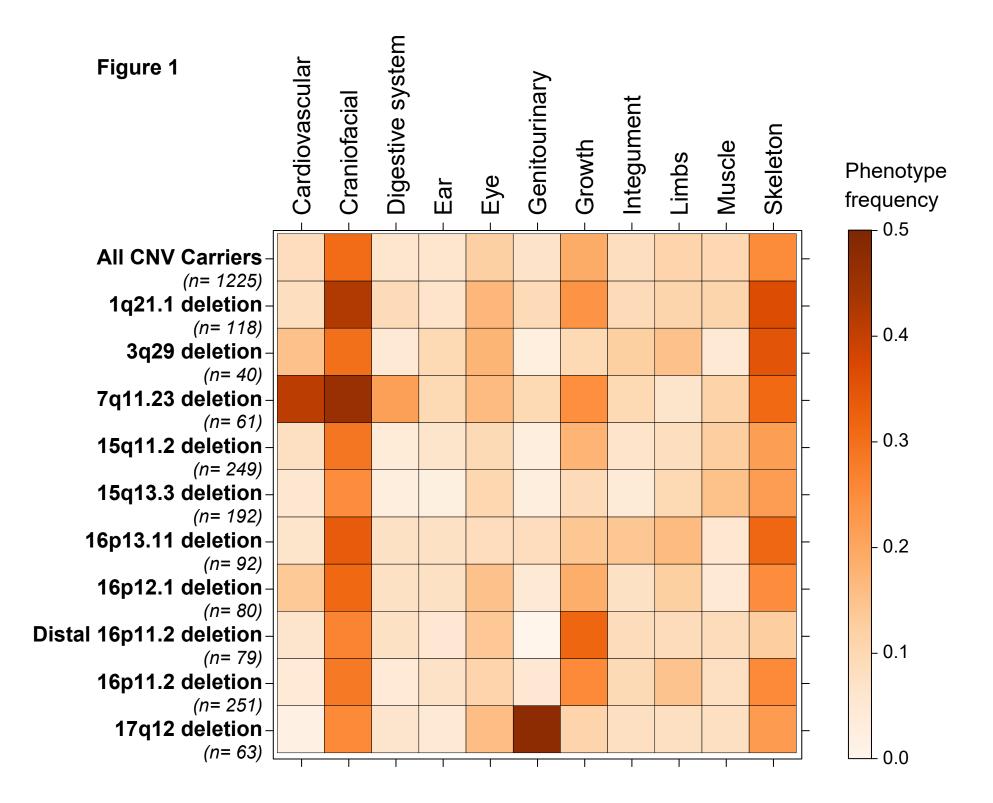
998

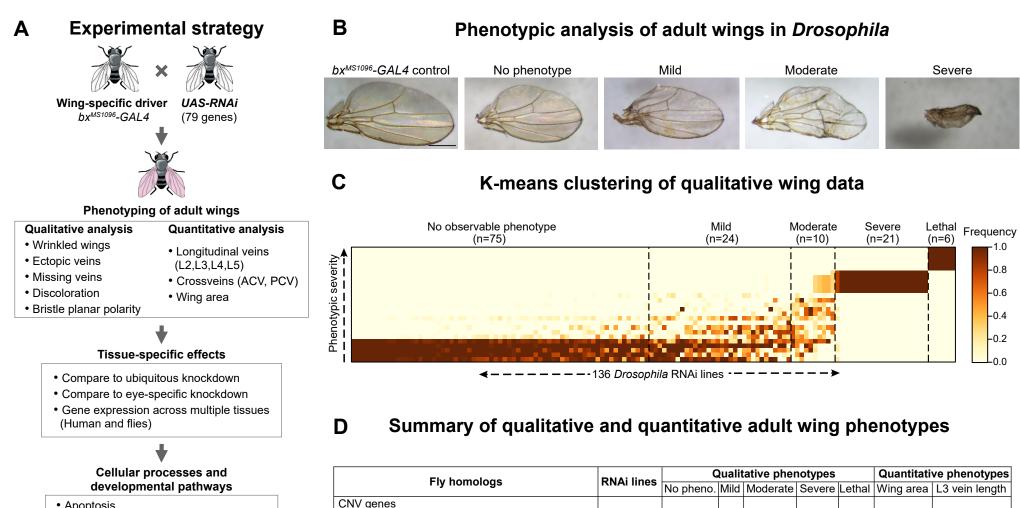
Figure 9. Connectivity of human CNV genes with conserved signaling pathway genes in 999 human tissue-specific networks. (A) Representative diagrams of eight human CNV and 1000 1001 neurodevelopmental genes whose fly homologs disrupt the Notch signaling pathway and 57 human Notch signaling genes within kidney, heart, and brain-specific gene interaction networks 1002 are shown. Yellow nodes represent CNV and neurodevelopmental genes, pink nodes represent 1003 1004 Notch signaling pathway genes, and green nodes represent connector genes within the shortest paths between CNV and Notch pathway genes. (B) Violin plots showing the average 1005 connectivity (i.e. inverse of shortest path lengths) of CNV genes to genes in Hedgehog, Notch, 1006 1007 and Wnt signaling pathways across the tested tissue-specific networks (n=322-810 pairwise interactions, p < 0.05, two-tailed Welch's t-test with Benjamini-Hochberg correction). (C) 1008 Table showing enriched clusters of Gene Ontology (GO) Biological Process terms for connector 1009 genes observed for each signaling pathway in the three tested tissue-specific networks, 1010 categorized by enrichments in ubiquitous, neuronal, and non-neuronal tissues (p<0.05, Fisher's 1011 1012 Exact test with Benjamini-Hochberg correction). 1013 Figure 10. A multigenic model for neuronal and non-neuronal phenotypes associated with 1014

1015 pathogenic CNVs. Schematic of a multigenic model for neuronal and non-neuronal phenotypes

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- 1016 associated with pathogenic CNVs. While a subset of genes within CNV regions contribute
- 1017 towards tissue-specific phenotypes, a majority of genes contribute towards both neuronal and
- 1018 non-neuronal phenotypes through disruption of developmental signaling pathways and global
- 1019 biological processes.





(15q11.2, 15q13.3, 16p11.2, Distal 16p11.2,

Known neurodevelopmental genes

Total

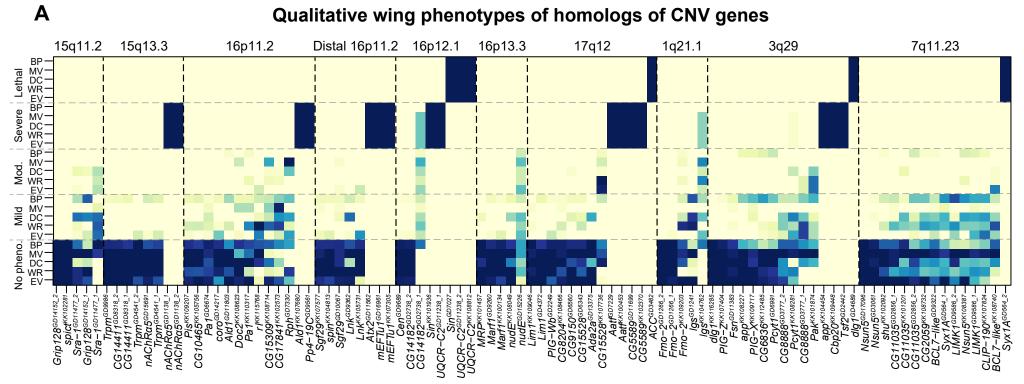
(β-catenin, core genes, microcephaly)

16p12.1, 16p13.11, 17q12, 1q21.1, 3q29, 7q11.23)

- Apoptosis
- Cell proliferation
- Disruptions in signaling pathways
- Human tissue-specific network analysis (Brain, heart, kidney)

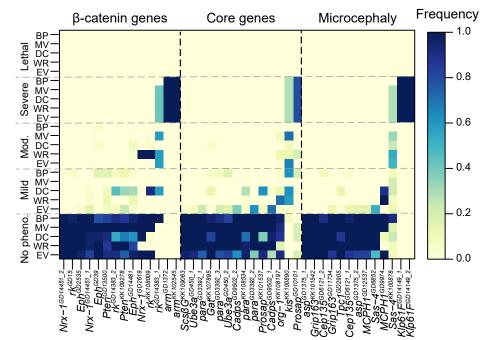
Figure 3

В

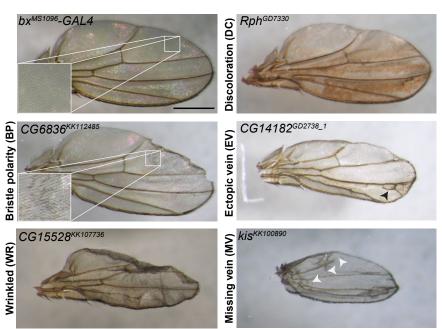


С

Qualitative wing phenotypes of homologs of neurodevelopmental genes

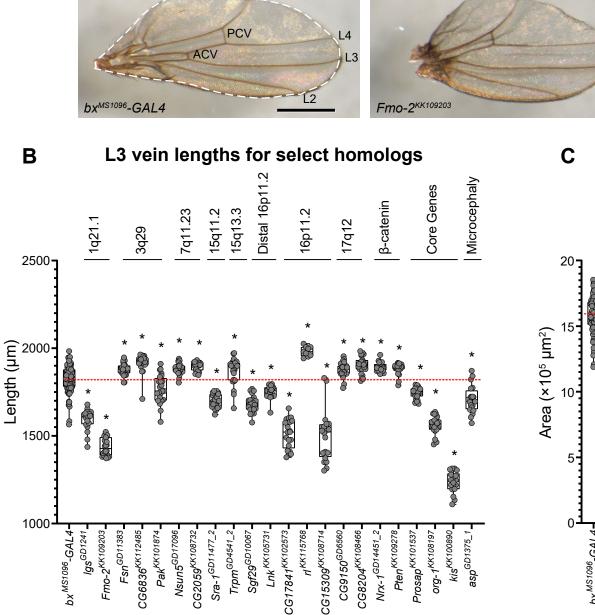


#### Representative qualitative phenotypes in the adult wing



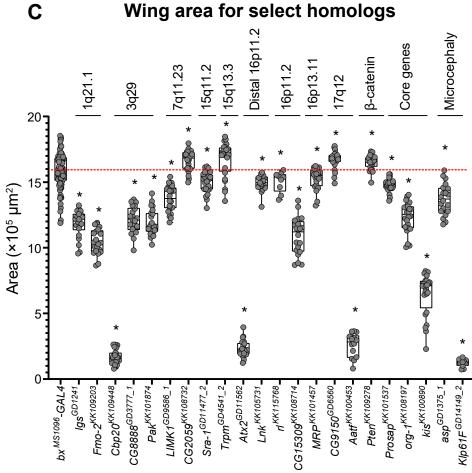
## Representative quantitative phenotypes in the adult wing

Smaller area/L3 vein length



L5

Larger area/L3 vein length

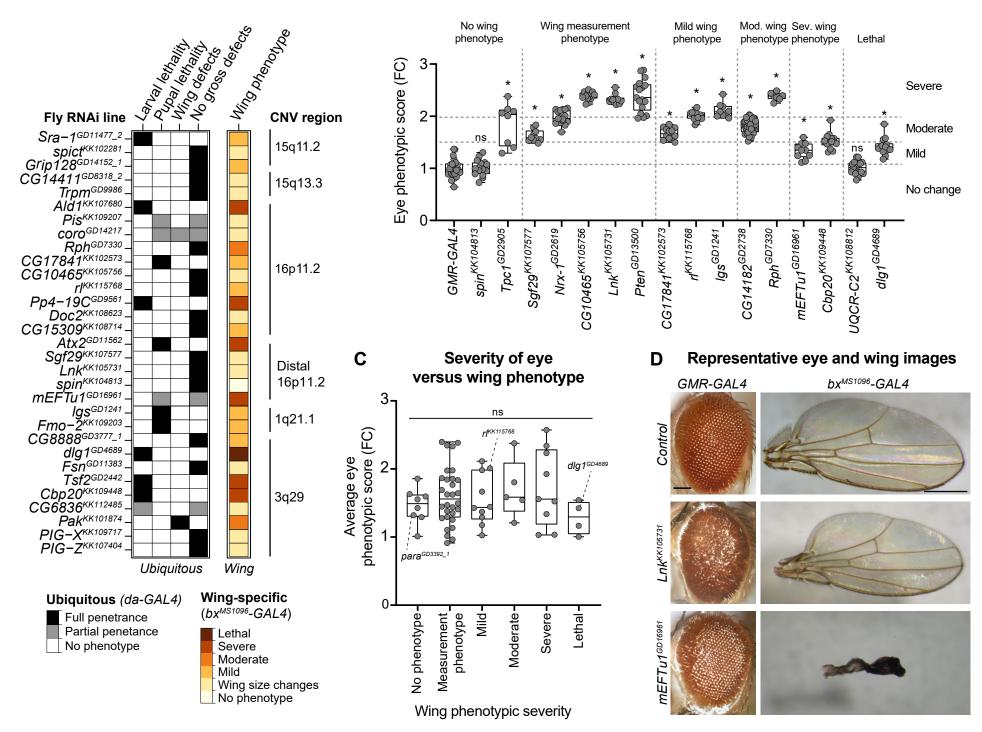


Α

A Ubiquitous knockdown

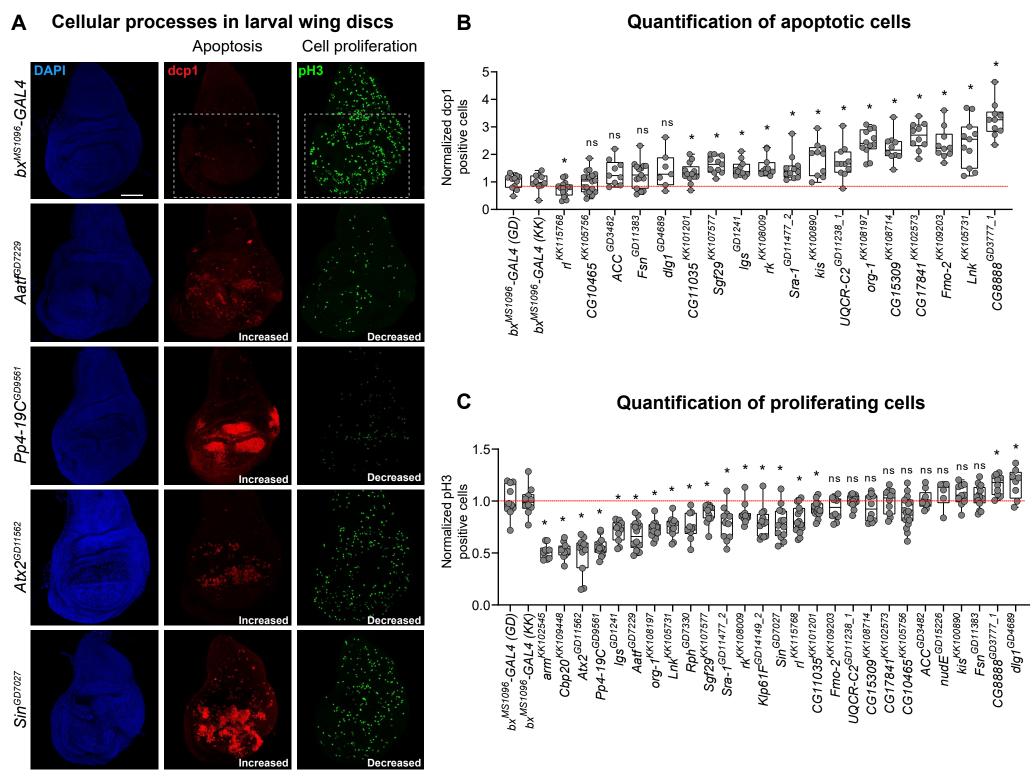
В

Eye versus wing phenotypes

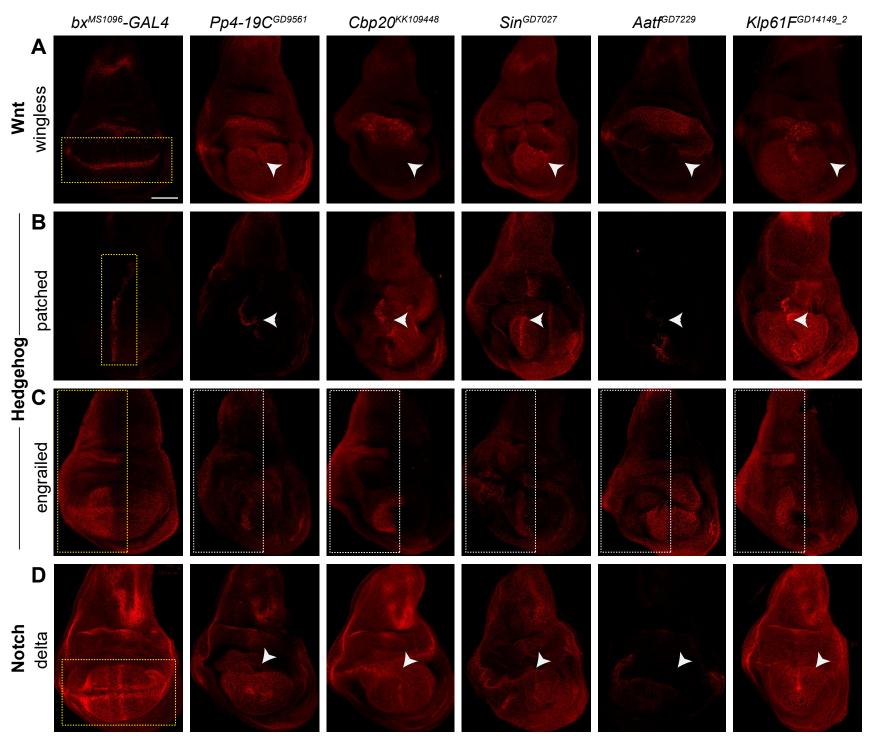


#### 309 0465 Wing phenotype 150 Lethal ß Severe Moderate Wing phenotype Mild . Wing size changes No phenotype CNS Larval Drosophila Fat body Gut-(FlyAtlas) Expression Trachea Very high Brain -High Adult Drosophila Fat body Moderate Gut-Low (FlyAtlas) No expression Heart-В Expression patterns of CNV genes across multiple human tissues Distal 16p11.2 Microcephaly Core genes 16p13.11 3-catenin 16p11.2 15q11.2 15q13.3 7q11.23 16p12.1 1q21.1 7q12 3q29 **CNV** regions 1<u>C</u>30 C101 5 Expression TUTON Brain -Very high Heart-X High Kidney Х Х Х Х Moderate Liver Х Х Low Lung Х X Muscle No expression

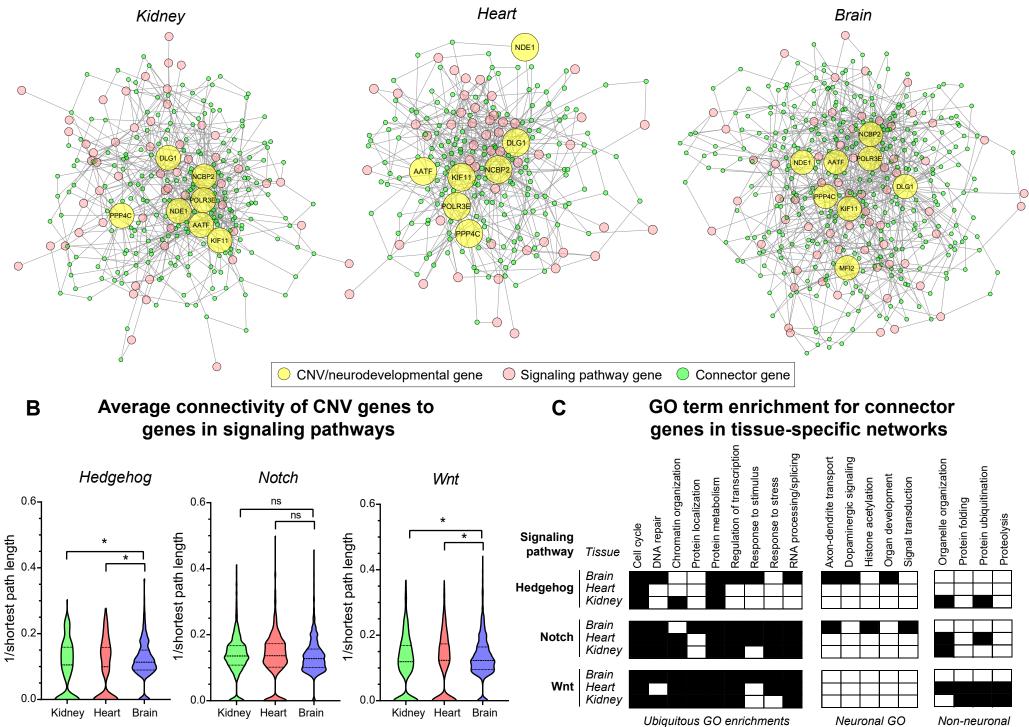
#### A Expression patterns of fly homologs of CNV genes across multiple fly tissues



## Disruption of signaling pathways in larval wing discs



A Human CNV genes interact with Notch signaling pathway genes in multiple tissues



Non-neuronal GO enrichments

enrichments

Figure 10

**CNV** region

