

Comprehensive molecular characterization of human colon and rectal cancer

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To characterize somatic alterations in colorectal carcinoma, we conducted a genome-scale analysis of 276 samples, analysing exome sequence, DNA copy number, promoter methylation and messenger RNA and microRNA expression. A subset of these samples (97) underwent low-depth-of-coverage whole-genome sequencing. In total, 16% of colorectal carcinomas were found to be hypermutated: three-quarters of these had the expected high microsatellite instability, usually with hypermethylation and *MLH1* silencing, and one-quarter had somatic mismatch-repair gene and polymerase ϵ (*POLE*) mutations. Excluding the hypermutated cancers, colon and rectum cancers were found to have considerably similar patterns of genomic alteration. Twenty-four genes were significantly mutated, and in addition to the expected *APC*, *TP53*, *SMAD4*, *PIK3CA* and *KRAS* mutations, we found frequent mutations in *ARID1A*, *SOX9* and *FAM123B*. Recurrent copy-number alterations include potentially drug-targetable amplifications of *ERBB2* and newly discovered amplification of *IGF2*. Recurrent chromosomal translocations include the fusion of *NAV2* and WNT pathway member *TCF7L1*. Integrative analyses suggest new markers for aggressive colorectal carcinoma and an important role for *MYC*-directed transcriptional activation and repression.

The Cancer Genome Atlas project plans to profile genomic changes in 20 different cancer types and has so far published results on two cancer types^{1,2}. We now present results from multidimensional analyses of human colorectal carcinoma (CRC).

CRC is an important contributor to cancer mortality and morbidity. The distinction between the colon and the rectum is largely anatomical, but it has both surgical and radiotherapeutic management implications and it may have an impact on prognosis. Most investigators divide CRC biologically into those with microsatellite instability (MSI; located primarily in the right colon and frequently associated with the CpG island methylator phenotype (CIMP) and hyper-mutation) and those that are microsatellite stable but chromosomally unstable.

A rich history of investigations (for a review see ref. 3) has uncovered several critical genes and pathways important in the initiation and progression of CRC (ref. 3). These include the WNT, RAS–MAPK, PI3K, TGF- β , P53 and DNA mismatch-repair pathways. Large-scale sequencing analyses^{4–6} have identified numerous recurrently mutated genes and a recurrent chromosomal translocation. Despite this background, we have not had a fully integrated view of the genetic and genomic changes and their significance for colorectal tumorigenesis. Further insight into these changes may enable deeper understanding of the pathophysiology of CRC and may identify potential therapeutic targets.

Results

Tumour and normal pairs were analysed by different platforms. The specific numbers of samples analysed by each platform are shown in Supplementary Table 1.

Exome-sequence analysis

To define the mutational spectrum, we performed exome capture DNA sequencing on 224 tumour and normal pairs (all mutations are listed in Supplementary Table 2). Sequencing achieved >20-fold coverage of at least 80% of targeted exons. The somatic mutation rates varied considerably among the samples. Some had mutation rates of

<1 per 10^6 bases, whereas a few had mutation rates of >100 per 10^6 . We separated cases (84%) with a mutation rate of <8.24 per 10^6 (median number of non-silent mutations, 58) and those with mutation rates of >12 per 10^6 (median number of total mutations, 728), which we designated as hypermutated (Fig. 1).

To assess the basis for the considerably different mutation rates, we evaluated MSI⁷ and mutations in the DNA mismatch-repair pathway^{8–10} genes *MLH1*, *MLH3*, *MSH2*, *MSH3*, *MSH6* and *PMS2*. Among the 30 hypermutated tumours with a complete data set, 23 (77%) had high levels of MSI (MSI-H). Included in this group were 19 tumours with *MLH1* methylation, 17 of which had CIMP. By comparison, the remaining seven hypermutated tumours, including the six with the highest mutation rates, lacked MSI-H, CIMP or *MLH1* methylation but usually had somatic mutations in one or more mismatch-repair genes or *POLE* aberrations seen rarely in the non-hypermutated tumours (Fig. 1).

Gene mutations

Overall, we identified 32 somatic recurrently mutated genes (defined by MutSig¹¹ and manual curation) in the hypermutated and non-hypermutated cancers (Fig. 1b). After removal of non-expressed genes, there were 15 and 17 in the hypermutated and non-hypermutated cancers, respectively (Fig. 1b; for a complete list see Supplementary Table 3). Among the non-hypermutated tumours, the eight most frequently mutated genes were *APC*, *TP53*, *KRAS*, *PIK3CA*, *FBXW7*, *SMAD4*, *TCF7L2* and *NRAS*. As expected, the mutated *KRAS* and *NRAS* genes usually had oncogenic codon 12 and 13 or codon 61 mutations, whereas the remaining genes had inactivating mutations. *CTNNB1*, *SMAD2*, *FAM123B* (also known as *WTX*) and *SOX9* were also mutated frequently. *FAM123B* is an X-linked negative regulator of WNT signalling¹², and virtually all of its mutations were loss of function. Mutations in *SOX9*, a gene important for cell differentiation in the intestinal stem cell niche^{13,14}, have not been associated previously with human cancer, but all nine mutated alleles in the non-hypermutated CRCs were frameshift or nonsense mutations. Tumour-suppressor

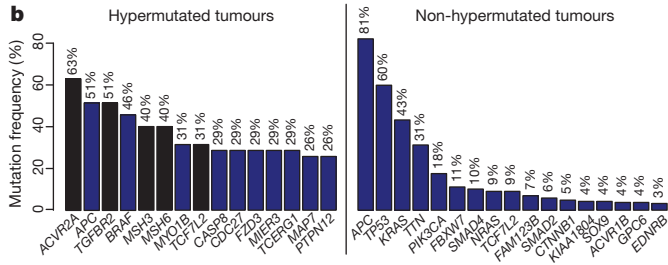
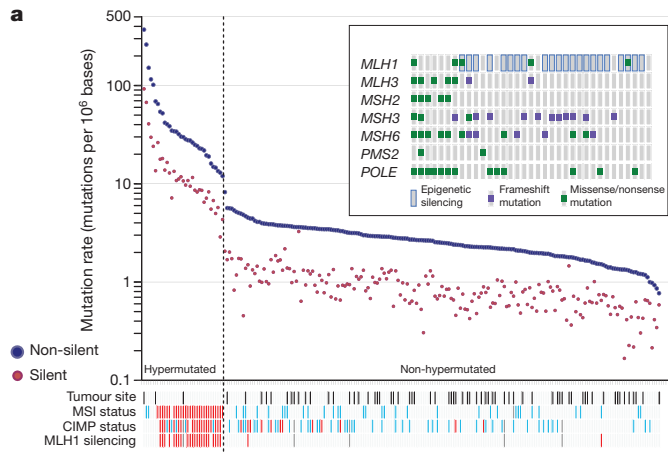


Figure 1 | Mutation frequencies in human CRC. **a**, Mutation frequencies in each of the tumour samples from 224 patients. Note a clear separation of hypermutated and non-hypermutated samples. Red, MSI high, CIMP high or MLH1 silenced; light blue, MSI low, or CIMP low; black, rectum; white, colon; grey, no data. Inset, mutations in mismatch-repair genes and *POLE* among the hypermutated samples. The order of the samples is the same as in the main graph. **b**, Significantly mutated genes in hypermutated and non-hypermutated tumours. Blue bars represent genes identified by the MutSig algorithm and black bars represent genes identified by manual examination of sequence data.

genes *ATM* and *ARID1A* also had a disproportionately high number of frameshift or nonsense mutations. *ARID1A* mutations have recently been reported in CRC and many other cancers^{15,16}.

In the hypermutated tumours, *ACVR2A*, *APC*, *TGFBR2*, *MSH3*, *MSH6*, *SLC9A9* and *TCF7L2* were frequent targets of mutation (Fig. 1b), along with mostly *BRAF(V600E)* mutations. However, two genes that were frequently mutated in the non-hypermutated

tumours were significantly less frequently mutated in hypermutated tumours: *TP53* (60 versus 20%, $P < 0.0001$) and *APC* (81% versus 51%, $P = 0.0023$; both Fisher's exact test). Other genes, including *TGFBR2*, were mutated recurrently in the hypermutated cancers, but not in the non-hypermutated samples. These findings indicate that hypermutated and non-hypermutated tumours progress through different sequences of genetic events.

As expected, hypermutated tumours with MLH1 silencing and MSI-H showed additional differences in the mutational profile. When we specifically examined 28 genes with long mononucleotide repeats in their coding sequences, we found that the rate of frameshift mutation was 3.6-fold higher than the rate of such mutations in hypermutated tumours without MLH1 silencing and 50-fold higher than that in non-hypermutated tumours (Supplementary Table 2).

Mutation rate and methylation patterns

As mentioned above, patients with colon and rectal tumours are managed differently¹⁷, and epidemiology also highlights differences between the two¹⁷. An initial integrative analysis of MSI status, somatic copy-number alterations (SCNAs), CIMP status and gene-expression profiles of 132 colonic and 62 rectal tumours enabled us to examine possible biological differences between tumours in the two locations. Among the non-hypermutated tumours, however, the overall patterns of changes in copy number, CIMP, mRNA and miRNA were indistinguishable between colon and rectal carcinomas (Fig. 2). On the basis of this result, we merged the two for all subsequent analyses.

Unsupervised clustering of the promoter DNA methylation profiles of 236 colorectal tumours identified four subgroups (Supplementary Fig. 1 and Supplementary Methods). Two of the clusters contained tumours with elevated rates of methylation and were classified as CIMP high and CIMP low, as previously described¹⁸. The two non-CIMP clusters were predominantly from tumours that were non-hypermutated and derived from different anatomic locations. mRNA expression profiles separated the colorectal tumours into three distinct clusters (Supplementary Fig. 2). One significantly overlapped with CIMP-high tumours ($P = 3 \times 10^{-12}$) and was enriched with hypermutated tumours, and the other two clusters did not correspond with any group in the methylation data. Analysis of miRNA expression by unsupervised clustering (Supplementary Fig. 3) identified no clear distinctions between rectal cancers and non-hypermutated colon cancers.

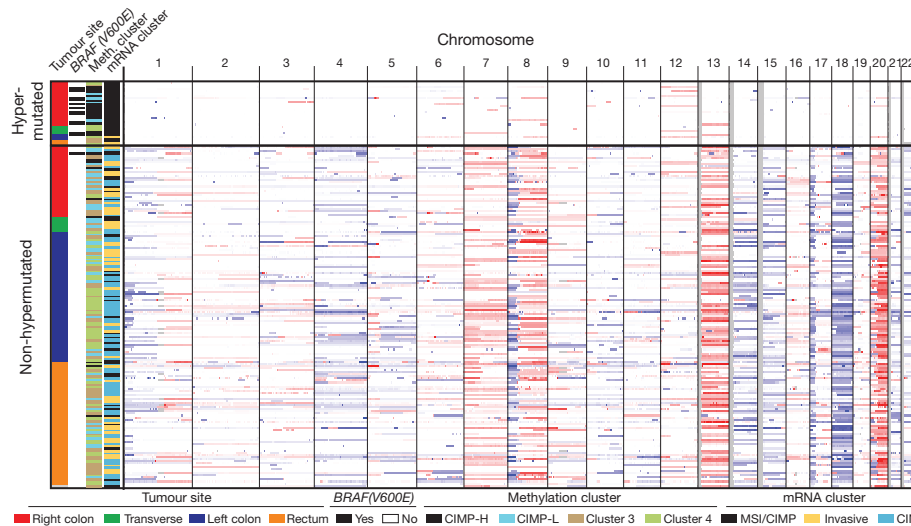


Figure 2 | Integrative analysis of genomic changes in 195 CRCs. Hypermutated tumours have near-diploid genomes and are highly enriched for hypermethylation, CIMP expression phenotype and *BRAF(V600E)* mutations. Non-hypermutated tumours originating from different sites are virtually

indistinguishable from each other on the basis of their copy-number alteration patterns, DNA methylation or gene-expression patterns. Copy-number changes of the 22 autosomes are shown in shades of red for copy-number gains and shades of blue for copy-number losses.

Chromosomal and sub-chromosomal changes

In total, 257 tumours were profiled for SCNAs with Affymetrix SNP 6.0 arrays. Of these tumours, 97 were also analysed by low-depth-of-coverage (low-pass) whole-genome sequencing. As expected, the hypermutated tumours had far fewer SCNAs (Fig. 2). No difference was found between microsatellite-stable and -unstable hypermutated tumours (Supplementary Fig. 4). We used the GISTIC algorithm¹⁹ to identify probable gene targets of focal alterations. There were several previously well-defined arm-level changes, including gains of 1q, 7p and q, 8p and q, 12q, 13q, 19q, and 20p and q (ref. 6). (Supplementary Fig. 4 and Supplementary Table 4). Significantly deleted chromosome arms were 18p and q (including *SMAD4*) in 66% of the tumours and 17p and q (including *TP53*) in 56%. Other significantly deleted chromosome arms were 1p, 4q, 5q, 8p, 14q, 15q, 20p and 22q.

We identified 28 recurrent deletion peaks (Supplementary Fig. 4 and Supplementary Table 4), including the genes *FHIT*, *RFXO1* and *WWOX* with large genomic footprints located in potentially fragile sites of the genome, in near-diploid hypermutated tumours. Other focal deletions involved tumour-suppressor genes such as *SMAD4*, *APC*, *PTEN* and *SMAD3*. A significant focal deletion of 10p25.2 spanned four genes, including *TCF7L2*, which was also frequently mutated in our data set. A gene fusion between adjacent genes *VTT1A* and *TCF7L2* through an interstitial deletion was found in 3% of CRCs and is required for survival of CRC cells bearing the translocation⁴.

There were 17 regions of significant focal amplification (Supplementary Table 4). Some of these were superimposed on broad gains of chromosome arms, and included a peak at 13q12.13 near the peptidase-coding gene *USP12* and at ~500 kb distal to the CRC

candidate oncogene *CDK8*; an adjacent peak at 13q12; a peak containing *KLF5* at 13q22.1; and a peak at 20q13.12 adjacent to *HNF4A*. Peaks on chromosome 8 included 8p12 (which contains the histone methyl-transferase-coding gene *WHSC1L1*, adjacent to *FGFR1*) and 8q24 (which contains *MYC*). An amplicon at 17q21.1, found in 4% of the tumours, contains seven genes, including the tyrosine kinase *ERBB2*. *ERBB2* amplifications have been described in colon, breast and gastro-oesophageal tumours, and breast and gastric cancers bearing these amplifications have been treated effectively with the anti-*ERBB2* antibody trastuzumab^{20–22}.

One of the most common focal amplifications, found in 7% of the tumours, is the gain of a 100–150-kb region of the chromosome arm 11p15.5. It contains genes encoding insulin (*INS*), insulin-like growth factor 2 (*IGF2*) and tyrosine hydroxylase (*TH*), as well as *miR-483*, which is embedded within *IGF2* (Fig. 3a). We found elevated expression of *IGF2* and *miR-483* but not of *INS* and *TH* (Fig. 3b, c). Immediately adjacent to the amplified region is *ASCL2*, a transcription factor active in specifying intestinal stem-cell fate²³. Although *ASCL2* has been implicated as a target of amplification in CRC^{23–25}, it was consistently outside the region of amplification and its expression was not correlated with copy-number changes. These observations suggest that *IGF2* and *miR-483* are candidate functional targets of 11p15.5 amplification. *IGF2* overexpression through loss of imprinting has been implicated in the promotion of CRC^{26, 27}. *miR-483* may also have a role in CRC pathogenesis²⁸.

A subset of tumours without *IGF2* amplification (15%) also had considerably higher levels of *IGF2* gene expression (as much as a 100-fold increase), an effect not attributable to methylation changes at the *IGF2* promoter. To assess the context of *IGF2* amplification/

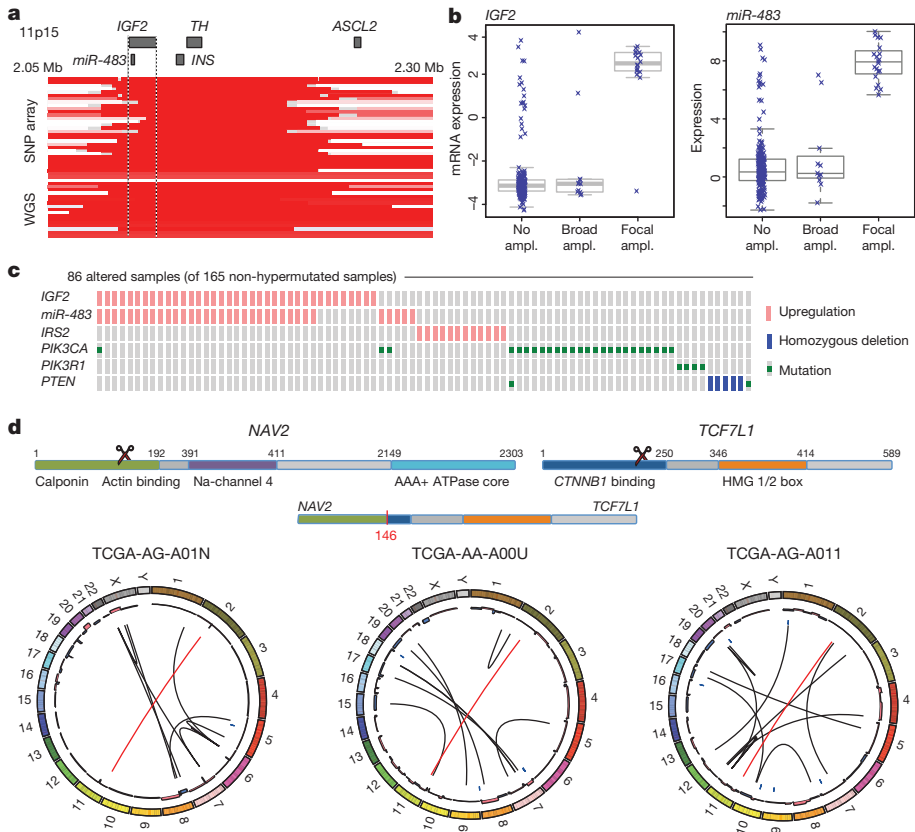


Figure 3 | Copy-number changes and structural aberrations in CRC.

a, Focal amplification of 11p15.5. Segmented DNA copy-number data from single-nucleotide polymorphism (SNP) arrays and low-pass whole-genome sequencing (WGS) are shown. Each row represents a patient; amplified regions are shown in red. **b**, Correlation of expression levels with copy-number changes for *IGF2* and *miR-483*. **c**, *IGF2* amplification and overexpression are mutually

exclusive of alterations in PI3K signalling-related genes. **d**, Recurrent *NAV2*–*TCF7L2* fusions. The structure of the two genes, locations of the breakpoints leading to the translocation and circular representations of all rearrangements in tumours with a fusion are shown. Red line lines represent the *NAV2*–*TCF7L2* fusions and black lines represent other rearrangements. The inner ring represents copy-number changes (blue denotes loss, pink denotes gain).

overexpression, we systematically searched for mutually exclusive genomic events using the MEMo method²⁹. We found a pattern of near exclusivity (corrected $P < 0.01$) of *IGF2* overexpression with genomic events known to activate the PI3K pathway (mutations of *PIK3CA* and *PIK3R1* or deletion/mutation of *PTEN*; Fig. 3c and Supplementary Table 5). The *IRS2* gene, encoding a protein linking IGF1R (the receptor for IGF2) with PI3K, is on chromosome 13, which is frequently gained in CRC. The cases with the highest *IRS2* expression were mutually exclusive of the cases with *IGF2* overexpression ($P = 0.04$) and also lacked mutations in the PI3K pathway ($P = 0.0001$; Fig. 3c). These results strongly suggest that the IGF2–IGF1R–IRS2 axis signals to PI3K in CRC and imply that therapeutic targeting of the pathway could act to block PI3K activity in this subset of patients.

Translocations

To identify new chromosomal translocations, we performed low-pass, paired-end, whole-genome sequencing on 97 tumours with matched normal samples. In each case we achieved sequence coverage of ~3–4-fold and a corresponding physical coverage of 7.5–10-fold. Despite the low genome coverage, we detected 250 candidate interchromosomal translocation events (range, 0–10 per tumour). Among these events, 212 had one or both breakpoints in an intergenic region, whereas the remaining 38 juxtaposed coding regions of two genes in putative fusion events, of which 18 were predicted to code for in-frame events (Supplementary Table 6). We found three separate cases in which the first two exons of the *NAV2* gene on chromosome 11 are joined with the 3' coding portion of *TCF7L1* on chromosome 2 (Supplementary Fig. 5). *TCF7L1* encodes TCF3, a member of the TCF/LEF class of transcription factors that heterodimerize with nuclear β -catenin to enable β -catenin-mediated transcriptional regulation. Intriguingly, in all three cases, the predicted structure of the *NAV2*–*TCF7L1* fusion protein lacks the TCF3 β -catenin-binding domain. This translocation is similar to another recurrent translocation identified in CRC, a fusion in which the amino terminus of *VTI1A* is joined to *TCF4*, which is encoded by *TCF7L2*, a homologue of *TCF7L1* that is deleted or mutated in 12% of non-hypermutated tumours⁴. We also observed 21 cases of translocation involving *TTC28* located on chromosome 22 (Supplementary Table 6). In all

cases the fusions predict inactivation of *TTC28*, which has been identified as a target of P53 and an inhibitor of tumour cell growth³⁰. Eleven of the 19 (58%) gene–gene translocations were validated by obtaining PCR products or, in some cases, sequencing the junction fragments (Supplementary Fig. 5).

Altered pathways in CRC

Integrated analysis of mutations, copy number and mRNA expression changes in 195 tumours with complete data enriched our understanding of how some well-defined pathways are deregulated. We grouped samples by hypermutation status and identified recurrent alterations in the WNT, MAPK, PI3K, TGF- β and p53 pathways (Fig. 4, Supplementary Fig. 6 and Supplementary Table 1).

We found that the WNT signalling pathway was altered in 93% of all tumours, including biallelic inactivation of *APC* (Supplementary Table 7) or activating mutations of *CTNNB1* in ~80% of cases. There were also mutations in *SOX9* and mutations and deletions in *TCF7L2*, as well as the DKK family members and *AXIN2*, *FBXW7* (Supplementary Fig. 7), *ARID1A* and *FAM123B* (the latter is a negative regulator of WNT– β -catenin signalling¹² found mutated in Wilms' tumour³¹). A few mutations in *FAM123B* have previously been described in CRC³². *SOX9* has been suggested to have a role in cancer, but no mutations have previously been described. The WNT receptor frizzled (*FZD10*) was overexpressed in ~17% of samples, in some instances at levels of 100 \times normal. Altogether, we found 16 different altered WNT pathway genes, confirming the importance of this pathway in CRC. Interestingly, many of these alterations were found in tumours that harbour *APC* mutations, suggesting that multiple lesions affecting the WNT signalling pathway confer selective advantage.

Genetic alterations in the PI3K and RAS–MAPK pathways are common in CRC. In addition to *IGF2* and *IRS2* overexpression, we found mutually exclusive mutations in *PIK3R1* and *PIK3CA* as well as deletions in *PTEN* in 2%, 15% and 4% of non-hypermutated tumours, respectively. We found that 55% of non-hypermutated tumours have alterations in *KRAS*, *NRAS* or *BRAF*, with a significant pattern of mutual exclusivity (Supplementary Fig. 6 and Supplementary Table 1). We also evaluated mutations in the erythroblastic leukemia viral oncogene homolog (ERBB) family of receptors because of the translational relevance of such mutations. Mutations or amplifications in

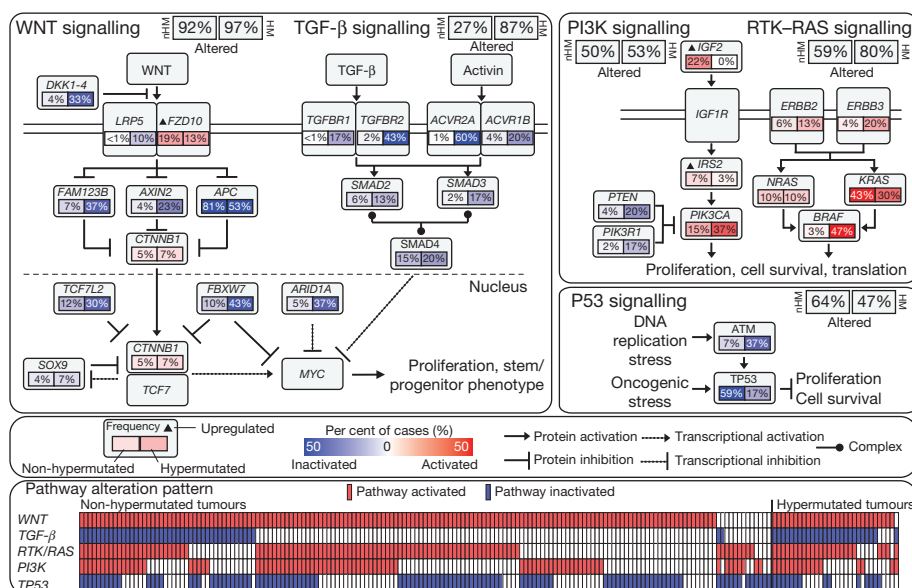


Figure 4 | Diversity and frequency of genetic changes leading to deregulation of signalling pathways in CRC. Non-hypermutated (nHM; $n = 165$) and hypermutated (HM; $n = 30$) samples with complete data were analysed separately. Alterations are defined by somatic mutations, homozygous deletions, high-level focal amplifications, and, in some cases, by significant

up- or downregulation of gene expression (*IGF2*, *FZD10*, *SMAD4*). Alteration frequencies are expressed as a percentage of all cases. Red denotes activated genes and blue denotes inactivated genes. Bottom panel shows for each sample if at least one gene in each of the five pathways described in this figure is altered.

one of the four ERBB family genes are present in 165 (13%) non-hypermuted and 16 out of 30 (53%) hypermuted cases. Some of the mutations are listed in the COSMIC database³³, suggesting a functional role. Intriguingly, recurrent *ERBB2(V842I)* and *ERBB3(V104M)* mutations were found in four and two non-hypermuted cases, respectively. Mutations and focal amplifications of *ERBB2* (Supplementary Fig. 6) should be evaluated as predictors of response to agents that target those receptors. We observed co-occurrence of alterations involving the RAS and PI3K pathways in one-third of tumours (Fig. 4; $P = 0.039$, Fisher's exact test). These results indicate that simultaneous inhibition of the RAS and PI3K pathways may be required to achieve therapeutic benefit.

The TGF- β signalling pathway is known to be deregulated in CRC and other cancers³⁴. We found genomic alterations in *TGFBRI*, *TGFBRI2*, *ACVR2A*, *ACVR1B*, *SMAD2*, *SMAD3* and *SMAD4* in 27% of the non-hypermuted and 87% of the hypermuted tumours. We also evaluated the p53 pathway, finding alterations in *TP53* in 59% of non-hypermuted cases (mostly biallelic; Supplementary Table 8) and alterations in *ATM*, a kinase that phosphorylates and activates P53 after DNA damage, in 7%. Alterations in these two genes showed a trend towards mutual exclusivity ($P = 0.016$) (Fig. 4, Supplementary Fig. 6 and Supplementary Table 1).

We integrated copy number, gene expression, methylation and pathway data using the PARADIGM software platform³⁵. The analysis showed a number of new characteristics of CRC (Fig. 5a). For example, despite the diversity in anatomical origin or mutation levels, nearly 100% of these tumours have changes in *MYC* transcriptional targets, both those promoted by and those inhibited by *MYC*. These findings are consistent with patterns deduced from genetic alterations (Fig. 4) and suggest an important role for *MYC* in CRC. The analysis also identified several gene networks altered across all tumour samples and those with differential alterations in hypermuted versus non-hypermuted samples (Supplementary Table 7, Supplementary Data on the Cancer Genome Atlas publication webpage).

Because most of the tumours used in this study were derived from a prospective collection, survival data are not available. However, the tumours can be classified as aggressive or non-aggressive on the basis

of tumour stage, lymph node status, distant metastasis and vascular invasion at the time of surgery. We found numerous molecular signatures associated with tumour aggressiveness, a subset of which is shown in Fig. 5b. They include specific focal amplifications and deletions, and altered gene-expression levels, including those of *SCN5A* (ref. 36), a reported regulator of colon cancer invasion (see Supplementary Tables 10 and 11 for a full list). Association with tumour aggressiveness is also observed in altered expression of miRNAs and specific somatic mutations (*APC*, *TP53*, *PIK3CA*, *BRAF* and *FBXW7*; Supplementary Fig. 8b). Mutations in *FBXW7* (38 cases) and distant metastasis (32 cases) never co-occurred ($P = 0.0019$). Interestingly, a number of genomic regions have multiple molecular associations with tumour aggressiveness that manifest as clinically related genomic hotspots. Examples of this are the region 20q13.12, which includes a focal amplification and multiple genes correlating with tumour aggression, and the region 22q12.3, containing *APOL6* (ref. 37) (Supplementary Figures 8 and 9).

Discussion

This comprehensive integrative analysis of 224 colorectal tumour and normal pairs provides a number of insights into the biology of CRC and identifies potential therapeutic targets. To identify possible biological differences in colon and rectum tumours, we found, in the non-hypermuted tumours irrespective of their anatomical origin, the same type of copy number, expression profile, DNA methylation and miRNA changes. Over 94% had a mutation in one or more members of the WNT signalling pathway, predominantly in *APC*. However, there were some differences between tumours from the right colon and all other sites. Hypermethylation was more common in the right colon, and three-quarters of hypermuted samples came from the same site, although not all of them had MSI (Fig. 2). Why most of the hypermuted samples came from the right colon and why there are two classes of tumours at this site is not known. The origins of the colon from embryonic midgut and hindgut may provide an explanation. As the survival rate of patients with high MSI-related cancers is better and these cancers are hypermuted, mutation rate may be a better prognostic indicator.

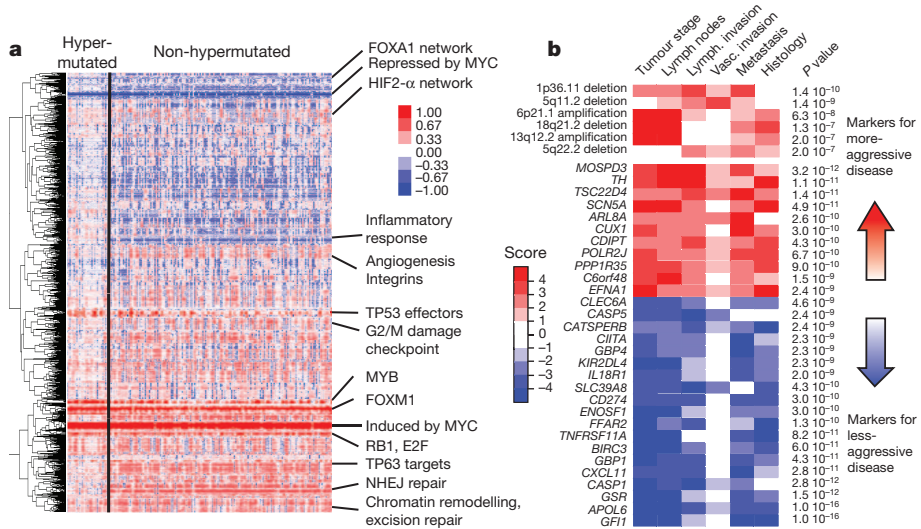


Figure 5 | Integrative analyses of multiple data sets. **a**, Clustering of genes and pathways affected in colon and rectum tumours deduced by PARADIGM analysis. Blue denotes under-expressed relative to normal and red denotes overexpressed relative to normal. Some of the pathways deduced by this method are shown on the right. NHEJ, non-homologous end joining. **b**, Gene-expression signatures and SCNAs associated with tumour aggression. Molecular signatures (rows) that show a statistically significant association with tumour aggressiveness according to selected clinical assays (columns) are shown in colour, with red indicating markers of tumour aggressiveness and

blue indicating the markers of less-aggressive tumours. Significance is based on the combined P value from the weighted Fisher's method, corrected for multiple testing. Colour intensity and score is in accordance with the strength of an individual clinical-molecular association, and is proportional to $\log_{10}(P)$, where P is the P value for that association. To limit the vertical extent of the figure, gene-expression signatures are restricted to a combined P value of $P < 10^{-9}$ and SCNAs to $P < 10^{-7}$, and features are shown only if they are also significant in the subset of non-MSI-H samples (the analysis was performed separately on the full data as well as on the MSI-H and non-MSI-H subgroups).

Whole-exome sequencing and integrative analysis of genomic data provided further insights into the pathways that are dysregulated in CRC. We found that 93% of non-hypermethylated and 97% of hypermethylated cases had a deregulated WNT signalling pathway. New findings included recurrent mutations in *FAM123B*, *ARID1A* and *SOX9* and very high levels of overexpression of the WNT ligand receptor gene *FZD10*. To our knowledge, *SOX9* has not previously been described as frequently mutated in any human cancer. *SOX9* is transcriptionally repressed by WNT signalling, and the *SOX9* protein has been shown to facilitate β -catenin degradation³⁸. *ARID1A* is frequently mutated in gynaecological cancers and has been shown to suppress *MYC* transcription³⁹. Activation of WNT signalling and inactivation of the TGF- β signalling pathway are known to result in activation of *MYC*. Our mutational and integrative analyses emphasize the critical role of *MYC* in CRC. We also compared our results with other large-scale analyses⁶ and found many similarities and few differences in mutated genes (Supplementary Table 3).

Our integrated analysis revealed a diverse set of changes in TCF/LEF-encoding genes, suggesting additional roles for TCF/LEF factors in CRC beyond being passive partners for β -catenin.

Our data suggest a number of therapeutic approaches to CRC. Included are WNT-signalling inhibitors and small-molecule β -catenin inhibitors, which are showing initial promise^{40–42}. We find that several proteins in the RTK–RAS and PI3K pathways, including IGF2, IGFR, ERBB2, ERBB3, MEK, AKT and MTOR could be targets for inhibition.

Our analyses show that non-hypermethylated adenocarcinomas of the colon and rectum are not distinguishable at the genomic level. However, tumours from the right/ascending colon were more likely to be hypermethylated and to have elevated mutation rates than were other CRCs. As has been recognized previously, activation of the WNT signalling pathway and inactivation of the TGF- β signalling pathway, resulting in increased activity of *MYC*, are nearly ubiquitous events in CRC. Genomic aberrations frequently target the MAPK and PI3K pathways but less frequently target receptor tyrosine kinases. In conclusion, the data presented here provide a useful resource for understanding this deadly disease and identifying possibilities for treating it in a targeted way.

METHODS SUMMARY

Tumour and normal samples were processed by either of two biospecimen core resources, and aliquots of purified nucleic acids were shipped to the genome characterization and sequencing centres (Supplementary Methods). The biospecimen core resources provided sample sets in several different batches. To assess any batch effects we examined the mRNA expression, miRNA expression and DNA methylation data sets using a combination of cluster analysis, enhanced principal component analysis and analysis of variance (Supplementary Methods). Although some differences among batches were detected, we did not correct them computationally because the differences were generally modest and because some of them may reflect biological phenomena (Supplementary Methods).

We used Affymetrix SNP 6.0 microarrays to detect copy-number alterations. A subset of samples was subjected to low-pass (2–5 \times) whole-genome sequencing (Illumina HiSeq), in part for detection of SCNA and chromosomal translocations^{43,44}. Gene-expression profiles were generated using Agilent microarrays and RNA-Seq. DNA methylation data were obtained using Illumina Infinium (HumanMethylation27) arrays. DNA sequencing of coding regions was performed by exome capture followed by sequencing on the SOLiD or Illumina HiSeq platforms. Details of the analytical methods used are described in Supplementary Methods.

All of the primary sequence files are deposited in dbGap and all other data are deposited at the Data Coordinating Center (DCC) for public access (<http://cancergenome.nih.gov/>). Data matrices and supporting data can be found at http://tcga-data.nci.nih.gov/docs/publications/coadread_2012/. The data can also be explored through the ISB Regulome Explorer (<http://explorer.cancerregulome.org/>), Next Generation Clustered Heat Maps (<http://bioinformatics.mdanderson.org/main/TCGA/Supplements/NGCHM-CRC>) and the cBio Cancer Genomics Portal (<http://cbioportal.org>). Descriptions of the data can be found at <https://wiki.nci.nih.gov/x/j5dXAg> and in Supplementary Methods.

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