Ohnologs in the human genome are dosage balanced and frequently associated with disease

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About 30% of protein-coding genes in the human genome are related through two whole genome duplication (WGD) events. Although WGD is often credited with great evolutionary importance, the processes governing the retention of these genes and their biological significance remain unclear. One increasingly popular hypothesis is that dosage balance constraints are a major determinant of duplicate gene retention. We test this hypothesis and show that WGD-duplicated genes (ohnologs) have rarely experienced subsequent small-scale duplication (SSD) and are also refractory to copy number variation (CNV) in human populations and are thus likely to be sensitive to relative quantities (i.e., they are dosage-balanced). By contrast, genes that have experienced SSD in the vertebrate lineage are more likely to also display CNV. This supports the hypothesis of biased retention of dosage-balanced genes after WGD. We also show that ohnologs have a strong association with human disease. In particular, Down Syndrome (DS) caused by trisomy 21 is widely assumed to be caused by dosage effects, and 75% of previously reported candidate genes for this syndrome are ohnologs that experienced no other copy number changes. We propose the remaining dosage-balanced ohnologs on chromosome 21 as candidate DS genes. These observations clearly show a persistent resistance to dose changes in genes duplicated by WGD. Dosage balance constraints simultaneously explain duplicate gene retention and essentiality after WGD.

whole genome duplication | copy number variation | Down Syndrome | trisomy 21

E arly in the vertebrate lineage the genome of our simple ancestor experienced radical upheaval from two rounds of whole genome duplication (WGD) and the subsequent chromosomal rearrangement and loss of many of the duplicate copies ("ohnologs") (1–3). Although only about 20–30% of the protein-coding genes in the human genome can be traced back to these events (ref. 3 and this study), the two tetraploid episodes in vertebrate history have frequently been credited with creating the conditions for the evolution of vertebrate complexity. Understanding the patterns of ohnolog retention is crucial to develop a unified model for the evolutionary impact of WGD and many groups have uncovered significant trends such as enrichment for developmental genes (4–6) and protein complex membership (7).

Recently it was shown that mammalian ohnologs are more essential (i.e., knockout of one copy is more likely to lead to sterility or inviability) than paralogs generated by small-scale duplication (SSD) and are equally as essential as singleton genes (7). A prevalence of dosage-balanced genes among ohnologs was proposed to explain this contradiction of the theoretical, expected backup role of duplicated genes, which should buffer against such effects. Dosage balance may exist between two or more genes whose products interact or participate in the same pathway or process (8-10). According to the dosage balance hypothesis, changes in the relative dosage of gene product, such as would occur through duplication of some but not all of the balanced gene set, should be deleterious (11). WGD creates a unique opportunity for the duplication of dosage-balanced genes because it guarantees the simultaneous duplication of all components of a balanced gene set (10, 12). Furthermore, once the genes have been duplicated by WGD, subsequent loss of individual genes would result in a dosage imbalance due to insufficient gene product, thus leading to biased retention of dosage-balanced ohnologs. In fact, evidence for preferential retention of dosagebalanced genes after WGD is accumulating (4, 7, 11–20). Copy number variation [copy number polymorphism (CNV)] describes population level polymorphism of small segmental duplications and is known to directly correlate with gene expression levels (21– 24). Thus, CNV of dosage-balanced genes is also expected to be deleterious. This model predicts that retained ohnologs should be enriched for dosage-balanced genes that are resistant to subsequent SSD and to CNV in human populations.

We track SSD events in vertebrate ohnologs after WGD and in sister lineages that did not experience WGD (Fig. 1 and *SI Materials and Methods*) in order to test the dosage-balance hypothesis and show the first large-scale evidence that ohnologs are resistant to fluctuations in relative quantities by SSD and CNV. We propose that ohnologs that have experienced neither SSD nor CNV are dosage-balanced and find that, consistent with this, they are strongly associated with disease. In particular, Down Syndrome (DS) caused by trisomy 21 appears to be caused in large part by the deleterious effects of the 1.5-fold increase in dosage of ohnologs on that chromosome.

Results and Discussion

To compare the frequency of SSD of different genes over a comparable period of time, we inferred the set of genes present just after the fish-tetrapod divergence and clustered all paralogs generated by subsequent duplications into "tetrapod gene families" (Fig. 1 and SI Materials and Methods). Only 6.7% of ancient ohnologs have experienced SSD in this time frame (449/6,742; blastp hit with E-value $< 10^{-7}$ and alignable region > 30%), compared to 10.1% (1,109/10,976) of ancient nonohnologs (P = 4.8×10^{-15} , χ^2 test). This observation demonstrates that ohnologs experienced SSD less frequently than other genes in the human genome. Furthermore, when we examine genes in the ascidian (Ciona intestinalis) genome, a lineage that did not experience WGD, we find that genes that have not experienced lineagespecific SSD in ascidian are more likely to be orthologs of human ohnologs (30.1%; 1,804/5,998) than ascidian genes that did experience lineage-specific SSD (20.6%; 649/3,147; $P < 2.2 \times 10^{-16}$, χ^2 test). We observe the same trend for fly (31.6% vs. 20.0%; $P < 2.2 \times 10^{-16}$), worm (31.6% vs. 21.1%; $P < 2.2 \times 10^{-16}$) and sea anemone (24.6% vs. 14.6%; $P < 2.2 \times 10^{-16}$). The resistance of retained ohnologs to the otherwise prevalent process of SSD, even in distantly-related lineages that did not experience WGD,

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Fig. 1. Tetrapod gene families. Each panel shows a hypothetical vertebrate gene family where members of each family have been generated by whole genome duplication (WGD) and/or small-scale duplication (SSD). Genes are labeled with the organism name. Many genes duplicated by WGD (ohnologs) are subsequently lost, and these are indicated in gray. (*A* and *B*) Ohnologs have been retained. (*C* and *D*) No ohnologs were retained. In order to compare the frequency of SSD of ohnologs and nonohnologs across a similar time-frame, vertebrate gene families are further broken down into tetrapod gene families (indicated by colored circles) and are classified into ohnologs without SSD and CNV (red), ohnologs that have experienced SSD or CNV (yellow), nonohnologs without SSD and CNV (blue) or nonohnologs that have experienced SSD or CNV (green).

strongly supports the inference that these genes are ancient dosage-balanced genes.

Within human populations, we expect that CNV of dosagebalanced genes should be deleterious. We compare the proportion of genes displaying CNV ($P_{\rm CNV}$) for ohnologs with that for all human protein coding genes. Any gene whose entire coding sequence is found within a CNV region is considered to have CNV. We find that the $P_{\rm CNV}$ of ohnologs (22.6%, 1,648/7,294) is significantly lower than the human genome average $P_{\rm CNV}$ (29.3%, 6,136/20,907; $P < 2.2 \times 10^{-16}$, χ^2 test). By contrast, the $P_{\rm CNV}$ of duplicated genes generated by SSD is significantly higher than the genome average (36.6%, 3,306/9,027; $P < 2.2 \times 10^{-16}$, χ^2 test). This observation is true of copy loss variants (CLV) and copy gain variants (CGV) independently. The proportions of CLVs (13.1%, 957/7,294) and of CGVs for ohnologs (9.9%, 722/7,294) are significantly lower than the genome average (18.4%, 3,843/20,907 and 14.6%, 3,055/20,907, respectively; $P < 2.2 \times 10^{-16}$ and $P < 2.2 \times 10^{-16}$, respectively, χ^2 test). By contrast, the proportions of CLVs (23.7%, 2,142/9,027) and of CGVs for SSD duplicates (20.6%, 1,858/9,027) are significantly higher than the genome average ($P < 2.2 \times 10^{-16}$ and $P < 2.2 \times 10^{-16}$, respectively, χ^2 test).

We consider the potential impact of the gene length bias of ohnologs because the average length of ohnologs (87,287 bp) is longer than that of all genes (55,970 bp). The longer the length of a gene, the less likely that the whole coding-sequence of the gene is within CNVs. When we repeat the analysis with an extremely loose definition of CNV genes that required only 1-bp overlap, the P_{CNV} of ohnologs (41.2%, 3,005/7,294) is still significantly lower than the genome average (42.8%, 8,945/20,907; P = 0.0073, χ^2 test).

This indicates that the propensity for individual gene duplication over evolutionary time in the vertebrate lineage is closely linked to the propensity for duplication/loss within human populations and suggests a persistent deleterious effect of dosage changes for a subset of human genes. Whereas genes that have experienced recent SSD in the human lineage continue to be subject to dosage changes through CNV in human populations, ohnologs without subsequent SSD are also resistant to CNV. Over 60% of ohnologs (63.6%; 4,638/7,294) are free of SSD and CNV, compared to 32.4% (4,412/13,613) of nonohnologs in the genome, and the difference is statistically significant ($P < 2.2 \times 10^{-16}$, χ^2 test). These results indicate that retained ohnologs in the human genome are enriched for dosage-balanced genes. We propose that these 4,638 genes are dosage-balanced ohnologs (DBOs).

This method of detecting dosage-balanced genes is indirect and we note that some dosage-balanced genes will not be detected by this method, and conversely that some genes that appear to be dosage-balanced by our measure may be dosage-insensitive genes that have not experienced duplications due to chance rather than dosage constraints. We examined some of the properties of DBOs with respect to expected characteristics of dosage-balanced genes. It has previously been shown that developmental genes, transcription factors, and protein complex members are likely to be dosage-balanced (8, 11, 18). We observe significant enrichment for protein complex membership for DBOs (14.6%, 676/4,638) compared to non-DBO ohnologs (10.5%, 280/2,656; $P = 1.1 \times$ 10^{-6} , χ^2 test) and nonohnologous genes (8.8%, 1,202/13,613; P < 2.2×10^{-16} , χ^2 test). Furthermore, we find that gene ontology (GO) terms "multicellular organismal development," "cell differentiation," "cell communication," and "transcription regulator activity," related to development and transcription are extensively enriched in DBOs (Table S1). On the other hand, for non-DBO ohnologs the enrichment of GO ids related to development is low and transcription regulator activity is not enriched (Table S2). These results further support that inferred DBOs in our data are genuinely dosage-balanced genes.

Several previous studies have considered the duplicability of dosage sensitive genes (both dosage-balanced and haploinsufficient). The results from these studies were somewhat contradictory and indicated both lower duplicability of genetic components of more complex proteins (more subunits) (25) and higher duplicability of genes with dominant-negative phenotypes (presumed haploinsufficient genes) (26). These observations are reconciled in the context of the special impact of whole genome duplication. As described above, protein-complex members are unlikely to be duplicated except by WGD. We find that, similarly, haploinsufficient genes are enriched within ohnologs and DBOs, and are depleted among SSD-duplicated genes (*SI Materials and Methods*). Thus we observe a consistent relationship between dosage constraints and duplication patterns, namely, preferential retention of ohnologs of dosage-sensitive genes and low duplicability by SSD.

CNV data from large studies of healthy individuals (such as the data used here) show that disease genes are significantly underrepresented in the lists of variable copy number genes (27) and

Table 1.	Dosage-balanced ohnolo	gs and Down S	vndrome-related	genes on chromosome 21

Ensembl id	Gene symbol	Full name	Reference
ENSG00000188992	LIPI	Lipase, member I	
ENSG00000185272	RBM11	RNA binding motif protein 11	
ENSG00000155313	USP25	Ubiquitin specific peptidase 25	
ENSG00000154640	BTG3	BTG family, member 3	
ENSG00000154645	CHODL	Chondrolectin	
ENSG00000154654	NCAM2	Neural cell adhesion molecule 2	
ENSG00000154721	JAM2	Junctional adhesion molecule 2	
ENSG00000142192	APP	Amyloid β (A4) precursor protein	37
ENSG00000156253	RWDD2B	RWD domain containing 2B	
ENSG00000156256	USP16	Ubiquitin specific peptidase 16	
ENSG00000156273	BACH1	BTB and CNC homology 1	37
ENSG00000171189	GRIK1	Glutamate receptor, ionotropic, kainate 1	
ENSG00000156299	TIAM1	T-cell lymphoma invasion and metastasis 1	
ENSG00000142168	SOD1	Superoxide dismutase 1	37
ENSG00000159082	SYNJ1	Synaptojanin 1	37
ENSG00000159110	IFNAR2	Interferon receptor 2	37
ENSG00000142188	TMEM50B	Transmembrane protein 50B	
ENSG00000159200	DSCR1	Down syndrome critical region gene 1	36, 37
ENSG00000159212	CLIC6	Chloride intracellular channel 6	
ENSG00000159216	RUNX1	Runt-related transcription factor 1	
ENSG00000159263	SIM2	Single-minded homolog 2	36
ENSG00000157540	DYRK1A	Dual-specificity tyrosine-(Y)-phosphorylation regulated kinase 1A	36, 37
ENSG00000157542	GIRK2	Potassium inwardly-rectifying channel, subfamily J, member 6	36
ENSG00000157554	ERG	V-ets erythroblastosis virus E26 oncogene homolog	37
ENSG00000157557	ETS2	V-ets erythroblastosis virus E26 oncogene homolog 2	37
ENSG00000185658	BRWD1	Bromodomain and WD repeat domain containing 1	
ENSG00000205581	HMG14	High-mobility group nucleosome binding domain 1	37
ENSG00000157578	LCA5L	Leber congenital amaurosis 5-like	
ENSG00000185437	SH3BGR	SH3 domain binding glutamic acid-rich protein	
ENSG00000183778	B3GALT5	β-1,3-galactosyltransferase 5	
ENSG00000171587	DSCAM	Down syndrome cell adhesion molecule	37
ENSG00000182240	BACE2	β-site APP-cleaving enzyme 2	37
ENSG00000183421	RIPK4	Receptor-interacting serine-threonine kinase 4	
ENSG00000157617	C2CD2	C2 calcium-dependent domain containing 2	
ENSG00000160179	ABCG1	ATP-binding cassette, sub-family G (WHITE), member 1	
ENSG00000160185	UBASH3A	Ubiguitin associated and SH3 domain containing, A	
ENSG00000160190	SLC37A1	Solute carrier family 37, member 1	
ENSG00000160199	PKNOX1	PBX/knotted 1 homeobox 1	37
ENSG00000184900	SUMO3	SMT3 suppressor of mif two 3 homolog 3	
ENSG00000197381	ADARB1	Adenosine deaminase, RNA-specific, B	
ENSG00000173638	SLC19A1	Solute carrier family 19, member 1	
ENSG00000183570	PCBP3	Poly(rC) binding protein 3	
ENSG00000160305	DIP2A	DIP2 disco-interacting protein 2 homolog A	
ENSG00000160307	S100B	S100 calcium binding protein B	37

Where a reference is provided, those genes were previously reported as candidate DS genes. Genes in bold are not dosage-balanced ohnologs.

many studies have reported a relationship between CNV and human disease (21, 28–32). The effect of duplicating a dosagebalanced gene should be deleterious and CNV of these genes is expected to lead to human disease (33). Consistent with this expectation, we find that DBOs are significantly enriched in human disease genes from Online Mendelian Inheritance in Man (34) (OMIM; 15.9%, 736/4,638) compared to other genes (11.1%, 1,812/16,269; $P < 2.2 \times 10^{-16}$, χ^2 test), as are all ohnologs (16.5%, 1,201/7,294, of ohnologs are disease genes; $P < 2.2 \times 10^{-16}$). This suggests the generality of a strong relationship between ohnologs and human disorders, including several genes causing conditions that have previously been reported to be specifically due to dosage imbalance such as the genes coding for ABCA1, BMI1, CHRNB2, CHRNA4, CLOCK, NCAM1, NCAM2, NOTCH1, NOTCH2, NOTCH3, and PLP1 (35). Interestingly, the proportion of essential genes for DBOs (17.1%, 793/4,638) is significantly higher than for other ohnologs (11.7%, 311/2,656; $P < 2.2 \times 10^{-16}$, χ^2 test) and nonohnologs (6.2%, 843/13,613; $P < 2.2 \times 10^{-16}$, χ^2 test), which possibly reflects a higher incidence of lethal phenotypes specifically associated with perturbation of DBOs.

Trisomy is an extreme example of CNV. Trisomy 21 results in DS, which is generally considered to be due to dosage imbalance caused by the extra copy of chromosome 21 and occurs at a frequency of more than 1/1,000 in human populations (36). Most trisomies are incompatible with life and are not observed in live births. Trisomy 21 has the least severe phenotypic consequences and is thus the most commonly observed human trisomy. In keeping with this, we observe that chromosome 21 has the smallest number of DBOs of any chromosome except the Y, and that DBOs are significantly underrepresented on chromosome 21 (observation 40 vs. expectation 56.1; P = 0.010), as are all ohnologs (observation 58 vs. expectation 88; $P = 4.8 \times 10^{-5}$).

Several genes on chromosome 21 have been identified as DSrelated genes (36, 37). For example, a 1.5-fold increase in dosage of DSCR1 and DYRK1A has been shown experimentally to lead to features of the DS phenotype (38). Table 1 lists all 40 DBOs from chromosome 21 and 16 candidate DS genes from the literature (36, 37). Strikingly, 75% (12/16) of reported DS candidates are also DBOs, whereas under a hypothesis of no association we would expect only two of the candidate genes to also be DBOs; this is a highly significant difference ($P = 5.9 \times 10^{-8}$, Fisher's exact test; Table 1). This result indicates that our results from a computational approach are consistent with previous reports based on experimental analysis. Only one previously reported DS candidate gene, S100B, displays CNV (gene gains: variation IDs 3,235 and 8,897). Interestingly, S100B is also a candidate gene for bipolar disorder where mutations in the promoter region leading to increased expression are linked to the disorder (39). In particular, duplication of a region on chromosome 21 known as the Down Syndrome critical region (DSCR) is thought to be a major determinant of the features of DS (38, 40-42), although it is still controversial (35, 43). We find significant overrepresentation of DBOs in the DSCR (P = 0.0012; Fig. 2). We propose that the contribution of the DSCR to the features of DS is determined by the enrichment of DBOs in the region (Fig. 2). A major goal of DS research is the identification of the particular genes on chromosome 21 and also genes on other chromosomes that contribute to the syndrome in order to advance detection and therapeutic strategies (36). We suggest that the DBOs on chromosome 21 are candidate DS genes worthy of further investigation. Furthermore, it is likely that ohnolog pairs of chromosome 21 DS candidates and DBOs (Table S3) are likely to participate in the same molecular processes and thus are candidate nonchromosome-21 genes involved in the DS phenotype.

As previously mentioned, a clear relationship has been demonstrated between gene copy number and expression level (e.g., ref. 21). However, it has been shown that a substantial proportion of triplicated genes in DS patients or DS model mice are automatically dosage-compensated (i.e., expressed at diploid levels (44–54); in Table S4) a phenomenon that would alleviate copy number constraints on dosage-balanced genes. However, their expression patterns are not consistent between studies or tissues (55). For example, the expression level of a DS gene DYRK1A (38) is increased 1.5-fold in DS brains but not increased in DS infants (56). Other experimentally verified, robust DS candidates have 1.5-fold dosage in some tissues, but their dosages are compensated automatically in other tissues (Table S4). This expression variability may be at least partly responsible for variability in the DS phenotype (44). Overexpressed genes are considered to be likely DS candidate genes (44); however, measures of overexpression are hampered by the difficulty in comparing "like-with-like" caused by some global changes in the DS phenotype (55), and DBOs are not significantly over-represented among reported overexpressed genes (Table S5).

We present evidence for dosage-balance constraints acting on retained ohnologs based on their patterns of small-scale duplication over the vertebrate lineage and duplication/loss within human populations. Our results support the hypothesis that ohnologs are enriched for dosage-balanced genes (4, 7, 11–20) and shed light on duplicate gene retention and essentiality for vertebrate genomes (7). We have further shown that ohnologs are frequently associated with disease including conditions known to be caused by dosage-imbalance, and in particular we propose a significant role for DBOs on chromosome 21 in determining the features of DS and propose novel DS candidate genes based on their evolutionary patterns. Application of this methodology to other human diseases caused by dosage imbalance may be effective in identifying candidate disease genes.

Materials and Methods

Gene with Copy Number Variants. There are 20,907 protein-coding genes that have known genomic locations and that were not on alternative sequences such as chr6_COX in Ensembl release 52 were used in this study (57). We downloaded CNVs in the human genome from Database of Genomic Variants version 7 (http://projects.tcag.ca/variation/). When the entire coding-sequence of a gene is within one of the copy number variants, we defined the gene as a CNV gene. We used 6,136 CNV genes and 14,771 non-CNV genes in this study. Out of 6,136 CNV genes, 3,843 and 3,055 genes displayed copy loss and copy gain variants, respectively.

Ohnologs and SSD Duplicated Genes. A detailed description of the identification of ohnologs (Tables S6 and S7) and SSD duplicated genes can be found in *SI Materials and Methods*.

GO. GO ids and GO "slim" annotations for biological process and molecular function of human were downloaded from ftp://ftp.geneontology.org/pub/go/gene-associations/ and ftp://ftp.geneontology.org/pub/go/GO_slims, respectively. We excluded the GO ids GO:0008150 (biological process unknown) and GO:0003674 (molecular function unknown). The frequency of each GO id assigned to DBOs or non-DBO ohnologs was counted. We calculated the



Fig. 2. Ohnologs and Down Syndrome (DS)-related genes on chromosome 21. Red and black vertical lines are ohnologs and other protein coding genes, respectively. Green dots mark reported DS candidate genes (Table 1). Gene symbols labeled in black and blue show dosage-balanced ohnologs (DBOs) and nonohnolog DS candidate genes, respectively. A gray rectangle indicates the Down Syndrome critical region covering 21q22.12, 21q22.13, and 21q22.2, which is shown in more detail below.

P value for each GO id by comparison of the observed frequency in the dataset with expectations based on a hypergeometric distribution using all genes with at least one GO id. The estimated *P* values were adjusted by Bonferroni correction. Significantly under- or overrepresented GO ids for DBOs and non-DBO ohnologs are shown in Table S1 and S2, respectively.

Members of Protein Complex. We obtained a list of members of human protein complex from Human Protein Reference Database (HPRD; http://www.hprd. org). We examined the enrichment for protein complex membership for DBOs.

Haploinsufficient Genes. As per Kondrashov and Koonin (26), we inferred haploinsufficient genes from genes with dominant-negative phenotypes (*SI Materials and Methods*). Disease gene lists were obtained from Lopez-Bigas et al. (58).

Underrepresentation of Dosage-Balanced Genes on Chromosome 21. We conducted simulations to investigate whether the number of DBOs on chromosome 21 was smaller than expected. We randomly shuffled gene locations of

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all protein coding genes on the human genome 1,000 times, and counted the number of DBOs on chromosome 21.

Disease Genes. We obtained 2,548 disease genes from the "Morbidmap" database produced by OMIM (ftp://ftp.ncbi.nih.gov/repository/OMIM/morbidmap).

Essential Genes. Mouse essential genes are determined by phenotype data from Mouse Genome Informatics (MGI; http://www.informatics.jax.org/). Full details of the identification of mouse essential genes are given in Makino et al. (7). We infer human essential genes through one to one orthology relationships with the mouse genes as defined by Ensembl release 52. Finally, we defined 1,947 genes with lethal or infertile phenotypes as essential genes in human.

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