Methods

Genetic Plasticity of V Genes Under Somatic Hypermutation: Statistical Analyses Using a New Resampling-Based Methodology

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Evidence for somatic hypermutation of immunoglobulin genes has been observed in all of the species in which immunoglobulins have been found. Previous studies have suggested that codon usage in immunoglobulin variable (V) region genes is such that the sequence-specificity of somatic hypermutation results in greater mutability in complementarity-determining regions of the gene than in the framework regions. We have developed a new resampling-based methodology to explore genetic plasticity in individual V genes and in V gene families in a statistically meaningful way. We determine what factors contribute to this mutability difference and characterize the strength of selection for this effect. We find that although the codon usage in immunoglobulin V genes renders them distinct among translationally equivalent sequences with random codon usage, they are nevertheless not optimal in this regard. We find that the mutability patterns in a number of species are similar to those we find for human sequences. Interestingly, sheep sequences show extremely strong mutability differences, consistent with the role of somatic hypermutation in the diversification of primary antibody repertoire in these animals. Human TCR V_{β} sequences resemble immunoglobulin in mutability pattern, suggesting one of several alternatives, that hypermutation is functionally operating in TCR, that it was once operating in TCR or in the common precursor of TCR and immunoglobulin, or that the hypermutation mechanism has evolved to exploit the codon usage in immunoglobulin (and fortuitously, TCR) rather than vice-versa. Our findings provide support to the hypothesis that somatic hypermutation appeared very early in the phylogeny of immune systems, that it is, to a large extent, shared between species, and that it makes an essential contribution to the generation of the antibody repertoire.

Affinity maturation is a distinctive feature of immune responses in endothermic species such as mice and humans. During a period of 2-3 weeks after immunization, the affinity of antibodies that are raised in response to the immunogen (the molecules in the inoculum that trigger the immune response) increases by 1-3 orders of magnitude. This is due to a miniature evolutionary process involving the cells (B cells) that secrete antibody molecules. The process takes place in the specialized microenvironment of the germinal centers (Jacob et al. 1991), in which B cells replicate at considerable rates (Hanna 1964; Zhang et al. 1988; Liu et al. 1991). Mutations are introduced in the variable regions of B-cell receptors (also known as antibodies, or immunoglobulins) engaged in the response, at a rate 10^5 - 10^6 times higher than background DNA mutation (Weigert et al. 1970; Bernard et al. 1978), therefore this mutational process is called somatic hypermutation. The affinity of B-cell receptors for immunogen constitutes the basis on which the cells are selected and recruited for the memory compartment. Memory B cells generally carry high-affinity receptors, in contrast to

the B cells involved in the early stages of the immune response whose receptors were unmutated (Berek et al. 1991; Jacob and Kelsoe 1992; Nossal 1992). The nature of somatic hypermutation is not known, but there is a wealth of knowledge about its sequence specificity (Lebecque and Gearhart 1990; Rogozin and Kolchanov 1992; Betz et al. 1993; Smith et al. 1996; Dörner et al. 1998; Milstein et al. 1998). Certain nucleotide motifs have been shown to be preferentially mutated, and are thus called hot spots. In most systems in which somatic hypermutation of B-cell receptors has been described (Wilson et al. 1992; Betz et al. 1993; Hinds-Frey et al. 1993; Van der Stoep et al. 1993; Reynaud et al. 1995), the sequence specificity seems to follow similar patterns.

The genes encoding the light and heavy chains of the antibody molecule, as well as the α and β chains of the T-cell receptor (TCR), are assembled through a somatic rearrangement process from a number of gene fragments (Tonegawa 1983). These fragments are V (variable), D (diversity, only present in immunoglobulin heavy chains and TCR β chains), J (junctional), and C (constant). A number of nonidentical copies for each type of fragment are present in the genome, constitut-

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ing what are called libraries of functionally identical gene fragments. A given B cell bears only one type of antibody (heavy and light chain) on its surface, but different B cells may have different receptors. During the folding process of the antibody heavy and light chains, regions that are not contiguous in the primary structure, come in close proximity to form the binding site. These regions are called complementarity-determining regions (CDR), and they alternate, in the primary structure of the protein, with framework regions (FR). As opposed to CDR, which participate in the immunogen binding, FR are essential for the correct folding of the antibody.

The diversity of CDR translates into a diversity of binding sites, and is therefore an essential ingredient in the ability of the immune system to respond to a wide variety of pathogens. Tanaka and Nei (1989) presented evidence for diversity-enhancing selection operating on the CDR. Although we believe that germ-line diversity is very important, it is also limited, and it seems plausible that the survival ability of the organism grows only slowly as a function of the size of its primary antibody repertoire (Oprea and Forrest 1999). In this study, we argue that CDR are not only diverse, but they are also readily diversifiable under somatic hypermutation, a property that will be referred to as plasticity. In contrast, framework regions are not only more conserved in evolution, but are also less likely to undergo somatic hypermutation.

That CDR are inherently more susceptible to (somatic) mutations has been suggested by various authors (Motoyama et al. 1991; Varade et al. 1993), and later supported by statistical evidence (Wagner et al. 1995; Kepler 1997; Dörner et al. 1998; Cowell et al. 1999). In this study, we develop a novel resampling-based methodology and use it to analyze several aspects of this genetic plasticity. We show that individual V gene fragments evolved codon bias that enhances their plasticity under somatic hypermutation, and also, that the strength of this effect varies between different V gene families. On the basis of the plasticity patterns that we find, we argue that the mechanism of somatic hypermutation is likely to be shared between a large number of species, and we discuss the possibility of TCR hypermutation (Zheng et al. 1994; Cheynier et al. 1998).

RESULTS

Statistical Analysis on the Level of Individual Sequences

One of the factors limiting previous analyses of mutability differences in immunoglobulin sequences is the small number of effectively independent sites for making the appropriate comparisons. There are just a handful of codons in the CDR of any given immuno-

globulin V gene, and the effect in which we are interested may be subtle enough that this limit on the sample size sharply reduces the power of any tests based on individual sequences. Furthermore, related sequences are not independent, so one is limited in the ways one can use information from such collections of related sequences (Kepler 1997). Our approach is quite different. To understand the mutability pattern of a given V-gene sequence we compare it with those of a large population of artificial sequences constructed by resampling of the original sequence according to various resampling schemes (see Methods). In this way, we are able to make statistically meaningful statements about individual sequences.

For each V region sequence, we calculate the following quantities: the average replacement mutability per FR nucleotide (μ_F), the average replacement mutability per CDR nucleotide (μ_C), and the CDR/FR mutability ratio (μ_C/μ_F). Each of the resampled, artificial sets preserves one particular structural feature of the actual gene (for details see the Methods section). The information regarding one gene sequence is graphically represented as follows. Each artificial variant of the sequence is characterized by two numbers, its predicted mean FR and CDR mutabilities. After collecting measurements over many artificial variants, we construct a histogram of the counts on these two numbers and display it as a contour plot in the plane of CDR versus FR mutabilities. By plotting these histograms for different artificial datasets along with the CDR and FR mean mutabilities for the actual sequence, we can see how these artificial sets relate to each other as well as where, within the range of variability for each artificial set, the actual sequence falls. Using this approach, we attempt a more detailed understanding of the selection pressures that operate individual genes.

For the purpose of illustration, we take the human heavy chain gene V_H6-1 , the sole member of the 6th V_H family. We find that the average replacement mu-

Figure 1 Contour plot of the predicted average FR vs. CDR mutability of V_H6-1 variants: (A) 10^5 sequences identical nucleotide composition (black), 10^5 sequences with similar codon composition (blue); (B) 10^5 sequences with identical amino acid translation (black). The contour levels are drawn at 1, 10, and 100 sequences. The actual gene is shown in red.

Figure 2 Sketch of the algorithm for generating artificial variants of (A) individual gene sequences. The nucleotides in FR and CDR are pooled separately. An artificial sequence is then constructed by sampling, without replacement from the pool of FR and CDR, respectively. Similarly, FR and CDR codons are separately pooled. To construct the FRs and CDRs of an artificial variant, FR and CDR codons are sampled, without replacement, from the respective pools of codons. Finally, the gene sequence is translated into the amino acid sequence. Then, for each amino acid position, one of the possible synonymous codons is chosen, with uniform probability for the artificial variant. (B) A family of gene sequences. The nucleotide positions in the alignment are numbered separately for FRs and CDRs. A permutation of these indices is generated and used to construct a complete artificial set of sequences. Then, the codon sites in the alignment are numbered, the indices permuted, and the permutation used to construct variant sequence sets with identical codon composition. Finally, the sequences are aligned and translated. At each amino acid position in the alignment, a new set of permutations over each of the synonymous codons is generated. The alignment is then traversed, and an artificial set of sequences is constructed by replacing the codon that appears in the real gene at that position with the one corresponding to it in the permutation.

tability of a CDR nucleotide in V_H6-1 is 1.6 times higher than the average replacement mutability of a FR nucleotide, consistent with the findings of Insel and Varade (1998). In addition, we provide information about the structural features underlying the CDR/FR mutability difference of this gene. Figure 1 shows several things; first the nucleotide composition alone could not be responsible for the difference (the black contour plot lies on the diagonal of identical CDR/FR mutability). Furthermore, the position of the observed

V_H6-1 (red dot) lies above and to the left of the contour of artificial sequences with the same CDR and FR nucleotide composition. This indicates that nearest-neighbor interactions both decrease the FR mutability and enhance the CDR mutability relative to the bulk of artificial sequences with identical nucleotide composition.

To determine what features of these interactions are most responsible for this effect, we turn to artificial sequences that preserve the codon composition of the actual sequence, but do not preserve the context of the codons. That is to say, all the codons of the actual sequence appear in the artificial sequence, although in a different order. What we find is that the contour plot of these artificial sequences (Fig. 1A, blue) is strongly displaced up and/or to the left of the diagonal line on which FR and CDR mutabilities are equal; CDR mutability is increased and/or FR mutability is decreased. Furthermore, the real sequence falls quite close to the center of the distribution, indicating that the inter-codon interactions are not playing a significant role in the plasticity of this gene (Table 1). In other words, the highly degenerate third codon position does not seem to be chosen for its influence on its 3' neighbor (first position in the next codon).

The encoding of some amino acids is doubly or even singly degenerate, whereas others are three-, four-, or sixfold degenerate. The latter are naturally less susceptible to replacement mutations than the former. It is conceivable that the amino acid sequence of CDR is enriched in amino acids that are more susceptible to replacement mutations purely by virtue of their degeneracy (Chang and Casali 1994). To test this hypothesis, we generated artificial sequences that have the same amino acid translation as the actual sequence, but use different codons to encode these amino acids. Figure 1B (black contour) shows that if codon usage were random, CDR would, on average, be somewhat more mu-

Figure 3 Contour plot of the average FR vs. CDR mutability over sets of artificial variants of human V_H sequences. We constructed (A) 10^4 sets with identical nucleotide composition (black), 10^4 sets with identical codon composition (blue), and (B) 10^4 sets with identical amino acid translation (black). The contour levels are drawn at 1, 10, and 100 sequences. The actual sequence set is shown in red.

Table 1. Quantiles of Individual Real V_H Sequences Within Each of the Three Variant Sets Generated by Resampling

Gene	Nucleotide permutations			Codon permutations			Translationally equivalent		
	μ_F	μ_C	μ_C/μ_F	μ_F	μ_C	μ_C/μ_F	μ_F	μ_C	μ_C/μ_F
Human V_H1 genes									
IGHV1-18	0.783	0.976	0.914	0.396	0.074	0.134	0.154	0.536	0.729
IGHV1-2	0.725	0.776	0.662	0.582	0.168	0.17	0.093	0.107	0.331
IGHV1-24	0.617	0.225	0.207	0.236	0.11	0.184	0.0745	0.6	0.797
IGHV1-3	0.861	0.92	0.783	0.639	0.078	0.077	0.287	0.478	0.598
IGHV1-45	0.896	0.84	0.66	0.735	0.241	0.177	0.351	0.118	0.175
IGHV1-46	0.805	0.969	0.898	0.134	0.359	0.566	0.191	0.709	0.824
IGHV1-58	0.815	0.779	0.637	0.474	0.477	0.485	0.221	0.552	0.65
IGHV1-69	0.878	0.885	0.731	0.49	0.561	0.563	0.19	0.787	0.863
IGHV1-8	0.837	0.47	0.313	0.257	0.07	0.142	0.154	0.137	0.292
IGHV1-f	0.931	0.8	0.547	0.66	0.187	0.163	0.344	0.529	0.61
Human V_H2 genes									
IGHV2-26	0.549	0.177	0.193	0.445	0.04	0.082	0.034	0.783	0.943
IGHV2-5	0.463	0.484	0.508	0.548	0.317	0.311	0.014	0.742	0.94
IGHV2-70	0.426	0.571	0.599	0.365	0.243	0.343	0.007	0.907	0.991
Human V_H3 genes									
IGHV3-11	0.74	0.95	0.872	0.564	0.762	0.717	0.055	0.922	0.977
IGHV3-13	0.829	0.866	0.725	0.906	0.477	0.284	0.42	0.776	0.79
IGHV3-15	0.592	0.554	0.498	0.415	0.192	0.238	0.24	0.61	0.708
IGHV3-16	0.159	0.216	0.397	0.472	0.286	0.307	0.019	0.579	0.826
IGHV3-19	0.227	0.221	0.364	0.507	0.294	0.308	0.061	0.564	0.76
IGHV3-20	0.178	0.363	0.555	0.516	0.07	0.081	0.018	0.6	0.895
IGHV3-21	0.481	0.995	0.987	0.504	0.787	0.752	0.03	0.991	0.999
IGHV3-23	0.815	0.953	0.858	0.721	0.322	0.256	0.126	0.941	0.971
IGHV3-30.3	0.766	0.849	0.687	0.678	0.438	0.371	0.088	0.956	0.987
IGHV3-30	0.679	0.752	0.634	0.608	0.576	0.515	0.097	0.938	0.975
IGHV3-33	0.594	0.862	0.789	0.606	0.542	0.488	0.026	0.916	0.984
IGHV3-35	0.254	0.211	0.342	0.367	0.279	0.345	0.037	0.571	0.799
IGHV3-38	0.523	0.819	0.785	0.37	0.224	0.294	0.039	0.856	0.954
IGHV3-43	0.388	0.731	0.753	0.467	0.367	0.393	0.058	0.867	0.961
IGHV3-47	0.614	0.981	0.952	0.434	0.715	0.727	0.131	0.986	0.994
IGHV3-48	0.76	0.995	0.966	0.663	0.924	0.864	0.136	0.995	0.997
IGHV3-49	0.627	0.888	0.815	0.678	0.096	0.09	0.204	0.767	0.854
IGHV3-53	0.495	0.983	0.97	0.341	0.527	0.605	0.022	0.878	0.975
IGHV3-64	0.77	0.955	0.872	0.734	0.447	0.356	0.177	0.955	0.971
IGHV3-66	0.629	0.978	0.944	0.395	0.479	0.533	0.059	0.899	0.967
IGHV3-7	0.741	0.759	0.603	0.737	0.516	0.411	0.071	0.89	0.962
IGHV3-72	0.197	0.966	0.977	0.269	0.686	0.77	0.038	0.893	0.979
IGHV3-73	0.504	0.967	0.943	0.656	0.53	0.456	0.022	0.863	0.969
IGHV3-74	0.555	0.957	0.92	0.657	0.635	0.552	0.063	0.971	0.992
IGHV3-9	0.306	0.813	0.848	0.639	0.258	0.226	0.036	0.966	0.994
IGHV3-d	0.574	0.742	0.692	0.383	0.226	0.291	0.124	0.82	0.909
Human V_H4 genes									
IGHV4-28	0.415	0.936	0.923	0.293	0.357	0.489	0.001	0.59	0.933
IGHV4-301	0.625	0.964	0.923	0.35	0.005	0.049	0.031	0.472	0.779
IGHV4-302	0.545	0.79	0.751	0.228	0.034	0.121	0.019	0.493	0.775
IGHV4-304	0.477	0.971	0.952	0.254	0.009	0.095	0.01	0.63	0.912
IGHV4-31	0.64	0.962	0.918	0.336	0.006	0.05	0.041	0.466	0.76
IGHV4-34	0.359	0.837	0.851	0.146	0.224	0.427	0.006	0.686	0.931
IGHV4-39	0.424	0.993	0.984	0.312	0.459	0.577	0.006	0.806	0.976
IGHV4-4	0.245	0.985	0.986	0.294	0.7	0.767	0.001	0.644	0.961
IGHV4-59	0.308	0.977	0.975	0.236	0.22	0.406	0.003	0.543	0.907
IGHV4-61	0.31	0.992	0.99	0.227	0.125	0.327	0.003	0.76	0.972
IGHV4-b	0.31	0.987	0.985	0.127	0.192	0.461	0.004	0.685	0.953

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Table 1. (Continued)

Gene	Nucleotide permutations			Codon permutations			Translationally equivalent		
	μ_F	μ_C	μ_C/μ_F	μ_F	μ_C	μ_C/μ_F	μ_F	μ_C	μ_C/μ_F
Human V_H5 genes									
IGHV5-51	0.791	0.996	0.977	0.599	0.934	0.903	0.065	0.917	0.975
IGHV5-a	0.888	0.997	0.967	0.596	0.938	0.901	0.21	0.975	0.981
Human V_H6 gene									
IGHV6-1	0.041	0.966	0.994	0.214	0.356	0.573	0.008	0.855	0.987
Human V_H7 genes									
IGHV7-41	0.453	0.886	0.869	0.24	0.131	0.264	0.012	0.193	0.601
IGHV7-81	0.893	0.515	0.319	0.522	0.005	0.014	0.26	0.015	0.043

table than FR, but the real sequence is significantly different from these artificial variants (Table 1). This indicates that, although detectable, the effect of amino acid usage is considerably enhanced by the specific codon usage of the actual gene.

In humans, there are seven families of heavy chain V-region sequences (Max 1998) with different apparent functionality, V-gene usage varies with the specific immunogen, and perhaps with other characteristics of the infection as well. Therefore, it may be of some interest to compare the plasticity of V_H families. Table 1 shows there is considerable variation in plasticity between V_H families. For each actual gene, we determined the quantile of the indicated statistic (μ_F , μ_C , μ_C/μ_F) within each group of resampled variants, the mutability ratio is high for all V_H families except V_H1 and V_H7 . V_H5 has an especially high CDR mutability, whereas V_H2 , V_H4 , and V_H6 have low FR mutability. In V_H3 genes, we observe both low FR mutability as well as high CDR mutability.

Analysis of V-Region Alignments

Because immunoglobulin V genes are related through common ancestry, we expect that their mutabilities will be correlated. Therefore, we adapted the foregoing tests for use on sequence alignments rather than on individual genes, obviating the problem of correlations (see Methods and Fig. 2).

Contour plots of the replacement mutability per FR and CDR nucleotide averaged over positions within

each gene and over genes within the alignments for the three types of artificial variants of the human V_H sequence set as shown in Figure 3. We find a small effect of nucleotide composition (Padlan 1997), as well as of amino acid composition on the CDR/FR mutability difference. What we have been able to show in this study is that, by far, the most important single factor in differential mutability is the different codon usage of the two types of regions. We infer this from both the placement of the artificial sequence sets in the plane of CDR-FR set average mutability, and from the position of the actual V_H genes relative to the artificial sequence sets. These results can again be partially summarized by the quantiles of the real gene set within each of its resampled variants (Table 2).

We examined the human V_K and V_L gene segments in a similar manner. We find that all of these sequences have higher replacement mutability of CDR nucleotides than of FR nucleotides (Fig. 4).

Are Human V Region Genes Locally Optimized for Somatic Hypermutation?

Having shown that selection for plasticity under somatic hypermutation is evident in individual V genes, we may ask whether these sequences appear to be locally optimal with respect to this property. That is, are these gene segments better than the sequences obtained by replacing a small number of nucleotides while preserving the translation?

To address this question, we use artificial se-

Table 2. Quantiles of Complete Human V_H Alignment Within Each of the Three Variant Sets Generated by Resampling

Nucleotide permutations			Codon permutations			Translationally equivalent		
μ_F	μ_C	μ_C/μ_F	μ_F	μ_C	μ_C/μ_F	μ_F	μ_C	μ_C/μ_F
0.623	0.9925	0.961	0.425	0.161	0.244	0.006	0.957	0.998

quences that differ from the real sequence by a small number of silent mutations. Among the 2-mutation neighbors, the proportion of sequences with higher CDR/FR mutability ratio than the actual sequence varies between 38 and 52 percent. Among 10-mutation neighbors, this proportion varies more widely (25% to 65%). By the time we reach 50-mutation neighbors, the *V* gene family-specific patterns that we discussed above (see also Table 1) begin to emerge. We conclude that although local codon bias clearly enhances the CDR/FR mutability ratio in human *V_H* genes, this differential codon bias is far from fully optimal for plasticity under somatic hypermutation.

Phylogenetic Analysis of V-Gene Plasticity

We analyzed two other complete germ-line sequence sets, sheep (*Ovis aries*) *V_λ* and rainbow trout (*Oncorhynchus mykiss*) *V_H*, a (possibly incomplete) germ-line set of *V_H* sequences from horned shark (*Heterodontus francisci*), and a set of cDNA *V_H* sequence of African clawed toad (*Xenopus laevis*). We find that CDR mutability is higher than FR mutability in these sequences, similar to human sequences (Fig. 5). Moreover, we also find codon usage consistent with low FR and high CDR mutability (Table 3). This suggests not only that these genes, too, have enhanced plasticity, but that the microsequence specificity is sufficiently well conserved that such patterns are evident even though the mutability model was inferred from murine data (see Methods). The average CDR/FR mutability ratio of the actual sequence set is always very high relative to translationally equivalent variant sets, and in one case, of the sheep *V_λ*, none of the variant sequence sets had as high a ratio as the actual set. A detailed analysis of individual *V_λ* genes of sheep is presented in Table 4. Both FR and CDR codon bias contribute to the high mutability ratio in a seemingly complementary manner. The CDR codon bias is more extreme in the species in which the FR codon bias is relatively low (rainbow trout) or absent (African toad).

We performed a similar test on a number of isolated sequences ranging from the new antigen receptor (Greenberg et al. 1995) of the nurse shark (*Ginglymostoma cirratum*) and short-tailed opossum (*Monodelphis domestica*), to the heavy chain dimers of the camel (*Camelus dromedarius*). High CDR relative to FR mutability is a general characteristic in almost all of the sequences that we analyzed (data not shown).

Relation Between Serine Codon Usage and Mutability

To determine the role that serine codon segregation plays in the mutability of the two regions of the *V* genes, we repeated the above analyses, disregarding the nucleotides that encode serine in the calculation of mutability. In human *V_H*, sheep *V_λ*, and rainbow trout *V_H*, we find that codon bias at amino acids other than

serine induces very low FR mutability. The CDR/FR mutability ratio remains high in the real sequence sets, even though for most of these sets, the CDR mutability becomes indistinguishable from that of translationally equivalent variants. The mutability of horned shark *V_H* is almost unaffected by serines, whereas the CDR/FR mutability difference of African toad sequences seems to be due entirely to the presence of the highly mutable serine codons in the CDR. These results are summarized in Table 3.

Higher Predicted Replacement Mutability of TCR CDR Than of TCR FR

Because the trace of somatic hypermutation is so apparent in immunoglobulin genes by use of our analytical methods, we attempted a similar analysis of TCR sequences, hoping to shed more light on the still-controversial issue of TCR hypermutation. Figure 6 shows the scatter plot of the average FR–CDR nucleotide mutability of TCR_α (blue) and TCR_β (red) *V* region genes. For most of TCR_β sequences, we predict higher replacement mutability of their CDR nucleotides than of their FR nucleotides. For TCR_α this difference is not as clear, many sequences having lower mutability in the CDR than in the FR. We find very strong evidence for plasticity enhancement in TCR_β, but not in TCR_α (Table 5).

DISCUSSION

It is usually quite difficult to construct a complete account of the evolutionary process in molecular detail, because the mapping from genotype to phenotype is generally too complex to determine fully. A remarkable feature of the system studied here, the evolution of immunoglobulin variable region genes under the pressures caused by somatic hypermutation, is that the phenotypic trait of plasticity under somatic hypermutation can be mapped to the genotype very satisfactorily. This is so because the trait is a property of the DNA sequences themselves, and not of their products.

There remain, of course, those traits of the immunoglobulins that are expressed in the protein molecules themselves. Ironically, perhaps, the map from genotype to protein phenotype in immunoglobulins is even more complex than usual due to the extensive somatic modification that is required for expression. Thus, plasticity under somatic hypermutation—the ability to put mutations in CDR, in which they have a higher chance of enhancing function and away from FR, in which they have a higher chance of disrupting function—although potentially having only subtle effects, may, by virtue of its directness, be a primary force in the formation of the germ-line *V*-gene repertoire.

We have undertaken a detailed study of *V*-gene plasticity at the level both of individual genes and of gene families.

Figure 4 Scatter plot of the predicted average mutability per FR vs. CDR nucleotide for the set of 56 human V_H (blue), 39 V_λ (green), and 37 V_κ (red) sequences.

What Determines the CDR/FR Mutability Difference in Human V_H Genes?

Consistent with the results of Padlan (1997), we found that the difference in nucleotide composition accounts, to some extent, for the difference in mutability. There are, however, important local interactions, codon bias makes FR significantly less mutable than their translationally equivalent variants, the converse being true for the CDR. The high mutability in CDR is due largely to local bias in the use of serine codons. Once this segregation is taken into account, CDR are not unusual relative to their translationally equivalent variants sampled without codon bias. This is not to say that AGY serine codons are entirely responsible for the high CDR mutability. Highly mutable amino acids (i.e., amino acids with low degeneracy in their encoding, as well as amino acids for which all codons have relatively high mutability) maintain a high CDR mutability independently of the serine codons.

Serine is a peculiar amino acid in the following sense. For all other amino acids, the synonymous codons are mutually accessible via single-point mutations. In contrast, serine is encoded by two mutually isolated codon sets, AGY and TCN. The largest differences in mutability among synonymous codons are those between these two disjoint serine codon sets. Thus, the preferential use of the mutable AGY codons

Figure 5 Scatter plot of the predicted average replacement mutability of CDR vs. FR nucleotides for: sheep V_λ (blue), horned shark V_H (green), rainbow trout V_H (red).

in CDR and of the less mutable TCN codons in FR, and the resulting high CDR/FR mutability ratios, are difficult to interpret. Is the observed segregation due to selection for plasticity under somatic hypermutation, or are the two different types of serine codons frozen accidents and the apparent mutability differences merely artifactual? The results that we obtained on horned shark V_H are very interesting to us from this perspective. The shark is phylogenetically the oldest species that we have in our data set. In fact, the vertebrate immune system arose with jawed vertebrates, that is, with sharks or their immediate ancestors (Du Pasquier and Flajnik 1998). We found that in this species, the CDR and FR mutabilities are almost unaffected by serines. In other words, the mutability pattern that we are studying already exists in the oldest known immunoglobulin genes, and is not due to the segregation of more mutable serine codons in the CDR.

Human V_H families differ in their mutability pattern, but in the absence of greater understanding of the functional role of these genes, we are not able to interpret these results.

Is the Somatic Hypermutation Mechanism Shared Between Mammals and Poikilothermic Vertebrates?

The mechanism responsible for somatic hypermutation in mammals may differ from that of poikilother-

Table 3. Quantiles of FR and CDR Mutability and CDR/FR Mutability Ratio of the Real Sequence Sets Compared to Translationally Equivalent Variants in Various Species

Species	Serine included			Serine excluded		
	μ_F	μ_C	μ_C/μ_F	μ_F	μ_C	μ_C/μ_F
Human V_H	0.006	0.957	0.998	0.002	0.57	0.744
Sheep V_λ	0.001	0.976	1	0.001	0.14	0.687
Rainbow trout V_H	0.1	0.983	0.994	0.007	0.325	0.805
Horned Shark V_H	0.047	0.675	0.974	0.022	0.787	0.983
African toad V_H	0.423	0.991	0.985	0.499	0.561	0.546

Table 4. Quantiles of Individual Sheep V_{λ} Sequences

Gene	Translationally equivalent variants		
	μ_F	μ_C	μ_C/μ_F
SHPIGJVB	0.003	0.911	0.992
AF040900	0.002	0.987	1
AF040901	0.01	0.999	1
AF040902	0.004	0.976	0.998
AF040904	0.031	0.427	0.685
AF040905	0.005	0.999	1
AF040907	0.002	0.975	0.999
AF040908	0.003	0.87	0.982
AF040909	0.015	0.673	0.919
AF040911	0.007	0.913	0.988
AF040913	0.006	0.804	0.96
AF040914	0.022	0.995	1
AF040915	0.008	0.978	0.998
AF040916	0.019	0.673	0.909
AF040917	0.001	0.91	0.991
AF040918	0.001	0.976	0.999
AF040919	0.01	0.672	0.932
AF040920	0.014	0.674	0.921
AF040921	0.006	0.288	0.745
AF040922	0.013	0.701	0.914
AF040923	0.001	0.975	0.999
AF040924	0.003	0.975	0.998

mic vertebrates such as nurse shark (Hinds-Frey et al. 1993) and African toad (Wilson et al. 1992; Hsu 1998). This issue has not yet been resolved, but our results may be relevant here. We detected differential codon bias associated with high CDR and low FR mutability in these poikilothermic species. For us to see these patterns with our methods, not only must these species be subject to selection for V-gene plasticity as are humans and mice (the patterns have to be there) but the microsequence specificity of the somatic hypermutation mechanism must be similar to those found in mouse (the source of our estimates for the mutation model). This is what we found, with the possible exception of the African toad sequences (with the caveat that these were cDNA rather than germ-line sequences and might already contain somatic mutations). These results argue for the ubiquity of at least some components of the somatic hypermutation mechanism. If the mechanism of somatic hypermutation shares biochemical features with the mechanisms underlying general meiotic mutation, as seems to be the case (M. Oprea and T.B. Kepler, in prep.), this conservation is not surprising.

Although a general mutability pattern did emerge, we also found considerable variability between species. In sheep, somatic hypermutation is used in the diversification of the primary repertoire (Reynaud et al. 1995), presumably without stringent antigen selection. Therefore, these receptors are screened for functionality only after several mutations have been introduced. Under these circumstances, it would seem that the advantage conferred by differential CDR–FR mutability

Table 5. Quantiles of Germ-Line TCR Gene Alignments with Respect to their Translationally Equivalent Variants

Sequence set	μ_F	μ_C	μ_C/μ_F
TCR α	0.352	0.394	0.444
TCR β	0.01	0.958	0.989

might be much higher in these animals. Interestingly, we found that these genes have very high plasticity. The FR mutability is invariably lower than that of the translationally equivalent variants—regularly in the lowest percentile, and the mutability ratio is extremely high; in four cases, none of the 10,000 synthetic sequences had ratios as high as that observed in the real sequence.

Do TCR Genes Hypermutate?

Although somatic hypermutation has been studied for many years in immunoglobulin V genes, only recently has it been found that TCRs also experience hypermutation (Zheng et al. 1994; Cheynier et al. 1998). The characteristics of T-cell hypermutation are remarkably like those in B cells, only germinal center T cells already recruited into the immune response are mutated. TCR mutations are found in the CDR and particularly in microsequences that are described as hotspots of B-cell receptor hypermutation. Yet, the functional significance of T-cell hypermutation has not been determined, and this part of the story remains controversial. Kepler and Bartl (1998), looking for the presence of mutable motifs in TCR CDR, concluded that some of the TCR chains resemble immunoglobulins in their mutability pattern, but could not provide definitive evidence that TCR sequences are selected for plasticity.

Our analysis of TCR sequences indicates no significant mutability difference between CDR and FR in

Figure 6 Scatter plot of the predicted FR vs. CDR nucleotide mutability values for the set of human TCR α (blue) and TCR β (red) sequences.

TCR $_{\alpha}$, TCR $_{\beta}$, on the other hand, have a mutability pattern similar to those in immunoglobulins. It may be possible that hypermutation does play a functional role in the development of the TCR $_{\beta}$ repertoire and is reflected in these genes' differential codon usage. Experimental support for this hypothesis has been provided recently (Cheynier et al. 1998). Alternatively, somatic hypermutation might have been active very early in ontogeny, acting on the ancestral receptor from which both immunoglobulin and TCR evolved. Perhaps somatic mutation was preserved in B cells, but was lost in T cells; the residual codon bias once shared with immunoglobulin carries the trace of the ancient hypermutation mechanism. Although the mutability pattern of immunoglobulins in diverse species also argues for an early origin of somatic mutation, the preservation of a relic local codon bias over long stretches of time in the absence of continued pressure to maintain it strikes us as unlikely. Therefore, we view our results as strong, although indirect, evidence that TCR hypermutation does carry functional significance.

CONCLUSION

It is clear that the hypermutation mechanism (whatever it turns out to be) has coevolved with its substrates. Both the sequence specificity of the mutator and the differential codon usage have likely adapted to each other. Our results are consistent with the mutator having adapted to the codon usage in the primordial antigen receptor with subsequent conservation of both the sequence specificity of the mutator and the codon usage in the *V* genes. In particular, the suboptimality of *V* genes in their local sequence neighborhoods and the lack of intercodon interactions (permuting codons within CDR and FR regions does not affect the differential mutability, see Table 1) are most easily accommodated by this perspective.

METHODS

Sequence Data

The sets of human immunoglobulin [H (56 sequences), κ (37 sequences), and λ (39 sequences)] and TCR [α (41 sequences) and β (54 sequences)] *V*-gene sequences were isolated from IMGT, the international ImMunoGeneTics database (<http://imgt.cnusc.fr:8104>, Curator: Marie-Paule Lefranc, Montpellier, France lefranc@ligm.igh.cnrs.fr). In cases in which multiple alleles were given for a certain locus, only the first one in the database was considered. As we are only interested in the properties of the germ-line genes, our analysis is restricted to FR1, FR2, FR3, and CDR1, CDR2 fragments. CDR3 is not entirely germ-line encoded, and also receives contribution from multiple gene fragments, therefore it was not included in our analysis. Sheep V_{λ} (22 sequences) and rainbow trout V_H (16 sequences) (listed in the IMGT database) were also extracted

from GenBank. FR/CDR assignment for these genes was also extracted from IMGT database.

The set of horned shark V_H sequences (15) was extracted from GenBank, accession numbers Z11777, Z11778, and Z11780–Z11792, and the set of African toad V_H sequences (14) was compiled from the Kabat database, accession numbers KADBID004348, KADBID004350–51, KADBID004353, KADBID004356–57, KADBID004359–61, KADBID004365–66, KADBID004371, KADBID004376, and KADBID004386. Note that this latter set contained cDNA sequences rather than germ-line sequences. The DNA sequences were translated into corresponding amino acid sequences, which were aligned to human V_H by the ClustalW algorithm available on-line from <http://www.ebi.ac.uk/clustalw>. We used the default parameters for this alignment. The FR/CDR assignment was then inferred from the alignment of protein sequences.

The two known germ-line nurse shark antigen receptor genes were compiled from Roux et al. (1998), with the given FR/CDR assignment, as these sequences have a low degree of homology with the other sequences that we used. The set of V_H camel cDNA sequences that form heavy chain dimers was extracted from the Kabat database, accession numbers KADBID022284–KADBID022292 and KADBID022294–KADBID022300. Three opossum cDNA sequences were generously provided by Dr. Robert Miller, Department of Biology, University of New Mexico, Albuquerque. These sequences were translated, aligned to human V_H as described above, and the alignment was used to infer the FR/CDR assignments.

Mutability Calculation

Parameters for a mutability model in which the mutability of a nucleotide is a function of its identity and the two flanking nucleotides were inferred as in Kepler (1997). These were used to calculate a predicted average mutability per nucleotide in FR and CDR, respectively. Because selection for FR and CDR functionality operates on the level of the protein sequence, we analyzed the replacement mutability. This quantity expresses the propensity of a nucleotide to undergo a mutation that changes the amino acid sequence of the protein. To calculate it, we need not only the mutability of the nucleotide, but also the probability that it mutates into each of the other three nucleotides. These values were taken from Cowell (1999). The algorithm for calculating of replacement mutability of a given nucleotide in the sequence is the following: (1) From the empirical mutability vector, we retrieve the mutability of the nucleotide, given its identity and the identity of its two neighboring nucleotides; (2) from the empirical transition matrix given in Cowell (1999), we retrieve the probability of each of the three possible substitutions of the nucleotide; (3) each substitution of the original nucleotide by another has a probability 0 or 1 to lead to an amino acid replacement; (4) the predicted replacement mutability at a given nucleotide is given by the product of the mutability of the nucleotide found in the actual sequence at that position, and the sum, over all three possible substitutions, of the product of the probability of the specific substitution and the probability that the given nucleotide substitution leads to an amino acid replacement.

The predicted average replacement mutability of a nucleotide in the sequence is calculated by taking the average over all sites in the sequence of the replacement mutability per site. We determine separately the mutability of FR and CDR sites.

Resampled Sequence Sets

To analyze the structural features that contribute to the mutability of an individual sequence, we constructed a number of artificial variants of this sequence. Each set of variants preserves a certain structural property of the real sequence as follows: nucleotide composition, codon composition, and amino acid translation. Figure 2A illustrates the algorithm for constructing these sets of artificial variants. The size of each set was 10^5 sequences. Once a set of artificial variants of a real sequence was constructed, we calculated, for each of the artificial sequences, the following quantities: average FR nucleotide mutability, μ_F ; average CDR nucleotide mutability, μ_C ; CDR/FR mutability ratio, μ_C/μ_F . The quantile of the real sequence is the proportion of artificial variant sequences with given statistic (μ_F , μ_C , μ_C/μ_F) less than or equal to that of the real sequence.

The artificial variant sets that we constructed so far for individual sequences cannot be used to test hypotheses about the whole gene locus. The reason is that the V-gene sequences are related through a close genealogical relationship; the data from different starting sequences is thus correlated. We can, nonetheless, design an adaptation of the algorithm presented above for constructing sequence variants, such that correlations in sequence composition among the genes in the set are preserved. The key idea is to work with positions in an alignment of sequences, rather than with positions in individual sequences. The new strategy is illustrated in Figure 2B. For the detailed study of human V_H -gene locus, we generated 10^4 artificial replicates of this sequence set, and for the study of codon bias related to somatic hypermutation in different species, 10^3 replicates of each sequence set were constructed.

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Genetic Plasticity of V Genes Under Somatic Hypermutation: Statistical Analyses Using a New Resampling-Based Methodology

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