# Monozygotic Twins Reveal Germline Contribution to Allelic Expression Differences

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Variation in the level of gene expression is a major determinant of a cell's function and characteristics. Common allelic variants of genes can be expressed at different levels and thus contribute to phenotypic diversity. We have measured allelic expression differences at heterozygous loci in monozygotic twins and in unrelated individuals. We show that the extent of differential allelic expression is highly similar within monozygotic twin pairs for many loci, implying that allelic differences in gene expression are under genetic control. We also show that even subtle departures from equal allelic expression are often genetically determined.

The alleles of an autosomal gene are not necessarily expressed at the same level.<sup>1-3</sup> These allelic differences in gene expression are a major component of phenotypic variability and contribute to both Mendelian and complex genetic traits. Allelic differences in expression have been observed in family and population studies<sup>2,4-6</sup>. These expression differences (differential allelic expression, or "DAE") can also be studied in heterozygotes.<sup>3</sup> In the most extreme form of DAE, monoallelic expression, only one of the two alleles in heterozygotes is expressed. Until recently, it was thought that monoallelic expression occurred only for a few kinds of genes: those that undergo allelic exclusion (e.g., immunoglobulins, odorant receptors) or imprinting and X-linked genes affected by the inactivation of one X chromosome in females. In a recent study, investigators used multiple clones of cells from the same heterozygous individual and concluded that "monoallelic" expression is found for 5%-10% of autosomal genes in a large proportion of the clones studied.<sup>7</sup> They also concluded that the choice of the expressed allele is made at random in different cells, and therefore represents epigenetic, not germline, effects. In contrast, our studies of twins show that germline effects must also be important. A parallel situation is found in X inactivation, when one allele is completely silenced. "Preferential X inactivation" is seen with rare promoter mutations of the XIST gene<sup>8</sup> (MIM 314670), and additional evidence for a germline non-random component is seen in family and linkage studies.<sup>9</sup>

In this study, we investigated the genetic basis of DAE by studying monozygotic (MZ) twins. We found that for many genes, the degree of DAE is remarkably similar in the members of the MZ twin pair. Instead of setting an arbitrary threshold, we defined the degree of DAE by using the distribution of allelic expression among all individuals studied. By this approach, we show that the similarity in the degree of DAE between MZ twins is seen even when the departure from equal expression is small. These results show that individual variation in the degree of DAE is under genetic control. Such a strong genetic effect implies that the overall degree of DAE for many genes depends on a process that is not random.

We prepared DNA and mRNA from lymphoblastoid cell lines representing 21 monozygotic (MZ) twins and ten CEU individuals from the International HapMap Project.<sup>10</sup> We obtained genotypes of the subjects by hybridizing their DNA on genotyping arrays (XbaI component of the 100K Affymetrix SNP array). Because the ten HapMap individuals have been genotyped at a very dense set of markers by the HapMap Project,<sup>11</sup> we compared our individual genotypes with those from the HapMap and confirmed that they were identical.

We measured differential hybridization of cDNA to the "A" and "B" alleles at each single-nucleotide polymorphism (SNP) on the genotyping arrays and estimated the relative abundance of allelic transcripts by the method of Pant et al.<sup>12</sup> with minor modifications due to the difference in our arrays. We adjusted for intrinsic differences in signal intensity between the two alleles by using the hybridization intensities of the alleles in the DNA samples on the arrays. Of the ~58,000 SNPs interrogated by the array, approximately 700 occur in exonic regions of genes. These exonic SNPs allowed us to distinguish and quantify the two allelic transcripts in heterozygotes. The resulting data were checked and filtered for genotype and phenotype quality.

We first investigated the overall distribution of allelic expression differences among the 31 unrelated individuals (one randomly chosen member of each twin pair and 10 HapMap individuals). We restricted attention to SNPs heterozygous in five or more individuals, which resulted in 285 exonic SNPs for the analysis of DAE (Figure 1A). For each SNP, we determined the departure from equal expression of alleles A and B in every heterozygote. Then we calculated the proportion of A-bearing transcripts as an "allelic expression ratio" a/(a+b), where a and b are the intensities of hybridization signals, which we take as the

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relative contributions of the two alleles to the mRNA for that gene, as in Pant et al.<sup>12</sup>. Because this ratio represents the relative abundance of A-bearing transcripts, DAE ("allelic imbalance") produces departures from the value 0.5. We used the distribution of a/(a+b) values among the heterozygotes, rather than an arbitrary threshold of allelic expression ratio, to assess the evidence for overall DAE of the corresponding gene. For each SNP, we converted the difference between the observed mean,  $\overline{x}$ , and the "expected" value, 0.5, to units of SE, the standard error of the mean. As is customary, values of  $\overline{x}$  that differed from 0.5 by more than 2 SE units were considered nominally significant (p < 0.05, two-tailed t test). Among the 285 SNPs, we found more than 50% (163 SNPs in 151 genes) with significant evidence of DAE, i.e., with  $\overline{x}$  different from 0.5 by  $\geq$  2 SE (see Table S1, available online). Among them, there were 17 with mean a/(a+b) greater than 0.66 or less than 0.33, representing a difference in expression of 2-fold or greater between the two alleles.

To assess the germline genetic contribution to DAE, we examined twin correlation of a/(a+b) in the sample of 21 MZ twin pairs. If cells from members of the same twin

## Figure 1. Differential Allelic Expression Is Extensive and Influenced by Genetic Variation

(A) Allelic expression ratio of 285 exonic SNPs measured in five or more unrelated individuals (colored dots) heterozygous at those sites. SNPs are ordered left to right by mean expression ratio, a/(a+b).

(B–D) Allelic expression ratios for selected SNPs in heterozygous MZ twin pairs (identified as in Table S2); twins have highly similar patterns of DAE. (B) Similar measurements were obtained from the two SNPs in *STOX1*. (C) Expression of the B allele is higher in all individuals studied [mean of a/(a+b) = 0.32 in 31 unrelated individuals]. (D) Twins are highly similar even when there is little evidence of DAE.

pair were grown in the same batch more often those from different pairs, the resulting batch effects could lead to artifactual similarity within pairs, i.e., exaggerated correlation of twins. We therefore grew cells from as many pairs as possible in the same batch (a total of two batches – see Table S2, available online). Thus, we were able to check that the results for twin similarity were not influenced by batch membership. For the RNA extraction and preparation of the cDNA samples for hybridization onto arrays, one batch consisted

entirely of "twin 1" from each pair, and the other batch consisted of "twin 2," so batch artifacts were completely eliminated from this procedure.

We used analysis of variance (ANOVA) to test the significance of twin resemblance. The ANOVA also provided an estimate of the intraclass correlation coefficient (ICC), the standard measure of similarity within pairs of subjects. ICC values less than or close to 0 indicate that MZ twins are no more similar than would be expected from the variation among unrelated individuals; values near 1 (the maximum) indicate that MZ twins are extremely similar.

Among the 211 SNPs heterozygous in five or more twin pairs, there are 63 (30%) with p < 0.05 for ICC (Table 1); among these, the values of ICC range from 0.47 to 0.98 (Table 1 and Figure S1). Among 211 SNPs, we expect approximately two with p < 0.01 by chance (we found 26) and much less than one with  $p < 10^{-4}$  (we found seven). Clearly, many more genes show evidence for genetic variation in allelic expression differences than would be expected by chance. When there were two SNPs in the same transcript, they gave similar results; for example, Figure 1B shows highly similar results for two SNPs in *STOX1* 

Table 1. 63 SNPs with Significant <sup>1</sup> Intraclass Correlation Coefficient for MZ Twins									
Gene	Accession Number	RS ID	Chromosome	Mean a/(a+b)	SE Units	Number of heterozygotes	Number Heterozygous Twin Pairs	ICC	ICC p Value
USP6	NM_004505	rs3890287	17	0.577	0.70	17	10	0.97	5.76E-08
ZNF605	NM_183238	rs10357	12	0.440	-2.66	12	10	0.92	1.69E-05
STOX1	NM_152709	rs10509306	10	0.451	-0.48	9	7	0.96	1.93E-05
RPS23	NM_001025	rs9099	5	0.452	-1.73	9	6	0.97	2.17E-05
ABCA12	NM_015657	rs10498027	2	0.380	-1.25	14	8	0.94	2.33E-05
KAB31 SVNCD1	NM_006868	rs1065548	18	0.487	-0.23	10	5 10	0.98	5.06E-05
STNORI SYTL2	NM_004711 NM_032943	rs597480	11	0.097	5.24 1.68	13	0	0.00	0.52E-05 1 29E-04
(1orf174	NM 207356	rs4131373	1	0.567	-0.93	8	8	0.09	1.29E-04
LOC388335	NM 001004313	rs440655	17	0.457	-3.02	16	12	0.82	1.75E-04
APOBEC2	NM 006789	rs2076472	6	0.540	2.69	10	7	0.92	2.68E-04
LOC388335	NM_001004313	rs435382	17	0.564	5.12	16	12	0.80	3.64E-04
C20orf35	NM_033542	rs2664543	20	0.478	-2.03	11	8	0.88	4.45E-04
STOX1	NM_152709	rs10509305	10	0.412	-1.02	7	5	0.95	4.68E-04
RAB6IP2	NM_015064	rs1064125	12	0.481	-0.48	14	10	0.83	4.95E-04
BRWD1	NM_018963	rs2836933	21	0.486	-1.04	16	13	0.76	5.42E-04
PEMT	NM_007169	rs7946	17	0.503	0.46	16	9	0.82	1.21E-03
C20orf35	NM_033542	rs707576	20	0.504	0.33	11	8	0.82	1.90E-03
ZNF313	NM_018683	rs6067282	20	0.530	5.09	18	13	0.70	2.00E-03
MS4A7 EVD	NM_021201	rs950802	11	0.324	-5.28	15	14	0.71	2.00E-03
ARTS_1	NM_001405	rs/60783	5	0.420	-1.49	21	14	0.00	2.00E-03 3.02E-03
VFZT	NM 017599	rs4468424	12	0.555	7 35	11	7	0.04	5.73E-03
IRF8	NM_002163	rs10514611	16	0.551	6.56	8	, 6	0.82	6.57E-03
GALNT10	NM 017540	rs3172941	5	0.524	2.51	15	9	0.72	6.97E-03
SLC25A26		rs13874	3	0.511	0.87	17	13	0.61	8.16E-03
C9orf84		rs10512411	9	0.588	1.96	10	7	0.75	1.01E-02
GALNT10	NM_017540	rs10796	5	0.479	-2.80	12	8	0.72	1.08E-02
EPB41L4A	NM_022140	rs7703522	5	0.442	-2.54	12	7	0.75	1.09E-02
PRKD3	NM_005813	rs2302650	2	0.433	-1.58	9	7	0.74	1.24E-02
GCNT1	NM_001490	rs707739	9	0.474	-1.19	10	7	0.74	1.26E-02
VLDLR	NM_001018056	rs8210	9	0.532	1.53	10	8	0.70	1.27E-02
	NM_012073	rs2578639	5	0.639	7.30	12	10	0.63	1.55E-02
SYNGRI	NM_004711	rs1010170	22	0.618	1.01	12	0	0.76	1.55E-02
CTE2CA	NM_012204	rs/62701	0	0.515	22 27	15	12	0.71	1.00E-02 1.76E-02
KI F12	NM_007249	rs9318219	13	0.509	-6.89	14	8	0.57	1.70L-02 1 89F-02
CD244	NM 016382	rs485618	1	0.538	1.40	21	12	0.56	2.04E-02
HIP1	NM 005338	rs1167829	7	0.430	-2.08	8	5	0.78	2.08E-02
SBF2	NM_030962	rs3829252	11	0.456	-1.84	13	9	0.62	2.13E-02
TBC1D2B	NM_015079	rs10519181	15	0.607	8.03	9	5	0.76	2.44E-02
PTPLAD2	NM_001010915	rs1134090	9	0.508	0.60	16	10	0.58	2.49E-02
ANKRD28	NM_015199	rs2470549	3	0.541	2.74	14	8	0.64	2.55E-02
ZNF192	NM_006298	rs9295759	6	0.535	6.45	11	7	0.67	2.58E-02
RNF36	NM_080745	rs2470911	15	0.489	-0.30	12	8	0.63	2.73E-02
L0C93349	NM_138402	rs7559665	2	0.583	12.42	14	8	0.62	2.92E-02
ZNF135	NM_003436	rs2229375	19	0.494	-0.16	18	13	0.50	3.01E-02
	NM_01/665	rs308/646	5 15	0.523	0.10	18	11	0.54	3.09E-02
ADT1	NM_024000	rs1130333	2	0.407	-1.05	19	8	0.49	3.40E-02 3.50E-02
TMEM106R	NM_018209	rs10488193	7	0.410	-10 10	10	8 10	0.00	3.79E-02
SMC2	NM_001042550	rs7872034	9	0.461	-5.01	18	10	0.51	3.83E-02
ORSL1	NM 018292	rs1026619	6	0.327	-23.79	10	6	0.66	3.99E-02
NR1I2	NM 003889	rs10511395	3	0.443	-2.65	7	6	0.66	4.01E-02
PSCDBP	NM_004288	rs267992	2	0.429	-7.61	9	7	0.62	4.03E-02
NT5DC3	NM_016575	rs9142	12	0.601	12.19	14	10	0.53	4.08E-02
GPR55	NM_005683	rs1992188	2	0.561	2.50	13	9	0.55	4.10E-02
KLHL5	NM_001007075	rs3733275	4	0.461	-3.56	12	9	0.55	4.10E-02
CD80	NM_005191	rs1599796	3	0.549	11.61	11	8	0.58	4.25E-02
ALKBH3	NM_139178	rs2292889	11	0.415	-9.62	8	6	0.65	4.28E-02
ARSK	NM_198150	rs10491246	5	0.507	0.84	9	9	0.54	4.48E-02
LUX4NB	NM_006067	rs8587	16 F	0.536	4.93	18	12	0.47	4.56E-02
JEFFI	MM_005410	150413428	2	0.000	0.39	12	0	0.57	4.04E-U2

 $^{1}$  p < 0.05.

(MIM 609397). (This result also provides evidence for technical reliability of the methods. Two SNPs in each of the transcripts for LOC388335 and *SYNGR1* (MIM 603925) provide additional support—see Supplemental Data.)

The marked twin resemblance in the magnitude of DAE was seen not only for genes such as *MS4A7* (MIM 606502), for which there are large departures from equal allelic expression (Figure 1C), but also for genes whose allelic forms are expressed at similar levels, i.e., for which there is no significant evidence of DAE, as in *ZNF605* (Figure 1D).

Our findings lead to several conclusions. First, for at least 50% of genes expressed in lymphoblastoid B cells, the entire distribution of the allelic expression ratio is significantly shifted away from the expected mean of 0.5 (equal allelic expression). This conclusion results from our analysis of the distribution of allelic ratios. If an arbitrary threshold had been used to define DAE, it would not have been possible to detect the small departures, where the expression phenotype as a whole shows small but significant DAE in normal individuals. In contrast, some of the differences are very large; they amount to two-fold or greater in average expression level between alleles. Second, the results from MZ twins show that the degree of DAE is significantly correlated within a twin pair for at least 30% of genes. This suggests that not just the presence of DAE, but also its quantitative extent, is under genetic control. This twin correlation is found even for genes where the average departure from the expected equal allelic expression is small and not significant. Third, our analysis suggests a genetic interpretation of the recent finding of widespread random monoallelic expression.<sup>7</sup> Gimelbrant and colleagues<sup>7</sup> studied cloned lymphoblastoid B cells and concluded that an individual is mosaic with regard to 5%-10% of genes expressed in B cells; for these genes, some cells express only the paternally derived allele, some express only the maternally derived allele, and (for most genes) some express both alleles. In our study, we also found that allelic differences in gene expression are common. However, the twin correlations show that even if the population of B cells is mosaic, the extent of differential allelic expression for the entire population of B cells in an individual is not random but rather is influenced by inherited variation. This implies that the determinants of allele-specific gene expression can be identified by genetic analyses. Further studies to map these genetic determinants of DAE will lead to a better understanding of regulation of human gene expression, a major determinant of cellular phenotype.

# Supplemental Data

Two figures and one table are available online at http://www.ajhg.org/.

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#### Web Resources

The URLs for SNPs and genes referred to herein are as follows:

International HapMap Project, http://www.hapmap.org/ Online Mendelian Inheritance in Man, http://www.ncbi.nlm.nih. gov/Omim

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