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8	Conserved microRNA targeting reveals preexisting gene dosage
9	sensitivities that shaped amniote sex chromosome evolution
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25 Mammalian X and Y chromosomes evolved from an ordinary autosomal pair. Genetic 26 decay of the Y led to X chromosome inactivation (XCI) in females, but some Y-linked genes 27 were retained during the course of sex chromosome evolution, and many X-linked genes 28 did not become subject to XCI. We reconstructed gene-by-gene dosage sensitivities on the 29 ancestral autosomes through phylogenetic analysis of microRNA (miRNA) target sites and 30 compared these preexisting characteristics to the current status of Y-linked and X-linked 31 genes in mammals. Preexisting heterogeneities in dosage sensitivity, manifesting as 32 differences in the extent of miRNA-mediated repression, predicted either the retention of a 33 Y homolog or the acquisition of XCI following Y gene decay. Analogous heterogeneities 34 among avian Z-linked genes predicted either the retention of a W homolog or gene-specific 35 dosage compensation following W gene decay. Genome-wide analyses of human copy 36 number variation indicate that these heterogeneities consisted of sensitivity to both 37 increases and decreases in dosage. We propose a model of XY/ZW evolution incorporating 38 such preexisting dosage sensitivities in determining the evolutionary fates of individual 39 genes. Our findings thus provide a more complete view of the role of dosage sensitivity in 40 shaping the mammalian and avian sex chromosomes, and reveal an important role for 41 post-transcriptional regulatory sequences (miRNA target sites) in sex chromosome 42 evolution.

43

44 INTRODUCTION

The mammalian X and Y chromosomes evolved from a pair of ordinary autosomes over the past
300 million years (Lahn & Page, 1999). Only 3% of genes on the ancestral pair of autosomes
survive on the human Y chromosome (Bellott et al., 2010; Skaletsky et al., 2003), compared to

48 98% on the X chromosome (Mueller et al., 2013). In females, one copy of the X chromosome is 49 silenced by X inactivation (XCI); this silencing evolved on a gene-by-gene basis following Y 50 gene loss and compensatory X upregulation (Berletch et al., 2015; Jegalian & Page, 1998; Ross 51 et al., 2005; Tukiainen et al., 2017), and some genes escape XCI in humans (Carrel & Willard, 52 2005) and other mammals (Yang, Babak, Shendure, & Disteche, 2010). In mammals, dosage 53 compensation, which refers to any mechanism restoring ancestral dosage following gene loss 54 from the sex-specific chromosome, thus consists of both X upregulation following Y gene loss 55 and the subsequent acquisition of XCI. 56 In parallel, the avian Z and W sex chromosomes evolved from a different pair of 57 autosomes than the mammalian X and Y chromosomes (Bellott et al., 2010; Nanda et al., 1999; 58 Ross et al., 2005). Decay of the female-specific W chromosome was similarly extensive, but 59 birds did not evolve a large-scale inactivation of Z-linked genes analogous to XCI in mammals 60 (Itoh et al., 2007). Dosage compensation, as measured by a male/female expression ratio close to 61 1, has been observed for some Z-linked genes in some tissues. (Mank & Ellegren, 2009; Uebbing 62 et al., 2015; Zimmer, Harrison, Dessimoz, & Mank, 2016). Thus, genes previously found on the 63 ancestral autosomes that gave rise to the mammalian or avian sex chromosomes have undergone 64 significant changes in gene dosage. In modern mammals, these molecular events have resulted in 65 three classes of ancestral X-linked genes representing distinct evolutionary fates: those with a 66 surviving Y homolog, those with no Y homolog and subject to XCI, and those with no Y 67 homolog but escaping XCI. In birds, two clear classes of ancestral Z-linked genes have arisen: 68 those with or without a W homolog, with additional heterogeneity among Z-linked genes without 69 a W homolog as a result of gene-specific dosage compensation. Identifying gene-by-gene 70 properties that distinguish classes of X- and Z-linked genes is thus crucial to understanding the

selective pressures underlying the molecular events of mammalian and avian sex chromosomeevolution.

73	Emerging evidence suggests a role for gene dosage sensitivity in mammalian and avian
74	sex chromosome evolution. X- and Z-linked genes with surviving homologs on the mammalian
75	Y or avian W chromosomes are enriched for important regulatory functions and predictors of
76	haploinsufficiency compared to those lacking Y or W homologs (Bellott et al., 2014, 2017);
77	similar observations have been made in fish (White, Kitano, & Peichel, 2015) and Drosophila
78	(Kaiser, Zhou, & Bachtrog, 2011). Human X- and chicken Z-linked genes that show the
79	strongest signatures of dosage compensation in either lineage also show signs of dosage
80	sensitivity as measured by membership in large protein complexes (Pessia, Makino, Bailly-
81	Bechet, McLysaght, & Marais, 2012) or evolutionary patterns of gene duplication and retention
82	(Zimmer et al., 2016). Despite these advances, little is known regarding selective pressures
83	resulting from sensitivity to dosage increases, as these studies either focused on
84	haploinsufficiency or employed less direct predictors of dosage sensitivity. Furthermore, it is not
85	known whether heterogeneities in dosage sensitivity among classes of sex-linked genes were
86	acquired during sex chromosome evolution, or predated the emergence of sex chromosomes, as
87	there has been no explicit, systematic reconstruction of dosage sensitivity on the ancestral
88	autosomes that gave rise to the mammalian and avian sex chromosomes.
89	To assess the role of preexisting dosage sensitivities in XY and ZW evolution, we sought
90	to employ a measure of dosage sensitivity that could be 1) demonstrably informative with respect
91	to sensitivity to dosage increases, and 2) explicitly reconstructed on the ancestral autosomes. We

93 of gene dosage by lowering target mRNA levels through pairing to the 3` untranslated region

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focused on regulation by microRNAs (miRNAs), small noncoding RNAs that function as tuners

94	(UTR) (Bartel, 2009). The repressive nature of miRNA targeting is informative with respect to
95	sensitivity to dosage increases, allowing for a more complete understanding of the role of dosage
96	sensitivity in sex chromosome evolution. Both miRNAs themselves and their complementary
97	target sites can be preserved over millions of years of vertebrate evolution, facilitating the
98	reconstruction of miRNA targeting on the ancestral autosomes through cross-species sequence
99	alignments. As miRNA targeting occurs post-transcriptionally, reconstruction of its ancestral
100	state is decoupled from transcriptional regulatory mechanisms such as XCI that evolved
101	following X-Y differentiation.
102	
103	RESULTS
104	Analysis of human copy number variation indicates conserved microRNA targeting of
105	genes sensitive to dosage increases
106	We first sought to determine whether conserved targeting by microRNAs (miRNAs) correlates
107	with sensitivity to dosage increases across the human genome. To estimate pressure to maintain
108	miRNA targeting, we used published probabilities of conserved targeting (P_{CT} scores) for each
109	gene-miRNA interaction in the human genome. The P_{CT} score reflects an estimate of the
110	probability that a given gene-miRNA interaction is conserved due to miRNA targeting, obtained
111	by calculating the conservation of the relevant miRNA target sites relative to the conservation of
112	the entire 3° UTR (Friedman, Farh, Burge, & Bartel, 2009). In this manner, the P_{CT} score
113	intrinsically controls for differences in background conservation and sequence composition, both
114	of which vary widely among 3°UTRs due to differing rates of expression divergence and/or
115	sequence evolution. We refer to these P_{CT} scores as "miRNA conservation scores" in the
116	remainder of the text.

117 A recent study reported a correlation between these miRNA conservation scores and 118 predicted haploinsufficiency (Pinzón et al., 2016), indicating that conserved miRNA targeting 119 broadly corresponds to dosage sensitivity. However, such a correlation does not isolate the 120 effects of sensitivity to dosage increases, which we expect to be particularly important in the 121 context of miRNA targeting. We reasoned that genes for which increases in dosage are 122 deleterious should be depleted from the set of observed gene duplications in healthy human 123 individuals. We used a catalogue of rare genic copy number variation among 59,898 control 124 human exomes (Exome Aggregation Consortium, ExAC)(Ruderfer et al., 2016) to classify 125 autosomal protein-coding genes as exhibiting or lacking duplication or deletion in healthy 126 individuals (see Methods). We compared duplicated and non-duplicated genes with the same 127 deletion status in order to control for differences in sensitivity to underexpression. We found that 128 non-duplicated genes have significantly higher miRNA conservation scores than duplicated 129 genes, irrespective of deletion status (Figure 1A,B). Non-deleted genes also have significantly 130 higher scores than deleted genes irrespective of duplication status (Supplemental Figure S1), but 131 duplication status has a greater effect on miRNA conservation scores than does deletion status 132 (blue vs. orange boxes, Figure 1C). Thus, conserved miRNA targeting is a feature of genes 133 sensitive to changes in gene dosage in humans and is especially informative with regards to 134 sensitivity to dosage increases, consistent with the known role of miRNAs in tuning gene dosage 135 by lowering target mRNA levels.

137 X-Y pairs and X-inactivated genes have higher miRNA conservation scores than X escape 138 genes

139 We next assessed whether the three classes of X-linked genes differ with respect to dosage 140 sensitivity as inferred by conserved miRNA targeting. To delineate these classes, we began with 141 the set of ancestral genes reconstructed through cross-species comparisons of the human X 142 chromosome and orthologous chicken autosomes (Bellott et al., 2014, 2017, 2010; Hughes et al., 143 2012; Mueller et al., 2013). We designated ancestral X-linked genes with a surviving human Y 144 homolog (Skaletsky et al., 2003) as X-Y pairs and also considered the set of X-linked genes with 145 a surviving Y homolog in any of eight mammals (Bellott et al., 2014) to increase the 146 phylogenetic breadth of findings regarding X-Y pairs. A number of studies have catalogued the 147 inactivation status of X-linked genes in various human tissues and cell-types. We used a meta-148 analysis that combined results from three studies by assigning a "consensus" X-inactivation 149 status to each gene (Balaton, Cotton, & Brown, 2015) to designate the remainder of ancestral 150 genes lacking a Y homolog as subject to or escaping XCI. In summary, we classified genes as 151 either: 1) X-Y pairs, 2) lacking a Y homolog and subject to XCI (X-inactivated), or 3) lacking a 152 Y homolog but escaping XCI (X escape).

We found that human X-Y pairs have the highest miRNA conservation scores, followed by X-inactivated and finally X escape genes (Figure 2A,B). The expanded set of X-Y pairs across eight mammals also has significantly higher miRNA conservation scores than ancestral Xlinked genes with no Y homolog (Supplemental Figure S2). Observed differences between miRNA conservation scores are not driven by distinct subsets of genes in each class, as indicated by gene resampling with replacement (Supplemental Figure S3). The decrease in miRNA conservation scores of X escape genes relative to X-inactivated genes and X-Y pairs is not

160 driven by genes that escape XCI variably across individuals (Supplemental Figure S4), and was 161 consistent even when including ambiguous genes as either X-inactivated or X escape genes 162 (Supplemental Figure S5). We also verified that these differences were not driven by artificially 163 inflated or deflated conservation scores of certain target sites due to non-uniformity in 3° UTR 164 conservation (Methods, Supplemental Figure S6). 165 Finally, we assessed whether miRNA conservation scores distinguish the three classes by 166 providing additional information not accounted for by known factors (Bellott et al., 2014) 167 influencing evolutionary outcomes. We used logistic regression to model, for each gene, the 168 probability of falling into each of the three classes (X-Y pair, X-inactivated, or X escape) as a 169 linear combination of haploinsufficiency probability (pHI) (Huang, Lee, Marcotte, & Hurles, 170 2010), human expression breadth (GTEx Consortium, 2015), purifying selection, measured by 171 the ratio of non-synonymous to synonymous substitution rates (dN/dS) between human and 172 mouse orthologs (Yates et al., 2016), and mean gene-level miRNA conservation scores. We note 173 that pHI is a score composed of several genic features, one of which is the number of protein-174 protein interactions, consistent with the idea that members of large protein complexes tend to be 175 dosage-sensitive (Papp, Pal, & Hurst, 2003; Pessia et al., 2012). Removing either miRNA 176 conservation or pHI as predictors from the full model resulted in inferior model fits as measured 177 by Aikake's information criterion (AIC) (full model, AIC 321.5; full model minus miRNA 178 conservation, AIC 327.7; full model minus pHI, AIC 327.3; higher AIC indicates inferior model). 179 Therefore, miRNA conservation and pHI contribute independent information that distinguishes 180 the 3 classes of X-linked genes. Based on our analyses of autosomal copy number variation 181 (Figure 1), we attribute this independence to the fact that miRNA conservation scores are most 182 informative with regards to sensitivity to dosage increases. Taken together, these results indicate

significant heterogeneity in dosage sensitivity, as inferred by miRNA target site conservation,
among the three classes of ancestral X-linked genes: X-Y pairs are the most dosage-sensitive,
while X-inactivated genes are of intermediate dosage sensitivity, and X escape genes are the
least dosage-sensitive.

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188 Heterogeneities in X-linked miRNA targeting were present on the ancestral autosomes

189 We next asked whether differences in miRNA targeting were present on the ancestral autosomes

190 that gave rise to the mammalian X and Y chromosomes. To reconstruct the ancestral state of

191 miRNA targeting, we first focused on miRNA target sites in the 3` UTR of human orthologs that

align with perfect identity to a site in the corresponding chicken ortholog; these sites were likely

193 present in the common ancestor of mammals and birds (Figure 3A,B). We found that X-Y pairs

194 have the most human-chicken conserved target sites, followed by X-inactivated genes, and then

195 X escape genes (Figure 3C, top). Unlike the miRNA conservation scores used earlier, this metric

196 does not account for background conservation; we therefore estimated the background

197 conservation of each 3` UTR using shuffled miRNA family seed sequences (see Methods). X-Y

198 pairs, X-inactivated genes, and X escape genes do differ significantly with respect to background

199 conservation (data not shown), but these differences cannot account for the observed differences

200 in true human-chicken conserved sites (Figure 3C, bottom). We observed similar results for the

201 expanded set of X-Y pairs across 8 mammals (Supplemental Figure S7A).

Differences in the number of human-chicken conserved sites among the three classes of X-linked genes could be explained by heterogeneity in miRNA targeting present on the ancestral autosomes, or by ancestral homogeneity followed by different rates of target site loss during or following X-Y differentiation. To distinguish between these two possibilities, we took advantage 206 of previous reconstructions of human sex chromosome evolution (Figure 3A) (Bellott et al., 207 2014), which confirmed that, following the divergence of placental mammals from marsupials, 208 an X-autosome chromosomal fusion generated the X-added region (XAR) (Watson, Spencer, 209 Riggs, & Graves, 1990). Genes on the XAR are therefore X-linked in placental mammals, but 210 autosomal in marsupials such as the opossum. We limited our analysis to genes in the XAR and 211 target sites conserved between orthologous chicken and opossum 3° UTRs, ignoring site 212 conservation in humans; these sites were likely present in the common ancestor of mammals and 213 birds, and an absence of such sites cannot be explained by site loss following X-Y differentiation. 214 We observed the same pattern as with the human-chicken conserved sites, both before and after 215 accounting for background 3° UTR conservation (Figure 3D, three gene classes; Supplemental 216 Figure S7B, X-Y pairs across 8 mammals). These results demonstrate that the autosomal 217 precursors of X-Y pairs and X-inactivated genes were subject to more miRNA-mediated 218 regulation than X escape genes. Combined with our earlier results, we conclude that present-day 219 heterogeneities in dosage sensitivity on the mammalian X chromosome existed on the ancestral 220 autosomes from which it derived.

221

222 Z-W pairs have higher miRNA conservation scores than other ancestral Z-linked genes

We next assessed whether classes of avian Z-linked genes, those with and without a W homolog, show analogous heterogeneities in sensitivity to dosage increases. We used the set of ancestral genes reconstructed through cross-species comparisons of the avian Z chromosome and orthologous human autosomes and focused on the set of Z-W pairs identified by sequencing of the chicken W chromosome (Bellott et al., 2017, 2010). To increase the phylogenetic breadth of our comparisons, we also included candidate Z-W pairs obtained through comparisons of male

229 and female genome assemblies (4 species set) or inferred by read-depth changes in female 230 genome assemblies (14 species set, see Methods for details) (Zhou et al., 2014). The more 231 complete 3` UTR annotations in the human genome relative to chicken allow for a more accurate 232 assessment of conserved miRNA targeting. Accordingly, we analyzed the 3° UTRs of the human 233 orthologs of chicken Z-linked genes. 234 We found that the human orthologs of Z-W pairs have higher miRNA conservation 235 scores than the human orthologs of other ancestral Z genes (Figure 4A, B). Differences in 236 miRNA conservation scores between Z-W pairs and other ancestral Z genes remained significant 237 when considering the expanded sets of Z-W pairs across four and 14 avian species 238 (Supplemental Figure S8). These differences are not driven by distinct subsets of genes, as 239 indicated by gene resampling with replacement (Supplemental Figure S9), and cannot be 240 accounted for by within-UTR variation in regional conservation (Supplemental Figure S10). 241 Logistic regression models indicate that miRNA conservation scores provide additional 242 information not captured by known factors (Bellott et al., 2017) influencing survival of W-linked 243 genes (full model model, AIC 127.1; full model minus miRNA conservation, AIC 137.8; full 244 model minus pHI 132.7; higher AIC indicates inferior model). Together, these results indicate 245 that Z-linked genes with a surviving W homolog are more sensitive to changes in dosage -- both 246 increases and decreases -- than are genes without a surviving W homolog. 247 While there are two clear classes of Z-linked genes -- those with or without a W homolog 248 -- studies of Z-linked gene expression have suggested additional heterogeneity among Z-linked 249 genes without a W homolog due to gene-specific dosage compensation (Mank & Ellegren, 2009; 250 Uebbing et al., 2015; Zimmer et al., 2016). If Z-linked genes with no W homolog exist upon a 251 continuum from non-compensated to dosage-compensated, those that are more compensated

252 should have more conserved miRNA target sites, reflective of greater dosage sensitivity. We 253 quantified the dosage compensation by using RNA sequencing data (Marin et al., 2017) to 254 compare, in 4 somatic tissues, the chicken male/female expression ratio to the analogous ratio in 255 human and anolis (see Methods). In the brain, kidney, and liver, Z-linked genes with no W 256 homolog and higher mean miRNA conservation scores had male/female expression ratios closer 257 to 1 (Supplemental Figure S11). Thus, in addition to the above-described differences between Z-258 linked genes with or without a W homolog, Z-linked genes with no W homolog but with more 259 effective dosage compensation have more conserved miRNA target sites than non-compensated 260 genes.

261

262 Heterogeneities in Z-linked miRNA targeting were present on the ancestral autosomes

263 We next asked whether differences in miRNA targeting between Z-W pairs and other ancestral 264 Z-linked genes were present on the ancestral autosomes that gave rise to the avian Z and W 265 chromosomes. We found that chicken Z-W pairs have more human-chicken-conserved miRNA 266 target sites than their Z-linked counterparts without surviving W homologs, both before (Figure 267 5C, top) and after (Figure 5C, bottom) accounting for the background conservation of each 268 individual 3° UTR. To confirm that these differences represent ancestral heterogeneity rather 269 than differential site loss during or following Z-W differentiation, we instead considered the 270 number of sites conserved between human and anolis lizard, which diverged from birds prior to 271 Z-W differentiation (Figure 5A). Chicken Z-W pairs contain an excess of human-anolis 272 conserved miRNA target sites, both before (Figure 5D, top) and after (Figure 5D, bottom) 273 accounting for the background conservation of each individual 3` UTR. We observed similar 274 results with the predicted four-species (Supplemental Figure S12) and 14-species (Supplemental

275	Figure S13) sets of Z-W pairs. Thus, the autosomal precursors of avian Z-W pairs were subject
276	to more miRNA-mediated regulation than the autosomal precursors of Z-linked genes that lack a
277	W homolog. Furthermore, in the liver and brain, Z-linked genes with no W homolog with an
278	excess of human-chicken-conserved miRNA sites had male/female expression ratios closer to 1,
279	implying more effective dosage compensation (Supplementary Figure S14). Together, these
280	results indicate heterogeneity in dosage sensitivity among genes on the ancestral autosomes that
281	gave rise to the avian Z chromosome.

282

283 Analyses of experimental datasets validate miRNA target site function

284 Our results to this point, which indicate preexisting heterogeneities in dosage constraints among 285 X- or Z-linked genes as inferred by predicted miRNA target sites, lead to predictions regarding 286 the function of these sites in vivo. To test these predictions, we turned to publically available 287 experimental datasets consisting both of gene expression profiling following transfection or 288 knockout of individual miRNAs, and of high-throughput crosslinking-immunoprecipitation 289 (CLIP) to identify sites that bind Argonaute in vivo (see Methods). If the above-studied sites are 290 effective in mediating target repression, targets of an individual miRNA should show increased 291 expression levels or Argonaute binding following miRNA transfection, and decreased expression 292 levels following miRNA knockout. Together, our analyses of publically available datasets 293 fulfilled these predictions, validating the function of these sites in multiple cellular contexts and 294 species (Figure 6). From the gene expression profiling data, we observed results consistent with 295 effective targeting by a) eleven different miRNA families in human HeLa cells (Supplemental 296 Figure S15), b) four different miRNAs in human HCT116 and HEK293 cells (Supplemental 297 Figure S16), and c) miR-155 in mouse B and Th1 cells (Supplemental Figure S17). In the CLIP

298	data, the human orthologs of X- or Z-linked targets of miR-124 are enriched for Argonaute-
299	bound clusters that appear following miR-124 transfection, while a similar but non-significant
300	enrichment is observed for miR-7 (Supplemental Figure S18). Thus, conserved miRNA target
301	sites used to infer dosage constraints on X-linked genes and the autosomal orthologs of Z-linked
302	genes can effectively mediate target repression in living cells.
303	
304	DISCUSSION
305	Here, through the evolutionary reconstruction of microRNA (miRNA) target sites, we provide
306	evidence for preexisting heterogeneities in dosage sensitivity among genes on the mammalian X
307	and avian Z chromosomes. We first showed that, across all human autosomal genes, dosage
308	sensitivity as indicated by patterns of genic copy number variation correlates with the degree
309	of conserved miRNA targeting. We found that conserved targeting correlates especially strongly
310	with sensitivity to dosage increases, consistent with miRNA targeting serving to reduce gene
311	expression. Turning to the sex chromosomes of mammals and birds, genes that retained a
312	homolog on the sex-specific Y or W chromosome (X-Y and Z-W pairs) have more conserved
313	miRNA target sites than genes with no Y or W homolog. In mammals, genes with no Y homolog
314	that became subject to XCI have more conserved sites than those that continued to escape XCI
315	following Y gene decay. In birds, across Z-linked genes with no W homolog, the degree of
316	conserved miRNA targeting correlates with the degree of gene-specific dosage compensation.
317	We then reconstructed the ancestral state of miRNA targeting, observing significant
318	heterogeneities in the extent of miRNA targeting, and thus dosage sensitivity, on the ancestral
319	autosomes that gave rise to the mammalian and avian sex chromosomes. Finally, through
320	analysis of publically available experimental datasets, we validated the function, in living cells,

of the miRNA target sites used to infer dosage sensitivity. We thus conclude that differences in
dosage sensitivity – both to increases and to decreases in gene dosage -- among genes on the
ancestral autosomes influenced their evolutionary trajectory during sex chromosome evolution,
not only on the sex-specific Y and W chromosomes, but also on the sex-shared X and Z
chromosomes.

326 Our findings build upon previous work in three important ways. First, our analysis of 327 miRNA-mediated repression indicates that these heterogeneities consist of sensitivities to dosage 328 increases and decreases, whereas previous studies had either focused on sensitivity to 329 underexpression or could not differentiate the two. Second, our reconstruction of miRNA 330 targeting on the ancestral autosomes provides direct evidence that heterogeneities in dosage 331 sensitivity among classes of X- and Z-linked were preexisting rather than acquired during sex 332 chromosome evolution. Finally, by pointing to specific regulatory sequences (miRNA target 333 sites) functioning to tune gene dosage both prior to and during sex chromosome evolution, our 334 study provides a view of dosage compensation encompassing post-transcriptional regulation. 335 Human disease studies support the claim that increased dosage of X-Y pairs and X-336 inactivated genes is deleterious to fitness. Copy number gains of the X-linked gene KDM6A, 337 which has a surviving human Y homolog, are found in patients with developmental 338 abnormalities and intellectual disability (Lindgren et al., 2013). HDAC6, CACNA1F, GDI1, and 339 *IRS4* all lack Y homologs and are subject to XCI in humans. A mutation in the 3[°] UTR of 340 HDAC6 abolishing targeting by miR-433 has been linked to familial chondrodysplasia in both 341 sexes (Simon et al., 2010). Likely gain-of-function mutations in CACNA1F cause congenital 342 stationary night blindness in both sexes (Hemara-Wahanui et al., 2005). Copy number changes of 343 GDI1 correlate with the severity of X-linked mental retardation in males, with female carriers

344 preferentially inactivating the mutant allele (Vandewalle et al., 2009). Somatic genomic deletions 345 downstream of *IRS4* lead to its overexpression in lung squamous carcinoma (Weischenfeldt et al., 346 2017). Males with partial X disomy due to translocation of the distal long arm of the X 347 chromosome (Xq28) to the long arm of the Y chromosome show severe mental retardation and 348 developmental defects (Lahn et al., 1994). Most genes in Xq28 are inactivated in 46,XX females 349 but escape inactivation in such X;Y translocations, suggesting that increased dosage of Xq28 350 genes caused the cognitive and developmental defects. We anticipate that further studies will 351 reveal additional examples of the deleterious effects of increases in gene dosage of X-Y pairs 352 and X-inactivated genes. 353 We and others previously proposed that Y gene decay drove upregulation of homologous 354 X-linked genes in both males and females, and that XCI subsequently evolved at genes sensitive 355 to increased expression from two active X-linked copies in females (Jegalian & Page, 1998; 356 Ohno, 1967). Our finding that X-inactivated genes have higher miRNA conservation scores than 357 X escape genes is consistent with this aspect of the model. However, recent studies indicating 358 heterogeneity in dosage sensitivity between classes of mammalian X- or avian Z-linked genes 359 (Bellott et al., 2014, 2017; Pessia et al., 2012; Zimmer et al., 2016), combined with the present 360 finding that these dosage sensitivities existed on the ancestral autosomes, challenge the previous 361 assumption of a single evolutionary pathway for all sex-linked genes. 362 We therefore propose a revised model of X-Y and Z-W evolution in which the ancestral 363 autosomes that gave rise to the mammalian and avian sex chromosomes contained three (or two, 364 in the case of birds) classes of genes with differing dosage sensitivities (Figure 7A,B). For 365 ancestral genes with high dosage sensitivity, Y or W gene decay would have been highly 366 deleterious, and thus the Y- or W-linked genes were retained. According to our model, these

367	genes' high dosage sensitivity also precluded upregulation of the X- or Z-linked homolog, and,
368	in mammals, subsequent X-inactivation; indeed, their X-linked homologs continue to escape
369	XCI (Bellott et al., 2014). For ancestral mammalian genes of intermediate dosage sensitivity, Y
370	gene decay did occur, and was accompanied or followed by compensatory upregulation of the X-
371	linked homolog in both sexes; the resultant increased expression in females was deleterious and
372	led to the acquisition of XCI. Ancestral mammalian genes of low dosage sensitivity continued to
373	escape XCI following Y decay; heterogeneity in X upregulation may further subdivide such
374	genes (Figure 6A). These genes' dosage insensitivity set them apart biologically, and
375	evolutionarily, from the other class of X-linked genes escaping XCI those with a surviving Y
376	homolog.
377	Our revised model relates preexisting, gene-by-gene heterogeneities in dosage sensitivity
378	to the outcomes of sex chromosome evolution. However, the suppression of X-Y recombination
379	did not occur on a gene-by-gene basis, instead initiating Y gene decay and subsequent dosage
380	compensation through a series of large-scale inversions encompassing many genes (Lahn & Page,
381	1999). The timings and boundaries of these evolutionary strata varied among mammalian
382	lineages, thus leading to unique chromosome-scale evolutionary dynamics across mammals.
383	These large-scale changes would have then allowed for genic selection to take place according to
384	the preexisting dosage sensitivities outlined above. In this way, the course of sex chromosome
385	evolution in mammals is a composite of 1) preexisting, gene-by-gene dosage sensitivities and 2)
386	the manner in which the history of the X and Y unfolded in particular lineages via discrete, large-
387	scale inversions.

In this study, we have focused on classes of ancestral X-linked genes delineated by the survival of a human Y homolog or by the acquisition of XCI in humans, but such evolutionary

390 states can differ among mammalian lineages and species. In mouse, for instance, both Y gene 391 decay (Bellott et al., 2014) and the acquisition of X-inactivation (Yang et al., 2010) are more 392 complete than in humans or other mammals, as exemplified by *RPS4X*, which retains a Y 393 homolog and continues to escape XCI in primates, but has lost its Y homolog and is subject to 394 XCI in rodents. These observations could be explained by shortened generation times in the 395 rodent lineage, resulting in longer evolutionary times, during which the forces leading to Y gene 396 decay and the acquisition of X-inactivation could act (Charlesworth & Crow, 1978; Jegalian & 397 Page, 1998; Ohno, 1967). Another case of lineage differences involves HUWE1, which lacks a Y 398 homolog and is subject to XCI in both human and mouse, but retains a functional Y homolog in 399 marsupials, where it continues to escape XCI. In the future, more complete catalogues of X-400 inactivation and escape in additional mammalian lineages would make it possible to examine 401 whether analogous, preexisting dosage sensitivities differentiate the three classes of X-linked 402 genes (X-Y pairs, X-inactivated genes, and X escape genes) in other species. 403 Previous studies have sought evidence of X-linked upregulation during mammalian sex 404 chromosome evolution using comparisons of gene expression levels between the whole of the X 405 chromosome and all of the autosomes, with equal numbers of studies rejecting or finding 406 evidence consistent with upregulation (Deng et al., 2011; Julien et al., 2012; Kharchenko, Xi, & 407 Park, 2011; Lin, Xing, Zhang, & He, 2012; Xiong et al., 2010). This is likely due to gene-by-408 gene heterogeneity in dosage sensitivities that resulted in a stronger signature of upregulation at 409 more dosage sensitive genes (Pessia et al., 2012). Similarly, studies of Z-linked gene expression 410 in birds provide evidence for the gene-by-gene nature of Z dosage compensation, as measured by 411 comparisons of gene expression levels between ZZ males and ZW females (Itoh et al., 2007; 412 Mank & Ellegren, 2009; Uebbing et al., 2015), and indicate a stronger signature of dosage

413 compensation at predicted dosage-sensitive genes (Zimmer et al., 2016). By showing that such 414 dosage sensitivities existed on the ancestral autosomes and consist of sensitivity to both increases 415 and decreases, our findings highlight an additional aspect of dosage compensation that affects 416 both birds and mammals. 417 In addition to revealing similarities between mammals and birds, our study provides a 418 view of dosage compensation that highlights post-transcriptional regulatory mechanisms, 419 pointing to specific non-coding sequences with known mechanisms (microRNA target sites) 420 functioning across evolutionary time. A recent study in birds showed a role for a Z-linked 421 miRNA, miR-2954-3p, in dosage compensation of some Z-linked genes (Warnefors et al., 2017). 422 Our study suggests an additional, broader role for miRNA targeting, with hundreds of different 423 miRNAs acting to tune gene dosage both before and during sex chromosome evolution.

424 Furthermore, our finding of greater conserved miRNA targeting of X-inactivated genes relative

to X escape genes shows that it is possible to predict the acquisition of a transcriptional

426 regulatory state (XCI) during sex chromosome evolution on the basis of a preexisting, post-

427 transcriptional regulatory state. Perhaps additional post-transcriptional regulatory mechanisms

428 and their associated regulatory elements will be shown to play roles in mammalian and avian429 dosage compensation.

Recent work has revealed that the sex-specific chromosome -- the Y in mammals and the W in birds -- convergently retained dosage-sensitive genes with important regulatory functions (Bellott et al., 2014, 2017). Our study, by reconstructing the ancestral state of post-transcriptional regulation, provides direct evidence that such heterogeneity in dosage sensitivity existed on the ancestral autosomes that gave rise to the mammalian and avian sex chromosomes. This heterogeneity influenced both survival on the sex-specific chromosomes in mammals and birds

- 436 and the evolution of XCI in mammals. Thus, two independent experiments of nature offer
- 437 empirical evidence that modern-day amniote sex chromosomes were shaped, during evolution,
- 438 by the properties of the ancestral autosomes from which they derive.

439 METHODS

440 Statistics

441 Details of all statistical tests (type of test, test statistic, and p-value) used in this manuscript are

442 provided in Supplemental Table S1.

443

444 Human genic copy number variation

- 445 To annotate gene deletions and duplications, we used data from the Exome Aggregation
- 446 Consortium (ExAC) (ftp://ftp.broadinstitute.org/pub/ExAC_release/release0.3.1/cnv/), which
- 447 consists of autosomal genic duplications and deletions (both full and partial) called in 59,898
- 448 exomes (Ruderfer et al., 2016). Further details are provided in Supplemental Methods in the
- section titled 'Human genic copy number variation'. These gene assignments are provided in
- 450 Supplemental Table S2.
- 451

452 X- and Z-linked gene sets

We utilized our previous reconstructions of the ancestral mammalian X (Bellott et al., 2014) and avian Z (Bellott et al., 2017) chromosomes, as well as information on multicopy and ampliconic X-linked genes (Mueller et al., 2013) and XCI status in humans (Balaton et al., 2015) to delineate classes of X- and Z-linked genes. Further details are provided in Supplemental Methods under the sections titled 'X-linked gene sets' and 'Z-linked gene sets'. Information on X-linked genes is provided in Supplemental Table S3. Information on Z-linked genes is provided in Supplemental Table S4.

460

461 microRNA target sites

- 462 Pre-calculated P_{CT} scores for all gene-miRNA family interactions
- 463 (http://www.targetscan.org/vert_71/vert_71_data_download/Summary_Counts.all_predictions.tx
- 464 <u>t.zip</u>) and site-wise alignment information
- 465 (http://www.targetscan.org/vert_71/vert_71_data_download/Conserved_Family_Info.txt.zip)
- 466 were obtained from TargetScan Human v7. Details on the filtering of miRNAs and resampling-
- 467 based assessment of P_{CT} scores are provided in Supplemental Methods in the section titled
- 468 'microRNA target site P_{CT} scores'. Details regarding analysis of human-chicken or human-anolis
- 469 conserved sites, as well as approaches to control for background conservation, are provided in
- 470 Supplemental Methods in the section titled 'Human-chicken conserved microRNA target sites.'
- 471

472 Variation in within-UTR conservation bias

473 To address the possibility that non-uniformity in regional 3` UTR conservation could artificially

474 inflate or deflate conservation scores of certain target sites, we implemented a step-detection

475 algorithm to segment 3` UTRs into regions of homogeneous background conservation and

476 calculated miRNA site conservation relative to these smaller regions. These regionally

477 normalized scores, corresponding to all gene-miRNA interactions, are provided in Supplemental

478 Table S5. Details of the step-detection algorithm are provided in Supplemental Methods in the

479 section titled 'Variation in within-UTR conservation bias'.

480

481 Logistic regression

482 Logistic regression models were constructed using the function 'multinom' in the R package

483 'nnet.' We used previously published values for known factors in the survival of Y-linked

484 (Bellott et al., 2014) and W-linked (Bellott et al., 2017) genes except for human expression

485	breadth, which we recalculated using data from the GTEx Consortium v6 data release
486	(Consortium, 2015). Briefly, kallisto was used to estimate transcript per million (TPM) values in
487	the 10 male samples with the highest RNA integrity numbers (RINs) from each of 37 tissues, and
488	expression breadth across tissues was calculated as described in (Bellott et al., 2014), using
489	median TPM values for each tissue.
490	
491	Assessing Z-linked dosage compensation using cross-species RNA-sequencing data
492	Raw data from Marin et al 2017 (add citation) was obtained, and kallisto and limma/voom were
493	used for abundance quantification and differential expression, respectively. Further details are
494	provided in Supplemental Methods in the section titled 'Assessing Z-linked dosage
495	compensation using cross-species RNA-sequencing data'.
496	
497	Gene expression profiling and crosslinking datasets
498	Fold-changes in mRNA expression and targets of Argonaute as determined by high-throughput
499	crosslinking-immunoprecipitation (CLIP) were obtained from a variety of publically available
500	datasets. Further details are provided in Supplemental Methods in the section titled 'Gene
501	expression profiling and crosslinking datasets.' All fold-changes and CLIP targets are provided
502	in Supplemental Table S6.
503	
504	Code availability
505	A custom Python (RRID:SCR_008394) script utilizing Biopython (RRID:SCR_007173) was
506	used to generate shuffled miRNA family seed sequences. Identification of miRNA target site

507 matches using shuffled seed sequences was performed using the 'targetscan_70.pl' perl script

508 (<u>http://www.targetscan.org/vert_71/vert_71_data_download/targetscan_70.zip</u>). 3` UTR

- segmentation was performed with the 'plot_transitions.py' python script. Code is available at:
- 510 https://github.com/snaqvi1990/Naqvi17-code and as Supplementary Code.
- 511

512 Data access

- 513 Data supporting the findings of this study are available within the paper and its Supplemental
- 514 information files. Accession numbers for publically available datasets are provided when
- 515 appropriate in Methods sections.

516

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524 Author contributions

- 525 S.N., D.W.B. and D.C.P designed the study. S.N. performed analyses with assistance from
- 526 D.W.B. K.S.L developed and implemented the step-detection algorithm. S.N. and D.C.P wrote
- 527 the paper.
- 528
- 529

530 **DISCLOSURE DECLARATION**

531 The authors declare no competing financial interests.

- Balaton, B. P., Cotton, A. M., and Brown, C. J. (2015). Derivation of consensus inactivation
 status for X-linked genes from genome-wide studies. *Biology of Sex Differences*, 6, 35.
 https://doi.org/10.1186/s13293-015-0053-7
- Bartel, D. P. (2009). MicroRNAs: target recognition and regulatory functions. *Cell*, *136*(2), 215–233. https://doi.org/10.1016/j.cell.2009.01.002
- 537 Bellott, D. W., Hughes, J. F., Skaletsky, H., Brown, L. G., Pyntikova, T., Cho, T.-J., Koutseva,
- 538 N., Zaghlul, S., Graves, T., Rock, S., Kremitzki, C., Fulton, R. S., Dugan, S., Ding, Y.,
- Morton, D., Khan, Z., Lewis, L., ... Page, D. C. (2014). Mammalian Y chromosomes retain
 widely expressed dosage-sensitive regulators. *Nature*, 508(7497), 494–499.
- 541 https://doi.org/10.1038/nature13206
- Bellott, D. W., Skaletsky, H., Cho, T.-J., Brown, L., Locke, D., Chen, N., Galkina, S., Pyntikova,
 T., Koutseva, N., Graves, T., Kremitzki, C., Warren, W. C., Clark, A. G., Gaginskaya, E.,
 Wilson, R. K., and Page, D. C. (2017). Avian W and mammalian Y chromosomes
 convergently retained dosage-sensitive regulators. *Nature Genetics, in press.*
- Bellott, D. W., Skaletsky, H., Pyntikova, T., Mardis, E. R., Graves, T., Kremitzki, C., Brown, L.
 G., Rozen, S., Warren, W. C., Wilson, R. K., and Page, D. C. (2010). Convergent evolution
 of chicken Z and human X chromosomes by expansion and gene acquisition. *Nature*,
 466(7306), 612–616. https://doi.org/10.1038/nature09172
- Berletch, J. B., Ma, W., Yang, F., Shendure, J., Noble, W. S., Disteche, C. M., and Deng, X.
 (2015). Escape from X Inactivation Varies in Mouse Tissues. *PLOS Genetics*, 11(3),
 e1005079. https://doi.org/10.1371/journal.pgen.1005079
- Carrel, L., and Willard, H. F. (2005). X-inactivation profile reveals extensive variability in Xlinked gene expression in females. *Nature*, 434(March), 400–404.
 https://doi.org/10.1038/nature03479
- Charlesworth, B., and Crow, J. F. (1978). Model for evolution of Y chromosomes and dosage
 compensation, 75(11), 5618–5622.
- Consortium, Gte. (2015). The Genotype-Tissue Expression (GTEx) pilot analysis: Multitissue
 gene regulation in humans. *Science (New York, N.Y.)*, 348(6235), 648–660.
- Deng, X., Hiatt, J. B., Nguyen, D. K., Ercan, S., Sturgill, D., Hillier, L. W., Schlesinger, F.,
 Davis, C. a, Reinke, V. J., Gingeras, T. R., Shendure, J., Waterston, R. H., Oliver, B., Lieb,
 J. D., and Disteche, C. M. (2011). Evidence for compensatory upregulation of expressed Xlinked genes in mammals, Caenorhabditis elegans and Drosophila melanogaster. *Nature Genetics*, 43(12), 1179–1185. https://doi.org/10.1038/ng.948
- Friedman, R. C., Farh, K. K.-H., Burge, C. B., and Bartel, D. P. (2009). Most mammalian
 mRNAs are conserved targets of microRNAs. *Genome Research*, *19*(1), 92–105.
 https://doi.org/10.1101/gr.082701.108
- Hemara-Wahanui, A., Berjukow, S., Hope, C. I., Dearden, P. K., Wu, S.-B., Wilson-Wheeler, J.,
 Sharp, D. M., Lundon-Treweek, P., Clover, G. M., Hoda, J.-C., Striessnig, J., Marksteiner,
- R., Hering, S., and Maw, M. a. (2005). A CACNA1F mutation identified in an X-linked
 retinal disorder shifts the voltage dependence of Cav1.4 channel activation. *Proceedings of the National Academy of Sciences of the United States of America*, 102(21), 7553–7558.
 https://doi.org/10.1073/pnas.0501907102
- Huang, N., Lee, I., Marcotte, E. M., and Hurles, M. E. (2010). Characterising and predicting
 haploinsufficiency in the human genome. *PLoS Genetics*, 6(10), e1001154.
- 576 https://doi.org/10.1371/journal.pgen.1001154
- 577 Hughes, J. F., Skaletsky, H., Brown, L. G., Pyntikova, T., Graves, T., Fulton, R. S., Dugan, S.,

- 578 Ding, Y., Buhay, C. J., Kremitzki, C., Wang, Q., Shen, H., Holder, M., Villasana, D.,
- Nazareth, L. V, Cree, A., Courtney, L., ... Page, D. C. (2012). Strict evolutionary
 conservation followed rapid gene loss on human and rhesus Y chromosomes. *Nature*,
- 581 483(7387), 82–86. https://doi.org/10.1038/nature10843
 582 Itoh, Y., Melamed, E., Yang, X., Kampf, K., Wang, S., Yehya, N., Van Nas, A., Replogle, K.,
- Band, M. R., Clayton, D. F., Schadt, E. E., Lusis, A. J., and Arnold, A. P. (2007). Dosage
 compensation is less effective in birds than in mammals. *Journal of Biology*, 6(1), 2.
 https://doi.org/10.1186/jbiol53
- Jegalian, K., and Page, D. C. (1998). A proposed path by which genes common to mammalian X
 and Y chromosomes evolve to become X inactivated. *Nature*, *394*(August), 776–780.
 Retrieved from http://www.nature.com/nature/journal/v394/n6695/abs/394776a0.html
- Julien, P., Brawand, D., Soumillon, M., Necsulea, A., Liechti, A., Schütz, F., Daish, T., Grützner,
 F., and Kaessmann, H. (2012, January). Mechanisms and evolutionary patterns of
 mammalian and avian dosage compensation. *PLoS Biology*.
- 592 https://doi.org/10.1371/journal.pbio.1001328
- Kaiser, V. B., Zhou, Q., and Bachtrog, D. (2011). Nonrandom gene loss from the drosophila
 miranda neo-Y chromosome. *Genome Biology and Evolution*, *3*, 1329–1337.
 https://doi.org/10.1093/gbe/evr103
- Kharchenko, P. V, Xi, R., and Park, P. J. (2011). Evidence for dosage compensation between the
 X chromosome and autosomes in mammals. *Nature Genetics*, 43(12), 1167–1169.
 https://doi.org/10.1038/ng.991
- Lahn, B. T., Ma, N., Breg, R. W., Stratton, R., Surti, U., and Page, D. C. (1994). Xq-Yq
 interchange resulting in supernormal X-linked gene expression in severely retarded males
 with 46,XYq- karyotype. *Nature Genetics*, 8, 362–369. https://doi.org/10.1038/ng1294-340
- Lahn, B. T., and Page, D. C. (1999). Four evolutionary strata on the human X chromosome.
 Science, 286(5441), 964–967. https://doi.org/10.1126/science.286.5441.964
- Lin, F., Xing, K., Zhang, J., and He, X. (2012). Expression reduction in mammalian X
 chromosome evolution refutes Ohno's hypothesis of dosage compensation. *Proceedings of the National Academy of Sciences*, 109(29), 11752–11757.
 https://doi.org/10.1072/page.1201816100
- 607 https://doi.org/10.1073/pnas.1201816109
- Lindgren, A. M., Hoyos, T., Talkowski, M. E., Hanscom, C., Blumenthal, I., Chiang, C., Ernst,
 C., Pereira, S., Ordulu, Z., Clericuzio, C., Drautz, J. M., Rosenfeld, J. a, Shaffer, L. G.,
- 610 Velsher, L., Pynn, T., Vermeesch, J., Harris, D. J., ... Morton, C. C. (2013).
- Haploinsufficiency of KDM6A is associated with severe psychomotor retardation, global
 growth restriction, seizures and cleft palate. *Human Genetics*, *132*(5), 537–52.
 https://doi.org/10.1007/s00439-013-1263-x
- Mank, J. E., and Ellegren, H. (2009). All dosage compensation is local: gene-by-gene regulation of sex-biased expression on the chicken Z chromosome. *Heredity*, *102*(3), 312–320.
- 616 https://doi.org/10.1038/hdy.2008.116
- Marin, R., Cortez, D., Lamanna, F., Pradeepa, M. M., Leushkin, E., Julien, P., Liechti, A.,
 Halbert, J., Brüning, T., Mössinger, K., Trefzer, T., Conrad, C., Kerver, H. N., Wade, J.,
 Tschopp, P., and Kaessmann, H. (2017). Convergent origination of a Drosophila -like
- 620 dosage compensation mechanism in a reptile lineage. *Genome Research*, 1–14.
- 621 https://doi.org/10.1101/gr.223727.117
- Mueller, J. L., Skaletsky, H., Brown, L. G., Zaghlul, S., Rock, S., Graves, T., Auger, K., Warren,
 W. C., Wilson, R. K., and Page, D. C. (2013). Independent specialization of the human and

- 624 mouse X chromosomes for the male germ line. *Nature Genetics*, 45(9), 1083–1087.
- 625 https://doi.org/10.1038/ng.2705
- Nanda, I., Shan, Z., Schartl, M., Burt, D. W., Koehler, M., Nothwang, H., Grützner, F., Paton, I.
 R., Windsor, D., Dunn, I., Engel, W., Staeheli, P., Mizuno, S., Haaf, T., and Schmid, M.
 (1999). 300 million years of conserved syntemy between chicken Z and human chromosome
- 629 9. *Nature Genetics*, 21(march), 258–259. https://doi.org/10.1038/6769
- 630 Ohno, S. (1967). Sex chromosomes and sex-linked genes. Springer-Verlag.
- Papp, B., Pal, C., and Hurst, L. D. (2003). Dosage sensitivity and the evolution of gene families
 in yeast. *Nature*, 424, 194–197. https://doi.org/10.1038/nature01713.1.
- Pessia, E., Makino, T., Bailly-Bechet, M., McLysaght, A., and Marais, G. a B. (2012).
 Mammalian X chromosome inactivation evolved as a dosage-compensation mechanism for
 dosage-sensitive genes on the X chromosome. *Proceedings of the National Academy of Sciences of the United States of America*, 109(14), 5346–51.
- 637 https://doi.org/10.1073/pnas.1116763109
- Pinzón, N., Li, B., Martinez, L., Sergeeva, A., Presumey, J., Apparailly, F., and Seitz, H. (2016).
 The number of biologically relevant microRNA targets has been largely over-estimated The
 number of biologically relevant microRNA targets has been largely overestimated,
 (November), 1–11. https://doi.org/10.1101/gr.205146.116
- Ross, M. T., Grafham, D. V, Coffey, A. J., Scherer, S., McLay, K., Muzny, D., and Platzer, M.
 (2005). The DNA sequence of the human X chromosome. *Nature*, 434(March), 325–337.
- Ruderfer, D. M., Hamamsy, T., Lek, M., Karczewski, K. J., Kavanagh, D., Samocha, K. E.,
 Exome Aggregation Consortium, Daly, M. J., MacArthur, D. G., Fromer, M., and Purcell, S.
 M. (2016). Patterns of genic intolerance of rare copy number variation in 59,898 human
 exomes. *Nature Genetics*, 48(10), 1107–1111. https://doi.org/10.1038/ng.3638
- 648 Simon, D., Laloo, B., Barillot, M., Barnetche, T., Blanchard, C., Rooryck, C., Marche, M.,
 649 Burgelin, I., Coupry, I., Chassaing, N., Gilbert-Dussardier, B., Lacombe, D., Grosset, C.,
 650 and Arveiler, B. (2010). A mutation in the 3'-UTR of the HDAC6 gene abolishing the post-
- 651 transcriptional regulation mediated by hsa-miR-433 is linked to a new form of dominant X652 linked chondrodysplasia. *Human Molecular Genetics*, *19*(10), 2015–2027.
 653 https://doi.org/10.1093/hmg/ddq083
- Skaletsky, H., Kuroda-kawaguchi, T., Minx, P. J., Cordum, H. S., Hillier, L., Brown, L. G.,
 Repping, S., Pyntikova, T., Ali, J., Bieri, T., Chinwalla, A., Delehaunty, A., Delehaunty, K.,
 Du, H., Fewell, G., Fulton, L., Fulton, R., ... Page, D. C. (2003). The male-specific region
 of the human Y chromosome is a mosaic of discrete sequence classes. *Nature*, 423, 825–
 838.
- Tukiainen, T., Villani, A.-C., Yen, A., Rivas, M. A., Marshall, J. L., Satija, R., Aguirre, M.,
 Gauthier, L., Fleharty, M., Kirby, A., Cummings, B. B., Castel, S. E., Karczewski, K. J.,
 Aguet, F., Byrnes, A., Aguet, F., Ardlie, K. G., ... MacArthur, D. G. (2017). Landscape of
 X chromosome inactivation across human tissues. *Nature*, *550*(7675), 244–248.
 https://doi.org/10.1038/nature24265
- Uebbing, S., Konzer, A., Xu, L., Backström, N., Brunström, B., Bergquist, J., and Ellegren, H.
 (2015). Quantitative mass spectrometry reveals partial translational regulation for dosage
 compensation in chicken. *Molecular Biology and Evolution*, *32*(10), 2716–2725.
 https://doi.org/10.1093/molbev/msv147
- Vandewalle, J., Van Esch, H., Govaerts, K., Verbeeck, J., Zweier, C., Madrigal, I., Mila, M.,
 Pijkels, E., Fernandez, I., Kohlhase, J., Spaich, C., Rauch, A., Fryns, J. P., Marynen, P., and

- 670 Froyen, G. (2009). Dosage-dependent severity of the phenotype in patients with mental
- 671 retardation due to a recurrent copy-number gain at Xq28 mediated by an unusual
- 672 recombination. American Journal of Human Genetics, 85(6), 809–822.
- 673 https://doi.org/10.1016/j.ajhg.2009.10.019
- Warnefors, M., Mossinger, K., Halbert, J., Studer, T., VandeBerg, J. L., Lindgren, I.,
 Fallahshahroudi, A., Jensen, P., and Kaessmann, H. (2017). Sex-biased microRNA
 expression in mammals and birds reveals underlying regulatory mechanisms and a role in
 dosage compensation. *Genome Research*, 1–13. https://doi.org/10.1101/gr.225391.117
- Watson, J. M., Spencer, J. A., Riggs, A. D., and Graves, J. A. (1990). The X chromosome of
 monotremes shares a highly conserved region with the eutherian and marsupial X
 chromosomes despite the absence of X chromosome inactivation. *Proceedings of the*
- 681 *National Academy of Sciences*, 87(18), 7125–7129. https://doi.org/10.1073/pnas.87.18.7125
- Weischenfeldt, J., Dubash, T., Drainas, A. P., Mardin, B. R., Chen, Y., Stütz, A. M., Waszak, S.
 M., Bosco, G., Halvorsen, A. R., Raeder, B., Efthymiopoulos, T., Erkek, S., Siegl, C.,
 Brenner, H., Brustugun, O. T., Dieter, S. M., Northcott, P. A., ... Korbel, J. O. (2017). Pan-
- cancer analysis of somatic copy-number alterations implicates IRS4 and IGF2 in enhancer
 hijacking. *Nature Genetics*, 49, 65–74. https://doi.org/10.1038/ng.3722
- White, M. a, Kitano, J., and Peichel, C. L. (2015). Purifying Selection Maintains DosageSensitive Genes during Degeneration of the Threespine Stickleback Y Chromosome. *Molecular Biology and Evolution*, 32(8), 1981–1995.
- 690 https://doi.org/10.1093/molbev/msv078
- Kiong, Y., Chen, X., Chen, Z., Wang, X., Shi, S., Wang, X., Zhang, J., and He, X. (2010). RNA
 sequencing shows no dosage compensation of the active X-chromosome. *Nature Genetics*,
 42(12), 1043–1047. https://doi.org/10.1038/ng.711
- Yang, F., Babak, T., Shendure, J., and Disteche, C. M. (2010). Global survey of escape from X
 inactivation by RNA-sequencing in mouse. *Genome Research*, 20(5), 614–622.
 https://doi.org/10.1101/gr.103200.109
- Yates, A., Akanni, W., Amode, M. R., Barrell, D., Billis, K., Carvalho-Silva, D., Cummins, C.,
 Clapham, P., Fitzgerald, S., Gil, L., Girón, C. G., Gordon, L., Hourlier, T., Hunt, S. E.,
 Janacek, S. H., Johnson, N., Juettemann, T., ... Flicek, P. (2016). Ensembl 2016. *Nucleic Acids Research*, 44(D1), D710–D716. https://doi.org/10.1093/nar/gkv1157
- Zhou, Q., Zhang, J., Bachtrog, D., An, N., Huang, Q., Jarvis, E. D., Gilbert, M. T. P., and Zhang,
 G. (2014). Complex evolutionary trajectories of sex chromosomes across bird taxa. *Science*,
 346(6215), 1246338. https://doi.org/10.1126/science.1246338
- Zimmer, F., Harrison, P. W., Dessimoz, C., and Mank, J. E. (2016). Compensation of DosageSensitive Genes on the Chicken Z Chromosome. *Genome Biology and Evolution*, 8(4),
- 706 1233–1242. https://doi.org/10.1093/gbe/evw075
- 707

1 Figure 1: Conserved miRNA targeting of autosomal genes stratified by copy number

2 variation in 59,898 human exomes. Probabilities of conserved targeting (P_{CT}) of all gene-

- 3 miRNA interactions involving non-duplicated and duplicated genes, further stratified as (A)
- 4 deleted (grey, n = 69,339 interactions from 4,118 genes; blue, n = 80,290 interactions from 3,976
- 5 genes) or (B) not deleted (orange, n = 51,514 interactions from 2,916 genes; purple, n = 72,826

6 interactions from 3,510 genes). *** p < 0.001, two-sided Kolmogorov-Smirnov test. (C) Mean

7 gene-level P_{CT} scores. ** p < 0.01, *** p < 0.001, two-sided Wilcoxon rank-sum test.

8

9 Figure 2. X-Y pairs and X-inactivated genes have higher miRNA conservation scores than

10 **X escape genes.** P_{CT} score distributions of all gene-miRNA interactions involving (A) human X-

11 Y pairs (n = 371 interactions from 15 genes), X-inactivated genes (n = 6,743 interactions from

12 329 genes), and X escape genes (n = 1,037 interactions from 56 genes). ** p < 0.01, two-sided

Kolmogorov-Smirnov test. (B) Mean gene-level P_{CT} scores. * p < 0.05, ** p < 0.01, two-sided
Wilcoxon rank-sum test.

15

Figure 3. Heterogeneities in X-linked miRNA targeting were present on the ancestral autosomes. (A) Example reconstruction of an ancestral miR-96 target site in the 3[°] UTR of KDM6A, an X-linked gene in the X-added region (XAR) with a surviving Y homolog. Dots in

19 non-human species indicate identity with the human sequence, dashes gaps indicate gaps in the

20 multiple sequence alignment. (B) Distributions of sites conserved between 3` UTRs of human

21 and chicken orthologs (top) or comparisons to background expectation (bottom, see Methods) for

human X-Y pairs (n = 16), X-inactivated genes (n = 251), and X escape genes (n = 42). (C)

23	Statistics as in (B), but using sites conserved between chicken and opossum 3` UTRs only for
24	genes in the XAR; X-Y pairs ($n = 11$), X-inactivated genes ($n = 58$), and X escape genes ($n = 27$)
25	
26	Figure 4. Z-W pairs have higher miRNA conservation scores than other ancestral Z-linked
27	genes. P_{CT} score distributions of all gene-miRNA interactions involving the human orthologs of
28	(A) chicken Z-W pairs (n = 832 interactions from 28 genes) and other ancestral Z genes (n =
29	16,692 interactions from 657 genes). *** $p < 0.001$, two-sided Kolmogorov-Smirnov test. (B)
30	Mean gene-level P_{CT} scores. *** p < 0.001, two-sided Wilcoxon rank-sum test.
31	
32	Figure 5. Heterogeneities in Z-linked miRNA targeting were present on the ancestral
33	autosomes. (A) Example reconstruction of an ancestral miR-145 target site in the 3° UTR of
34	RASA1, a Z-linked gene with a surviving W homolog. Example of 3 [°] UTR sequence alignment
35	for RASA1, a Z-linked gene with a surviving W homolog, with a target site for miR-145
36	highlighted in gray. (B) Numbers of sites conserved between 3` UTRs of human and chicken
37	orthologs (top) or comparisons to background expectation (bottom) for chicken Z-W pairs (n =
38	27) and other ancestral Z genes ($n = 578$). (C) Statistics as in (B), but using sites conserved
39	between human and anolis 3` UTRs.
40	
41	Figure 6. Analyses of experimental datasets validate miRNA target site function. Responses
42	to transfection (A,B,C) or knockout (D) of indicated miRNAs in human (A,B,C) or mouse (D)

43 cell-types. Each panel depicts corresponding changes in mRNA levels (A,B), in fraction of

44 Argonaute-bound genes (C), and in mRNA stability and translational efficiency as measured by

45 ribosome protected fragments (RPF, D). In each case, X-linked genes and the human orthologs

46	of Z-linked genes containing target sites with an assigned P_{CT} score (red) for the indicated
47	miRNA were compared to all expressed genes lacking target sites (black); gene numbers are
48	indicated in parentheses. (A,B,D) *** p < 0.001, two-sided Kolmogorov-Smirnov test. (C) * p <
49	0.05, two-sided Fisher's exact test.
50	
51	Figure 7. An evidence-based model of preexisting heterogeneities in dosage sensitivity
52	shaping mammalian and avian sex chromosome evolution. In this model, preexisting
53	heterogeneities in dosage sensitivity determined the trajectory of Y/W gene loss in both
54	mammals and birds, and of subsequent X-inactivation in mammals and dosage compensation in
55	birds. Colored arrow widths are scaled approximately to the number of ancestral genes in each
56	class. (A) The dashed orange line represents the possibility that a subset of X-linked genes may
57	have not undergone compensatory X upregulation following Y gene decay. (B) Ancestral Z
58	genes with no W homolog follow a gradient of preexisting dosage sensitivity (top, grey to white),
59	which determined the degree of dosage compensation following W gene loss (bottom).
60	
61	Supplemental Figure S1: Effect of deletion status on autosomal P _{CT} scores. Probabilities of
62	conserved targeting (P _{CT}) of all gene-miRNA interactions involving non-deleted and deleted
63	genes, further stratified as (A) duplicated (grey, $n = 69,339$ interactions from 4,118 genes; orange,
64	n = 51,514 interactions from 2,916 genes) or (B) not duplicated (purple, $n = 72,826$ interactions
65	from 3,510 genes; blue, $n = 80,290$ interactions from 3,976 genes). *** $p < 0.001$, two-sided
66	Kolmogorov-Smirnov test. (C) P_{CT} scores for all gene sets in (A) and (B) superimposed on one
67	plot. (D) Mean gene-level P_{CT} scores when aggregating sets of duplicated/not duplicated (left) or
68	deleted/not deleted (right) genes. *** $p < 0.0001$, two-sided Wilcoxon rank-sum test.

70	Supplemental Figure S2: P _{CT} scores of X-Y pairs across 8 mammals. (A) P _{CT} score
71	distributions of all gene-miRNA interactions involving X-Y pairs across eight sequenced
72	mammalian Y chromosomes ($n = 647$ interactions from 32 genes) and other ancestral X genes (n
73	= 8,831 interactions from 457 genes). ** $p < 0.01$, two-sided Kolmogorov-Smirnov test. (B)
74	Gene-level mean P_{CT} scores. * p < 0.05, two-sided Wilcoxon rank-sum test.
75	
76	Supplemental Figure S3: Resampled mean P _{CT} scores of X-linked genes. (A) Resampled
77	gene-miRNA P_{CT} scores for human X-Y pairs (n = 15 genes), X-inactivated genes (n = 329
78	genes) and X escape genes (n = 56 genes). (B) Resampled gene-miRNA P_{CT} scores for X-Y pairs
79	across eight mammals ($n = 32$ genes) and genes with no Y homolog in any of eight mammals (n
80	= 457 genes). Points and error bars represent the median and 95% confidence intervals from
81	1,000 gene samplings with replacement. * p < 0.05, ** p < 0.01, empirical p-value computed as
82	the fraction of random non-overlapping gene sets with a median difference in P_{CT} score at least
83	as large as the true difference.
84	
85	Supplemental Figure S4: P_{CT} score comparisons with consistent and variable escape genes
86	separated. (A) P _{CT} score distributions of all gene-miRNA interactions involving X-Y pairs (n =
87	371 interactions from 16 genes), X-inactivated genes ($n = 6743$ interactions from 329 genes),
88	consistent escape genes (n = 567 interactions from 30 genes), or variable escape genes (n = 470
89	interactions from 26 genes) as defined by Balaton et al (Balaton et al., 2015). * p < 0.05, ** p <
90	0.01, two-sided Kolmogorov-Smirnov test. (B) Resampled gene-miRNA P_{CT} scores of gene
91	classes from (A). Points and error bars represent the median and 95% confidence intervals from

921,000 gene samplings with replacement. * p < 0.05, empirical p-value computed as the fraction93of random non-overlapping gene sets with a median difference in P_{CT} score at least as large as94the true difference.

95

96 Supplemental Figure S5: PCT score comparisons with discordant genes included as X-

- 97 inactivated or escape. P_{CT} score distributions of all gene-miRNA interactions (A,C) or mean
- 98 gene-level P_{CT} score (B,D) of classes of X-linked genes with genes with a discordant XCI call (n
- 99 = 721 interactions from 40 genes) included as X-inactivated (A,B) or X escape (C,D). Numbers
- 100 of gene-miRNA interactions and genes as in Figure 1, but with the addition of discordant gene
- 101 numbers/interactions to X-inactivated genes (A,B) or X escape genes (C,D). * p < 0.05, ** p < 0.05, * p < 0.

102 0.01, two-sided Kolmogorov-Smirnov (A,C) or Wilcoxon rank-sum (B,D) test.

103

104 Supplemental Figure S6: Variation in within-UTR conservation does not account for

105 observed differences in P_{CT} score among classes of X-linked genes. (A) Example of step-

106 detection to segment 3` UTRs. Top, base-wise branch length scores; bottom, probabilities of

- 107 transition to a new section. Dashed line indicates p-value cutoff used to delineate a new section
- 108 (plotted as alternating magenta/yellow points). (B) Boxplots of within-UTR conservation bias
- 109 (see Methods) for all gene-miRNA interactions involving classes of X-linked genes. (C)
- 110 Comparisons of P_{CT} scores normalized by within-UTR bias. **, p < 0.01, *** p < 0.001, two-
- 111 sided Kolmogorov-Smirnov test.
- 112

113 Supplemental Figure S7: Ancestral miRNA targeting of X-Y pairs across 8 mammals. (A)

114 Distributions of sites conserved between 3` UTRs of human and chicken orthologs (top) or

comparisons to background expectation (bottom, see Methods) for X-Y pairs across 8 mammals
(n = 25) and other ancestral X genes (n = 351). (D) Statistics as in (C), but using sites conserved
between chicken and opossum 3° UTRs only for genes in the XAR; X-Y pairs across 8 mammals
(n = 15), other ancestral X genes (n = 102).
Supplemental Figure S8: P_{CT} scores of Z-W pairs across 4 and 14 birds. (A,C) P_{CT} score
distributions of all gene-miRNA interactions (A) Z-W pairs including predictions from three
additional birds with male and female genome sequence (n = 2,187 interactions from 78 genes)

and other ancestral Z genes (n = 15,357 interactions from 607 genes), or (C) Z-W pairs including

124 read depth-based predictions from 10 additional birds with only female genome sequence (n =

4,458 interactions from 157 genes) and other ancestral Z genes (n = 13,086 interactions from 528

126 genes) *** p < 0.001, two-sided Kolmogorov-Smirnov test. (B,D) Gene-level mean P_{CT} scores.

127 *** p < 0.01, two-sided Wilcoxon rank-sum test.

128

129 Supplemental Figure S9: Resampled mean P_{CT} scores of Z-linked genes. Gene sets: (A)

130 chicken Z-W pairs (n = 28 genes) and other ancestral Z genes (n = 657 genes), (B) Z-W pairs

131 across four birds (n = 78 genes) compared to the remainder of ancestral Z genes (n = 607 genes),

and (C) Z-W pairs across 14 birds (n = 157 genes) compared to the remainder of ancestral Z

133 genes (n = 528 genes). Points and error bars represent the median and 95% confidence intervals

from 1,000 gene samplings with replacement. *** p < 0.001, empirical p-value computed as the

135 fraction of random non-overlapping gene sets with a median difference in P_{CT} score at least as

136 large as the true difference.

138	Supplemental Figure S10: Variation in within-UTR conservation cannot account for
139	observed differences in P _{CT} score among classes of Z-linked genes. (A) Boxplots of within-
140	UTR conservation bias (see Methods) for all gene-miRNA interactions involving chicken Z-W
141	pairs or other ancestral X genes. Numbers of interactions and genes as in Figure 4A. ** $p < 0.01$,
142	two-side Wilcoxon rank-sum test. (B) Comparisons of P _{CT} scores normalized by within-UTR
143	bias. *** p < 0.001, two-sided Kolmogorov-Smirnov test.
144	
145	Supplemental Figure S11: Correlation of Z-linked gene-specific dosage compensation with
146	gene-level P_{CT} score. Distributions of chicken male/female expression ratio, normalized to that
147	of human and anolis (y-axis) as a function of mean gene-level P_{CT} quartile (x-axis) for all
148	expressed Z-linked gene with no W homolog. Expression ratios are plotted on a log ₂ scale;
149	values closer to 0 imply more effective dosage compensation following W gene loss.
150	
151	Supplemental Figure S12: Ancestral miRNA targeting of Z-W pairs across 4 birds. (A)
152	Distributions of sites conserved between 3` UTRs of human and chicken orthologs (top) or
153	comparisons to background expectation (bottom, see Methods) for Z-W pairs across chicken and
154	three additional birds with male and female genome sequence (4 birds, $n = 73$) and other
155	ancestral Z genes ($n = 532$). (D) Statistics as in (C), but using sites conserved between human
156	and anolis 3° UTRs; Z-W pairs across 4 birds (n = 73), other ancestral Z genes (n = 527). *** p <
157	0.001, two-sided Fisher's exact test.
158	
159	Supplemental Figure S13: Ancestral miRNA targeting of predicted Z-W pairs across 14

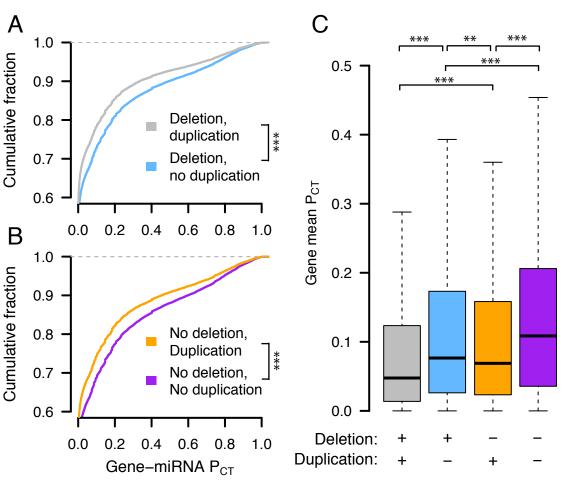
160 **birds.** (A) Distributions of sites conserved between 3° UTRs of human and chicken orthologs

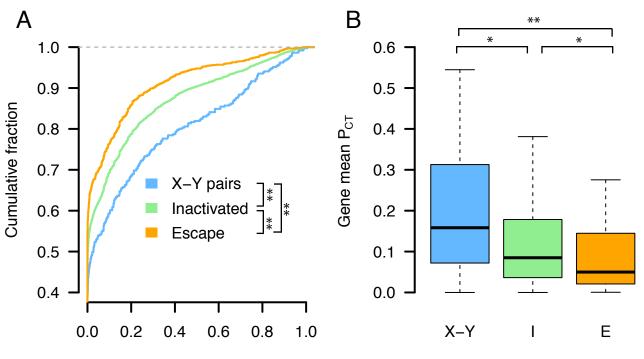
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161 (top) or comparisons to background expectation (bottom, see Methods) for Z-W pairs in chicken, 162 predicted in three additional birds with male and female genome sequence, and predicted based 163 on read depth from 10 additional birds with only female genome sequence (14 birds, n = 147) 164 and other ancestral Z genes (n = 458). (D) Statistics as in (C), but using sites conserved between 165 human and anolis 3° UTRs; Z-W pairs across 14 birds (n = 147), other ancestral Z genes (n = 166 453). 167 168 Supplemental Figure S14: Correlation of Z-linked gene-specific dosage compensation with 169 human-chicken-conserved site excess. Distributions of chicken male/female expression ratios, 170 normalized to those of human and anolis (y-axis) for expressed Z-linked genes with no W 171 homolog with (left) or without (right) an excess of human-chicken-conserved miRNA sites. ** p 172 < 0.01, *** p < 0.0001, Wilcoxon rank-sum test. 173 174 Supplemental Figure S15: Gene expression changes following small RNA transfections in 175 human HeLa cells. * p < 0.05, *** p < 0.001, two-sided K-S test. 176 177 Supplemental Figure S16: Gene expression changes following transfection or knockdown 178 of additional miRNAs in human HCT116 or HEK293 cells. *** p < 0.001, two-sided 179 Kolmogorov-Smirnov test. 180 181 Supplemental Figure S17: Changes in mRNA stability and translational efficiency and gene 182 expression following miR-155 knockout in mouse immune cells. In each case, mouse 183 orthologs of X- or Z-linked genes containing a human-mouse-conserved (hsa-mmu) miR-155

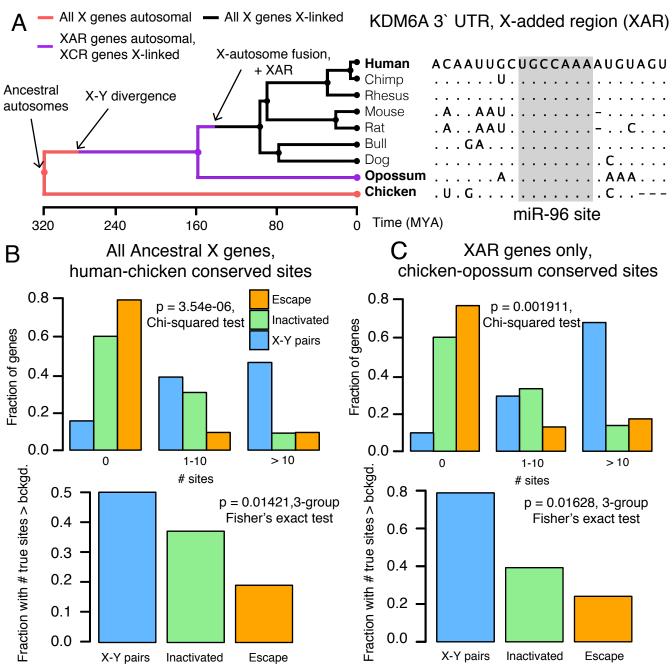
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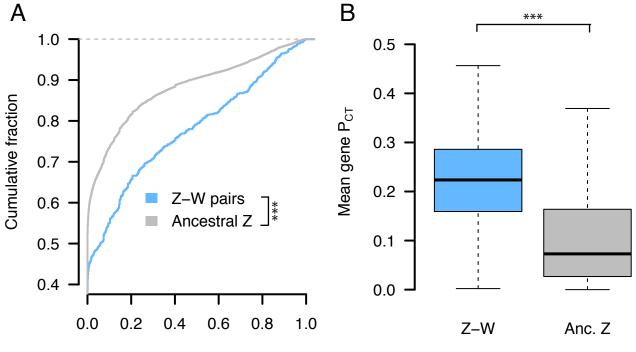
- site were compared to mouse genes containing only nonconserved miR-155 sites. * p < 0.05, ***
- 185 p < 0.001, two-sided Kolmogorov-Smirnov test.
- 186
- 187 Supplemental Figure S18: Argonaute binding measured by high-throughput crosslinking-
- 188 immunoprecipitation (CLIP) following miRNA transfection in HEK293 cells. * p < 0.05,
- 189 two-sided Fisher's exact test.



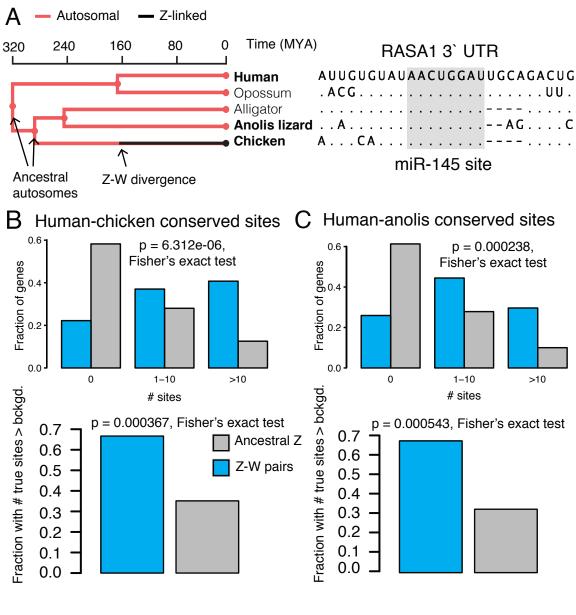


Gene-miRNA P_{CT}

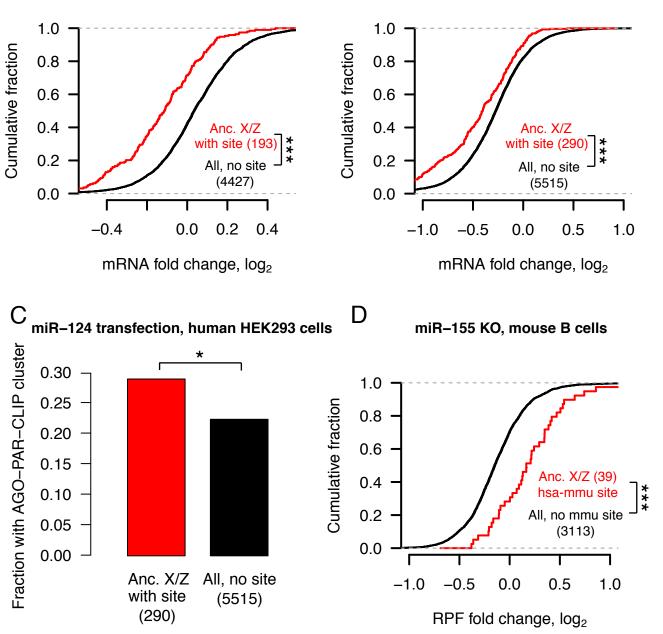


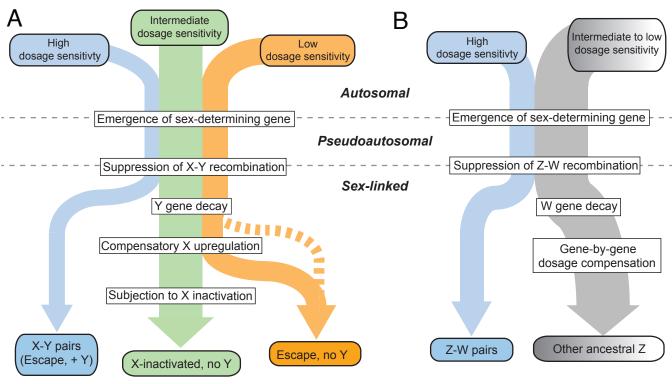


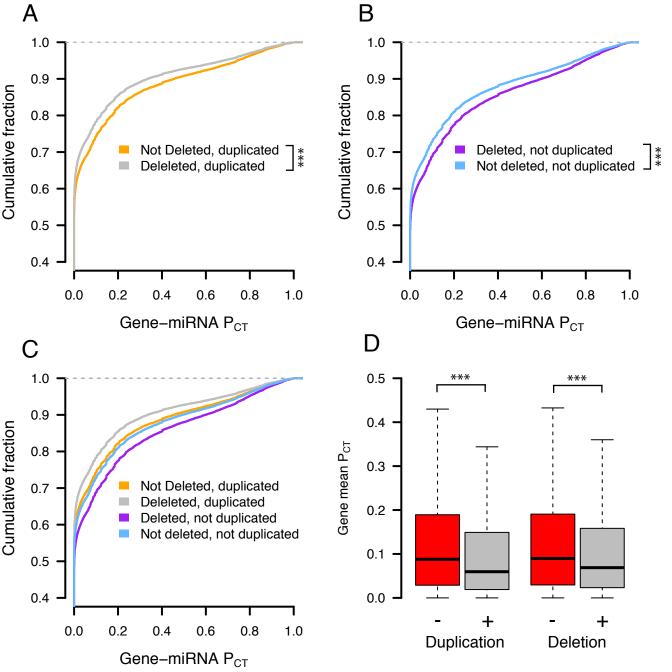
Gene-miRNA P_{CT}

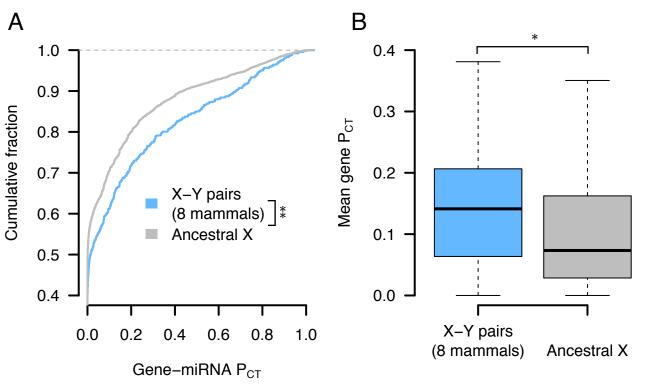


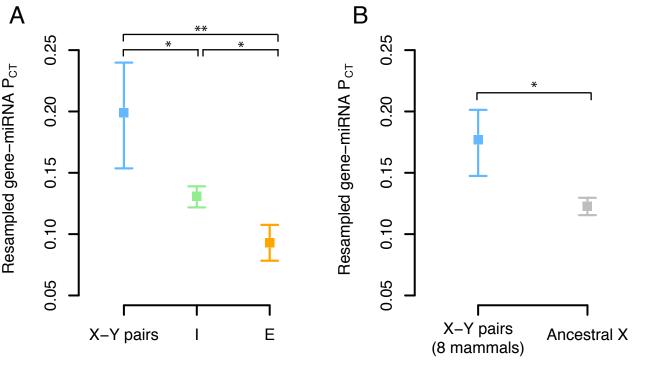
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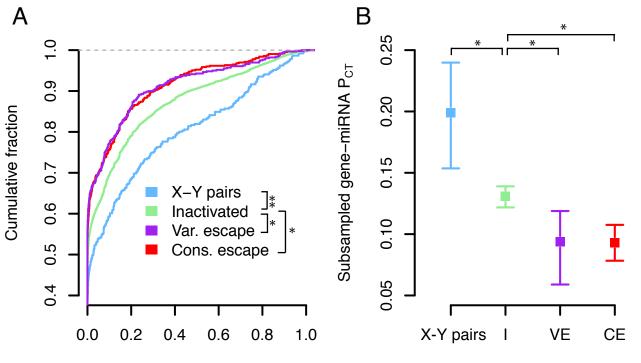




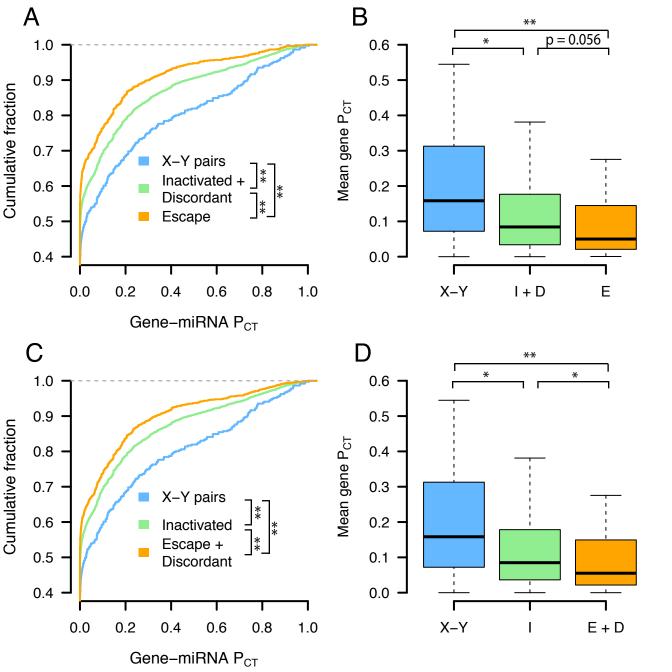


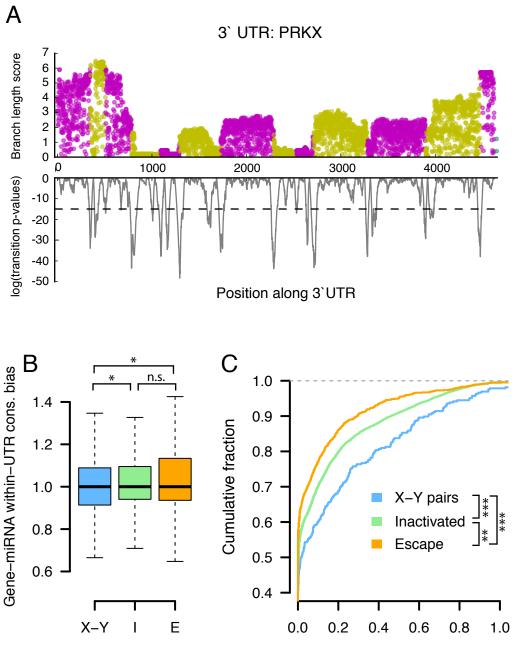




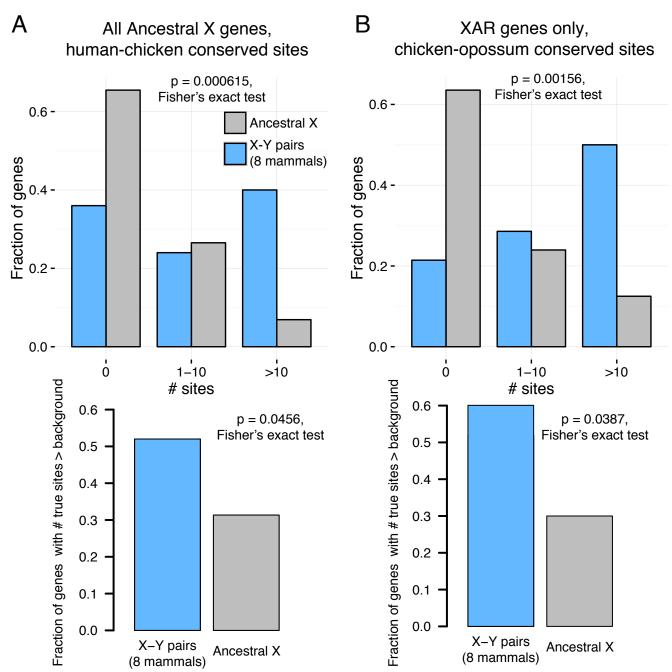


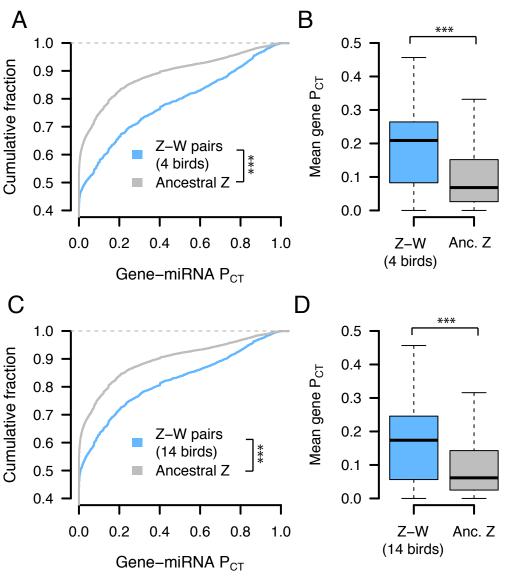
Gene-miRNA P_{CT}

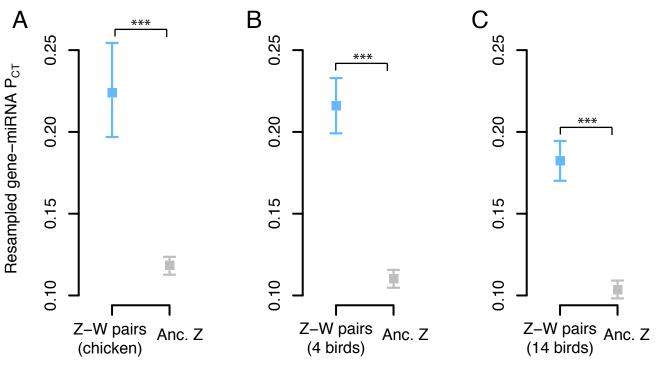


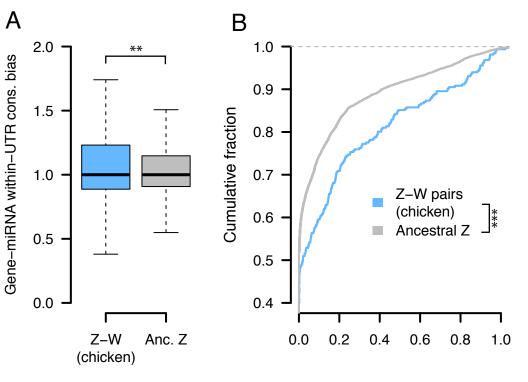


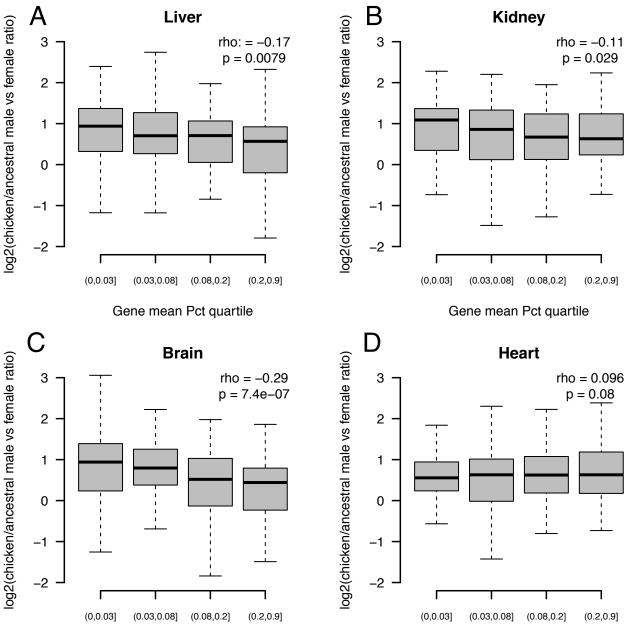
Gene-miRNA (P_{CT} / within-UTR cons. bias)





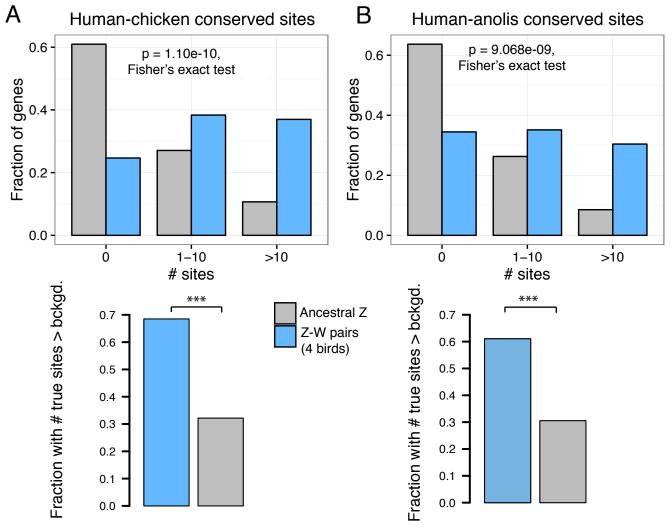


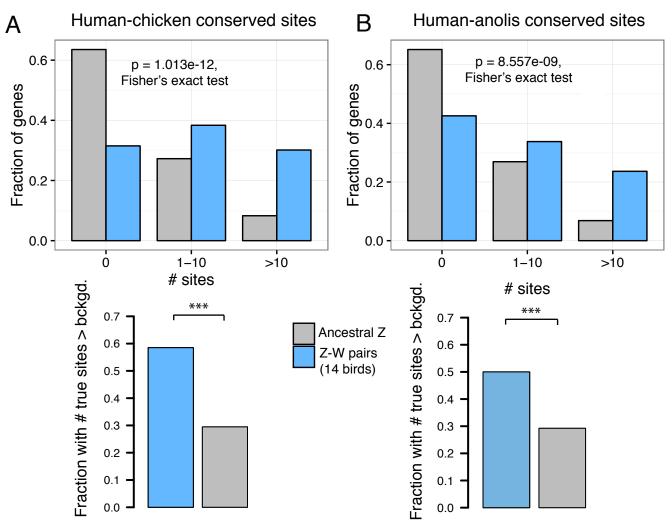


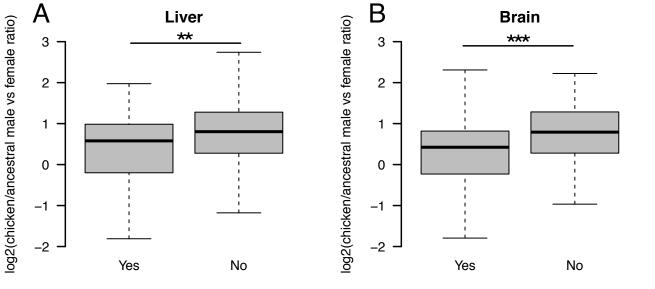


Gene mean Pct quartile

Gene mean Pct quartile

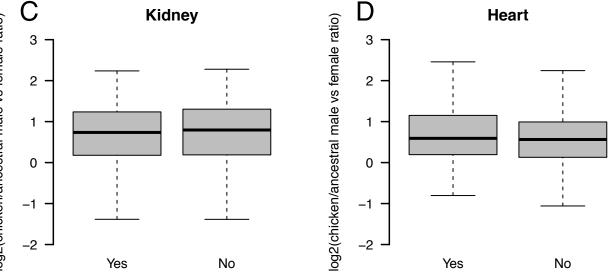






human-chicken-conserved sites > background?

human-chicken-conserved sites > background?



human-chicken-conserved sites > background?

human-chicken-conserved sites > background?

