

 Open access • Journal Article • DOI:10.1038/S41586-019-1672-7

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**Published on:** 16 Aug 2019 - Nature (Nature)

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# The landscape of somatic mutation in normal colorectal epithelial cells

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## Abstract

The colorectal adenoma-carcinoma sequence has provided a paradigmatic framework for understanding the successive somatic genetic changes and consequent clonal expansions leading to cancer. As for most cancer types, however, understanding of the earliest phases of colorectal neoplastic change, which may occur in morphologically normal tissue, is comparatively limited because of the difficulty of detecting somatic mutations in normal cells. Each colorectal crypt is a small clone of cells derived from a single recently-existing stem cell. Here, we whole genome sequenced hundreds of normal crypts from 42 individuals. Signatures of multiple mutational processes were revealed, some ubiquitous and continuous, others only found in some individuals, in some crypts or during some phases of the cell lineage from zygote to adult cell. Likely driver mutations were present in ~1% of normal colorectal crypts in middle-aged individuals, indicating that adenomas and carcinomas are rare outcomes of a pervasive process of neoplastic change across morphologically normal colorectal epithelium.

## Introduction

Sequencing of >20,000 cancers has identified the repertoire of driver mutations in cancer genes converting normal cells into cancer cells and revealed the mutational signatures of the underlying biological processes generating somatic mutations<sup>1,2</sup>. Cancers are, however, end stages of an evolutionary process operating within cell populations and commonly arise through the accumulation of multiple driver mutations engendering a series of clonal expansions. Understanding this progression has depended, in substantial part, on identifying somatic mutations in morphologically abnormal neoplastic proliferations representing intermediate stages between normal and cancer cells. Classical studies of driver mutations in colorectal adenomas and carcinomas have been particularly influential in shaping our perspective in this regard<sup>3</sup>.

53 As for most cancer types, however, the earliest stages of progression to colorectal cancer  
54 remain considerably less well understood. The driver mutation that first sets a colorectal  
55 epithelial cell on the path to cancer is likely caused by mutational processes operative in  
56 normal cells, of which there is limited understanding. The nature and numbers of the earliest  
57 neoplastic clones with driver mutations, which conceivably are morphologically  
58 indistinguishable from normal cells, are similarly unclear. In large part, these deficiencies are  
59 due to the technical challenge of identifying somatic mutations in normal tissues, which are  
60 composed of myriad microscopic cell clones. Several approaches have been adopted to  
61 address this, including sequencing of *in vitro* expanded cell populations derived from single  
62 cells<sup>4-9</sup>, sequencing normal tissue microbiopsies incorporating small numbers of clones<sup>10,11</sup>,  
63 sequencing single normal cells<sup>12-14</sup>, highly error corrected sequencing<sup>15</sup>, and non-sequencing  
64 based approaches<sup>27,44</sup>.

65  
66 These approaches have provided insights into early stages of cancer development. Signatures  
67 of common somatic mutational processes have been found in normal cells of the small and  
68 large intestine, liver, blood, skin, and nervous system but thus far studies have not been of  
69 sufficient scale to characterise variation in their activity or detect less frequent processes<sup>4-10,</sup>  
70 <sup>12-15</sup>. Remarkably high proportions of normal skin epithelial cells have been shown to be  
71 members of clones already carrying driver mutations<sup>10</sup>, and large mutant clones have been  
72 detected in blood<sup>16-19</sup>. Driver mutations have similarly been detected in a high proportion of  
73 endometrial crypts<sup>11</sup>. The extent of this phenomenon in the colon, an organ with a high  
74 cancer incidence, has not been investigated.

75  
76 The colonic epithelial lining is a contiguous cell sheet organised into ~15,000,000 glandular  
77 units, known as crypts, oriented perpendicular to the luminal surface and composed of ~2,000  
78 cells<sup>20</sup>. Towards the base of each crypt resides a small number of stem cells ancestral to the  
79 maturing and differentiated cells in the crypt<sup>21</sup>. These stem cells stochastically replace one  
80 another through a process of neutral drift<sup>22,23</sup> such that all stem cells, and thus all cells, in a  
81 crypt derive from a single ancestor stem cell that existed in recent years<sup>24-27</sup>. The somatic  
82 mutations that were present in this ancestor are thus found in all ~2,000 descendant cells and  
83 can be revealed by DNA sequencing of an individual crypt. Following acquisition of the  
84 requisite numbers and combinations of driver mutations, these stem cells are also thought to  
85 be the cells of origin of colorectal cancers<sup>28</sup>. To characterise the earliest stages of colorectal  
86 carcinogenesis, somatic mutation burdens, mutational signatures and the frequency of driver  
87 mutations in normal colorectal epithelium were explored by sequencing individual colorectal  
88 crypts.

## 90 **Results**

### 91 **Somatic mutations and mutational signatures**

92 2,035 individual colonic crypts from 42 individuals aged 11 to 78 were isolated using laser  
93 capture microdissection and sequenced using a modified library-making protocol developed  
94 for small amounts of input DNA. The samples were from seven transplant organ donors, 34  
95 individuals biopsied to investigate potential colorectal disease and an autopsy of a subject  
96 with oesophageal cancer. In total, 15 had colorectal cancer and 27 showed no evidence of  
97 colorectal disease (Supplementary Table). Samples from all individuals in this study are  
98 referred to as “normal” crypts as when a cancer was present only biopsies distant from the  
99 lesion were used. The distribution of the variant allele fractions of mutations from whole  
100 genome sequencing of 571 individual crypts indicated that the large majority of crypts were  
101 predominantly clonal cell populations derived from a single ancestral stem cell (Extended  
102 Data Fig. 1d). There was substantial variation in mutation burdens between individual crypts,

103 ranging from 1,508 to 15,329 for individuals in their sixties, which was not obviously  
104 attributable to technical factors. To explore the biological basis of this variation we extracted  
105 mutational signatures and estimated the contribution of each to the mutation burden of each  
106 crypt (Methods, Supplementary Results).

107

108 Nine single base substitution (SBS), six doublet base substitution (DBS), and five small indel  
109 (ID) mutational signatures were found. Of these, 14 closely matched (Methods) a known  
110 reference signature (SBS1, SBS2, SBS5, SBS13, SBS18, DBS2, DBS4, DBS6, DBS8,  
111 DBS9, DBS11, ID1, ID2, and ID5, nomenclature as in Alexandrov et al<sup>1</sup>) and six did not  
112 (SBSA, SBSB, SBSC, SBSD, IDA, and IDB) (Fig. 1, Extended Data Fig. 2-4). Thus, new  
113 mutational signatures were extracted despite extensive prior analysis of cancers, perhaps due  
114 to masking by the comparative complexity of signature mixtures present in cancer genomes.

115

### 116 **Ubiquitous mutational signatures**

117 11 signatures (three SBS, five DBS and three ID) were found in >85% of crypts and are here  
118 termed “ubiquitous”. All have been previously described<sup>1</sup>. SBS1 is characterised by C>T  
119 substitutions at NCG trinucleotides (the mutated base is underlined) and is likely due to  
120 deamination of 5-methylcytosine. Its mutation load correlated linearly with age (Fig. 2).  
121 There was, however, variation in SBS1 mutation burdens between crypts from the same  
122 individual. This was due, in part, to different SBS1 mutation rates in different colonic sectors,  
123 with 16.8 mutations per year (95% CI 15.2-18.3) in the right (ascending and caecum), 16.1  
124 (95% CI 14.4-17.5) in the transverse, and 12.8 (95% CI 11.1-14.4) in the left colon  
125 (descending and sigmoid). The SBS1 mutation rate in the terminal part of the small bowel,  
126 the ileum, was 12.7 (95% CI 10.6-14.9) (Supplementary Results).

127

128 SBS5 is a relatively flat, featureless signature of unknown cause and SBS18 is predominantly  
129 characterised by C>A mutations, which may be due to DNA damage by reactive oxygen  
130 species<sup>29,30</sup>. The mutation burdens of these signatures also showed positive correlations with  
131 age, with the same ordering of sector differences as SBS1. Even after taking anatomical  
132 location and age into account, differences in mutation burden remained between different  
133 crypts, notably for SBS18, indicating that additional factors influence mutation rates in  
134 normal cells (Fig. 2, Extended Data Fig. 9, Extended Data Fig. 6a).

135

136 DBS2, DBS4, DBS6, DBS9, and DBS11 were tightly correlated in all colonic crypts. A  
137 composite spectrum of DBS2 and DBS4 is also present in normal mouse cells and, in human  
138 cancers, both correlate with age of diagnosis confirming that a substantial proportion of their  
139 mutations are generated in normal cells<sup>1</sup>. ID1, ID2, and ID5, which are predominantly  
140 characterised by insertions and deletions of a single T and may be the consequence of  
141 slippage during DNA replication, all accumulated linearly with age with the same order of  
142 sector differences as SBS1, SBS5, and SBS18 (Supplementary Results, Extended Data Fig.  
143 5).

144

145 The correlations of mutation burden with age indicate that the mutational processes  
146 underlying these ubiquitous mutational signatures operate continuously throughout life, in all  
147 individuals and in all colorectal stem cells at similar rates. However, the results also suggest  
148 that differences in physiology and/or microenvironment (and potentially age of the most  
149 recent common ancestor of crypts<sup>27</sup>) between cells in different sectors of the colon cause  
150 measurable differences in somatic mutation rates.

151

### 152 **Sporadic mutational signatures**

153 Nine signatures (six SBS, one DBS and two ID) were present only in a subset of individuals  
154 and/or a subset of crypts and are termed “sporadic”. All were novel, except for SBS2, SBS13  
155 and DBS8. SBS2 and SBS13 are predominantly characterised by C>T and C>G mutations at  
156 TCN, are likely due to activity of APOBEC cytidine deaminases and usually occur  
157 together<sup>31,32</sup>. SBS2 and SBS13 were clearly observed in one colonic crypt from one  
158 individual and one ileal crypt from another, but smaller contributions may be present in  
159 additional crypts (Extended Data Fig. 9). To our knowledge, this is the first reported evidence  
160 that APOBEC DNA-editing of the human genome occurs in normal cells *in vivo*. However,  
161 in the colon at least, it is restricted to a small subset of cells. The factors that initiate it are  
162 unknown, although viral entry, retrotransposon transposition and local inflammation have  
163 been proposed in other contexts<sup>33</sup>. The wider sequence context of these mutations in normal  
164 colon suggests that APOBEC3A is the major contributing enzyme<sup>34</sup>.

166 Four SBS signatures that do not match the reference set, SBSA-D, were found in normal  
167 colorectal cells (SBSA has recently been reported in an oral squamous carcinoma<sup>35</sup>). SBSA is  
168 characterised predominantly by T>C mutations at ATA, ATT, and TTT, and T>G mutations  
169 at TTT. Its mutation burden correlated closely with that of IDA, which is characterised by  
170 single T deletions in short runs of Ts (with a mode of four), suggesting that they are due to  
171 the same underlying mutational process. SBSA exhibited a highly variable mutational  
172 burden, being present in 29/42 individuals studied, often in just a subset of crypts, and  
173 showed evidence of spatial clustering in the colon, with crypts from the same biopsy carrying  
174 the signature even though the mutations themselves were not shared (Supplementary Results,  
175 Extended Data Fig. 9). 2.5-fold more T>C mutations occurred when the T was on the  
176 transcribed than on the untranscribed strand. Transcriptional strand bias is often due to  
177 transcription coupled nucleotide excision repair (TC-NER) acting on DNA damaged by  
178 exogenous exposures causing covalently bound bulky adducts, but can also be caused by  
179 transcription coupled DNA damage<sup>36</sup>. Assuming either is the case, damage to adenine  
180 underlies SBSA. To investigate the timing of SBSA mutation generation, phylogenetic trees  
181 of mutations were constructed and the mutational signatures in each branch established (Fig.  
182 3, Extended Data Fig. 6). SBSA was confined to early branches of these phylogenies (when  
183 these were available for analysis). (Fig. 3b, Extended Data Fig. 6 f, h, z, aa, am, ao). Using  
184 the number of SBS1 mutations as indicators of real time, the mutational process underlying  
185 SBSA appears to be active usually before 10 years of age. The initiating event for this  
186 relatively frequent mutational process is unknown, but the results suggest an extrinsic, locally  
187 acting and patchily distributed mutagenic insult occurring during childhood.

189 SBSB was predominantly characterised by C>T substitutions at ACA, T>A at CTN, and T>G  
190 at GTG and was present in subsets of crypts from four individuals (Fig. 3c, Extended Data  
191 Fig. 6). In the two individuals in whom it could be timed (Extended Data Fig. 6 aa, ai), it  
192 appeared – as with SBSA – to be active in the first decade of life. SBSB correlated with  
193 DBS8 and IDB (Fig. 3c, Extended Data Fig. 9), suggesting that they are caused by the same  
194 underlying mutational process. DBS8 is composed of AC>CA and AC>CT mutations and  
195 has previously been reported in rare hypermutated cancers with no obvious cause<sup>1</sup>. IDB is  
196 dominated by deletion of a single T with no other Ts surrounding it. The mutational process  
197 underlying this signature is unknown.

199 SBSC is characterised predominantly by one C>T mutation in CC dinucleotides. It is of  
200 unknown aetiology and primarily affects three crypts from the left colon of one individual  
201 with an unremarkable history (Extended Data Fig. 9).

202



203 All crypts from a 66 year-old man carried many thousands of mutations of SBS1,  
204 characterised predominantly by T>A substitutions with a transcriptional strand bias  
205 compatible with damage to adenine. This individual had been treated with multiple  
206 chemotherapeutic agents (including cyclophosphamide, doxorubicin, vincristine,  
207 prednisolone, chlorambucil, bleomycin and etoposide) for lymphoma and subsequently  
208 developed caecal adenocarcinoma. SBS1 resembles SBS25, (cosine similarity 0.9),  
209 previously found in Hodgkin lymphoma cell lines from two chemotherapy-treated  
210 patients<sup>31,37</sup>. To our knowledge this is the first time that the mutational consequences of  
211 chemotherapy have been demonstrated in normal human cells *in vivo*. The mutation burden  
212 in this individual's colorectal epithelium was 3-5 fold higher than expected for his age, thus  
213 by extrapolation equivalent to that of a 200-300 year-old, and it is plausible that other tissues  
214 have been similarly affected.

215

### 216 **Copy number changes and structural variants**

217 Copy number changes and/or structural variants were found in 80 out of 449 (18%) evaluable  
218 normal crypts. Five crypts exhibited eight whole chromosome copy number increases which,  
219 notably, affected the same three chromosomes: 3, 7 and 9, as well as the X chromosome  
220 (Extended Data Fig. 7a). Thus, copy number increases clustered in certain crypts and tended  
221 to affect certain chromosomes. No whole chromosome losses were observed. Regions of  
222 copy number neutral loss of heterozygosity were observed in 12 crypts, affecting  
223 chromosomes 1p, 6p, 7p, 8q, 9q, 10q (twice), 17p, 17q, 18q, 21q and 22q. Five of these copy  
224 number changes could be timed and all were estimated to have occurred in adulthood. Two  
225 changes that affected the same crypt appeared to be synchronous (Supplementary Results,  
226 Extended Data Fig. 7b). Forty-eight large deletions, 18 tandem duplications, four  
227 translocations, and two inversions were detected. All were private to a single crypt, except for  
228 one deletion which was present in two adjacent crypts sharing few mutations, indicating that  
229 the deletion occurred during gestation or early childhood.

230

### 231 **Driver mutations**

232 Driver mutations are those that confer a selective advantage during cancer evolution and  
233 may, but need not, promote neoplasia<sup>38</sup>. To search for driver mutations in normal colon, the  
234 whole genome sequences of 571 crypts were supplemented with targeted sequencing of 90  
235 known colorectal cancer genes in an additional series of crypts. In total, substitutions in these  
236 genes were evaluable in 1,403 crypts and indels in 1,046. Statistical analysis revealed  
237 evidence of positive selection on the recessive cancer genes *AXIN2* (three truncating  
238 mutations, adjusted q value 0.004) and *STAG2* (two truncating mutations, adjusted q value  
239 0.038) indicating that these mutations are likely drivers. Additional likely driver mutations  
240 were identified in cancer genes characterised by canonical missense hotspot mutations. Nine  
241 hotspot mutations in *PIK3CA* (E542K, R38H), *ERBB2* (R678Q, V842I, T862A), *ERBB3*  
242 (R475W, R667L), and *FBXW7* (R505C, R658Q) were observed (Extended Data Fig. 8).  
243 Given the specificity of these hotspot mutations, most are likely to be drivers. In addition,  
244 heterozygous truncating mutations were found in the recessive cancer genes *ARID2*, *ATM*  
245 (two), *ATR*, *BRCA2*, *CDK12* (two), *CDKN1B*, *RNF43* (two), *TBL1XR1*, and *TP53*  
246 (Supplementary Table). There was no statistical evidence for selection of truncating  
247 mutations in the set of 90 colorectal cancer genes overall. The possibility that some have  
248 conferred clonal growth advantage, however, is not excluded. No crypt carried more than one  
249 putative driver mutation.

250

251 23 pairs of adjacent crypts shared over 100 SBS1 mutations and thus were likely to have been  
252 generated by postnatal crypt fission. Two pairs carried driver mutations (one with an *AXIN2*

253 nonsense mutation and one with *PIK3CA* E542K), although the association of driver  
254 mutations with crypt fission is not significant ( $p=0.17$ ). In one sister crypt the *AXIN2*  
255 mutation was rendered homozygous by copy number neutral chromosome 17q LOH,  
256 revealing ongoing clonal evolution in normal colon (Fig. 4, Fig. 3b).

257

258 On the conservative assumption that just the *AXIN2* and *STAG2* truncating mutations and the  
259 missense hotspot mutations in *PIK3CA*, *ERBB2*, *ERBB3* and *FBXW7* are drivers, ~1% of  
260 normal colorectal crypts (~150,000 crypts) in a 50-60 year old carries a driver mutation.  
261 Since in the over 70s ~40% of people have an adenoma on colonoscopy<sup>39</sup> and ~5% of people  
262 develop colorectal cancer over their lifetime<sup>40</sup> (and some of these may arise from more  
263 recently-acquired driver mutations) only an extremely small proportion of these crypt  
264 microneoplasms becomes a macroscopically detectable adenoma ( $< 1/375,000$ ) or carcinoma  
265 ( $< 1/3,000,000$ ) within the following few decades.

266

267 The proportion of normal colorectal cells with a driver mutation (1%) is considerably lower  
268 than that observed in normal skin (30%). The lower frequency of drivers in colon may be  
269 due, at least in part, to the modular structure of glandular epithelia. The small number of stem  
270 cells within a crypt diminishes the probability that a cell with a driver mutation will  
271 outcompete its wild-type neighbours. Moreover, even if it does colonise the crypt, a mutant  
272 stem cell is entombed in it unless it can overcome the largely unknown forces that govern  
273 clonal expansion through crypt fission.

274

#### 275 **Comparisons with colorectal cancer**

276 There are marked differences between the genomes of normal colorectal stem cells and those  
277 of colorectal cancers. The total mutation burdens of base substitutions (10,000-20,000) and  
278 indels (1,000-2,000) found in most colorectal carcinomas<sup>1</sup> (excluding those with  
279 hypermutator phenotypes in which it is usually >10-fold more) is higher than the ~3,000  
280 substitutions and 300 indels found in most normal crypts from 50-60 year old individuals.  
281 The particularly high base substitution and indel mutation burdens and associated mutational  
282 signatures of DNA mismatch repair deficiency and/or polymerase epsilon/delta mutations  
283 were not found in any normal colorectal crypts but are present in ~20% colorectal cancers.  
284 Equally striking is the difference between the 0-4 structural changes per normal crypt (with  
285 the majority having none) and the 10s to 100s per colorectal cancer<sup>41</sup>. In all these respects,  
286 the genomes of normal crypts with driver mutations were similar to those of normal crypts  
287 without drivers (Extended Data Fig. 9).

288

289 Elevated mutation burdens are, therefore, characteristic of the evolutionary trajectory from  
290 normal colorectal cell to cancer cell. The increased base substitution and indel mutation loads  
291 in cancers are due to a combination of higher burdens of the ubiquitous mutational signatures  
292 found in normal crypts, additional base substitution and indel signatures thus far found  
293 exclusively in cancers (confirming previous reports<sup>5,42</sup>) and larger numbers of copy number  
294 changes and structural variation. The causes of some of these additional mutational loads are  
295 known (for example, defective DNA mismatch repair and polymerase epsilon/delta  
296 mutations) but the remainder are uncertain.

297

298 The relative frequencies of mutated cancer genes differ between colorectal  
299 adenomas/carcinomas and normal colorectal cells ( $p=0.003$ , Supplementary Results). In  
300 colorectal cancer, mutations in *APC*, *KRAS* and *TP53* are common<sup>43</sup>, accounting for 56% of  
301 base substitution and indel drivers (Supplementary Methods) but are comparatively rare  
302 among normal crypts with driver mutations (1/14). By contrast, mutations in, for example,

303 *ERBB2* and *ERBB3* are relatively common in normal crypts with drivers (5/14) but rare in  
304 colorectal cancer (7/631). The results suggest that mutations in *APC*, *KRAS* and *TP53* confer  
305 higher likelihoods of conversion to adenoma and carcinoma than mutations in *ERBB2* and  
306 *ERBB3* whereas mutations in *ERBB2* and *ERBB3* confer higher likelihoods of stem cells  
307 colonising crypts than *APC*, *KRAS* and *TP53*. Nevertheless, previous reports suggest that  
308 1:3,500 epithelial cells, and therefore >4,000 crypts per colon, bear *KRAS* G12D<sup>44</sup>, and so  
309 even these have a low probability of progression.

310

311

## 312 **Discussion**

313 This study has characterised all classes of somatic mutation in normal colorectal epithelial  
314 stem cells. A substantial repertoire of base substitution and indel mutational processes is  
315 operative, some ubiquitous and some sporadic, together with relatively infrequent copy  
316 number changes and genome rearrangements. APOBEC DNA-editing occurs in normal  
317 colon, albeit only in rare cells. Many signatures, however, are of unknown aetiology and  
318 some appear to be acquired early in life. The presence of five times the age-standard mutation  
319 load in all colorectal cells, and potentially many other tissues, in an individual who had  
320 undergone chemotherapy provides new insight into the impact of such exposures and raises  
321 questions pertaining to its relationship with chemotherapy's relatively modest impact on  
322 cancer risk<sup>45</sup>.

323

324 The earliest stages of colorectal cancer development have been revealed in this manuscript.  
325 They are characterised by numerous crypts carrying driver mutations, of which only a very  
326 small fraction ever manifest as macroscopic neoplasms. Certain mutated cancer genes appear  
327 to foster this pervasive and invisible wave of microneoplastic change whereas others  
328 particularly engender progression to colorectal adenoma and cancer. The conversion of these  
329 early microneoplasms to more advanced stages of colorectal neoplasia is associated with  
330 acquisition of elevated mutational loads, whether composed of base substitutions, indels,  
331 structural variants or copy number changes. More extensive studies of normal colorectal  
332 epithelium will enable characterisation of the rarer intermediate stages between these early  
333 clones and small adenomas, and refine understanding of the development of the subset of  
334 microneoplasms with higher likelihoods of becoming adenomas and carcinomas.

335

336 The proportion of normal colorectal epithelial cells with driver mutations is, however,  
337 substantially lower than that of other normal tissues so far studied, notably skin<sup>10</sup> and  
338 endometrium<sup>11</sup>. Colorectal epithelium is constituted of crypts, modular units which may  
339 themselves constrain clonal expansion, and this architecture may contribute to such  
340 differences with skin. The reason for the difference with endometrium, which is also  
341 glandular, remains to be explored.

342

343 Fundamental questions are being addressed with respect to differences in cancer incidence  
344 rates between tissues. The somatic mutation burden in colon and ileum is similar despite the  
345 substantially higher cancer incidence rate in colon (as previously noted<sup>4</sup>) and therefore does  
346 not appear to account for this difference. Whether the total burden of microneoplastic change  
347 across the colon and in other tissues more closely correlates with these differences is yet to be  
348 determined.

349

350 Finally, this study provides a reference perspective on the mutational signatures and driver  
351 mutations in normal colon against which disease states of inflammatory, genetic, neoplastic,  
352 degenerative and other aetiologies can be compared. Similar surveys conducted across the



353 range of normal cell types will inform on the universal process of somatic evolution in the  
354 human body in health and disease.

355

356

357

### 358 **ACKNOWLEDGEMENTS**

359 This work was supported by the Wellcome Trust. We thank Paul Scott, Jo Fowler, David  
360 Fernandez-Antoran, and Yvette Hooks for their advice with histology and laser capture  
361 microdissection, and Moritz Gerstung for his advice on statistics. We further thank Krishnaa  
362 Mahbubani, Rogier ten Hoopen, Cinzia Scarpini, and the Phoenix study team of Nicola  
363 Grehan, Irene Debiram-Beecham, Jason Crawte, Tara Nuchkeddy Grant, Pierre Lao-Sirieix,  
364 and Andy Hindmarsh for their help with sample collection. Access to transplant organ donor  
365 samples were provided by the Cambridge Biorepository for Translational Medicine. Finally,  
366 we thank all the individuals who contributed samples to this study.

367

368

369

### 370 **AUTHOR CONTRIBUTIONS**

371 MRS and HLS designed the study and wrote the manuscript with contributions from all the  
372 authors. KSP, NC, MZ, RCF, NG, FT, AN, MG, and LM recruited patients and obtained  
373 samples. PE, RO, HLS, and LM devised the protocol to laser capture microdissect and  
374 sequence colonic crypts. HLS prepared sections, microdissected, and lysed colonic crypts. PR  
375 contributed to laser capture microdissection. PE and CA made libraries. HLS performed most  
376 of the data curation and statistical analysis. MAS devised filters for substitution calling. JW  
377 performed in-house NMF signature extraction. TC contributed to statistical analyses. LON  
378 provided technical assistance. PJC and IM oversaw statistical analyses. MRS supervised the  
379 study.

380

381

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- 483
- 484

## 485 FIGURE LEGENDS

486

487 **Figure 1. Mutational signatures present in normal colon.** **a**, an example SBS, DBS, and  
488 ID signature showing the categories into which mutations are divided. Later figures are  
489 shown with the same categories, ordering, and colour scheme. **b**, the complement of  
490 signatures discovered in normal colonic epithelium. Known signatures are labelled according  
491 to their nomenclature in PCAWG, while novel signatures are labelled with letters. SBS,  
492 single base substitution; DBS, doublet base substitution; ID, small insertion or deletion.

493

494 **Figure 2. Mutation burden versus age for every signature.** For every signature, the median  
495 (horizontal bar) and range (vertical bar) in mutation burden for all the crypts from each  
496 individual are shown. Each individual is coloured differently. See Supplementary Results for  
497 plots showing every crypt.

498

499 **Figure 3. Crypt phylogenies.** For four selected individuals (**a-d**), the phylogeny is shown  
500 three times: on top, with branch lengths proportional to the number of single base

501 substitutions; in the middle, with branch lengths proportional to the number of doublet base  
502 substitutions; on the bottom, with branch lengths proportional to the number of small  
503 insertions and deletions. Scale bars are shown on the right-hand side. A stacked barplot of the  
504 mutational signatures that contribute to each branch is superimposed onto every branch.  
505 Please note that the ordering of signatures along a given branch is just for visualisation  
506 purposes: we cannot distinguish the timing of different signatures along a branch. “X0”  
507 indicates mutations that could not confidently be assigned to any signature. The phylogenies  
508 for all individuals are shown in Extended Data Fig. 6. (a) a phylogeny dominated by  
509 ubiquitous and known signatures. A *PIK3CA* mutation is shared by two crypts. (b) a  
510 phylogeny with a strong contribution of SBSA and IDA, as well as an *AXIN2* mutation (the  
511 same as in Fig. 4). (c) a phylogeny with SBSB, DBS8, and IDB. (d) the phylogeny of the  
512 individual exposed to chemotherapy, showing a strong contribution of SBSB.

513

514 **Figure 4. An *AXIN2* driver mutation in normal colon.** (a) a section (after dissection) in  
515 which an inactivating *AXIN2* mutation was found. Red dots represent crypts with the *AXIN2*  
516 mutation. Blue dots represent crypts that could be assessed and were found not to have the  
517 mutation. Crypts without dots failed sequencing and could not be assessed. (b) the two crypts  
518 with the *AXIN2* mutations prior to dissection did not appear different to other crypts. (c) copy  
519 neutral loss of heterozygosity (CNN-LOH) of one of the crypts over the *AXIN2* locus. The  
520 copy number state (y axis) for every chromosome is shown, with one allele coloured red and  
521 the other green. (d) Jbrowse image of reads supporting the *AXIN2* mutations in each of the  
522 crypts. The mutation is coloured red. 25 out of 29 reads support the mutation in the crypt that  
523 has CNN-LOH; the four reads that do not are presumably the result of stromal contamination.

524

525 **Figure 5. Comparison of the mutational signatures and driver landscape of normal**  
526 **crypts and colorectal adenocarcinomas.** (a) a comparison of the burden of mutations due to  
527 every mutational signature found in either group. For each signature, the (mutation burden+1)  
528 of every sample is shown on the y axis on a log scale. Normal colon and cancer samples are  
529 ordered within their groups. Colorectal adenocarcinoma signature attributions and burden are  
530 from Alexandrov et al.<sup>1</sup>. (b-c) the frequency of driver mutations in normal colon and  
531 colorectal cancer. The frequency of driver mutations is derived using data from The Cancer  
532 Genome Atlas Network<sup>43</sup> (Supplementary Methods). (b) the proportion of crypts or cancers  
533 with driver mutations in each gene found in either of the two groups. (c) the proportion of  
534 driver mutations in each gene in normal and cancer.

535

536

537

## 538 EXTENDED FIGURE LEGENDS

539

540 **Extended Data Figure 1. Laser capture microdissection of crypts.** (a) a representative  
541 image of a section of colonic tissue, with a magnified inset showing the section before and  
542 after dissection of a crypt. (b-c), the coverage of crypts that underwent whole genome (b) and  
543 targeted (c) sequencing. (d-e), their respective VAF (which is half of the clonal fraction).

544

545 **Extended Data Figure 2. HDP signature extraction results.** Results of signature  
546 extraction using an HDP with conditioning on signatures known to be active in colorectal  
547 cancer. For each signature, the extracted signature and the profile of a sample that has a  
548 strong contribution of that signature are shown. Signatures are presented as in Fig. 2. The  
549 HDP extraction was followed by deconvolution by Expectation Maximisation (Methods,

550 Extended Data Fig. 3) to produce the version of signatures presented in the main text. HDP,  
551 Hierarchical Dirichlet Process.

552

553 **Extended Data Figure 3. Expectation maximisation decomposition of HDP signatures.**

554 Three signatures were decomposed. For each panel, the original HDP version is shown on  
555 the top left, the PCAWG signatures that are deemed to contribute at least 10% of mutations to  
556 it on the right, and the reconstituted signature built by combining the PCAWG signatures on  
557 the bottom left. The cosine similarity of the reconstituted signature to the original is shown in  
558 the title to the reconstituted signature plot. HDP, Hierarchical Dirichlet Process; PCAWG,  
559 Pan Cancer Analysis of Whole Genomes.

560

561 **Extended Data Figure 4. Validation of single base substitution signatures.** Other methods

562 of signature extraction were run to test the robustness of signature decomposition. **a**, HDP  
563 without pre-conditioning on PCAWG. **b**, In-house NNMF without pre-conditioning on  
564 PCAWG. **c**, NNMF implemented by the MutationalPatterns R package (Methods). HDP,  
565 Hierarchical Dirichlet Process; PCAWG, Pan Cancer Analysis of Whole Genomes; NNMF,  
566 Non-Negative Matrix Factorisation.

567

568 **Extended Data Figure 5. Linear modelling of signature accumulation.** For signatures that  
569 appeared to show a linear accumulation with age, the mutation rate per site was determined  
570 using mixed models, with age and site as fixed effects, and individual as a random effect.  
571 Confidence intervals were determined by bootstrapping.

572

573 **Extended Data Figure 6. Crypt phylogenies.** For every individual, the phylogeny of crypts  
574 is shown three times: on top, with branch lengths proportional to the number of single base  
575 substitutions; in the middle, with branch lengths proportional to the number of doublet base  
576 substitutions; on the bottom, with branch lengths proportional to the number of small  
577 insertions and deletions. Scale bars are shown on the right-hand side. A stacked barplot of the  
578 mutational signatures that contribute to each branch is overlaid over every branch. "XO"  
579 indicates mutations that could not confidently be assigned to any signature. Please note that  
580 the ordering of signatures along a given branch is just for visualisation purposes: we cannot  
581 distinguish the timing of different signatures along a branch.

582

583 **Extended Data Figure 7. Copy number changes in normal colon.** **(a)** whole chromosome  
584 amplifications in five crypts. The copy number state (y axis) for each allele, one coloured red,  
585 and one coloured green, is shown. Chromosomes are labelled along the top of the graph. **(b)**  
586 timing of copy number changes throughout life. Vertical bars represent 95% confidence  
587 intervals determined by bootstrapping.

588

589 **Extended Data Figure 8. Gain of function driver mutations in normal colon.** Putative  
590 driver missense mutations in oncogene hotspots. The number of substitutions catalogued in  
591 COSMIC are shown on the y axis at each position along the gene, with the mutations  
592 observed in our cohort highlighted.

593

594 **Extended Data Figure 9. Occurrence matrix of signatures and driver mutations in  
595 crypts.** For all crypts that were whole genome sequenced to sufficient depth and for crypts  
596 that underwent targeted sequencing and in which driver mutations were found, the signatures  
597 and driver mutations are shown. Each vertical column represents a crypt. The individual to  
598 which each crypt belongs is indicated by alternating colours in the top bar. The site to which  
599 each crypt belongs is shown underneath. The contribution of each signature to each crypt;



600 thus the crypt with the largest contribution of a given signature is coloured purple, and the  
601 crypt with the smallest contribution is coloured white. Crypts in which the signatures could  
602 not be assessed, either because they underwent targeted sequencing or the coverage was poor,  
603 are coloured grey. Driver mutations, including heterozygous mutations in tumour suppressor  
604 genes, are indicated by a black bar.

605

606

607

## 608 SUPPLEMENTARY METHODS

609

### 610 **Human tissues**

611 We obtained healthy colonic biopsies from four cohorts. The first represents seven deceased  
612 organ donors ranging in age from 36 to 67, from whom colonic and small intestinal biopsies  
613 were taken at the time of organ donation (REC 15/EE/0152). The second represents  
614 individuals aged 60 to 72 who were having a colonoscopy following a positive faecal occult  
615 blood test as part of the Bowel Cancer Screening Programme (Ethical approval 08-H0308-  
616 13); we selected 16 who were not found to have either an adenoma or a carcinoma on  
617 colonoscopy, and 15 who were found to have a colorectal carcinoma (the normal biopsies  
618 that we use were distant from these lesions). The third cohort represents three paediatric  
619 patients who underwent routine colonoscopy to exclude inflammatory bowel disease and who  
620 were found to have a completely normal intestinal mucosa macroscopically and histologically  
621 (REC 12/EE/0482). The final cohort included one 78 year-old gentleman with oesophageal  
622 cancer who underwent a warm autopsy (REC 13/EE/0043). All samples were obtained with  
623 informed consent and studies approved by East of England Research Ethics Committees.

624

### 625 **Laser capture microdissection of colonic crypts**

626 Fresh frozen biopsies were embedded in optimal cutting temperature (OCT) compound. 30  
627 micrometre sections were fixed in methanol for five minutes, washed three times with  
628 phosphate-buffered saline, and stained with Gill's haematoxylin for 20 seconds. Crypts were  
629 isolated by laser capture microdissection, and collected in separate wells of a 96-well plate.  
630 They were lysed using the Arcturus PicoPure Kit (Applied Biosystems) according to the  
631 manufacturer's instructions. DNA library prep then proceeded without clean-up or  
632 quantification.

633

### 634 **Library preparation**

635 Two library preparation methods were used for laser capture microdissected (LCM) material:  
636 in initial experiments sonication was used to fragment DNA, and later, an enzymatic  
637 fragmentation method was implemented as it could make libraries from even lower input.  
638 Comparison of the two methods showed no difference in mutation calls once post-processing  
639 filters (described below) had been implemented. All samples in this study were processed  
640 using an Agilent Bravo Workstation (Option B; Agilent Technologies).

641

642 For sonication libraries, LCM lysate (20  $\mu$ l) was mixed with 100  $\mu$ l TE buffer (Ambion; 10  
643 mM Tris-HCl, 1 mM EDTA) and DNA was fragmented using focused acoustics (Covaris  
644 LE220; Covaris, Inc.). Fragmented DNA was mixed with 80  $\mu$ l Ampure XP beads (Beckman  
645 Coulter). Following a 5 min binding reaction and magnetic bead separation, genomic DNA  
646 was washed twice with 75% ethanol. Beads were resuspended in 20  $\mu$ l nuclease-free water  
647 (Ambion) and processed immediately for DNA library construction. Each sample (20  $\mu$ l) was  
648 mixed with 2.8  $\mu$ l of NEBNext Ultra II End Prep Reaction Buffer, 1.25  $\mu$ l of NEBNext Ultra  
649 II End Prep Enzyme Mix (New England BioLabs) and incubated on a thermal cycler for 30

650 min at 20°C then 30 min at 65°C. Following DNA fragmentation and A-tailing, each sample  
651 was incubated for 20 min at 20°C with a mixture of 30 µl ligation mix and 1 µl ligation  
652 enhancer (New England BioLabs), 0.9 µl nuclease-free water (Ambion) and 0.1 µl duplexed  
653 adapters (100 µM; 5'-ACACTCTTTCCCTACACGACGCTCTTCCGATC\*T-3', 5'-phos-  
654 GATCGGAAGAGCGGTTCAGCAGGAATGCCGAG-3'). Adapter-ligated libraries were  
655 purified using Ampure XP beads by addition of 65 µl Ampure XP solution (Beckman  
656 Coulter) and 65 µl TE buffer (Ambion). Following elution and bead separation, DNA  
657 libraries (21.5 µl) were amplified by PCR by addition of 25 µl KAPA HiFi HotStart  
658 ReadyMix (KAPA Biosystems), 1 µl PE1.0 primer (100 µM; 5'-  
659 AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTTCCGA  
660 TC\*T-3') and 2.5 µl iPCR-Tag (40 µM; 5'-  
661 CAAGCAGAAGACGGCATAACGAGATXGAGATCGGTCTCGGCATTCTGCTGAACC  
662 GCTCTTCCGATC-3') where 'X' represents one of 96 unique 8-base indexes The sample  
663 was then mixed and thermal cycled as follows: 98 °C for 5 min, then 12 cycles of 98 °C for  
664 30 s, 65°C for 30 s, 72 °C for 1 min and finally 72 °C for 5 min. Amplified libraries were  
665 purified using a 0.7:1 volumetric ratio of Ampure Beads (Beckman Coulter) to PCR product  
666 and eluted into 25 µl of nuclease-free water (Ambion). DNA libraries were adjusted to 2.4  
667 nM and sequenced on the HiSeq X platform (illumina) according to the manufacturer's  
668 instructions with the exception that we used iPCRtagseq (5'-  
669 AAGAGCGGTTCAGCAGGAATGCCGAGACCGATCTC-3') to read the library index.

670  
671 For enzymatic fragmentation, LCM lysate (20 ul) was mixed with 50 ul Ampure XP beads  
672 (Beckman Coulter) and 50 µl TE buffer (Ambion; 10 mM Tris-HCl, 1 mM EDTA) at room  
673 temperature. Following a 5 min binding reaction and magnetic bead separation, genomic  
674 DNA was washed twice with 75% ethanol. Beads were resuspended in 26 µl TE buffer and  
675 the bead/genomic DNA slurry was processed immediately for DNA library construction.  
676 Each sample (26 µl) was mixed with 7 µl of 5X Ultra II FS buffer, 2 µl of Ultra II FS enzyme  
677 (New England BioLabs) and incubated on a thermal cycler for 12 min at 37°C then 30 min at  
678 65°C. Following DNA fragmentation and A-tailing, each sample was incubated for 20 min at  
679 20°C with a mixture of 30 µl ligation mix and 1 µl ligation enhancer (New England  
680 BioLabs), 0.9 µl nuclease-free water (Ambion) and 0.1 µl duplexed adapters (100 µM; 5'-  
681 ACACTCTTTCCCTACACGACGCTCTTCCGATC\*T-3', 5'-phos-  
682 GATCGGAAGAGCGGTTCAGCAGGAATGCCGAG-3'). Adapter-ligated libraries were  
683 purified using Ampure XP beads by addition of 65 µl Ampure XP solution (Beckman  
684 Coulter) and 65 µl TE buffer (Ambion). Following elution and bead separation, DNA  
685 libraries (21.5 µl) were amplified by PCR by addition of 25 µl KAPA HiFi HotStart  
686 ReadyMix (KAPA Biosystems), 1 µl PE1.0 primer (100 µM; 5'-  
687 AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTTCCGA  
688 TC\*T-3') and 2.5 µl iPCR-Tag (40 µM; 5'-  
689 CAAGCAGAAGACGGCATAACGAGATXGAGATCGGTCTCGGCATTCTGCTGAACC  
690 GCTCTTCCGATC-3') where 'X' represents one of 96 unique 8-base indexes The sample  
691 was then mixed and thermal cycled as follows: 98 °C for 5 min, then 12 cycles of 98 °C for  
692 30 s, 65°C for 30 s, 72 °C for 1 min and finally 72 °C for 5 min. Amplified libraries were  
693 purified using a 0.7:1 volumetric ratio of Ampure Beads (Beckman Coulter) to PCR product  
694 and eluted into 25 µl of nuclease-free water (Ambion). DNA libraries were adjusted to 2.4  
695 nM and sequenced on the HiSeq X platform (Illumina) according to the manufacturer's  
696 instructions with the exception that we used iPCRtagseq (5'-  
697 AAGAGCGGTTCAGCAGGAATGCCGAGACCGATCTC-3') to read the library index.

698  
699

## Whole genome sequencing

700 We generated paired end sequencing reads (150bp) using Illumina XTEN® machines  
701 resulting in ~15x coverage per sample. Sequences were aligned to the human reference  
702 genome (NCBI build37) using BWA-MEM.

703

#### 704 **Targeted sequencing**

705 A 2.3 MB capture panel was designed in-house to pull down genes that are known or  
706 suspected to play a role in neoplasia. We performed custom RNA bait design following the  
707 manufacturer's guidelines (SureSelect, Agilent). Samples were multiplexed on flow cells and  
708 subjected to paired end sequencing (75-bp reads) using Illumina HiSeq2000 machines. One  
709 96-well plate of samples was sequenced on each lane, but as tissue recovery was variable, a  
710 range of coverage was achieved. Sequences were aligned to the human reference genome  
711 (NCBI build37) using BWA-align.

712

#### 713 **Data Availability**

714 Whole genome and targeted sequencing data are deposited in the European Genome  
715 Phenome Archive (EGA). sequencing data have been deposited with EGA accession  
716 EGAD00001004192, EGAD00001004192, and EGAD00001004193.

717

#### 718 **Code Availability**

719 Code for statistical analyses is provided as part of the supplement. Custom R scripts and their  
720 input data for signature analysis are available on GitHub at [https://github.com/HLee-Six/colon\\_microbiopsies](https://github.com/HLee-Six/colon_microbiopsies). All other code is available from the authors on request.

722

#### 723 **Calling substitutions**

724 Substitution calling was broken down into three steps: mutation discovery; filtering to  
725 produce a list of clean sites; and genotyping, where the presence or absence of every  
726 mutation in every sample is evaluated.

727

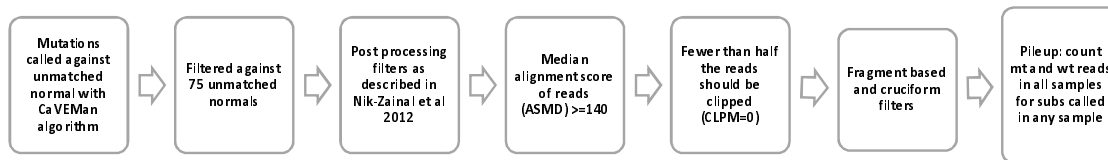
728 First, mutations were initially discovered using the Cancer Variants through Expectation  
729 Maximisation (CaVEMan) algorithm<sup>46</sup>. CaVEMan uses a naïve Bayesian classifier to derive  
730 the probability of all possible genotypes at each nucleotide. CaVEMan copy number options  
731 were set to major copy number 5 and minor copy number 2 for normal clones, as in our  
732 experience this maximises sensitivity. The algorithm was run using an unmatched normal in  
733 order to be able to derive phylogenies: had another sample from the same individual been  
734 treated as a matched normal, early embryonic mutations would have been treated as germline  
735 and discarded, resulting in incorrect trees.

736

737 Second, a number of post-processing filters were applied. These included filtering against a  
738 panel of 75 unmatched normal samples to remove common single nucleotide polymorphisms,  
739 post-processing as described previously<sup>32</sup> and two filters (only applied to whole genome  
740 sequencing data) designed to remove mapping artefacts associated with BWA-MEM: the  
741 median alignment score of reads supporting a mutation should be greater than or equal to  
742 140, and fewer than half of these reads should be clipped. The library preparation protocol for  
743 microbiopsies produced shorter library insert sizes than standard methods. Reads could  
744 therefore overlap, resulting in double counting of mutant reads. Fragment-based statistics  
745 were generated to prevent the calling of variant supported by a low number of fragments.  
746 Variants were annotated by ANNOVAR<sup>47</sup> and fragment-based statistics (fragment coverage,  
747 number of fragments supporting the variant, fragment-based allele fraction) were calculated  
748 for each variant after the exclusion of marked PCR duplicates. In the rare event of  
749 discordance in the called base at the variant position between overlapping paired-end reads,

750 the base with the highest quality score was selected. Fragment-based statistics were  
751 calculated separately for high quality fragments (alignment score  $\geq 40$  and base scores  $\geq 30$ ).  
752 Variants supported by at least three high quality fragments were retained and used for the  
753 next stage of variant filtering. Inspection of variants specific to LCM experiments revealed  
754 that the vast majority were present within inverted repeats capable of forming hairpin  
755 structures, that they were supported by reads with very similar alignment start position (and  
756 so not marked as PCR duplicates), and were primarily located close to the alignment start  
757 within the supporting reads. Commonly these variants coincided with other proximal variants  
758 (1-30 bp), but filtering based on variant proximity would also remove actual kataegis events.  
759 *In silico* modelling of the potential hairpin showed that the variants were aligning to each  
760 other in the stem of the structure, but could not form a base pair, while all other bases could.  
761 The artefacts are likely the consequence of erroneous processing of cruciform DNA (existing  
762 either prior to DNA isolation or formed during library preparation) by the enzymatic  
763 digestion protocol applied. We have considered modelling the hairpin structures to filter these  
764 variants, but given the fact that read clustering (i.e., similar alignment position) serves as a  
765 hallmark for these artefacts, we opted to use the proximity of the variant to the alignment  
766 start, and the standard deviation (SD) and median absolute deviation (MAD) of the variant  
767 position within the supporting reads, as features for filtering. These statistics were calculated  
768 separately for positive and negative strand aligned reads. In case the variant was supported by  
769 a low number of reads (i.e., 0-1 reads) for one of the strands, the filtering was based only on  
770 the statistics generated for the other strand. Per variant, if one of the strands had too few reads  
771 supporting, it was required for the other strand that either: (I) there should be  $\leq 90\%$   
772 supporting reads to report the variant within the first 15% of the read starting from the  
773 alignment start, or (II) the statistics  $MAD > 0$  and  $SD > 4$ . Per variant, if both strands were  
774 supported by sufficient reads it was required for both strands separately that either: (I) there  
775 should be  $\leq 90\%$  supporting reads to report the variant within the first 15% of the read, (II)  
776 the statistics  $MAD > 2$  and a  $SD > 2$ , or (III) that the other strand should have the statistics  
777  $MAD > 1$  and  $SD > 10$  (i.e., the variant is retained if the other strand demonstrates strong  
778 measures of variance). In our experience, the proposed strategy vastly reduces the number of  
779 artefactual variants while retaining all other variants, as assessed by running the last filtering  
780 step on WGS data from non-LCM experiments.

781  
782 Third, mutations were genotyped in every sample. A pileup of all the samples from a given  
783 individual was constructed, counting the number of mutant and wild type reads in every  
784 sample over every site that had been called in any sample from that person. Only reads with a  
785 mapping quality of 30 or above and bases with a base quality of 30 or above were counted.  
786 After applying these filters, mutations were genotyped based on the number of mutant and  
787 wild type reads at each locus. Mutations were called based on a variant allele fraction (VAF)  
788  $> 0.2$ , a depth  $> 7$ , and at least 4 mutant reads. If the depth over a locus was less than seven in  
789 a given sample, or if there was more than one mutant read but the other criteria were not met,  
790 the genotype was set to NA for tree construction purposes. Loci that were set to NA in more  
791 than one third of the samples were removed for construction of the phylogeny. Positions were  
792 called as germline if they were either called as present or NA in all of the samples from a  
793 given individual.  
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### Calling short insertions and deletions (indels)

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### Calling structural variants

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### Calling copy number

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### Detection of driver variants and positive selection

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Driver mutations were detected both through an unbiased dNdS method and through manual annotation. For these analyses, the CaVEMan and Pindel calls were used without post-processing filters in order to maximise our sensitivity. All putative driver variants were visually inspected using Jbrowse<sup>51</sup>, and so we could afford a higher false positive rate in the mutation discovery phase.

dNdScv<sup>52</sup> was used to conduct three tests: first, using only the whole genome sequencing data, an analysis of selection over all genes; second, using combined whole genome and targeted sequencing data, over all the genes covered by the bait-set; and finally, using again



839 this combined dataset, over 90 selected cancer genes (appendix). R code for this analysis is  
840 included in the supplementary information.

841

842 Manual annotation of driver variants based on prior knowledge complemented this. A list of  
843 90 colorectal cancer genes (appendix) curated from the literature that were also covered by  
844 the bait-set were intersected with the list of substitutions and indels from combined whole  
845 genome and targeted sequencing. Mutations were annotated as putative drivers if they were  
846 either missense mutations that fell in an oncogene hotspot (based on visualisation of the  
847 distribution of mutations in the gene on COSMIC<sup>53</sup>), or if they were truncating mutations that  
848 fell in a tumour suppressor gene.

849

850 Structural variants that might act as drivers were assessed by intersection of genes involved  
851 in each structural variant with the twelve genes involved in gene fusions that have been  
852 reported in colorectal cancer in COSMIC (*VTIIA*, *TCF7L2*, *TPM3*, *NTRK1*, *PTPRK*, *RSPO3*,  
853 *ETV6*, *NTRK3*, *EIF3E*, *RSPO2*, *C2orf44*, and *ALK*). No fusion genes were found. None of the  
854 genes involved in structural variants in our data overlapped with the list of 90 cancer genes  
855 used for assessing substitutions and indels, and nor were there any genes that were affected  
856 by more than one structural variant. No high-level copy number amplifications were observed  
857 and there were no homozygous deletions.

858

#### 859 **Estimation of frequency of driver mutations in cancer**

860 Publically-available colorectal cancer mutation calls were obtained from The Cancer Atlas  
861 Network<sup>43</sup>. Driver mutations were annotated manually in the same way as in our dataset: only  
862 mutations that fell in the 90 genes that we had selected were considered, and they were  
863 annotated as putative drivers if they were either missense mutations that fell in an oncogene  
864 hotspot (based on visualisation of the distribution of mutations in the gene on COSMIC<sup>53</sup>), or  
865 if they were truncating mutations that fell in a tumour suppressor gene.

866

#### 867 **Construction of phylogenies**

868 Phylogenies are used in this analysis for timing mutations. The most informative branches in  
869 this case are the long branches shared by a small number of crypts, which are very robust to  
870 all tree construction methods. Trees were built using maximum parsimony using substitutions  
871 called as described above. For every individual, the input matrix of mutation calls was  
872 bootstrapped 100 times. Phylogenies were constructed for each replicate using the Wagner  
873 method of the Mix programme from the Phylip suite of tools<sup>54</sup>. The consensus of all the  
874 phylogenies constructed was used.

875

876 The phylogenies were validated using the indel calls. To do this, the same procedure as for  
877 substitutions was followed for indel matrices. As there were fewer indels than substitutions,  
878 nodes in indel phylogenies were generally reconstructed with lower confidence than in  
879 substitution phylogenies, but they broadly agree. 85% of nodes reconstructed with  $\geq 90\%$   
880 confidence in the indel tree were present with exactly the same set of descendants in the  
881 substitution trees.

882

883 The phylogeny inference programme used provided the topology of the tree but not the  
884 assignment of mutations. Mutations from the input matrix of genotypes therefore have to be  
885 re-assigned to branches. In order to assign a set of mutation calls with no false negative and  
886 no false positives to a tree, each branch of the tree was considered in turn. If a mutation was  
887 called in all the descendants of a given branch, and in no samples that were not descendants  
888 of the branch, mutations were assigned to that branch.

889

890 Some colonic microbiopsies suffered from low coverage and stromal contamination. For this  
891 reason, we did not expect mutations to fit the tree perfectly, as a mutation that was truly  
892 present in a colony might be missed if too few supporting reads are found. Mutations were  
893 only assigned to the tree in order to determine the mutational processes active at a particular  
894 time. We reasoned that it was preferable to assign only mutations that fit the tree perfectly  
895 and adjust the branch lengths based on the power to call mutations at a given branch, rather  
896 than attempting to assign mutations that fit the tree imperfectly. Using the clonality and  
897 coverage of all descendants of a branch, the proportion of true substitutions or indels on the  
898 branch that would be first discovered (whether by CaVEMan or Pindel) and then genotyped  
899 as present according to the criteria described above was calculated. The observed branch  
900 length was then adjusted by dividing by this proportion. This was done for both substitutions  
901 and indels, but not for structural variants and for larger copy number changes due to a lack of  
902 data: most branches have no large variants and so could not be extended appropriately.  
903 Rearrangements and copy number changes were assigned to phylogenies manually.

904

#### 905 **Extraction of mutational signatures**

906 Mutational signatures were extracted using the mutations assigned to every branch of a  
907 phylogeny as a 'sample'. This allows better discrimination of mutational processes that may  
908 occur at different times within the same cell. Mutations were categorised following the  
909 method used by the Mutational Signatures working group of the Pan Cancer Analysis of  
910 Whole Genomes (PCAWG)<sup>1</sup>. Single base substitutions were categorised into 96 classes  
911 according to the identity of the pyrimidine mutated base pair, and the base 5' and 3' to it.  
912 Doublet base substitutions were categorised into 78 classes according to the identity of the  
913 reference and alternative bases. Indels were classified according to whether they were an  
914 insertion or a deletion, the identity of the inserted/deleted base, the length of the  
915 mononucleotide tract in which they occurred, or the degree of homology with the  
916 surrounding sequence into 83 classes (Fig. 1a).

917

918 Signatures were extracted using a hierarchical Dirichlet Process<sup>55,56</sup>. Code and the input  
919 mutations are provided at [https://github.com/HLee-Six/colon\\_microbiopsies](https://github.com/HLee-Six/colon_microbiopsies). First, the  
920 algorithm was conditioned on the set of mutational signatures that have found to be operative  
921 in colorectal cancers in PCAWG<sup>1</sup>: SBS1, SBS2, SBS3, SBS5, SBS13, SBS16, SBS17a,  
922 SBS17b, SBS18, SBS25 (included although it is not found in colorectal cancer because the  
923 similarity with the mutational profile with crypts from one individual had been previously  
924 noted), SBS28, SBS30, SBS37, SBS40, SBS41, SBS43, SBS45, SBS49, DBS, DBS3, DBS4,  
925 DBS6, DBS7, DBS8, DBS9, DBS10, DBS11, ID1, ID2, ID3, ID4, ID5, ID6, ID7, ID8, ID10,  
926 and ID14. This allows simultaneous discovery of new signatures and matching to known  
927 ones. Nine single base substitution (SBS), two doublet base substitution (DBS), and five  
928 indel (ID) signatures were discovered (Extended Data Fig. 2). Despite pre-conditioning,  
929 signatures that were perfectly correlated in all samples were still amalgamated. This  
930 occurred, for example, with signatures 1, 5, and 18. Therefore, expectation maximisation was  
931 used to deconvolute all HDP signatures into known PCAWG signatures. If a signature  
932 reconstituted from the components that expectation maximisation extracted (only including  
933 PCAWG signatures that accounted for at least 10% of mutations in each sample to avoid  
934 over-fitting) had a cosine similarity to the HDP signature of more than 0.95, the signature  
935 was presented as its expectation maximisation deconvolution. Three HDP signatures met  
936 these criteria: the HDP SBS1 signature was deconvoluted into a mixture of PCAWG SBS1,  
937 PCAWG SBS5, and PCAWG SBS18; the HDP DBSA was deconvoluted in PCAWG DBS2,  
938 PCAWG DBS4, PCAWG DBS6, PCAWG DBS9, and PCAWG DBS11; and the HDP IDC

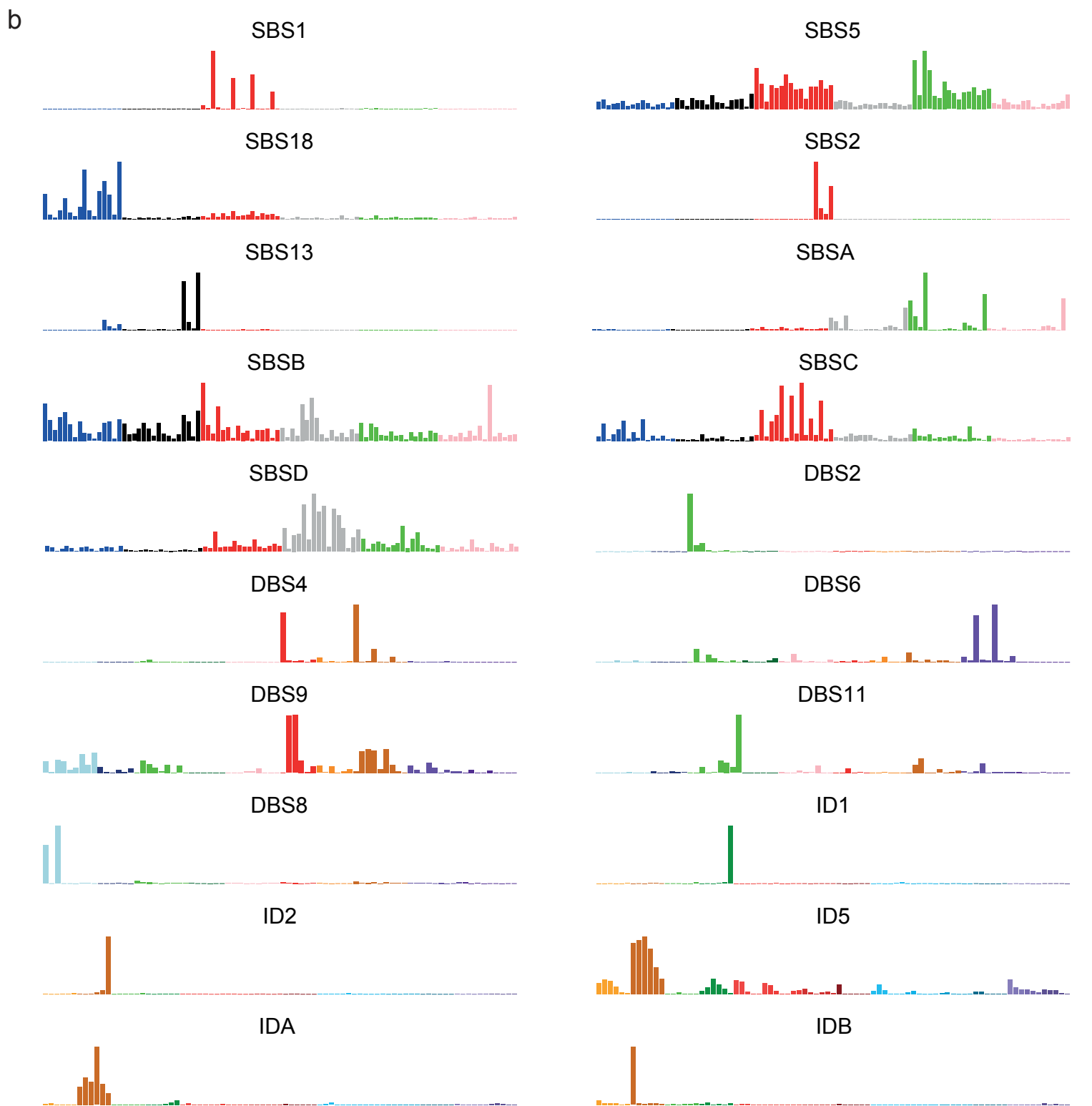
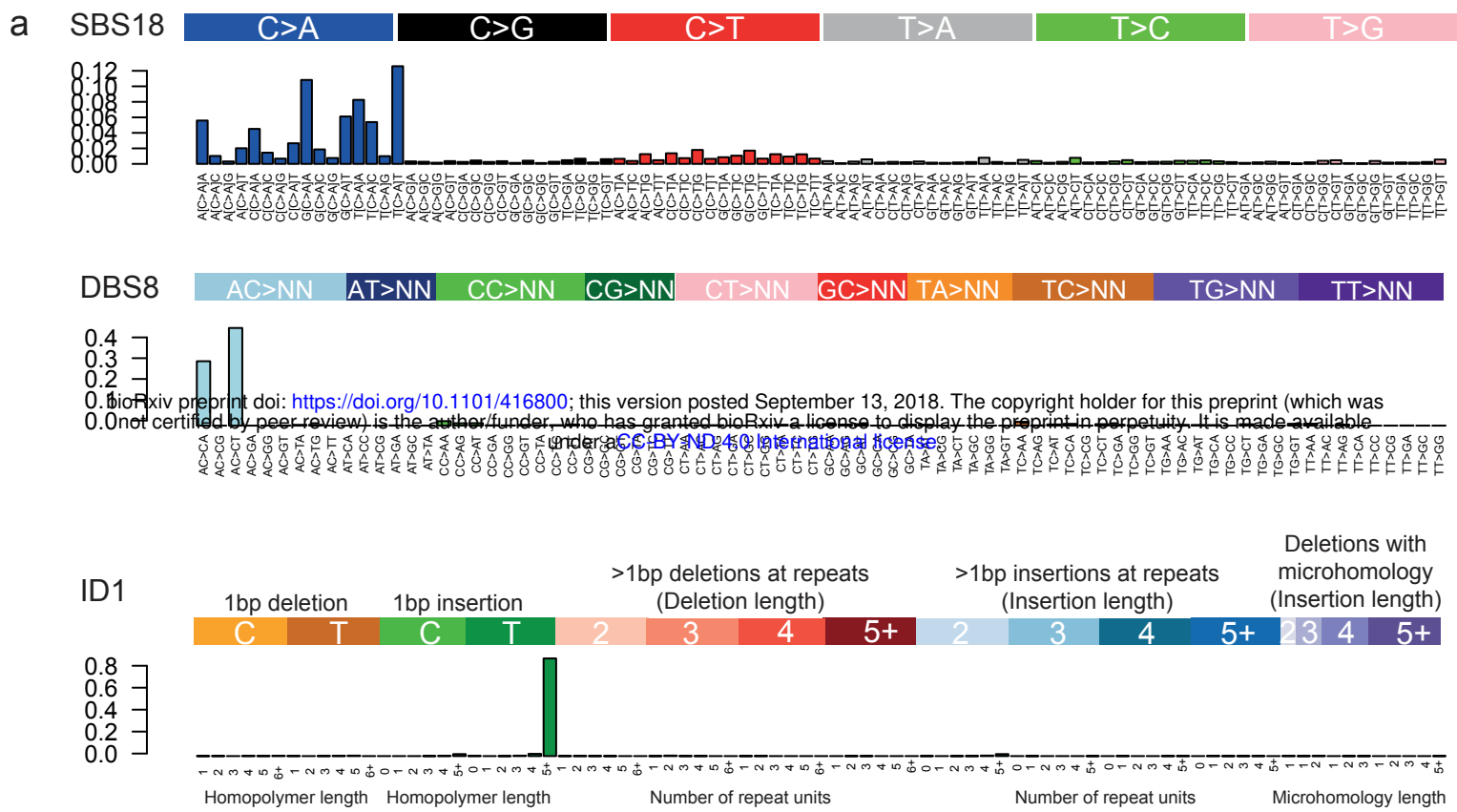
939 was deconvoluted into PCAWG ID1, PCAWG ID2, and PCAWG ID5 (Extended Data Fig.  
940 3). To test the robustness of this signature analysis, other signature extraction methods were  
941 used: HDP with no pre-conditioning, the non-negative matrix factorisation (NNMF) method  
942 used by Blokzijl and colleagues<sup>4</sup>, and a version of the NNMF algorithm used by Alexandrov  
943 and colleagues<sup>1</sup>. These all produced comparable results (Extended Data fig. 4).  
944

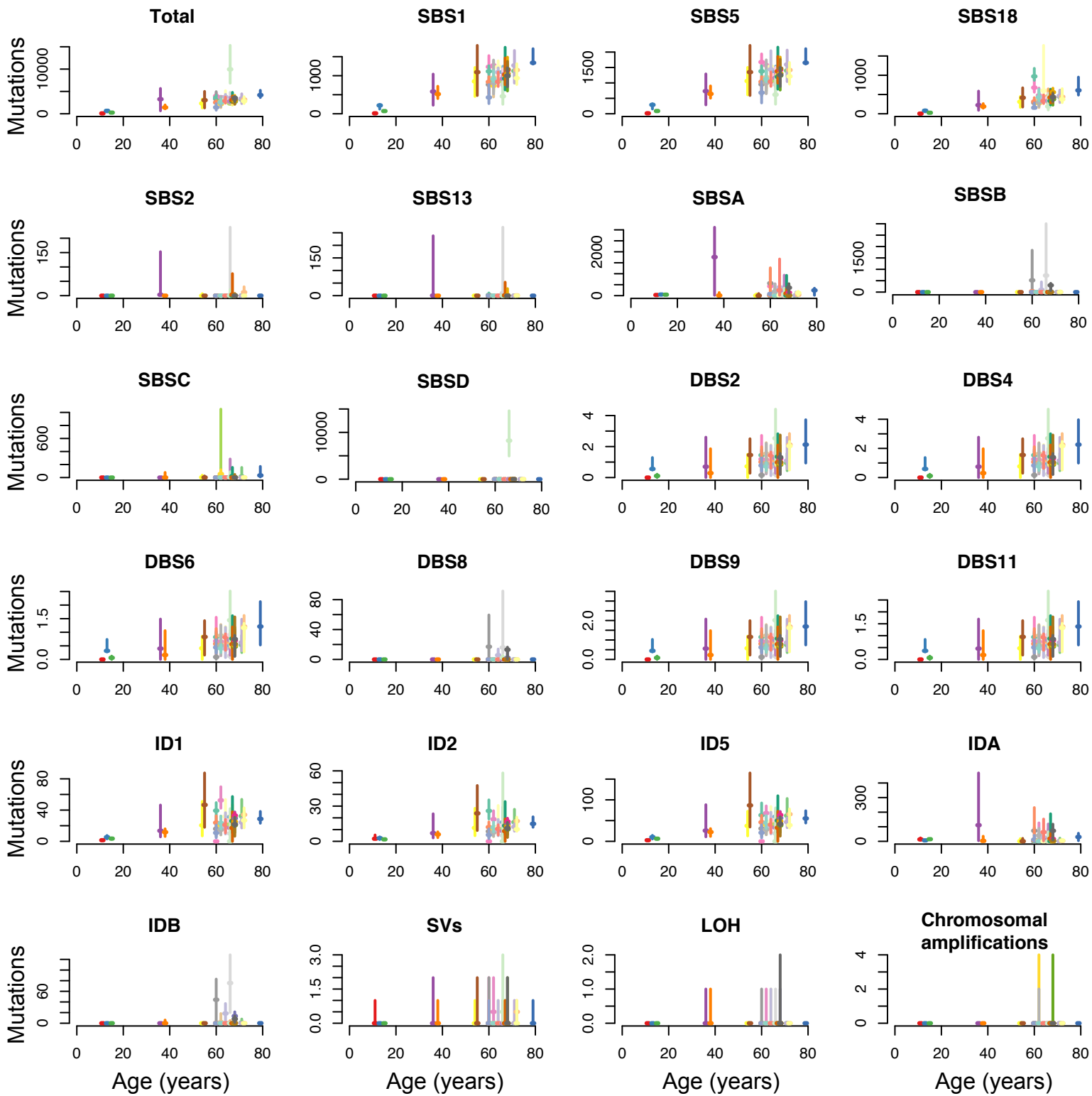
#### 945 **Statistical analyses**

946 All statistical analyses were performed in R (Supplementary Results).  
947  
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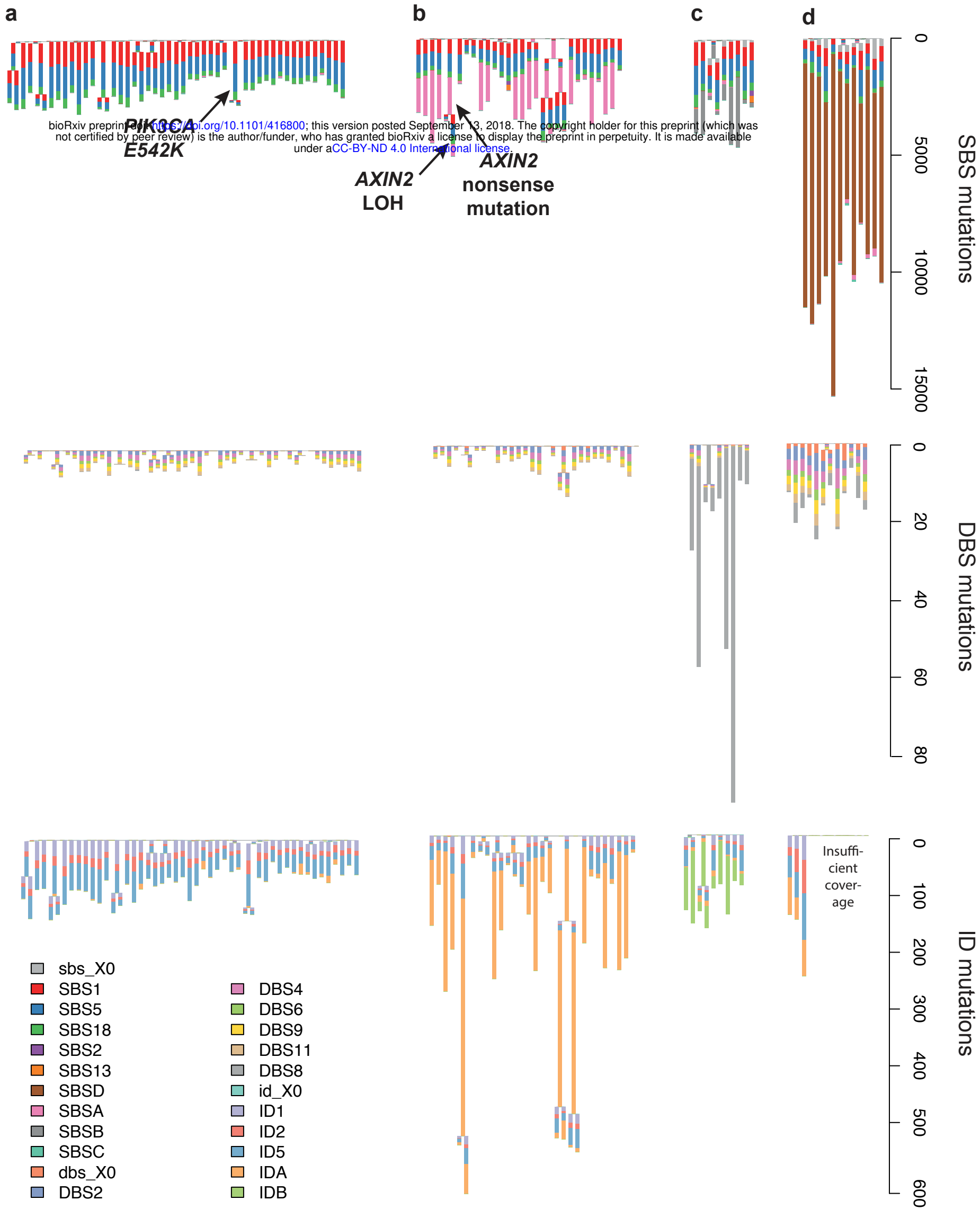
#### 949 **REFERENCES FOR SUPPLEMENTARY METHODS**

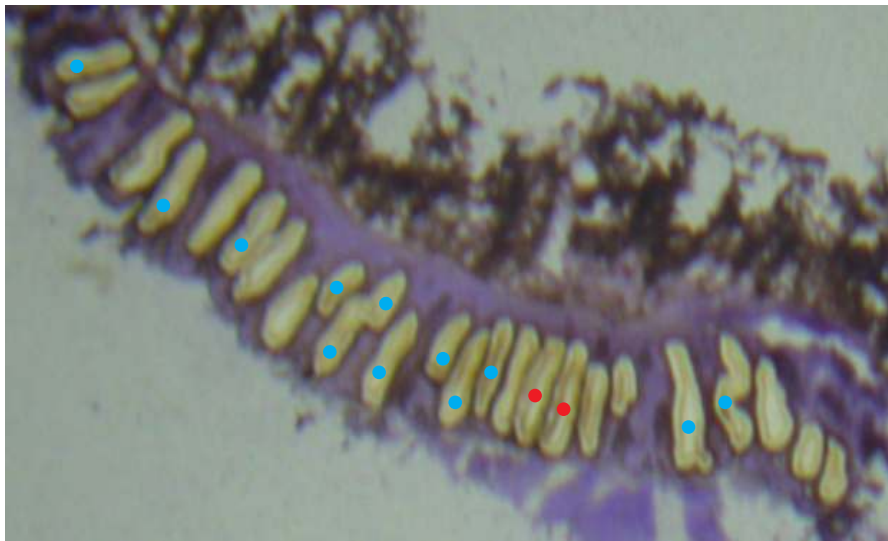
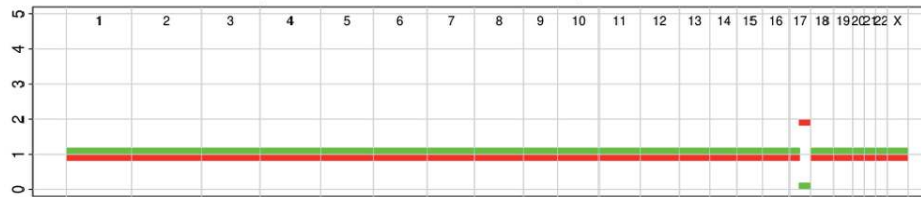
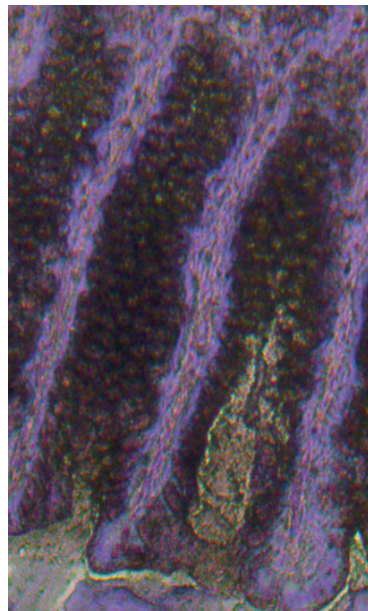
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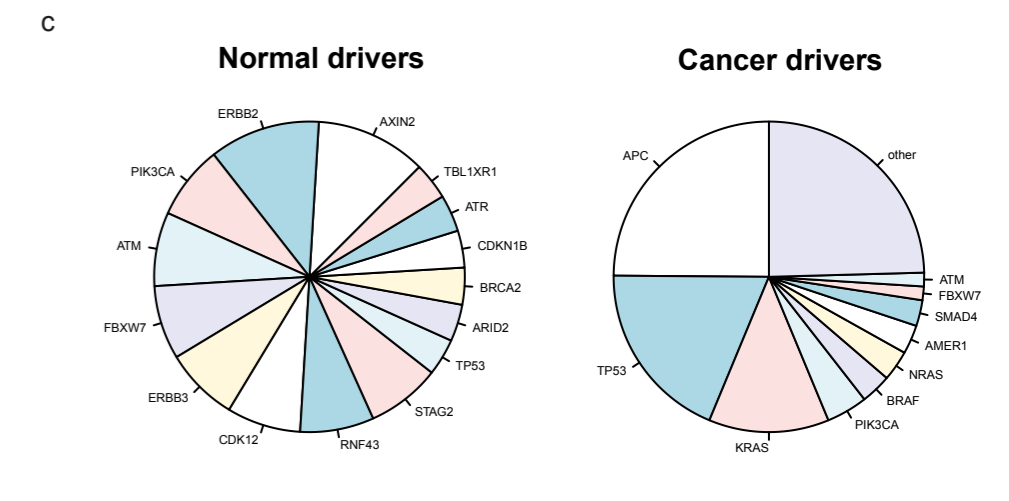
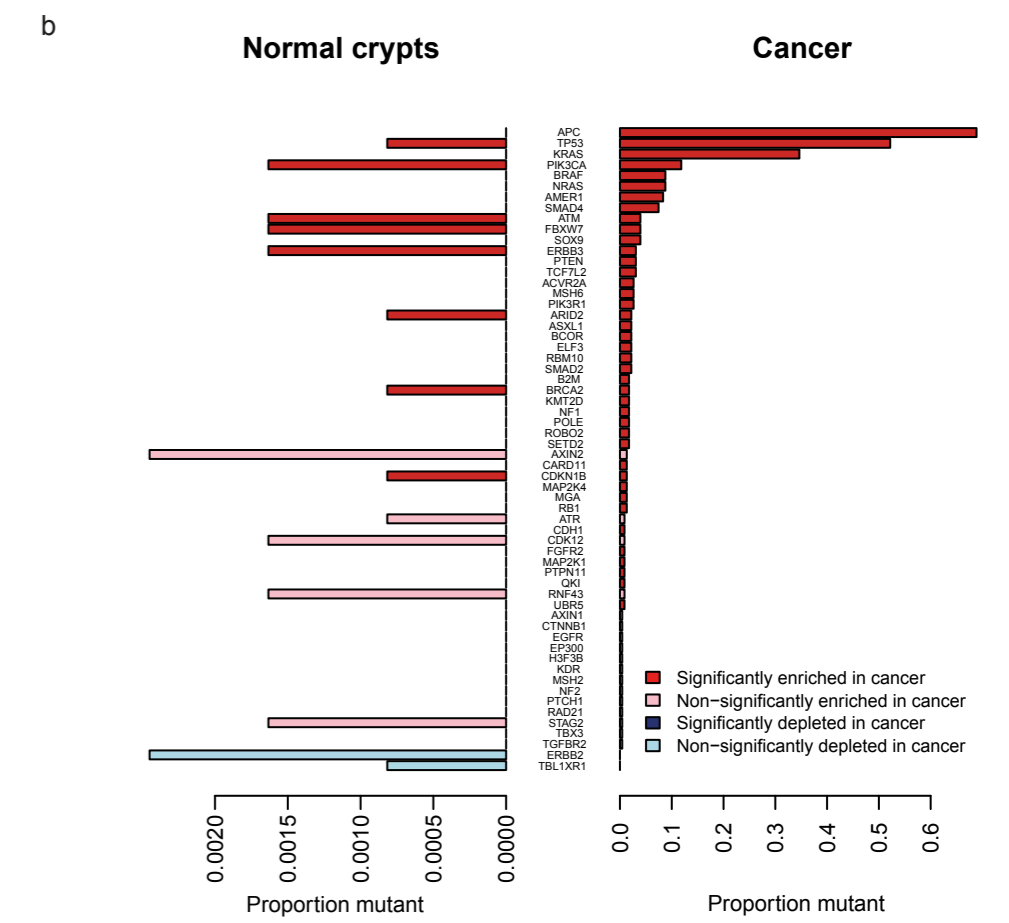
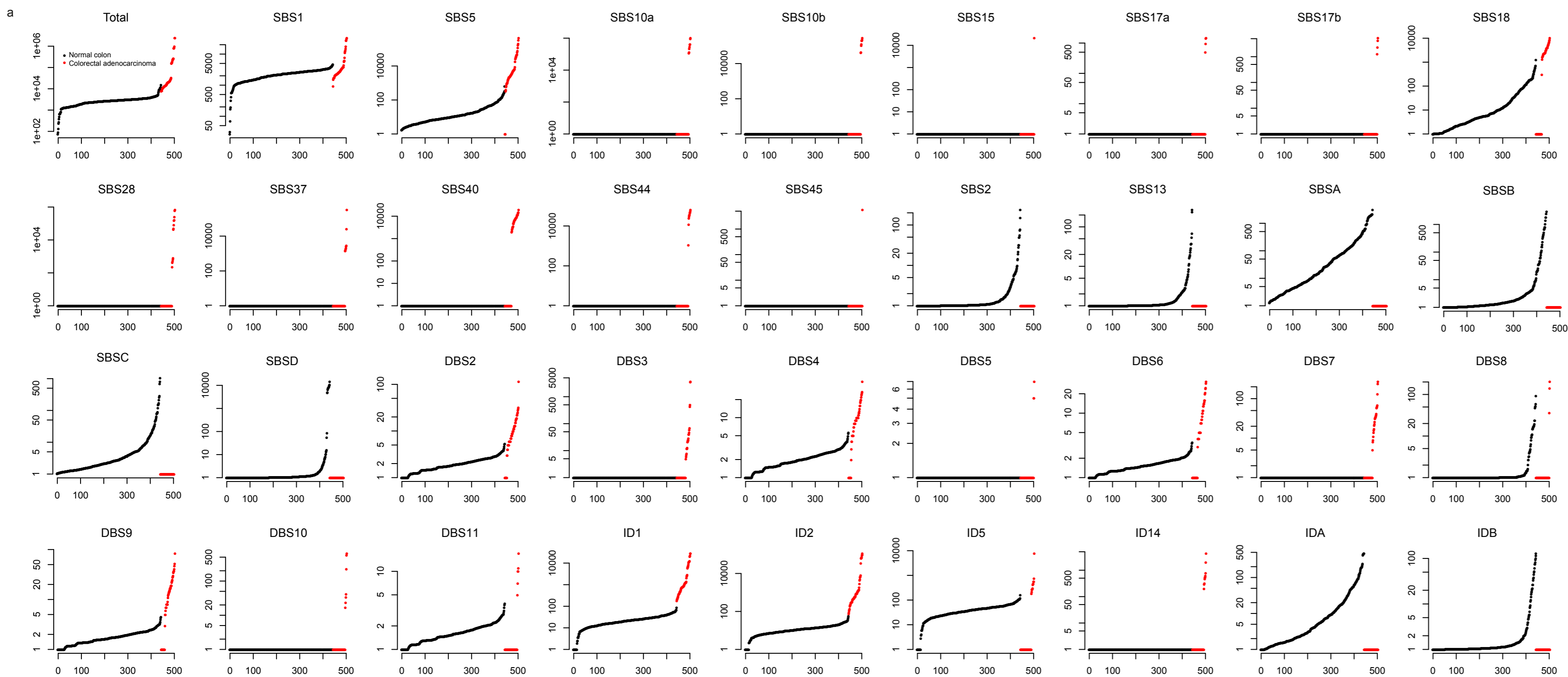






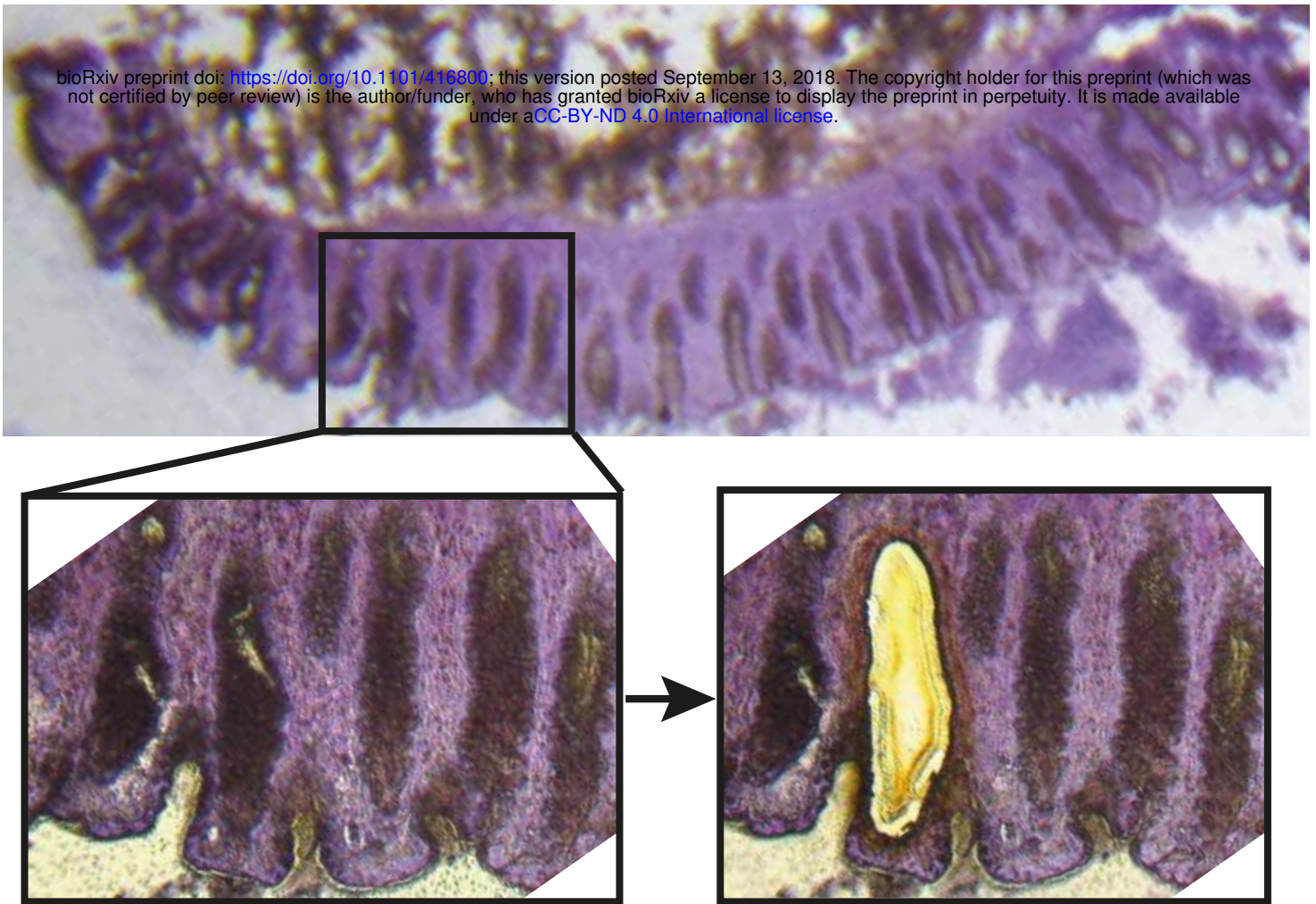
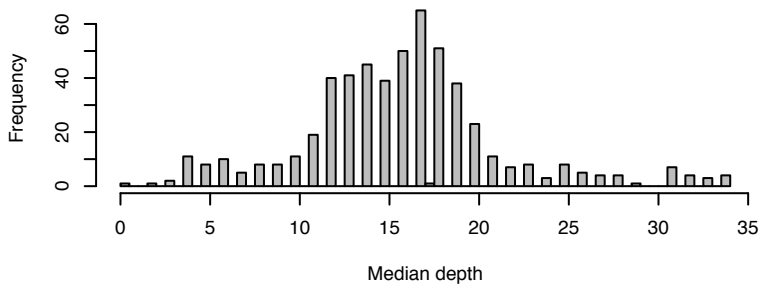
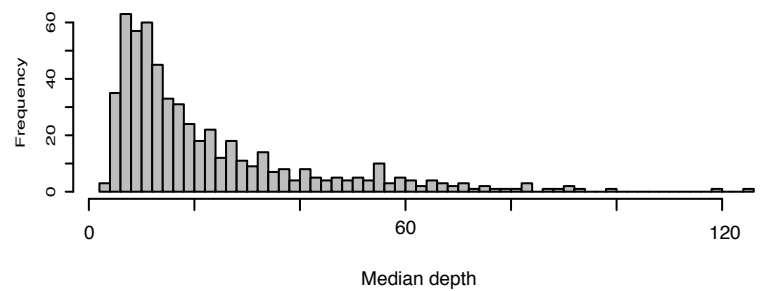
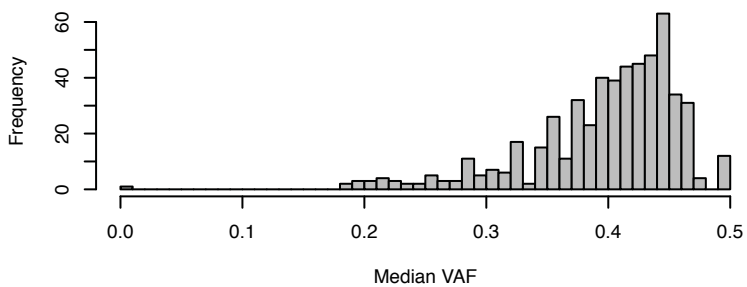
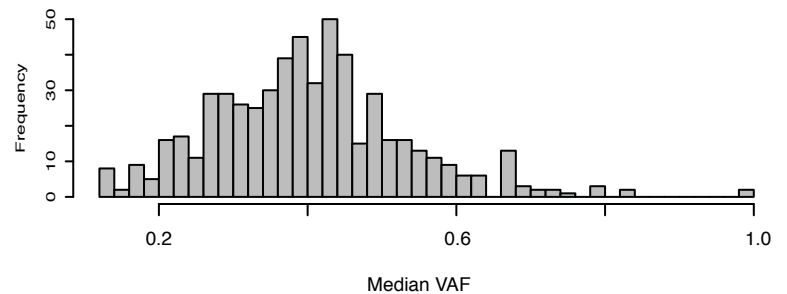


**a****c****b****d**



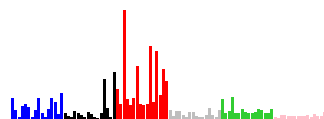
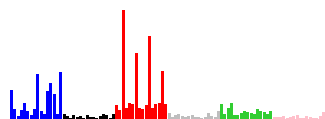
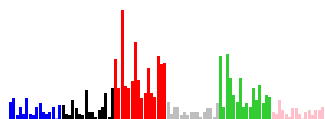
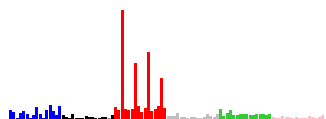
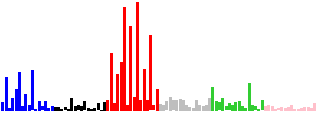
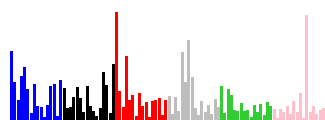
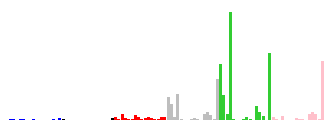
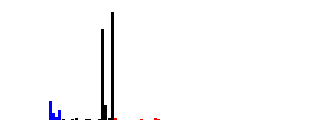
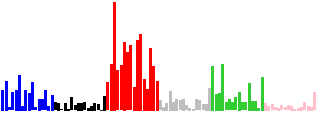
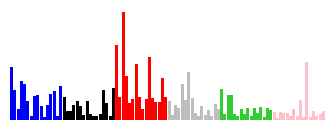
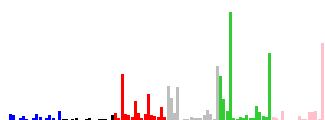
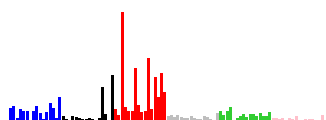
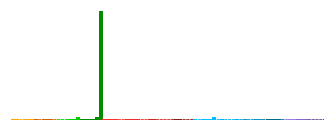
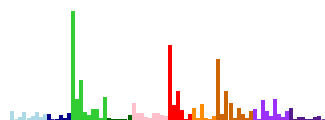
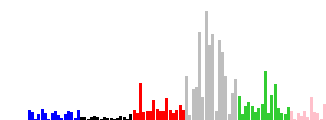
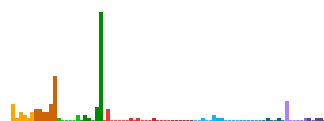
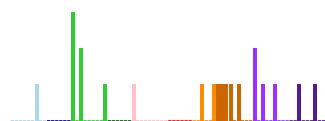
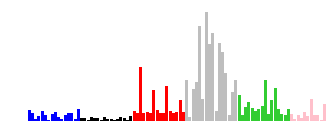
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**b****Median depth WGS crypts****c****Median depth targeted crypts****d****Median VAF WGS crypts****e****Median VAF targeted crypts**

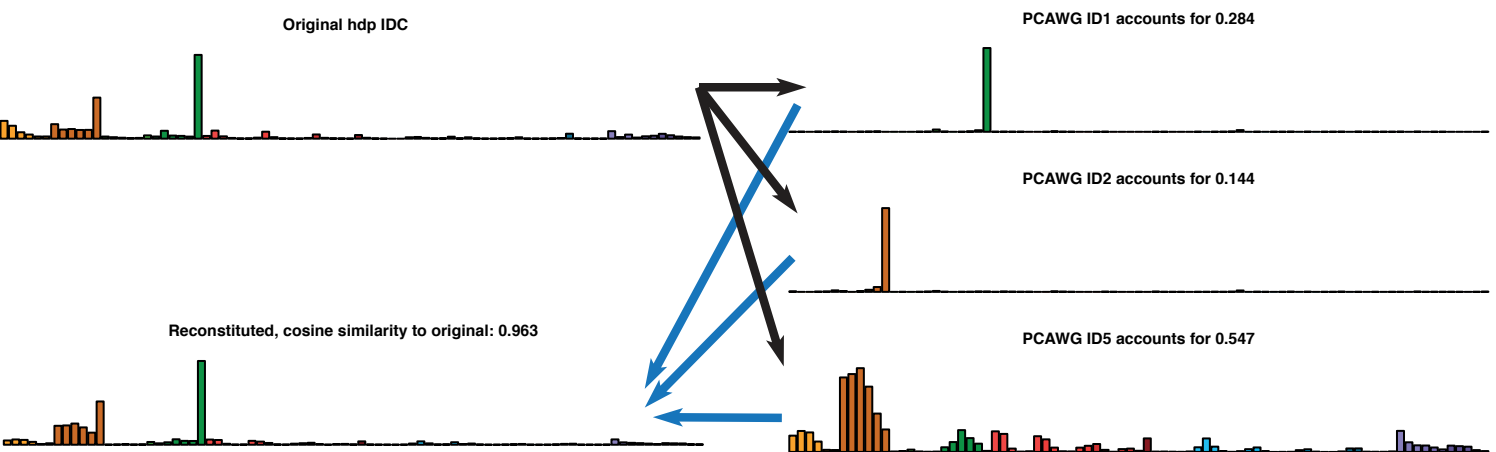
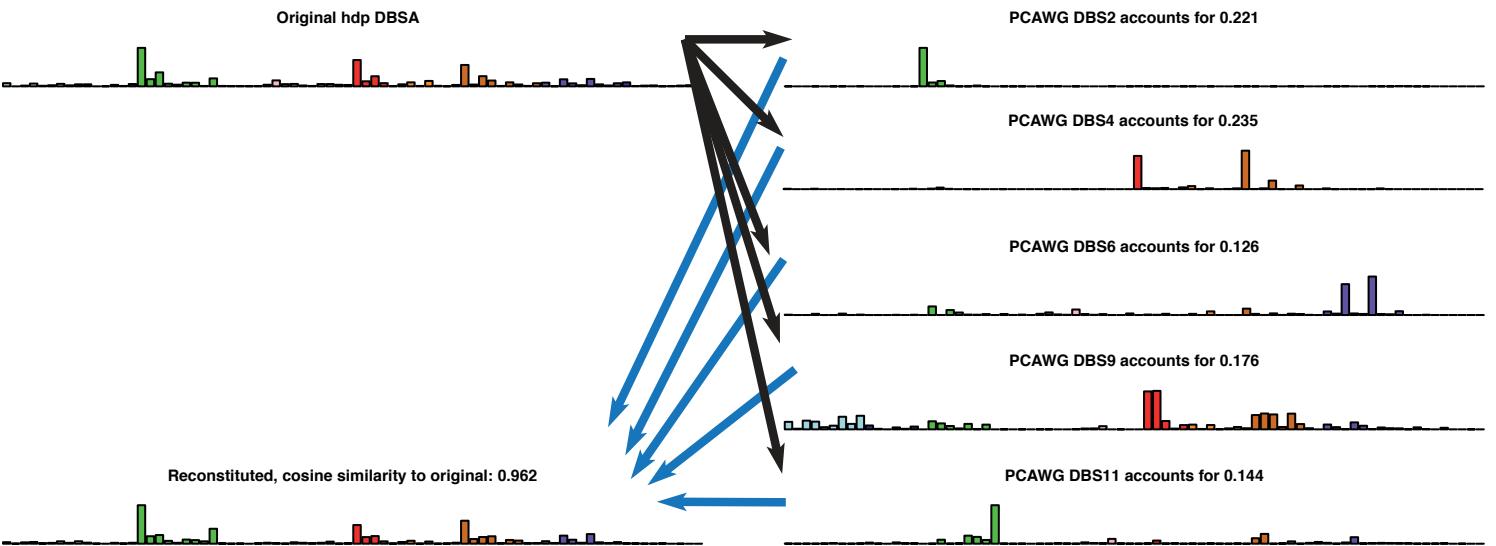
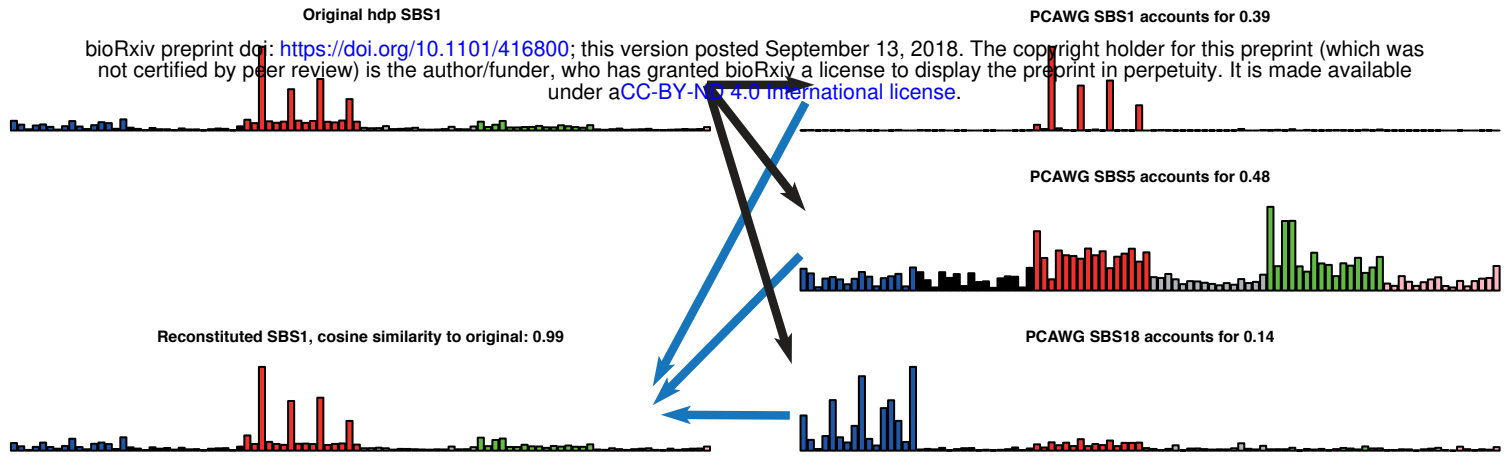
**SBS1****SBS5****SBS18****SBS2**

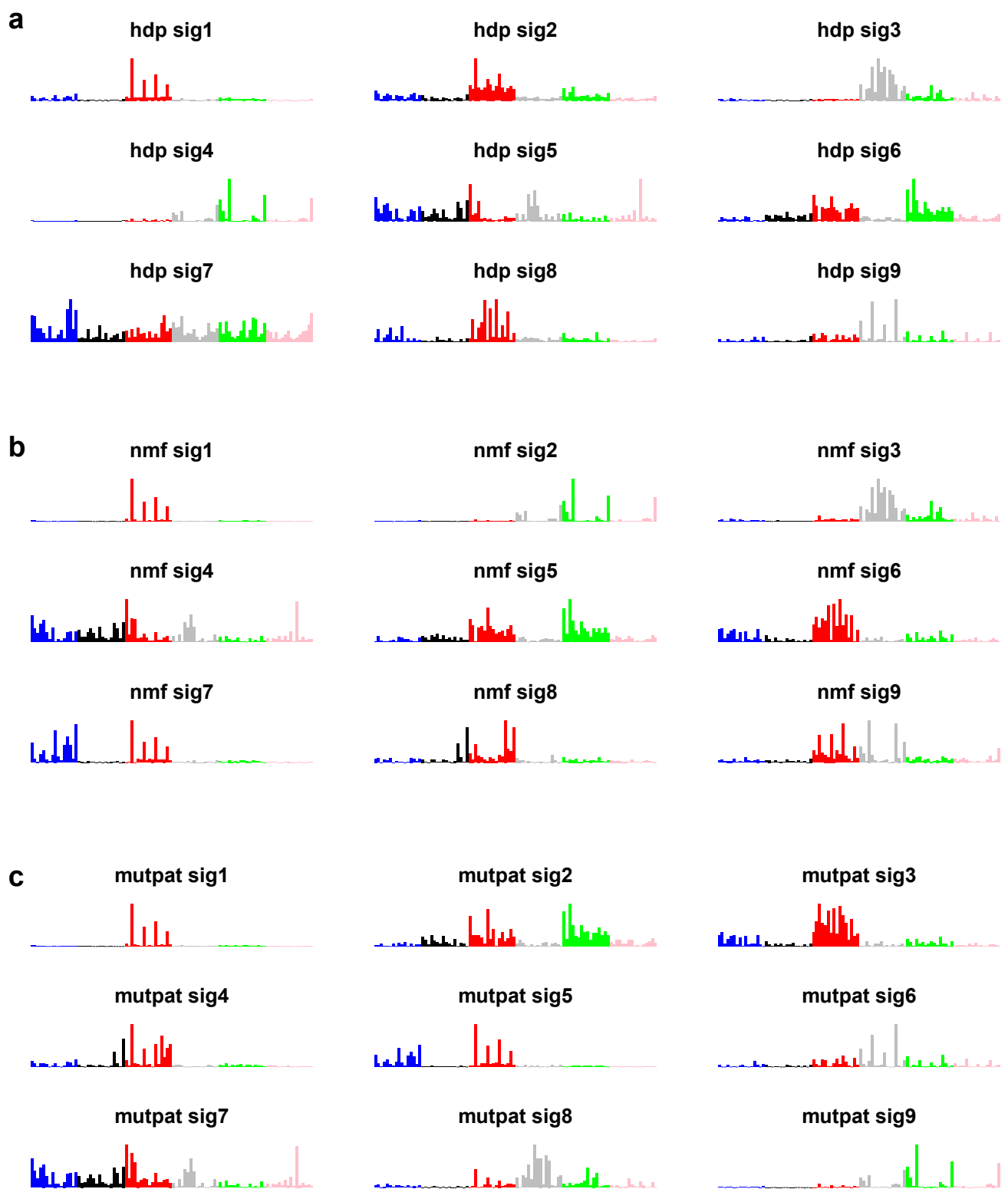
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**Sample rich in SBS1****Sample rich in SBS5****Sample rich in SBS18****Sample rich in SBS2****SBS13****SBSA****SBSB****SBSC****Sample rich in SBS13****Sample rich in SBSA****Sample rich in SBSB****Sample rich in SBSC****SBSD****DBS8****DBSN1****ID1****Sample rich in SBSD****Sample rich in DBS8****Sample rich in DBSN1****Sample rich in ID1****ID2****IDA****IDB****IDC****Sample rich in ID2****Sample rich in IDA****Sample rich in IDB****Sample rich in IDC**

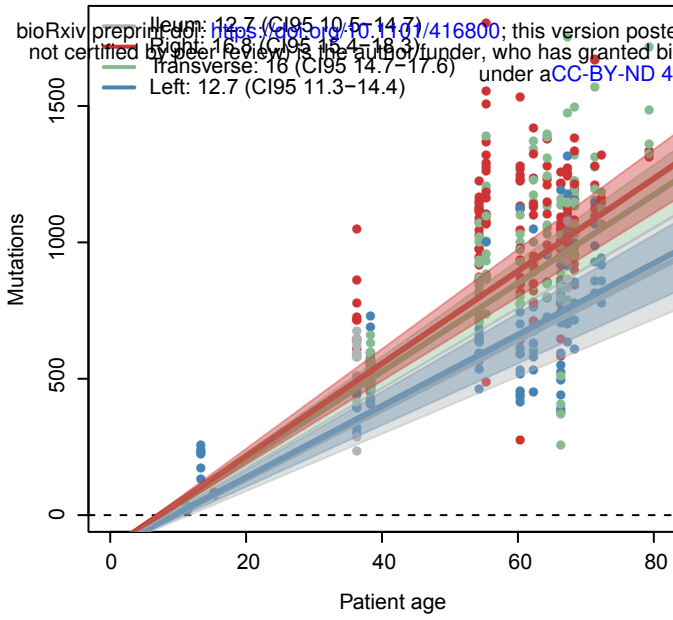


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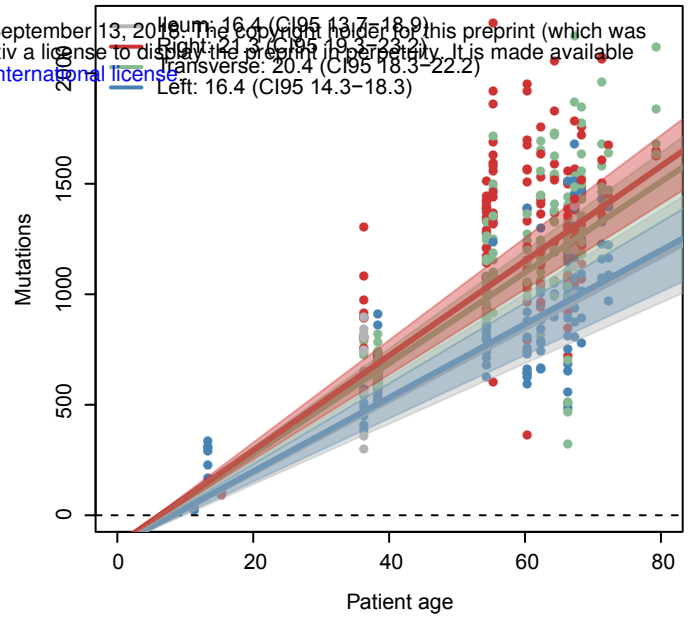




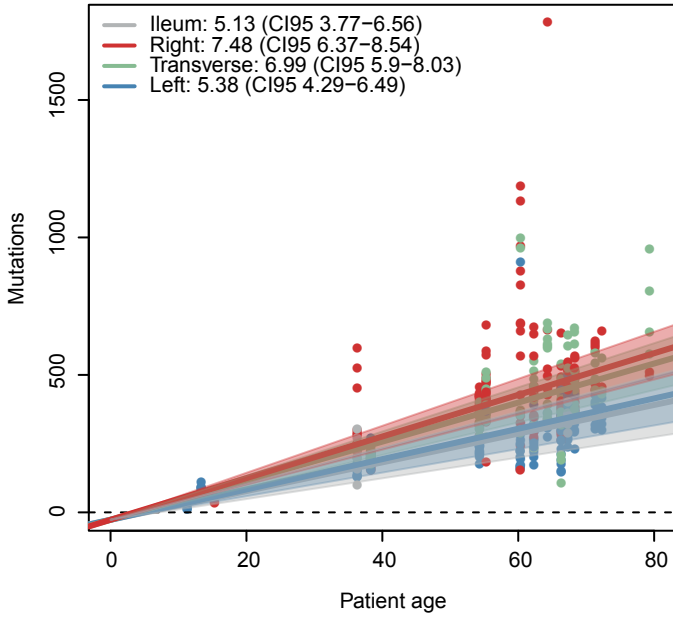
### SBS1



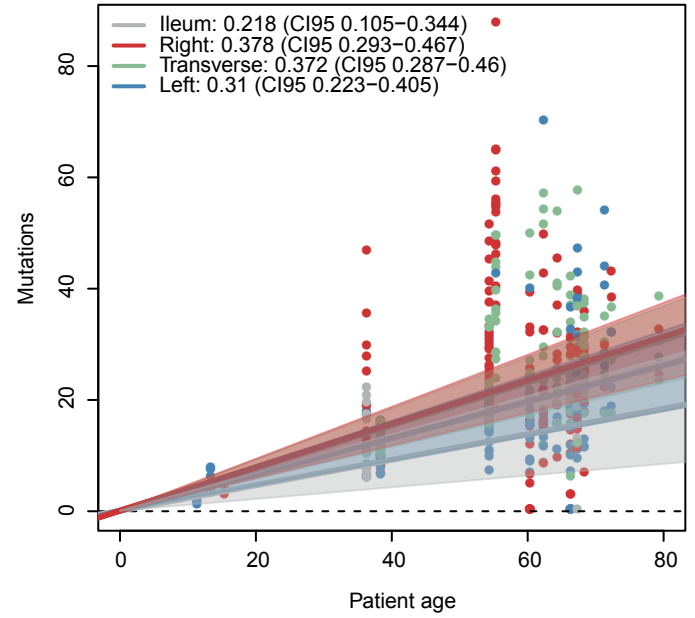
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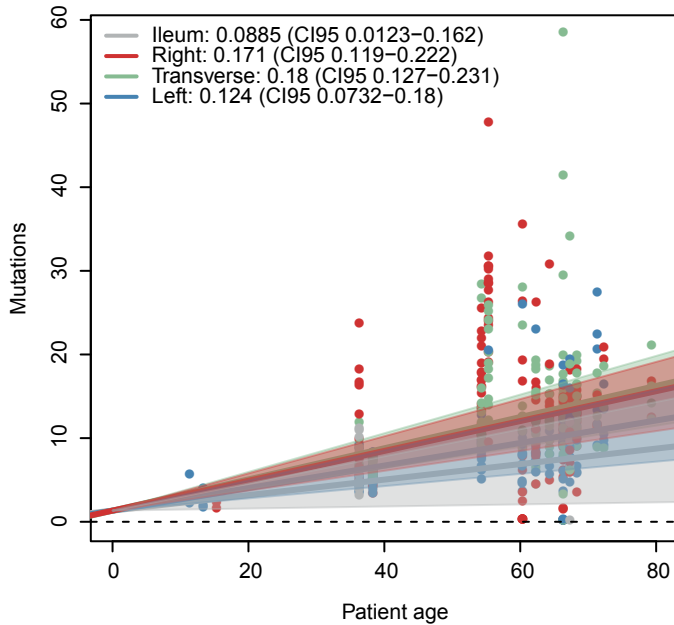
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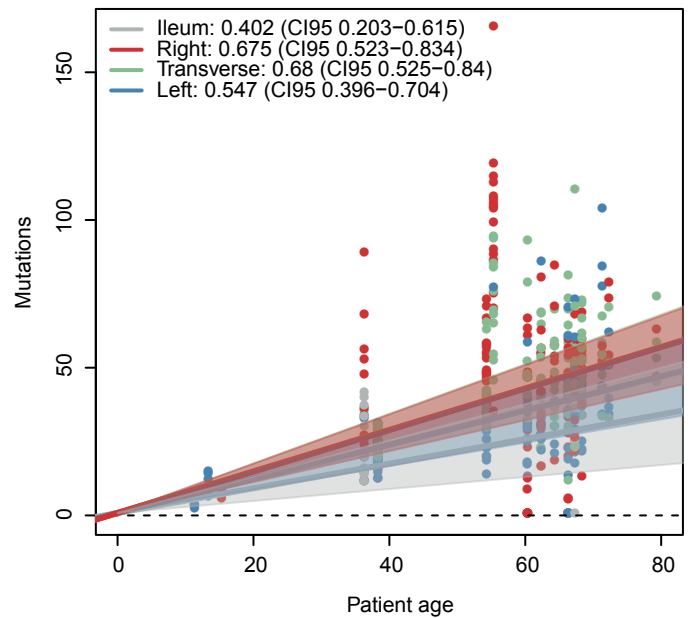
### ID1

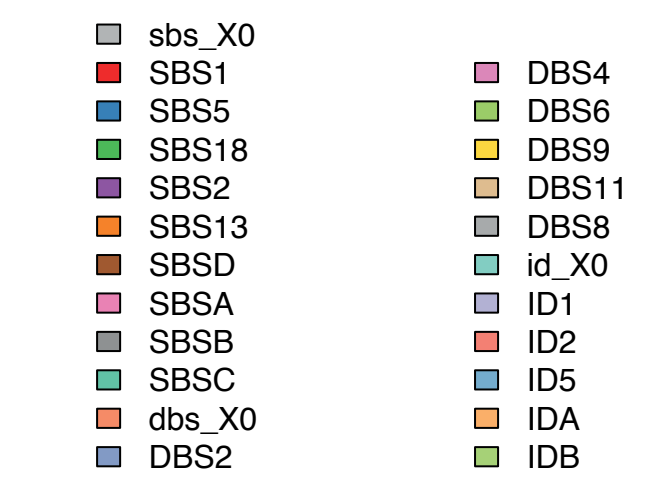
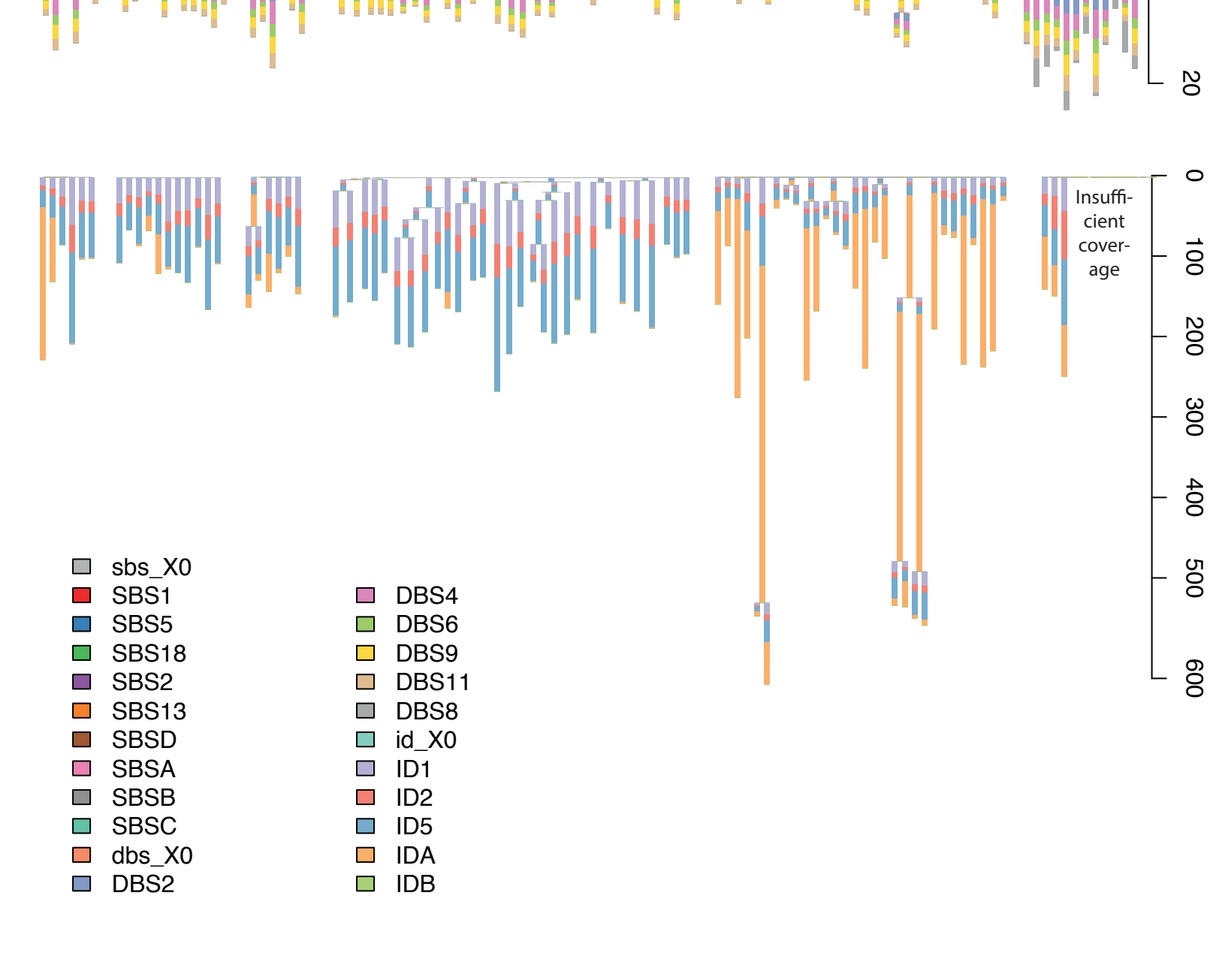
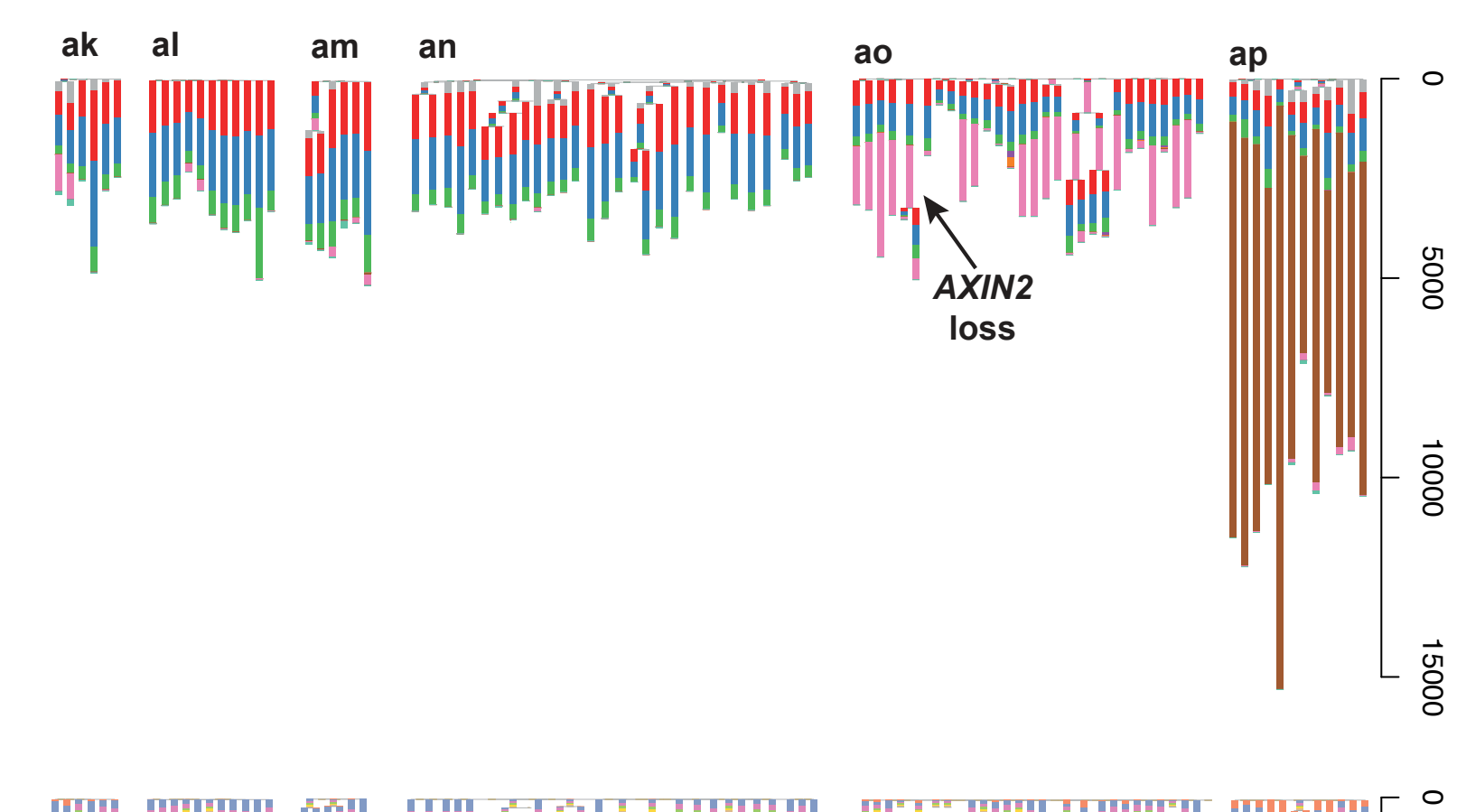
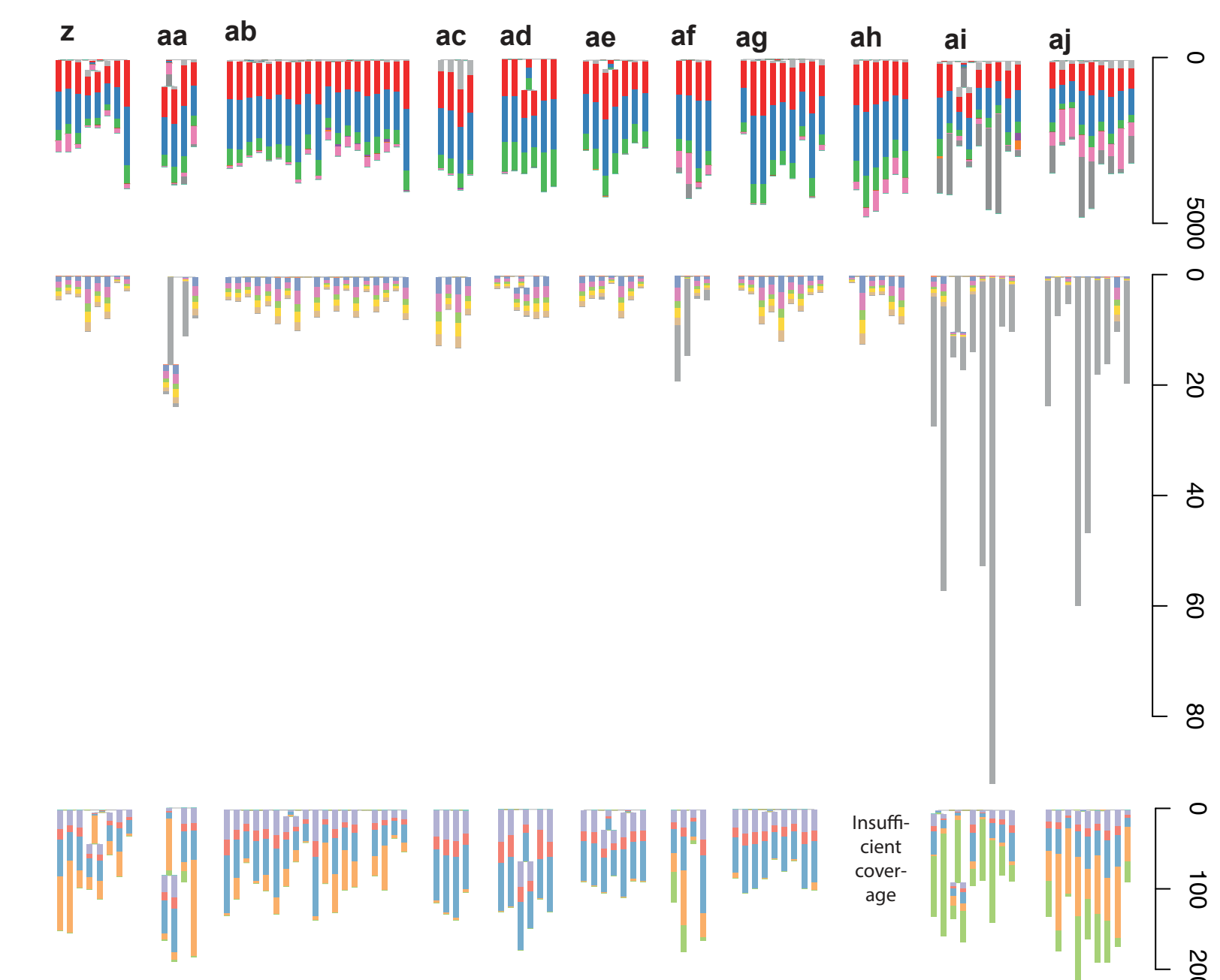
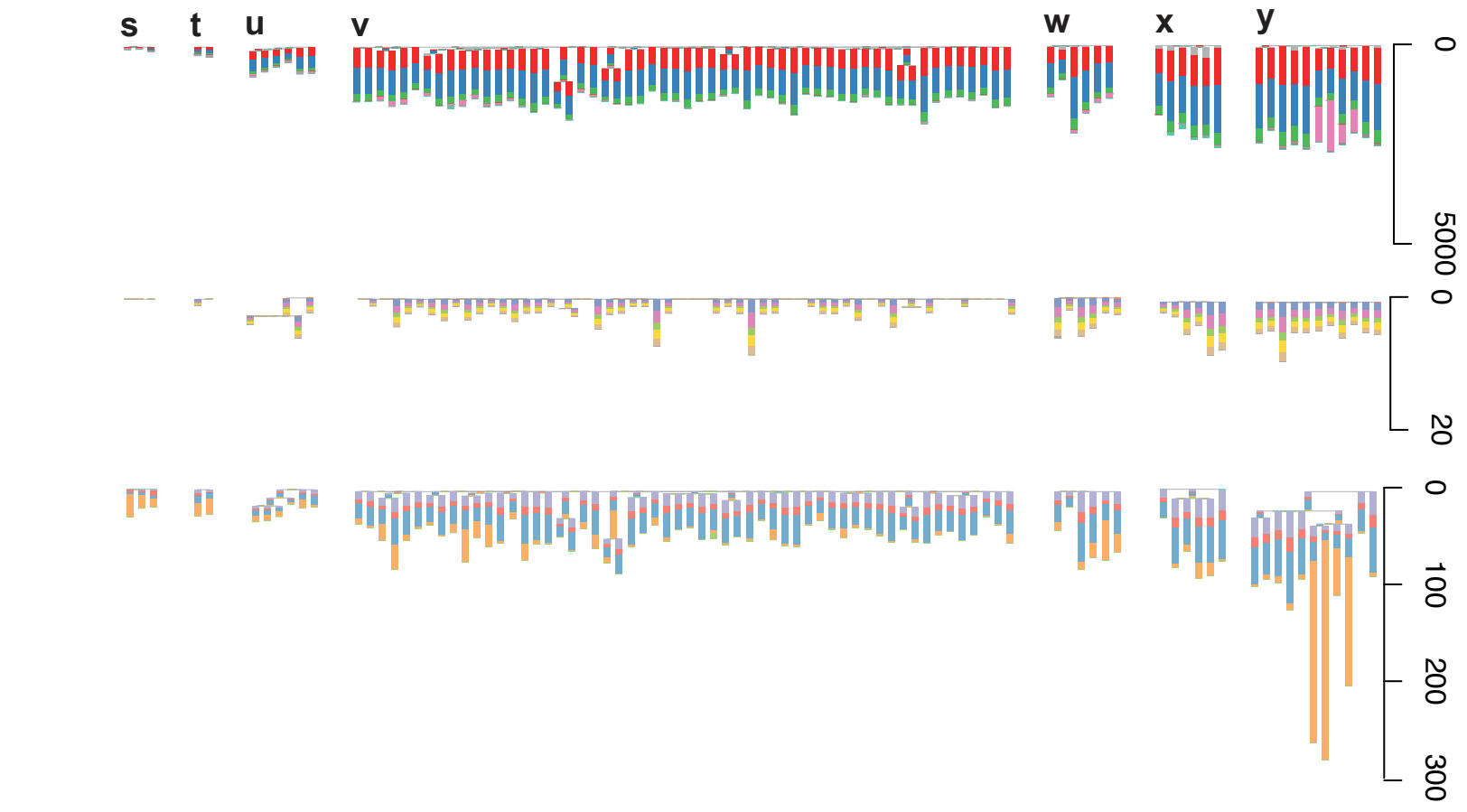
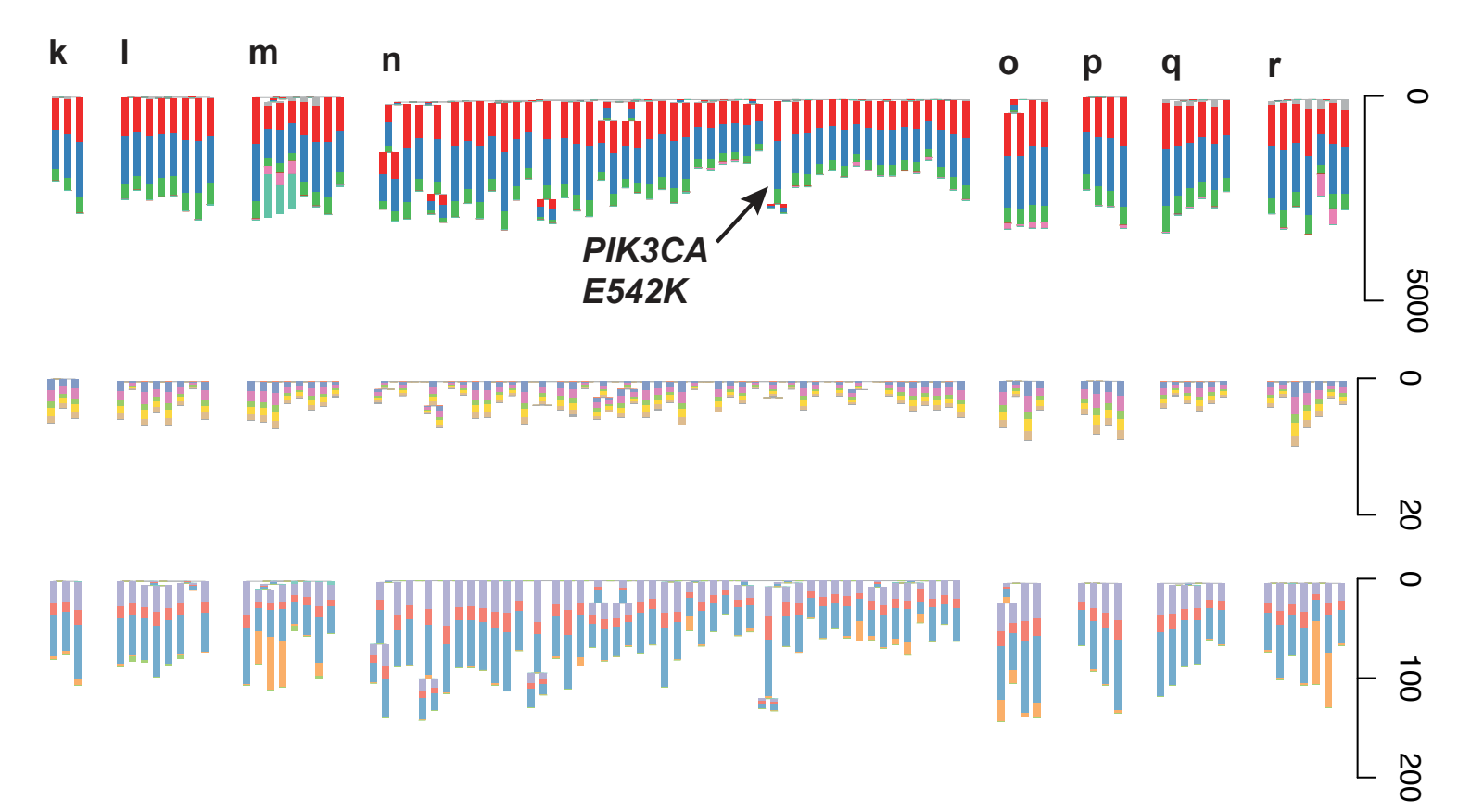
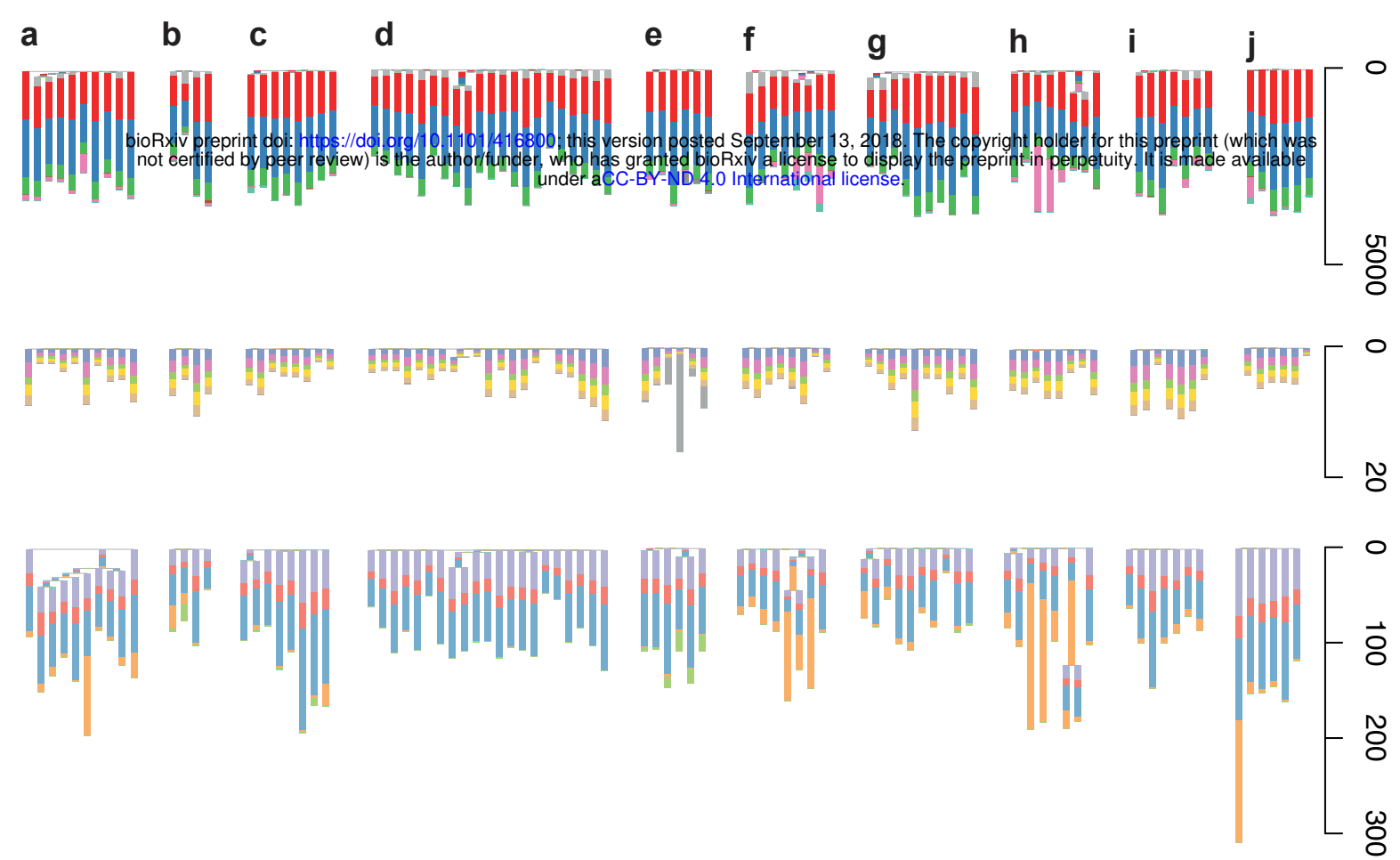


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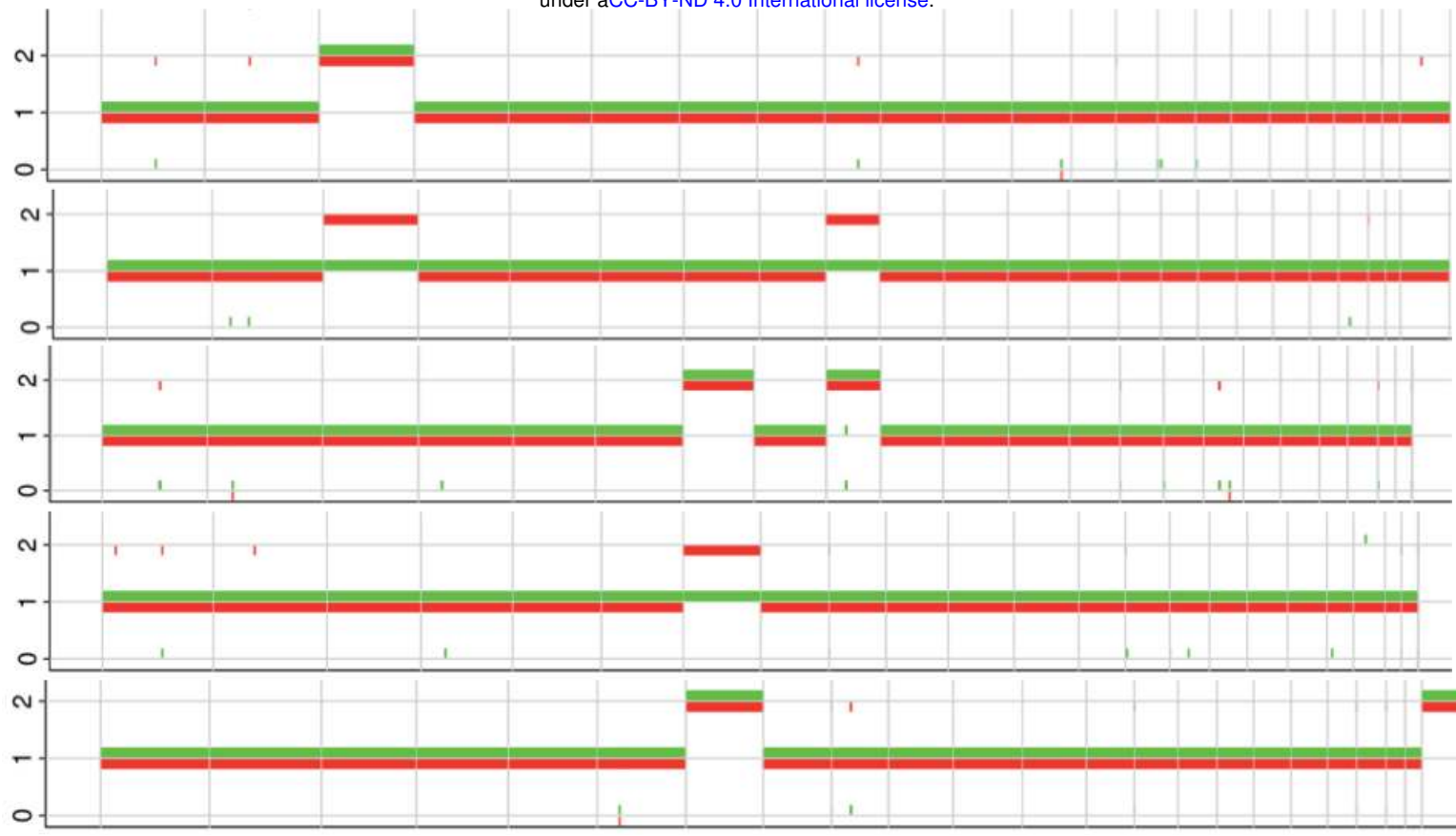
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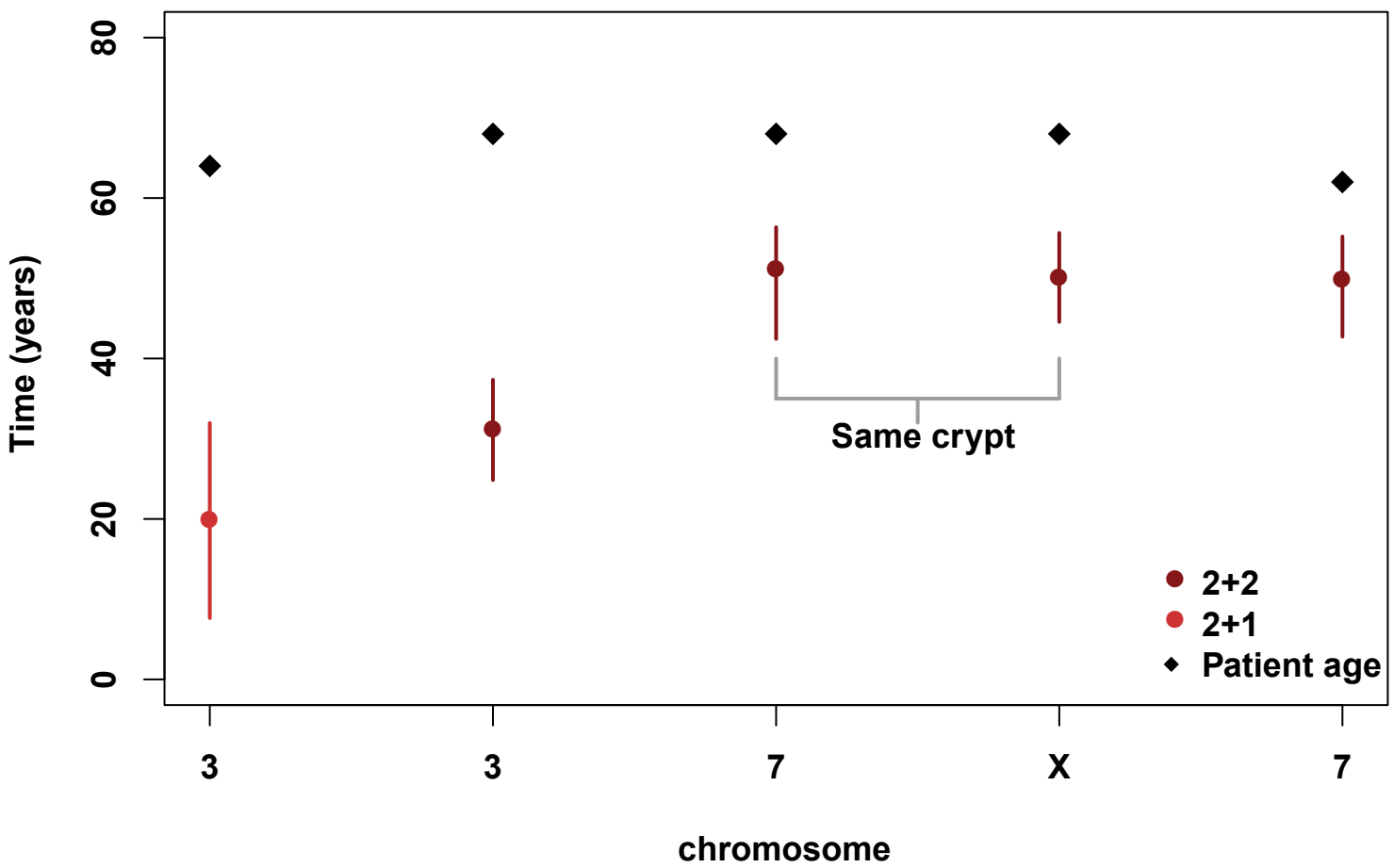
a

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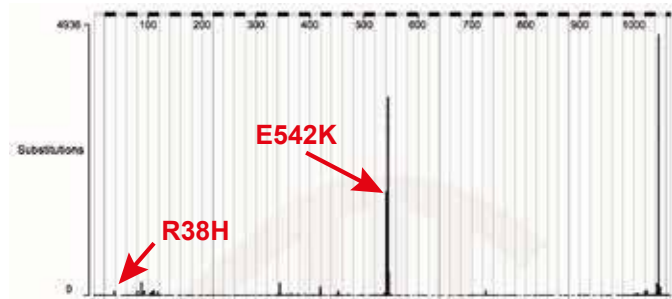
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### Timing of copy number changes

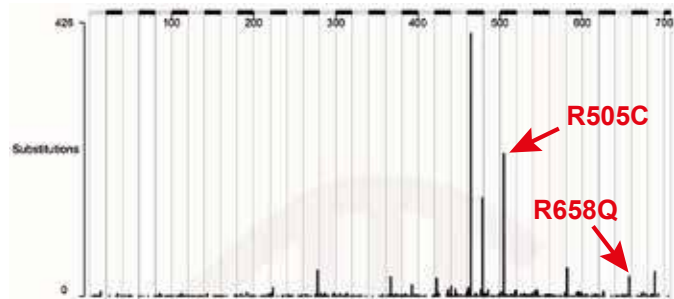




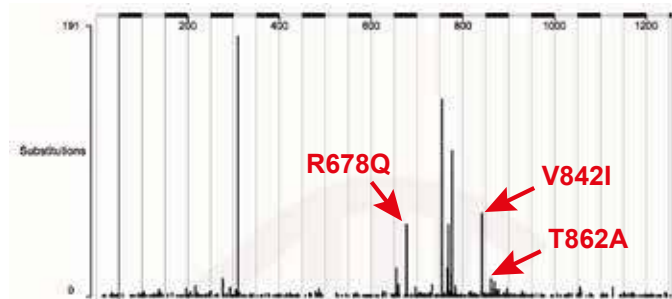
## PIK3CA



## FBXW7



## ERBB2



## ERBB3

