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Deep Phylogeny of Cancer Drivers and Compensatory Mutations

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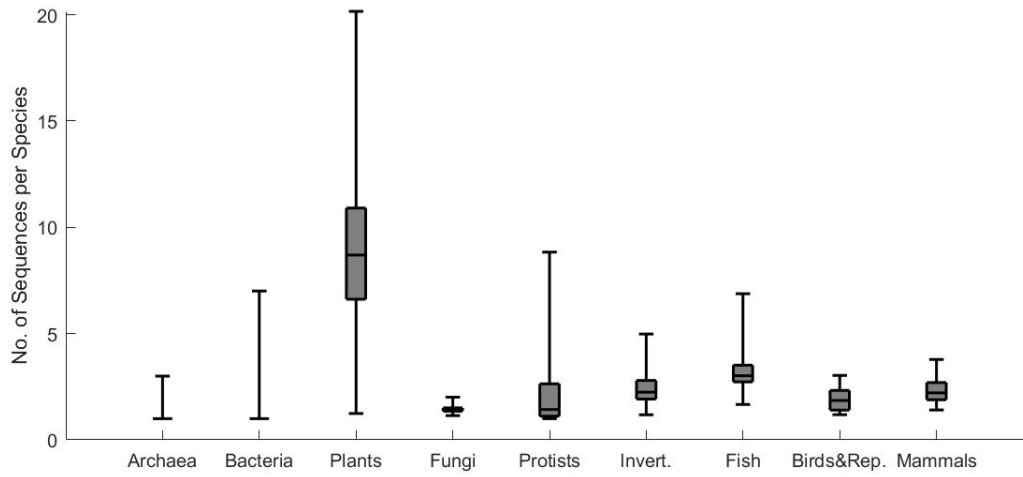
Keywords: cancer driver gene, cancer driver mutation, compensatory mutation, deep

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phylogeny, epistasis within proteins

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13 **Supplementary Figures**



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15 **Supplementary Figure 1. Number of Sequences Per Species Per MSA** Box plot of
16 major taxonomic groups.

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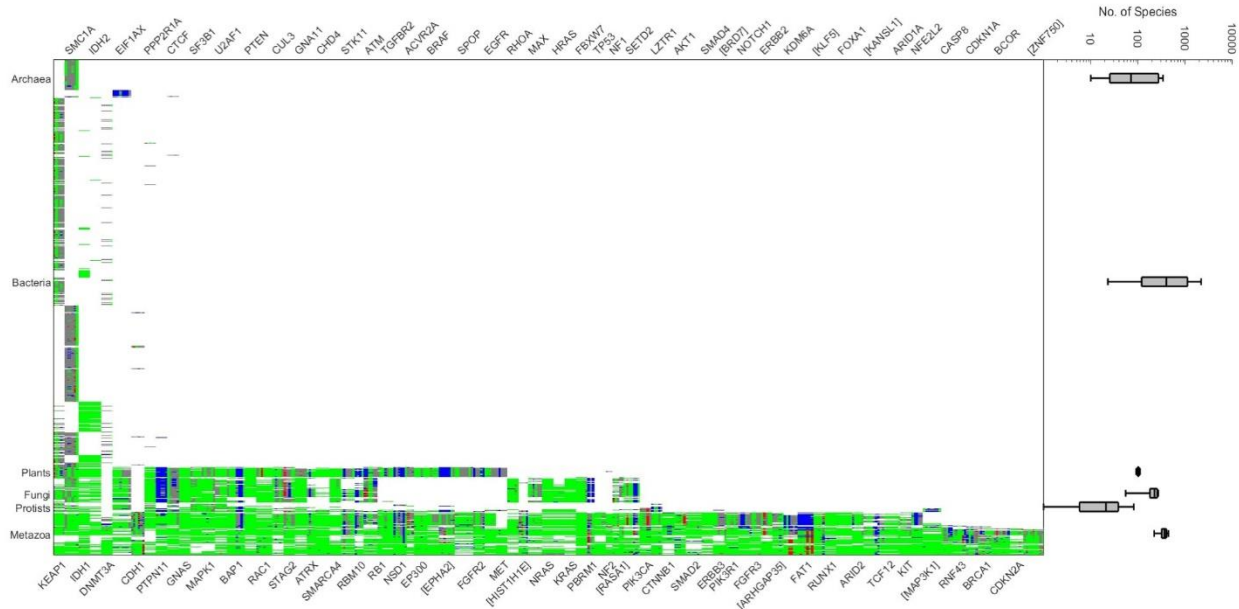
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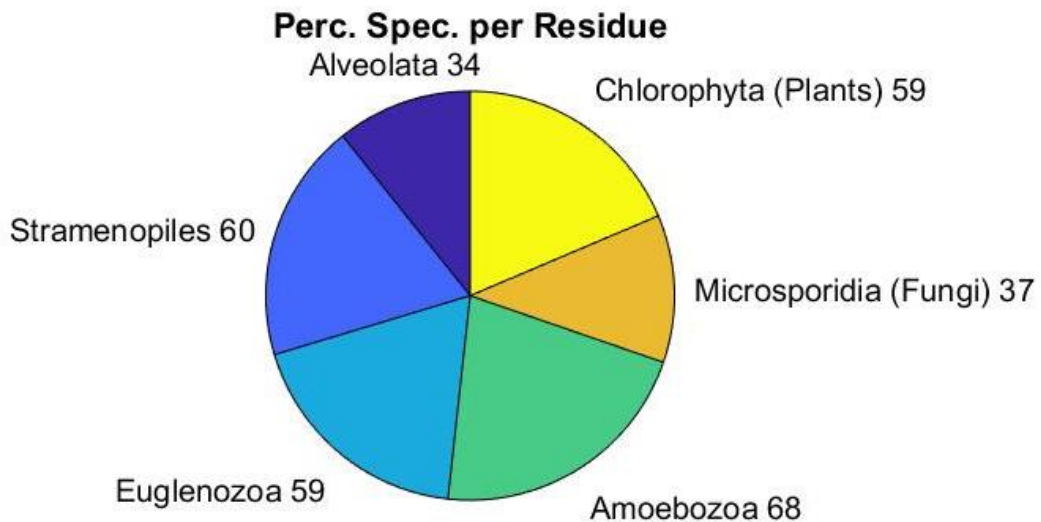
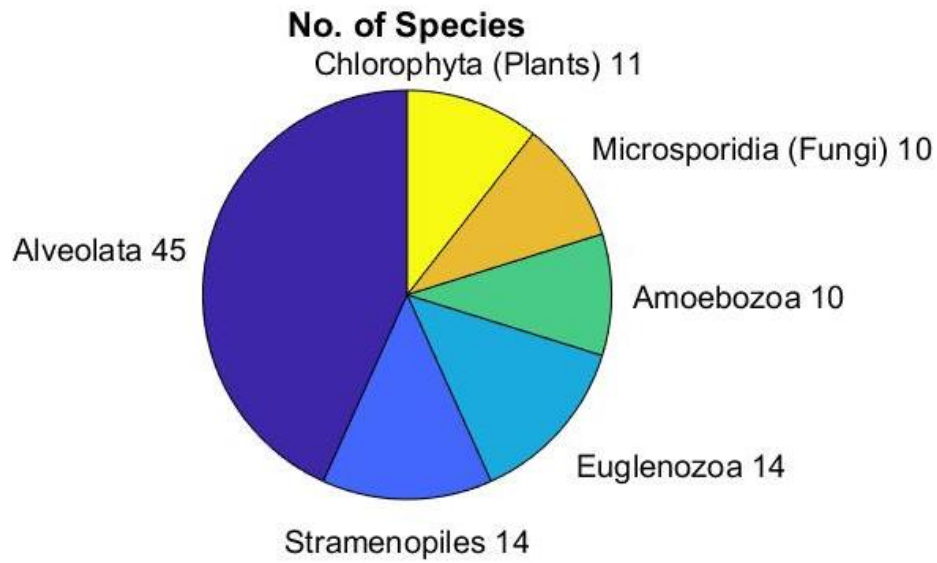
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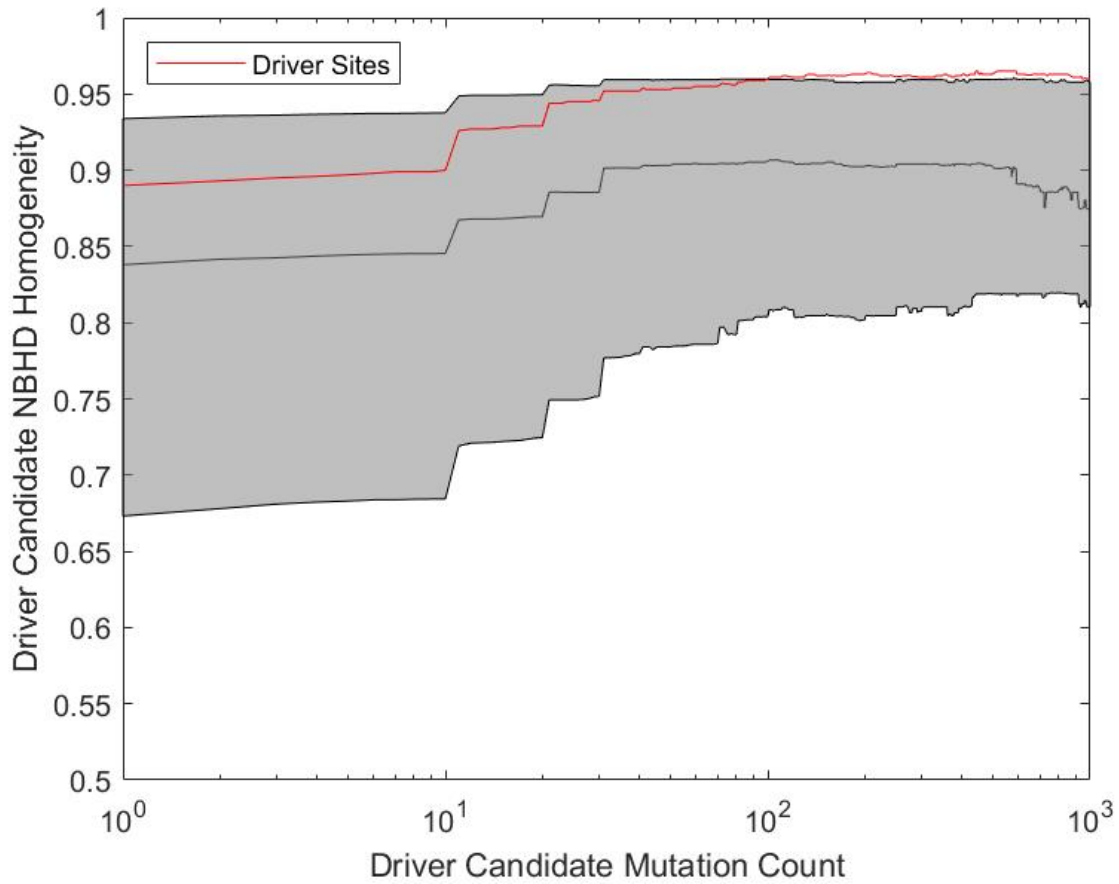


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 26 **Supplementary Figure 2. Cancer Driver Phylogeny Through Prokaryotes Summary**
 27 of driver phylogeny. Each row represents one species, each column one driver. Sites
 28 harboring multiple drivers appear multiple times. Colors correspond to mode residues
 29 over all sequences from each species in each site: white=absent from MSA, blue=gap,
 30 green=human reference residue, red=driver, gray=any other residue. Species are
 31 ordered by taxonomy, and within labelled clades by appearance within # of MSA. Sites
 32 are ordered by harboring gene phylogenetic depth. Rows are followed by box plots of
 33 number of species within each clade observed across MSA where that clade is
 34 represented. Whiskers are at 2/98%. For a focused view on Eukaryotes see Fig. 1F/H.
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 38 **Supplementary Figure 3. Available Protist Phylogeny** Few protists appear across all
 39 MSA. Most are in Alveolata. Members of Alveolata are particularly unevenly distributed
 40 across the MSA with only 34% of total species present in any MSA found in any given
 41 MSA (Percent Species per Residue).

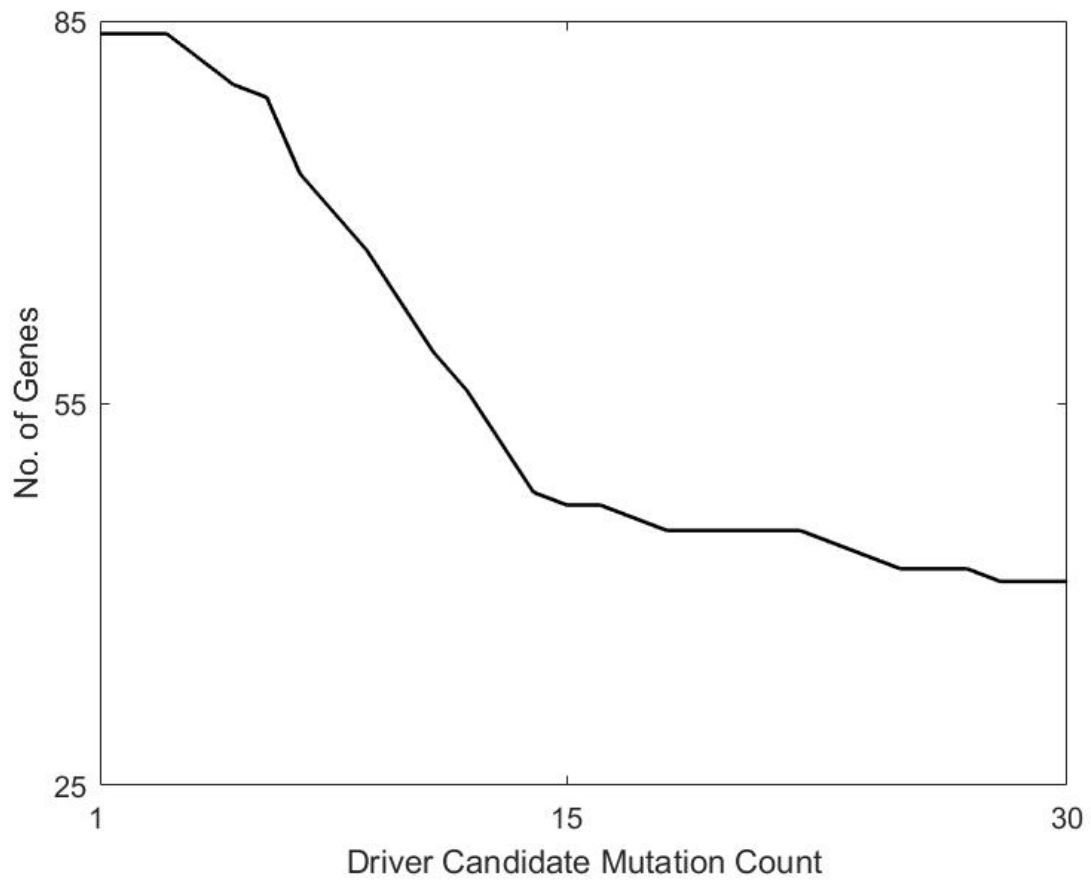
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45 **Supplementary Figure 4. Vertebrate Homogeneity Binned By Mutation Frequency**46 Median vertebrate homogeneity of COSMIC mutation nbhds (± 3 sites) and sites47 logarithmically binned by mutation count (number of tumors). 25th-75th percentiles

48 shaded.

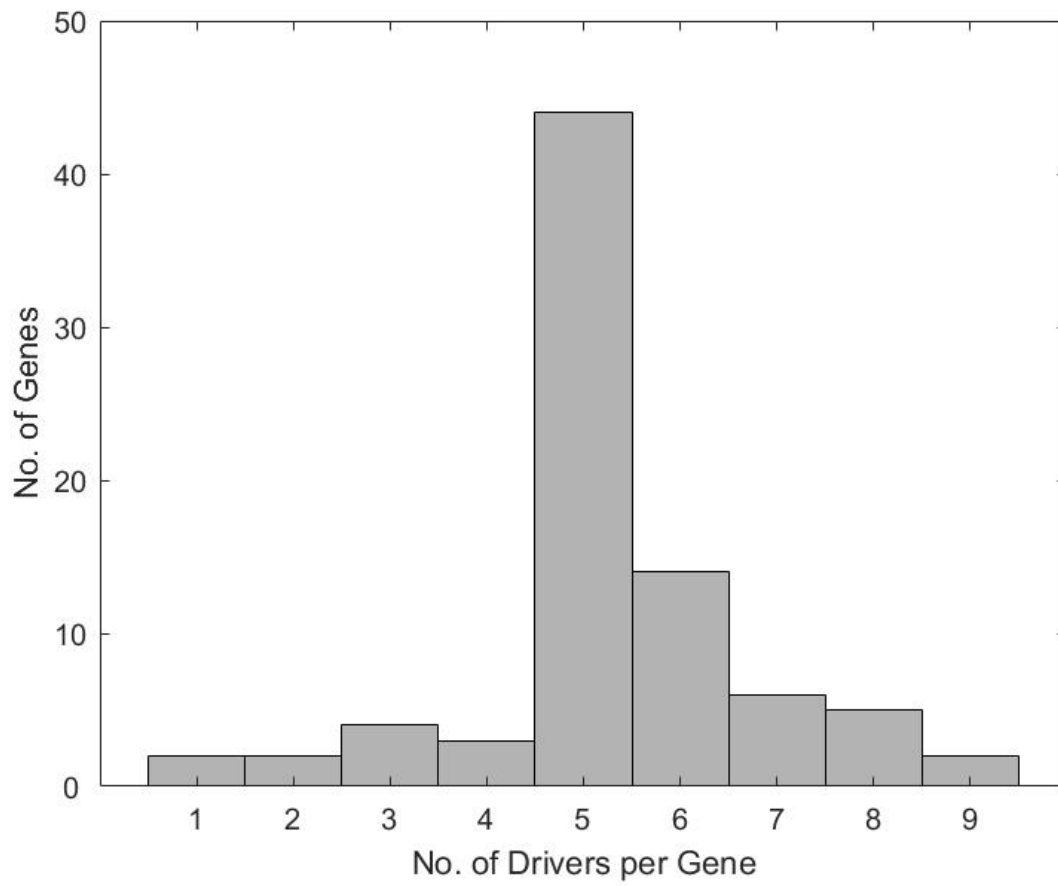


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50 **Supplementary Figure 5. Number of Drivers with Given Mutation Frequency**

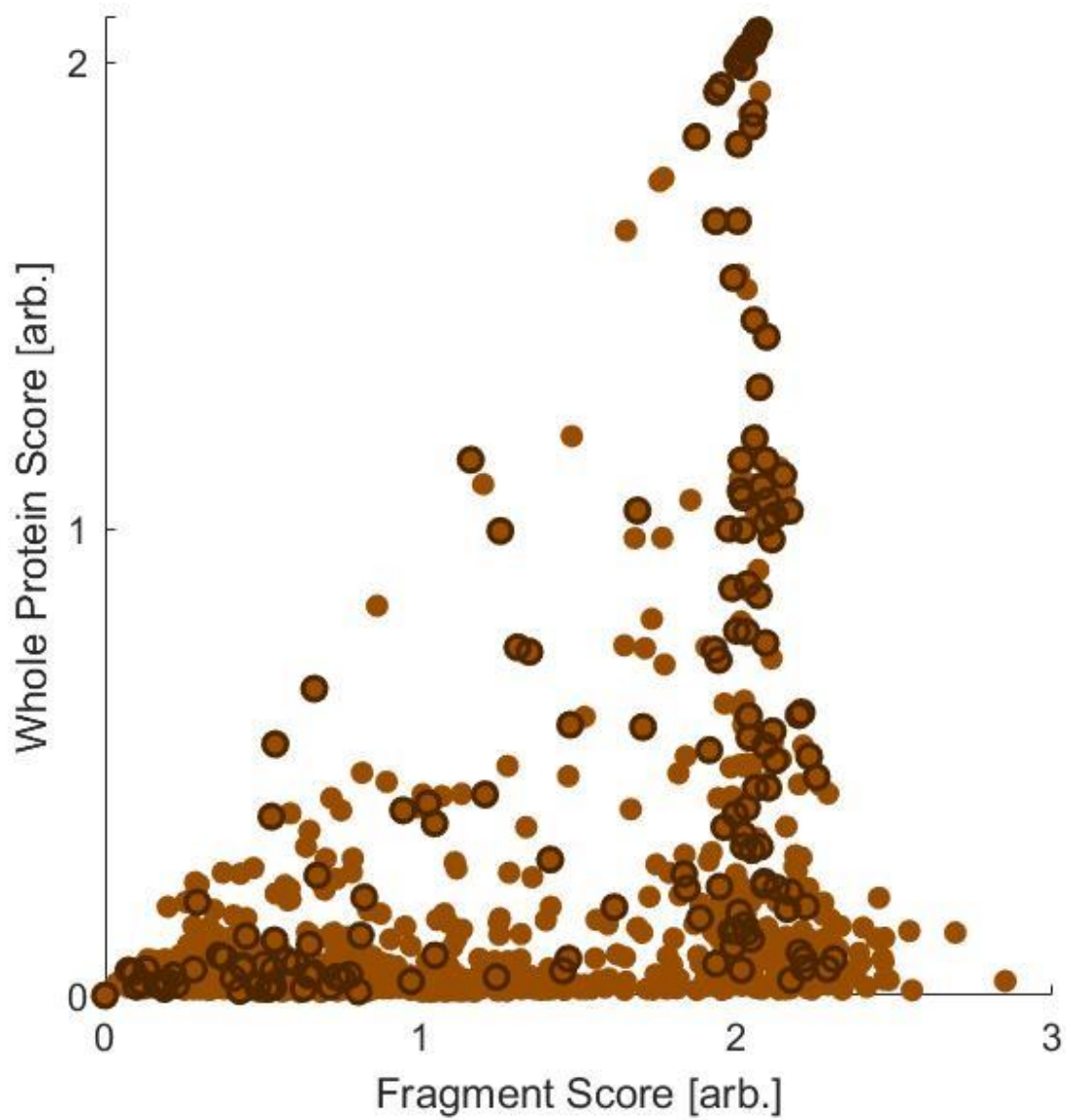
51 #Driver genes (84 total) with at least 1 missense mutation of specified cosmic mutation

52 frequency.



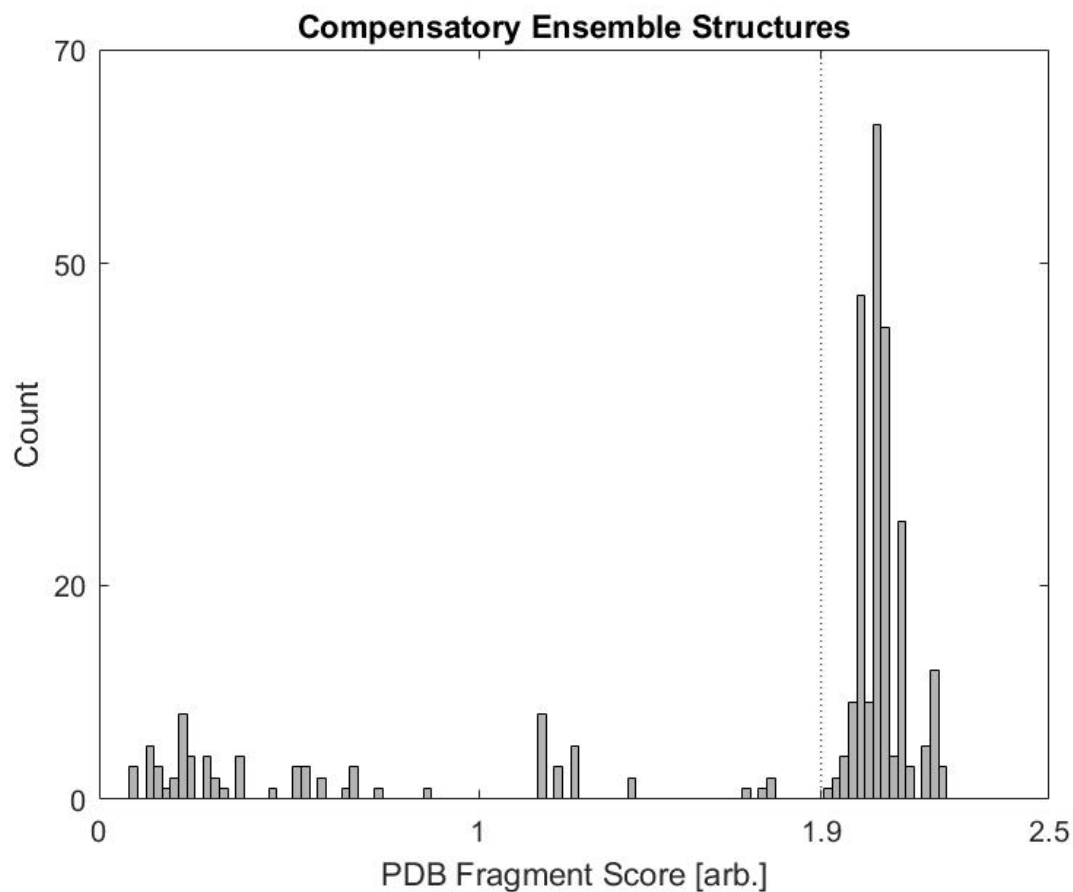
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54 **Supplementary Figure 6. Number of Drivers Designated per Gene**



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56 **Supplementary Figure 7. Maximum Identity Score Against PDB Structures** All sites
57 in driver genes with driver sites outlined in black. Global Score vs. driver-containing
58 Local Score. Global Score \leq Local Score, see Methods; Fig. S8 for details.



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60 **Supplementary Figure 8. Distribution of Local Scores for PDB Structures**
61 **Encompassing Drivers and Compensatory Ensembles** Vertical line at threshold
62 score of 1.9.

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RBM10

		4	9	4	9	4	9	4	9	4	//	4	9	4	9	4	8 9	4	9	4
		0	0	1	1	2	2	3	3	4	//	7	7	8	8	9	9 9	0	0	1
		1	1	1	1	1	1	1	1	1	//	3	3	3	3	3	3 3	4	4	4
Mammal		DQDYRTEQGEEEEEE E D--EEEEKASNI VMLRMLPQAATEDDI//LTIDGKTINVEFAKGSKRDMASNEGSRI N AASVASTAIAAAQWAI																		
Mammal		DQDYRTEQGEEEE-- E EEEEEEKASNI VMLRMLPQAATEDDI//LTIDGKTINVEFAKGSKRDMASNEGSRI N AASVASTAIAAAQWAI																		
Mammal		DQDYRTEQGEEDEEE E E--EEEEKASNI VMLRMLPQAATEDDI//LTIDGKTINVEFAKGSKRDMASNEGSRI N AASVASTAIAAAQWAI																		
Mammal		DQDYRTEQGEEEE-- E EEEEEEKASNI VMLRMLPQAATEDDI//LTIDGKTINVEFAKGSKRDMASNEGSRI N AASVASTAIAAAQWAI																		
Mammal		DQDYRTEQGEEEE-- E EEEEEEKASNI VMLRMLPQAATEDDI//LTIDGKTINVEFAKGSKRDMASNEGSRI N AASVASTAIAAAQWAI																		
Mammal		DQDYRTEQGEEEE-- E EEEEEEKASNI VMLRMLPQAATEDDI//LTIDGKTINVEFAKGSKRDMASNEGSRI N AASVASTAIAAAQWAI																		
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Simiiforme		DQDYRTEQGEDEEEE E D--EEEEKASNI VMLRMLPQAATEDDI//LTIDGKTINVEFAKGSKRDMASNEGSRI S AASVASTAIAAAQWAI																		
Target [Human]		DQDYRTEQGEEEEEE E D--EEEEKASNI VMLRMLPQAATEDDI//LTIDGKTINVEFAKGSKRDMASNEGSRI S AASVASTAIAAAQWAI																		

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68 **Supplementary Figure 9. Reduced MSA for driver gene *RBM10* Driver E119D and**

69 **compensator S398N highlighted. The driver neighborhood in the MSA is almost**

70 **exclusively composed of gaps outside of mammalian sequences. Within mammals there**

71 **are multiple isoforms of *RBM10* about half of which have gaps in the driver**

72 **neighborhood as well. The compensator residue 398N is ancestral transitioning to the**

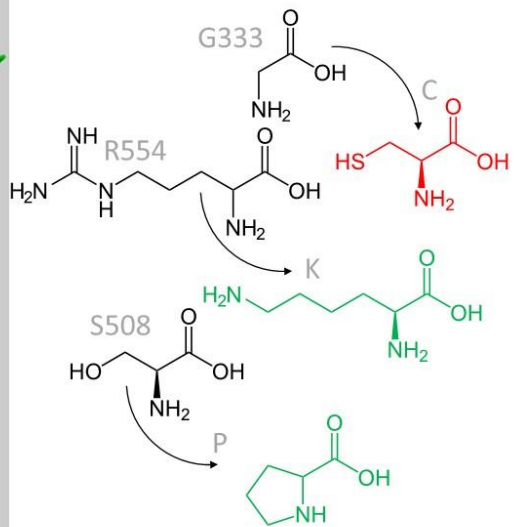
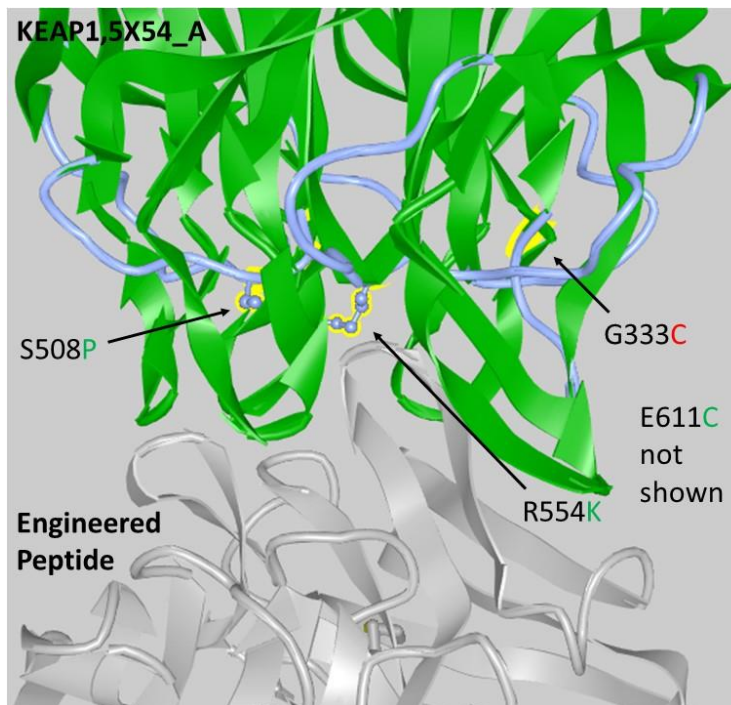
73 **human reference residue 398S at siimiformes and the driver is relatively common**

74 **among mammals, approaching 15% among glires suggesting the driver residue may**

75 **only be deleterious among higher primates due to the absence of the compensator**

76 **S398N.**

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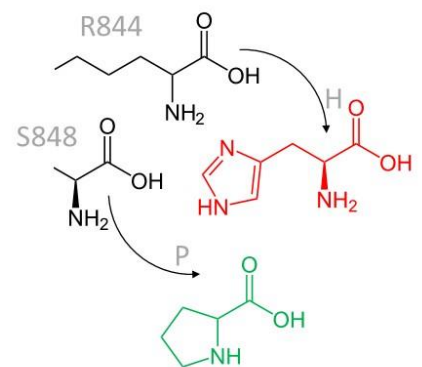
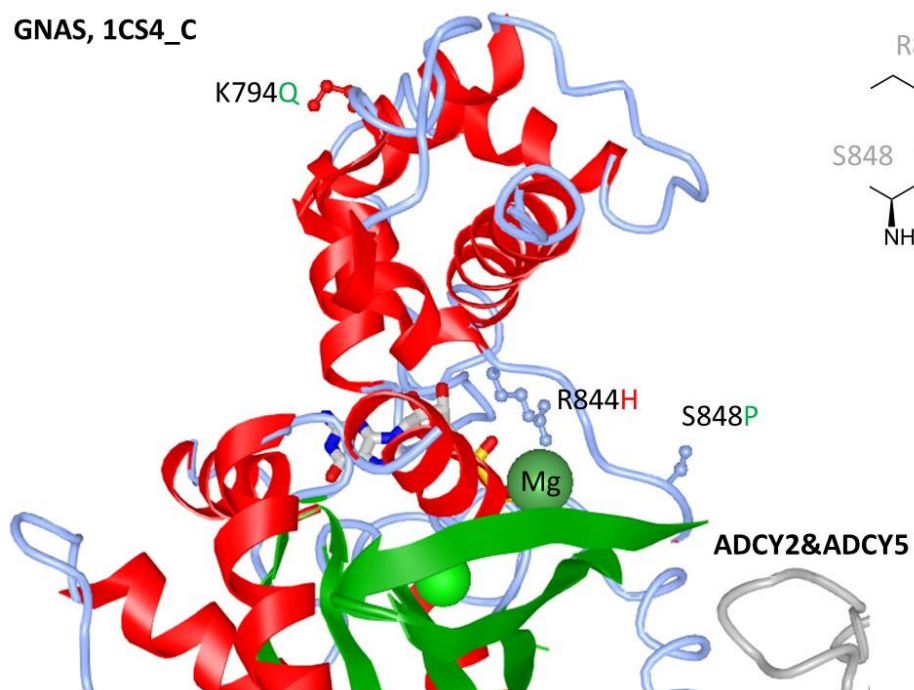


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Supplementary Figure 10. Detailed View of *KEAP1* Structure

GNAS, 1CS4_C

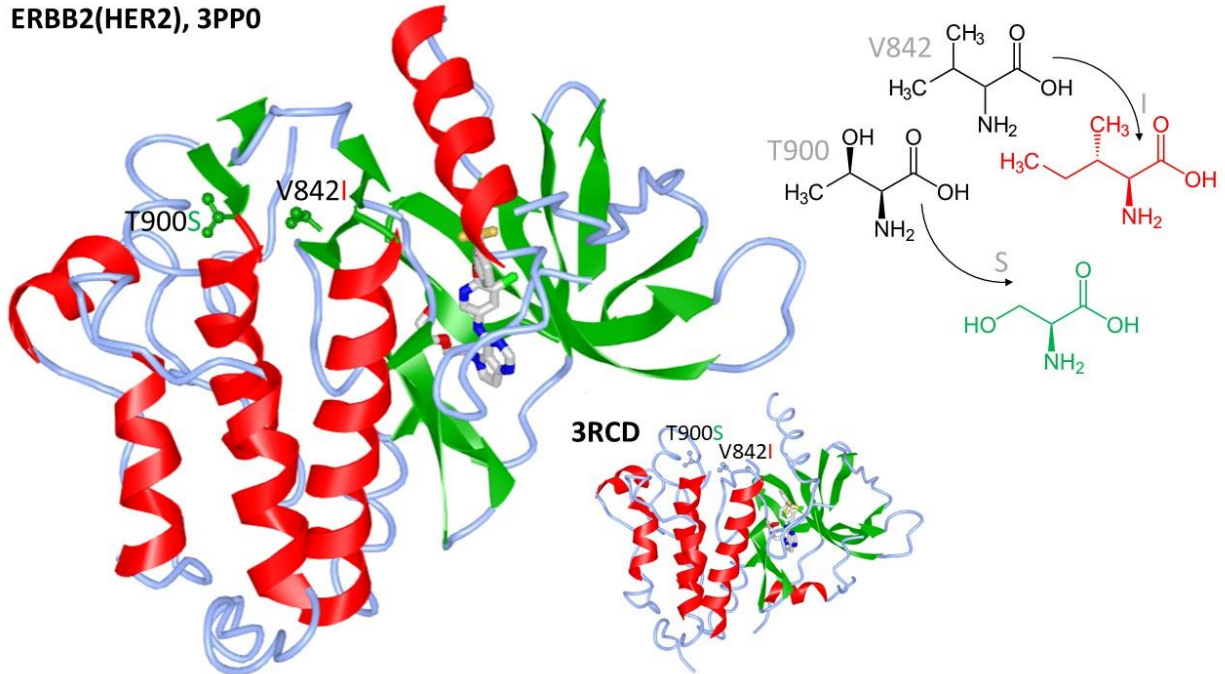


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Supplementary Figure 11. Detailed View of *GNAS* Structure

ERBB2(HER2), 3PP0

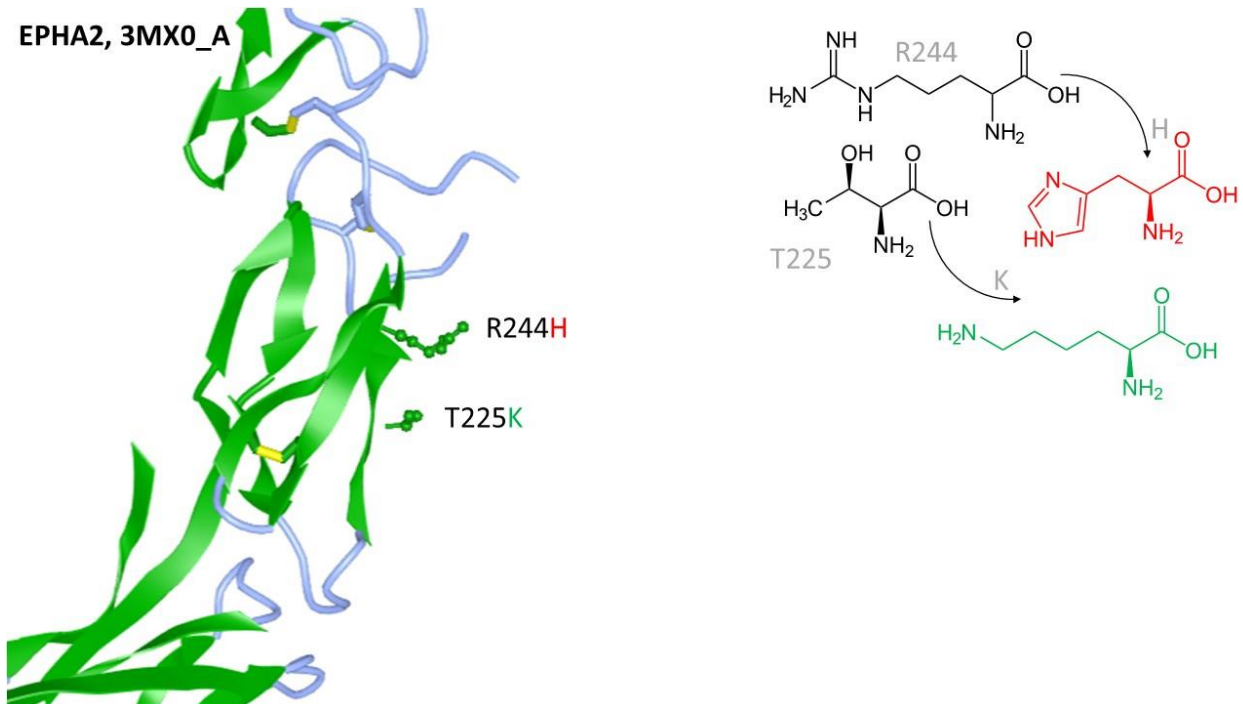


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83 **Supplementary Figure 12. Detailed View of *ERBB2* Structure**

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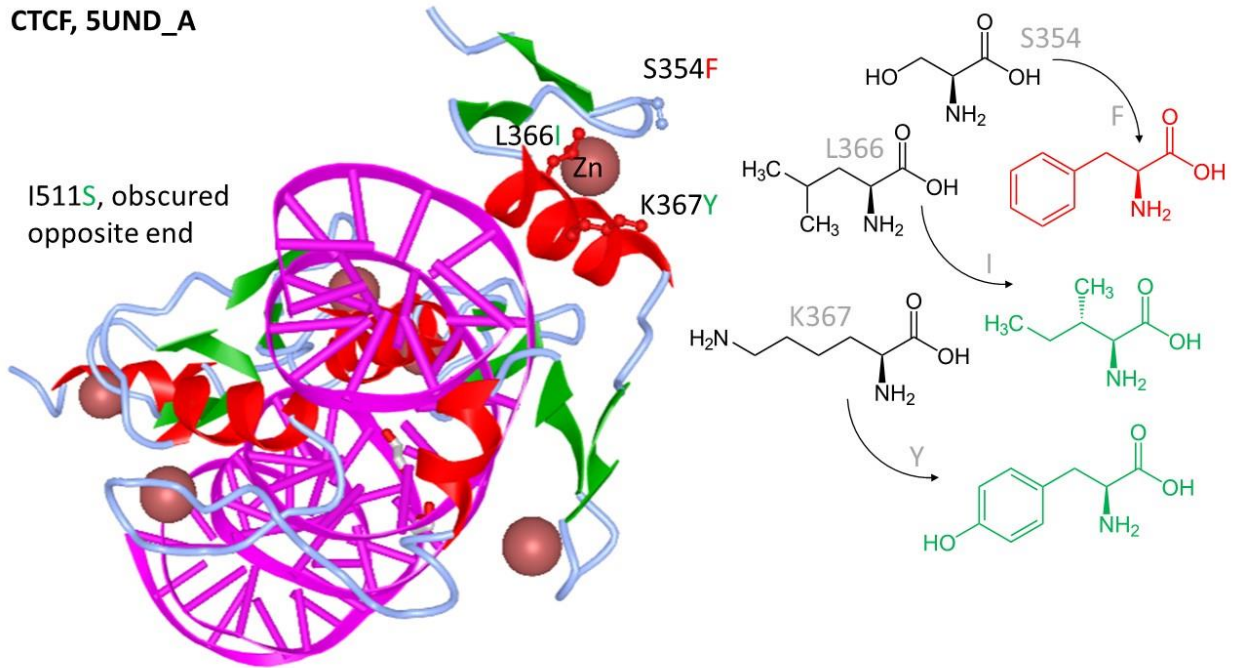
EPHA2, 3MX0_A



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86 **Supplementary Figure 13. Detailed View of *EPHA2* Structure**

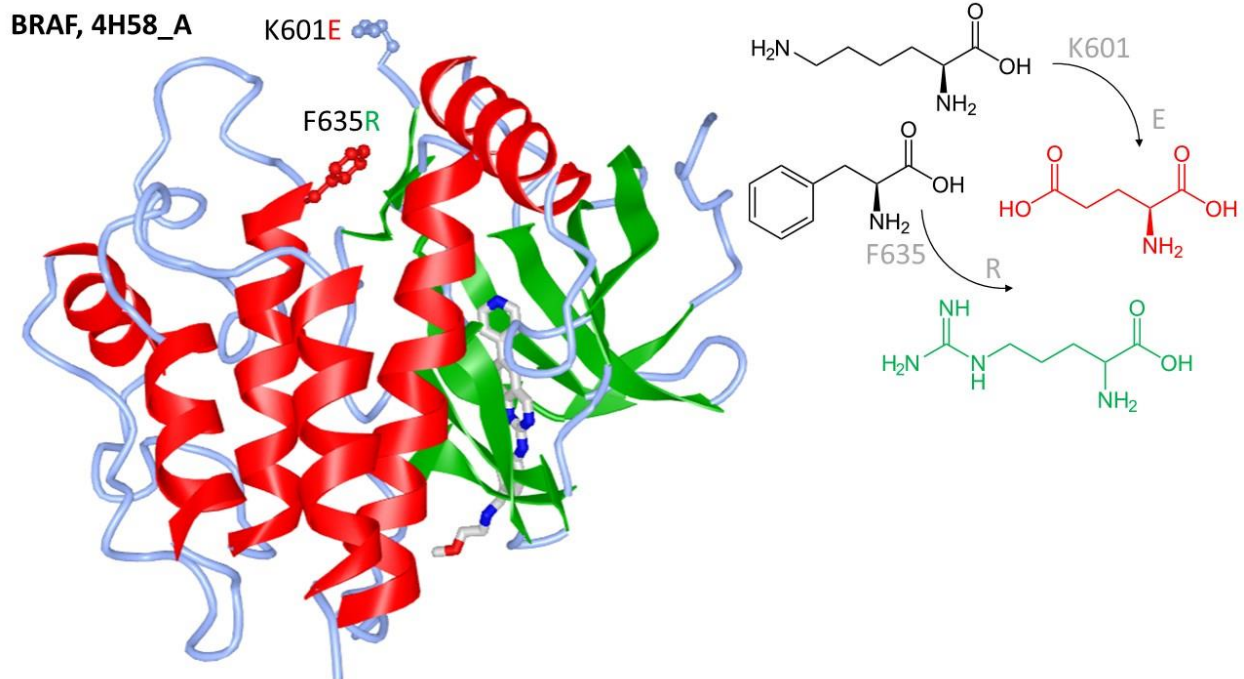
CTCF, 5UND_A



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88 **Supplementary Figure 14. Detailed View of CTCF Structure**

BRAF, 4H58_A

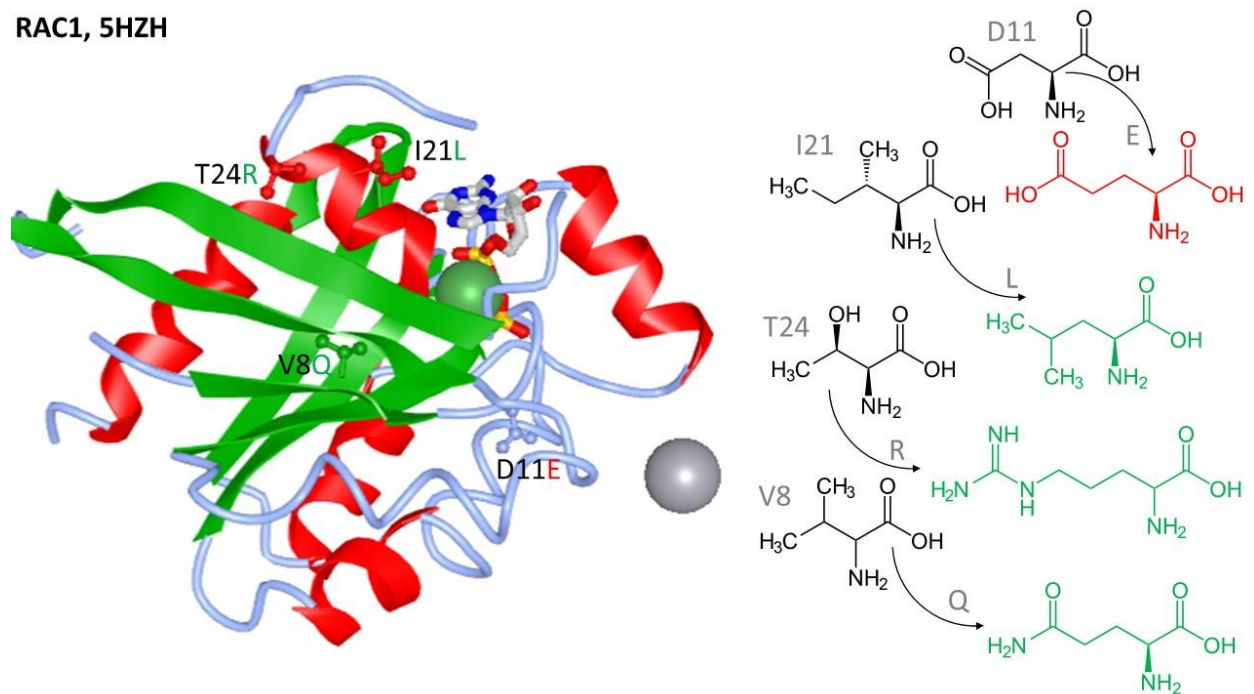


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90 **Supplementary Figure 15. Detailed View of BRAF Structure**

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RAC1, 5HZH

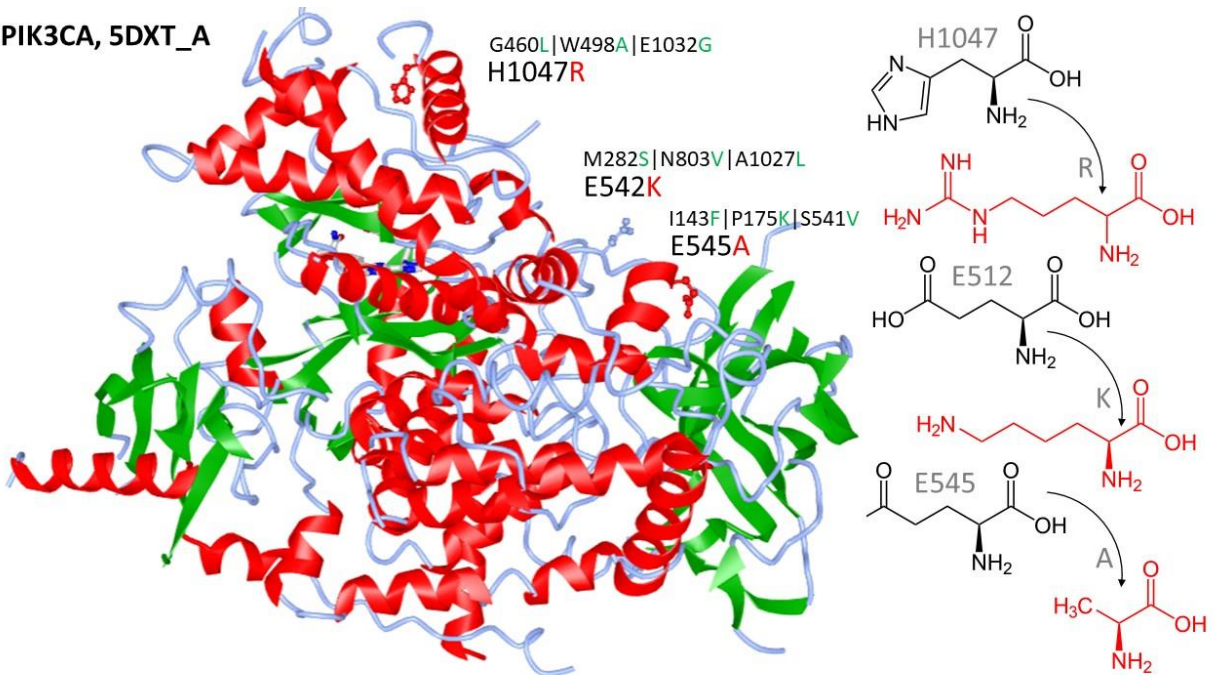


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93 **Supplementary Figure 16. Detailed View of RAC1 Structure**

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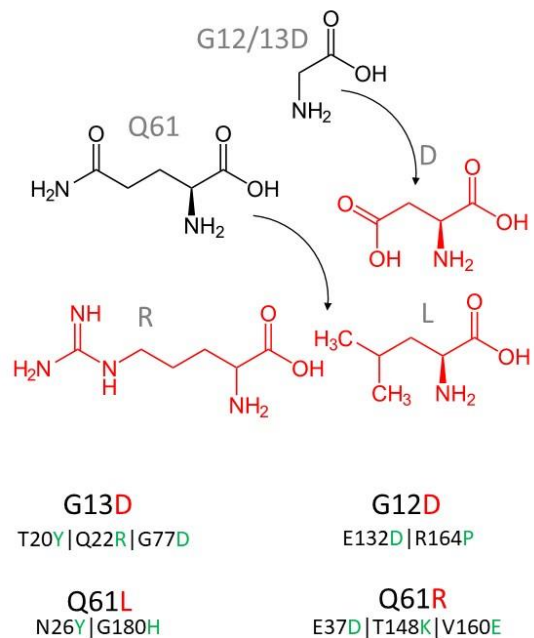
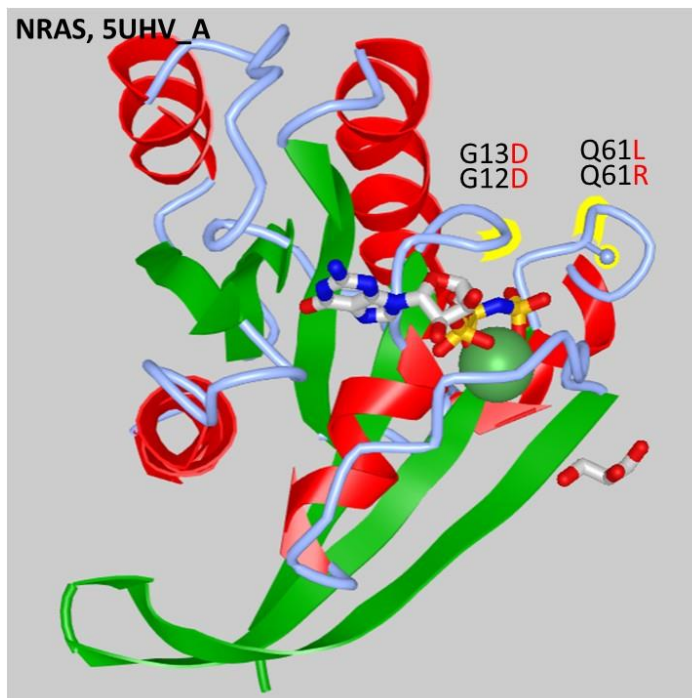
PIK3CA, 5DXT_A



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96 **Supplementary Figure 17. Detailed View of PIK3CA Structure**

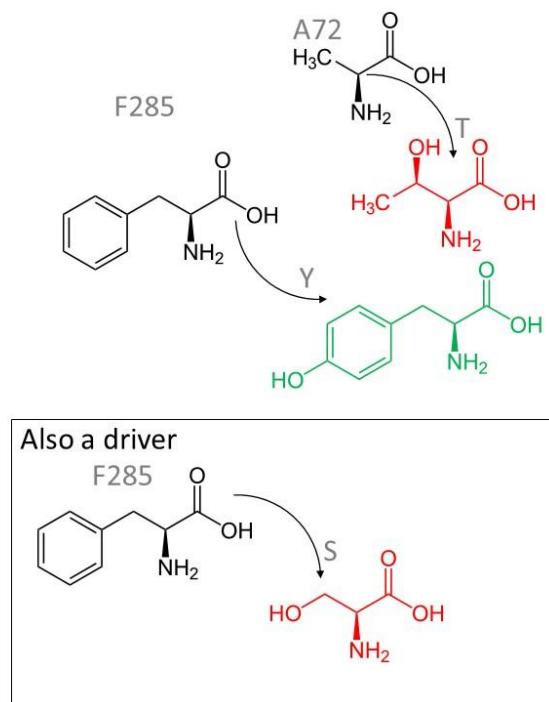
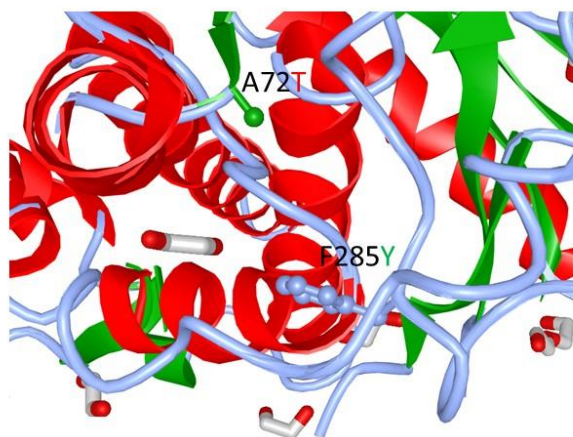
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99 **Supplementary Figure 18. Detailed View of NRAS Structure**

PTPN11, 4NWG



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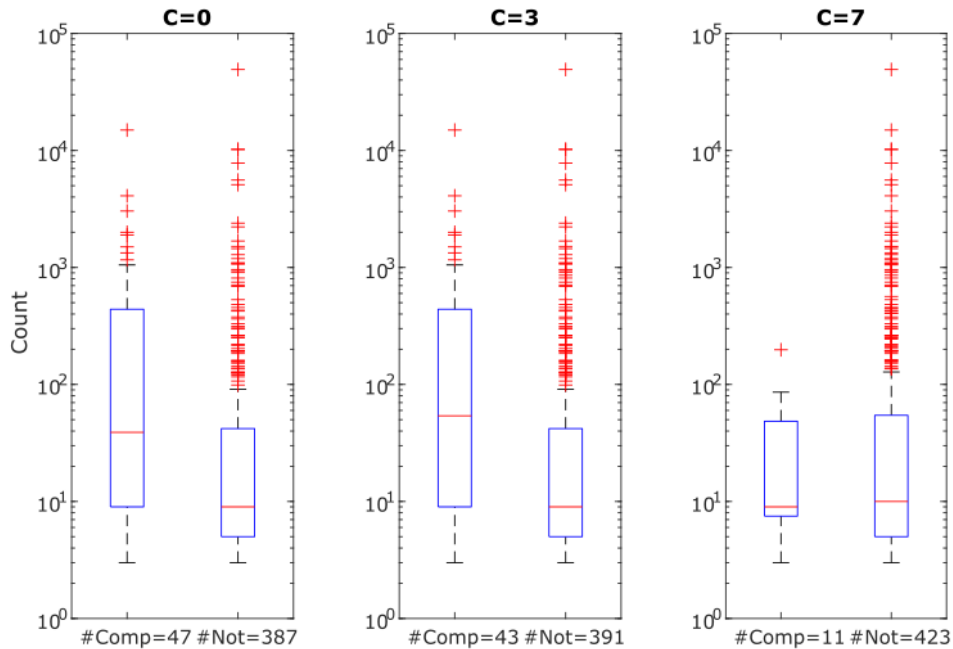
101 **Supplementary Figure 19. Structure of PTPN11 with E139D mutation, PDB ID:**

102 **4NWG**

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109 **Supplementary Figure 20. Differing Prevalence Among Tumors Between Drivers**

110 **with Putative Compensators and those Without.** For each driver, given a cutoff, C,

111 mutations with high association scores (see Methods: Calculation of Association Score

112 for Pairs of Mutations) paired with that driver among both species and tumors were

113 identified as putative compensators. The 434 drivers considered were then divided into

114 two ensembles based on the identification of at least one putative compensator. Drivers

115 with at least one such mutation identified are more frequently observed (total number of

116 tumors, both compensated and uncompensated) among tumors insensitive to the

117 threshold used. **Note1:** Drivers with a higher overall count are more likely to support

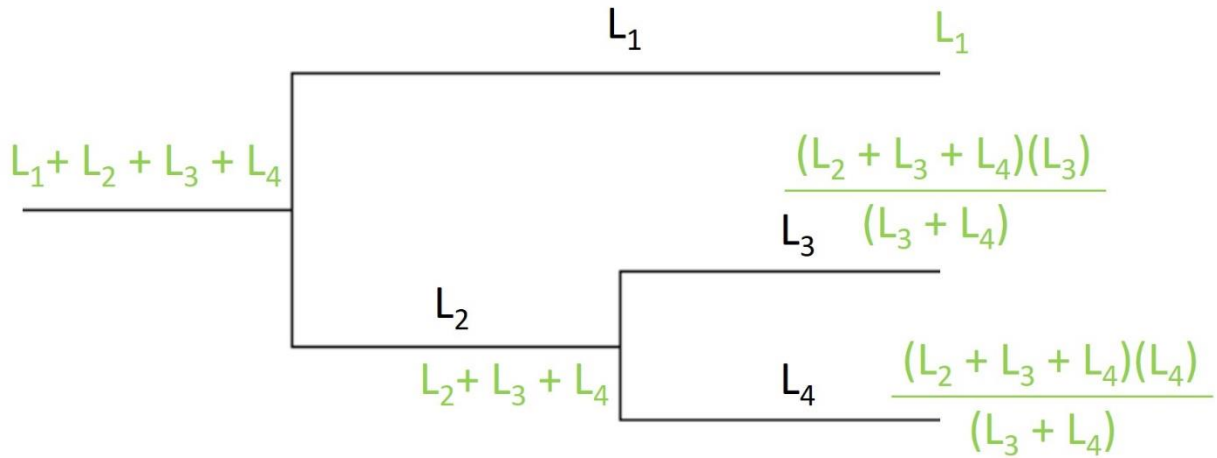
118 evidence of compensation simply because there are greater opportunities for

119 statistically significant associations with a larger number of observations. **Note2:** Many

120 putative compensators are observed in the minority of tumors harboring the associated

121 driver and such a driver is placed in the “compensated” ensemble even if that driver is

122 more often observed “uncompensated”.



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124 **Supplementary Figure 21. Illustration of Leaf-Weighting Procedure** Branch lengths

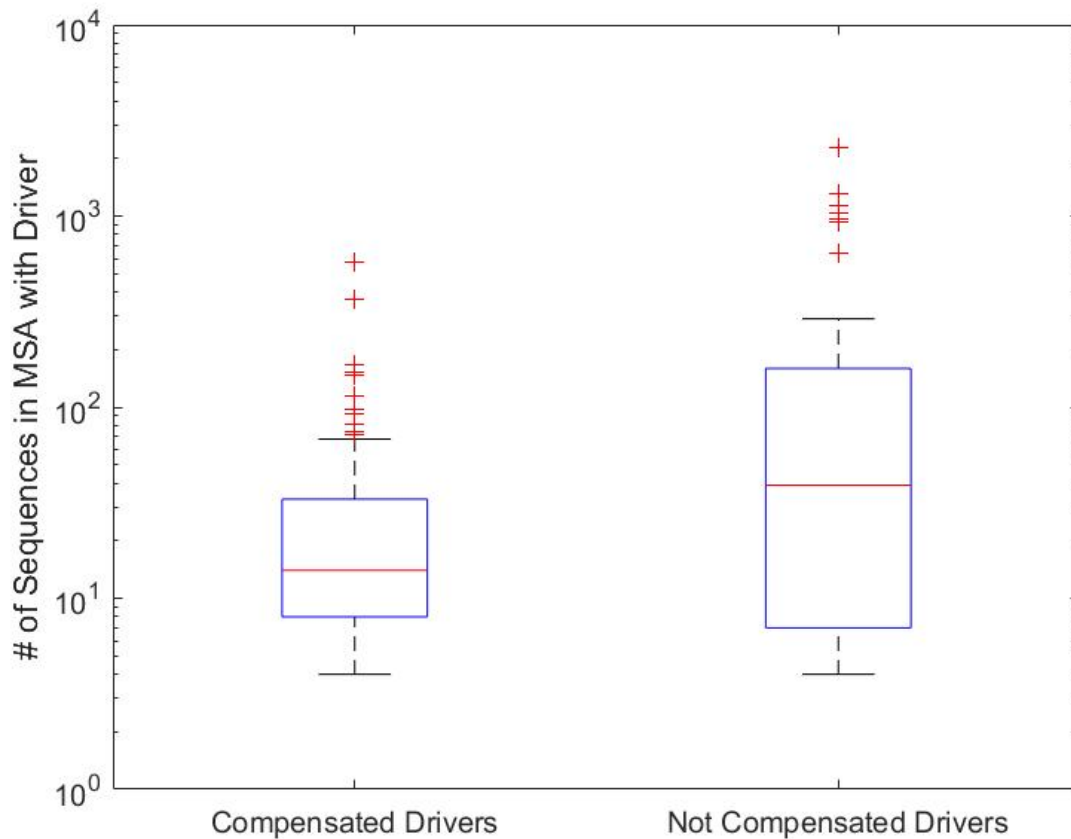
125 are labelled L_i .

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131 **Supplementary Figure 22. Differing Prevalence Among Species Between Drivers**

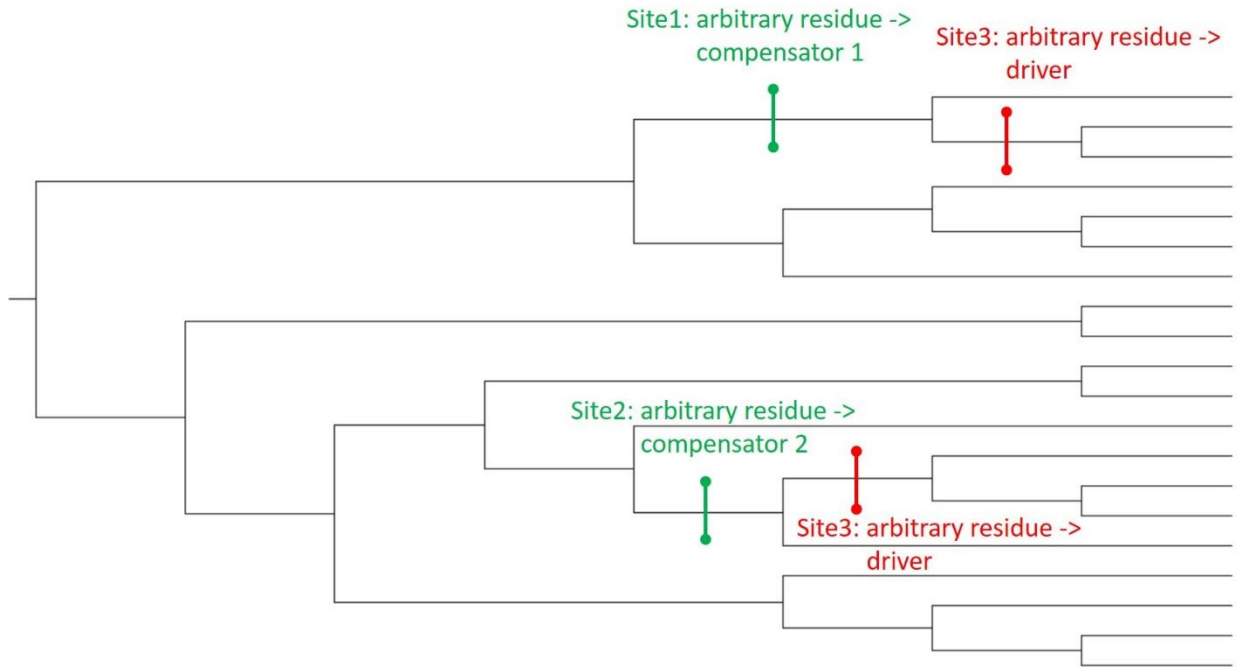
132 **with Compensatory Ensembles and those Without** All drivers which appear in at

133 least four leaves were divided into two groups: those for which a compensatory

134 ensemble was constructed, and those without. Drivers without a compensatory

135 ensemble tend to be more frequently observed in the MSA than those with a

136 compensatory ensemble.



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138 **Supplementary Figure 23. Cartoon of Driver/Compensatory Ensemble**

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149 **References**

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