The genomic complexity of primary human prostate cancer

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Prostate cancer is the second most common cause of male cancer deaths in the United States. However, the full range of prostate cancer genomic alterations is incompletely characterized. Here we present the complete sequence of seven primary human prostate cancers and their paired normal counterparts. Several tumours contained complex chains of balanced (that is, 'copy-neutral') rearrangements that occurred within or adjacent to known cancer genes. Rearrangement breakpoints were enriched near open chromatin, androgen receptor and ERG DNA binding sites in the setting of the ETS gene fusion *TMPRSS2-ERG*, but inversely correlated with these regions in tumours lacking ETS fusions. This observation suggests a link between chromatin or transcriptional regulation and the genesis of genomic aberrations. Three tumours contained rearrangements that disrupted *CADM2*, and four harboured events disrupting either *PTEN* (unbalanced events), a prostate tumour suppressor, or *MAGI2* (balanced events), a PTEN interacting protein not previously implicated in prostate tumorigenesis. Thus, genomic rearrangements may arise from transcriptional or chromatin aberrancies and engage prostate tumorigenic mechanisms.

Among men in the United States, prostate cancer accounts for more than 200,000 new cancer cases and 32,000 deaths annually¹. Although androgen deprivation therapy yields transient efficacy, most patients with metastatic prostate cancer eventually die of their disease. These aspects underscore the critical need to articulate both genetic underpinnings and novel therapeutic targets in prostate cancer.

Recent years have heralded a marked expansion in our understanding of the somatic genetic basis of prostate cancer. Of considerable importance has been the discovery of recurrent gene fusions that render ETS transcription factors under the control of androgenresponsive or other promoters²⁻⁵. These findings suggest that genomic rearrangements may comprise a major mechanism driving prostate carcinogenesis. Other types of somatic alterations also engage important mechanisms⁶⁻⁸; however, the full spectrum of prostate cancer genomic alterations remains incompletely characterized. Moreover, although the androgen signalling axis represents an important therapeutic focal point^{9,10}, relatively few additional drug targets have yet been elaborated by genetic studies of prostate cancer¹¹. To discover additional genomic alterations that may underpin lethal prostate cancer, we performed paired-end, massively parallel sequencing on tumour and matched normal genomic DNA obtained from seven patients with 'high-risk' primary prostate cancer.

Landscape of genomic alterations

All patients harboured tumours of stage T2c or greater, and Gleason grade 7 or higher. Serum prostate-specific antigen levels ranged from 2.1 to 10.2 ng ml^{-1} (Supplementary Table 1). Three tumours contained chromosomal rearrangements involving the *TMPRSS2* (transmembrane protease, serine 2)–*ERG* (v-ets erythroblastosis virus E26 oncogene homologue (avian)) loci as determined by fluorescence *in situ* hybridization (FISH) and PCR with reverse transcription (RT–PCR)² (Table 1 and Supplementary Table 1). We obtained approximately 30-fold mean sequence coverage for each sample, and reliably detected somatic mutations in more than 80% of the genome (described in Supplementary Information). Circos plots¹² indicating genomic rearrangements and copy number alterations for each prostate cancer genome are shown in Fig. 1.

We identified a median of 3,866 putative somatic base mutations (range 3,192–5,865) per tumour (Supplementary Table 2); the estimated mean mutation frequency was 0.9 per megabase (see Supplementary Methods). This mutation rate is similar to that observed in acute myeloid leukaemia and breast cancer^{13–16} but 7–15-fold lower than rates reported for small cell lung cancer and melanoma^{17–19}. The mutation rate at CpG (that is, cytosine–phosphate–guanine) dinucleotides was more than tenfold higher than at all other genomic positions

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Table 1 | Landscape of somatic alterations in primary human prostate cancers

Tumour						
PR-0508	PR-0581*	PR-1701*	PR-1783	PR-2832*	PR-3027	PR-3043
$\begin{array}{c} 97.8 \times 10^9 \\ 96.7 \times 10^9 \end{array}$	93.9×10^9 57.8×10^9	110×10^9 108×10^9	90.9×10^9 92.3×10^9	106×10^9 103×10^9	$\begin{array}{c} 93.6 \times 10^{9} \\ 87.8 \times 10^{9} \end{array}$	$\begin{array}{c} 94.9 \times 10^{9} \\ 96.6 \times 10^{9} \end{array}$
31.8 31.4	30.5 18.8	35.8 34.9	29.5 30.0	34.4 33.4	30.4 28.5	30.8 31.4
0.84 0.73	0.83 0.60	0.87 0.49	0.82 0.75 4.502 (2.227)	0.84 0.59 2.465 (1.821)	0.84 0.74 5.865 (2.452)	0.85 0.68
5,090 (1,447)	3,829 (1,430)	3,000 (1,930)	4,505 (2,227)	3,465 (1,651)	5,865 (2,452)	5,192 (1,715)
16 (5)	20 (3)	24 (9)	32 (20)	13 (7)	43 (16)	14 (10)
0.7 53	0.7 67	0.8 90	1.0 213	0.8 133	1.2 156	0.7 43
	$\begin{array}{c} \text{PR-0508} \\ \hline 97.8 \times 10^9 \\ 96.7 \times 10^9 \\ 31.8 \\ 31.4 \\ 0.84 \\ 0.73 \\ 3,898 (1,447) \\ 16 (5) \\ 0.7 \\ 53 \end{array}$	$\begin{array}{c c} PR-0508 & PR-0581^* \\ \hline 97.8 \times 10^9 & 93.9 \times 10^9 \\ 96.7 \times 10^9 & 57.8 \times 10^9 \\ 31.8 & 30.5 \\ 31.4 & 18.8 \\ 0.84 & 0.83 \\ 0.73 & 0.60 \\ 3,898 (1,447) & 3,829 (1,430) \\ 16 (5) & 20 (3) \\ 0.7 & 0.7 \\ 53 & 67 \\ \end{array}$	$\begin{array}{c c c c c c c c c c c c c c c c c c c $	$\begin{array}{c c c c c c c c c c c c c c c c c c c $	$\begin{array}{c c c c c c c c c c c c c c c c c c c $	PR-0508PR-0581*PR-1701*PR-1783PR-2832*PR-302797.8 × 10993.9 × 109110 × 10990.9 × 109106 × 10993.6 × 10996.7 × 10957.8 × 109108 × 10992.3 × 109103 × 10987.8 × 10931.830.535.829.534.430.431.418.834.930.033.428.50.840.830.870.820.840.840.730.600.490.750.590.743,898 (1,447)3,829 (1,430)3,866 (1,936)4,503 (2,227)3,465 (1,831)5,865 (2,452)16 (5)20 (3)24 (9)32 (20)13 (7)43 (16)0.70.70.81.00.81.2536790213133156

* Harbours TMPRSS2–ERG gene fusion

†Estimated from SNP array-derived allele specific copy number levels using the ABSOLUTE algorithm (Supplementary Methods).

(Supplementary Fig. 1). A median of 20 non-synonymous base mutations per sample were called within protein-coding genes (range 13–43; Supplementary Table 3). We also identified six high-confidence coding indels (4 deletions, 2 insertions) ranging from 1 to 9 base pairs (bp) in length, including a 2-bp frameshift insertion in the tumour suppressor gene, *PTEN* (phosphatase and tensin homologue; Supplementary Table 4, Supplementary Fig. 2).

Two genes (SPTA1 and SPOP) harboured mutations in two out of seven tumours. SPTA1 encodes a scaffold protein involved in erythroid cell shape specification, while SPOP encodes a modulator of Daxxmediated ubiquitination and transcriptional regulation²⁰. The SPOP mutations exceeded the expected background rate in these tumours (Q = 0.055). (Q is defined as the false discovery rate (FDR)-corrected P value.) Moreover, SPOP was also found significantly mutated in a separate study of prostate cancer²¹. Interestingly, the chromatin modifiers CHD1, CHD5 and HDAC9 were mutated in 3 out of 7 prostate cancers. These genes regulate embryonic stem cell pluripotency, gene regulation, and tumour suppression²²⁻²⁴. Members of the HSP-1 stress response complex (HSPA2, HSPA5 and HSP90AB1) were also mutated in three out of seven tumours. The corresponding proteins form a chaperone complex targeted by several anticancer drugs in development²⁵. Furthermore, we found a single KEGG pathway 'antigen processing and presentation' to be significantly mutated out of 616 diverse gene sets corresponding to gene families and known pathways (Q = 0.0021). This result is intriguing, given the clinical benefit associated with immunotherapy for prostate cancer^{26,27}. Other known cancer genes were mutated in single tumours, including *PRKCI* and *DICER*. Thus, some coding mutations may contribute to prostate tumorigenesis and suggest possible therapeutic interventions.

Complex patterns of balanced rearrangements

Given the importance of oncogenic gene fusions in prostate cancer, we next characterized the spectrum of chromosomal rearrangements. We identified a median of 90 rearrangements per genome (range 43-213) supported by ≥ 3 distinct read pairs (Supplementary Table 5). This distribution of rearrangements was similar to that previously described for breast cancer²⁸. We examined 594 candidate rearrangements by multiplexed PCR followed by massively parallel sequencing, and validated 78% of events by this approach (Supplementary Methods). Three genes disrupted by rearrangements also harboured non-synonymous mutations in another sample: ZNF407, CHD1 and PTEN. Notably, the chromatin modifier CHD1, which contains a validated splice site mutation in prostate tumour PR-1701 (as indicated above), also harboured intragenic breakpoints in two additional samples (PR-0508 and PR-1783). These rearrangements predict truncated proteins, raising the possibility that dysregulated CHD1 may contribute to a block in differentiation in some prostate cancer precursor cells²².

In 88% of cases, the fusion point could be mapped to base pair resolution (Supplementary Methods). The most common type of fusion involved a precise join, with neither overlapping nor intervening sequence at the rearrangement junction. In a minority of cases, an overlap (microhomology) of 2 bp or more was observed. The



Figure 1 | **Graphical representation of seven prostate cancer genomes.** Each Circos plot¹² depicts the genomic location in the outer ring and chromosomal copy number in the inner ring (red, copy gain; blue, copy loss). Interchromosomal translocations and intrachromosomal rearrangements are

shown in purple and green, respectively. Genomes are organized according to the presence (top row) or absence (bottom row) of the *TMPRSS2–ERG* gene fusion.

rearrangement frequency declined by approximately twofold for each base of microhomology. This result differed from the patterns seen in breast tumours, in which the most common junction involved a microhomology of 2–3 bp (ref. 28). Thus, mechanisms by which rearrangements are generated may differ between prostate and breast cancer.

Detailed examination of these chromosomal rearrangements revealed a distinctive pattern of balanced breaking and rejoining not previously observed in solid tumours: several genomes contained complex inter- and intra-chromosomal events involving an exchange of 'breakpoint arms'. A mix of chimaeric chromosomes was thereby generated, without concomitant loss of genetic material (that is, all breakpoints produced balanced translocations, illustrated conceptually in Fig. 2a).

This 'closed chain' pattern of breakage and rejoining was evident in each of the *TMPRSS2–ERG* fusion-positive prostate cancers. In two such cases, both the *TMPRSS2* and *ERG* genomic loci were involved in a closed chain of breakpoints. For example, the *TMPRSS2–ERG* gene

fusion in PR-1701 was produced by a closed quartet of balanced translocations on chromosomes 21 and 1 (Fig. 2b). The *TMRPSS2*–*ERG* gene fusion in PR-0581 occurred within a closed trio of intrachromosomal rearrangements involving *C210RF45*, *ERG* and *TMPRSS2* (Supplementary Fig. 3).

One noteworthy closed chain of rearrangements harboured breakpoints situated independently of *TMPRSS2–ERG* (Supplementary Fig. 4) but in close proximity to multiple known cancer genes or orthologues. This chain (found in sample PR-2832) contained breakpoint pairs at the following loci: (1) 60 bp from exon 6 of TANK binding kinase 1 (*TBK1* or 'NF-kB-activating kinase')²⁹; (2) within the first intron of *TP53* (7 kilobases (kb) upstream of translation start); (3) 51 kb from *MAP2K4* (a kinase recently shown to induce anchorage-independent growth via mutations²¹); and (4) 3 kb from the *ABL1* proto-oncogene (Fig. 2c). This striking phenomenon suggests that complex translocations may dysregulate multiple genes in parallel to drive prostate tumorigenesis.





Figures are based on the Integrative Genomics Viewer (http:// www.broadinstitute.org/igv). Bottom, Diagram of breakpoints and balanced translocations. Hatching indicates sequences that are duplicated in the derived chromosomes at the resulting fusion junctions. c, Complex rearrangement in prostate tumour PR-2832 involving breakpoints and fusions at 9 distinct genomic loci. Hatching indicates sequences that are duplicated or deleted in the derived chromosomes at the resulting fusion junctions. For breakpoints in intergenic regions, the nearest gene in each direction is shown. In addition to the sheer number of regions involved, this complex rearrangement is notable for the abundance of breakpoints in or near cancer-related genes, such as *TBK1*, *MAP2K4*, *TP53* and *ABL1*.

Association of rearrangements and epigenetic marks

The closed chain pattern of chromosomal breakpoints also raised the possibility that multiple genomic regions might become spatially co-localized before undergoing rearrangement. Conceivably, such a phenomenon could reflect migration to 'transcription factories'preassembled nuclear subcompartments that contain RNA polymerase II holoenzyme³⁰. In prostate cells, androgen signalling has been shown to induce co-localization of TMPRSS2 and ERG, thereby allowing double-strand breaks to facilitate gene fusion formation³¹⁻³³. A role for transcription in the genesis of TMPRSS2-ERG in PR-1701 seems plausible, as genomic sequences of up to 240 bp are duplicated at the resulting fusion junctions (Fig. 2b). Alternatively, chains of breakpoints might reflect the clustering of active and inactive chromatin within the recently demonstrated fractal globule structure of nuclear architecture³⁴. Stimulated by these models, we considered whether the genomic regions involved in prostate cancer rearrangements exhibited similarities in terms of either transcriptional patterns or chromatin marks. Here, we used published chromatin immunoprecipitation and massively parallel sequencing (ChIP-seq) data from VCaP, an androgensensitive prostate cancer cell line that harbours the TMPRSS2-ERG gene fusion³⁵.

The location of rearrangement breakpoints from the *TMPRSS2–ERG* fusion-positive tumour PR-2832 showed significant spatial correlation with various marks of open chromatin in VCaP cells (Fig. 3 and Supplementary Fig. 5). These marks included ChIP-seq peaks corresponding to RNA polymerase II (pol II, $P = 1.0 \times 10^{-15}$), histone H3K4 trimethylation (H3K4me3, $P = 3.1 \times 10^{-7}$), histone H3K36 trimethylation (H3K36me3, $P = 3.5 \times 10^{-12}$) and histone H3 acetylation (H3ace, $P = 9.5 \times 10^{-12}$) (Fig. 3). Similar statistical correlations were observed for peaks corresponding to the androgen receptor (AR) ($P = 1.1 \times 10^{-5}$) and ERG binding sites ($P = 4.9 \times 10^{-14}$) (Fig. 3 and



log₂(Enrichment of breakpoints near ChIP-Seq peaks)

Figure 3 Association between rearrangement breakpoints and genomewide transcriptional/histone marks in prostate cancer. ChIP-seq binding peaks were defined previously for the *TMPRSS2–ERG* positive (ERG-positive) prostate cancer cell line VCaP³⁵. For each genome, enrichment of breakpoints within 50 kb of each set of binding peaks was determined relative to a coveragematched simulated background (see Methods). *TMPRSS2–ERG*-positive prostate tumours are in black; ETS fusion-negative prostate tumours are in white. Enrichment is displayed as the ratio of the observed breakpoint rate to the background rate near each indicated set of ChIP-seq peaks. Rearrangements in ETS fusion-negative tumours are depleted near marks of active transcription (AR, ERG, H3K4me3, H3K36me3, Pol II and H3ace) and enriched near marks of closed chromatin (H3K27me3). *P*-values were calculated according to the binomial distribution and are displayed in Supplementary Fig. 5 and Supplementary Table 6. *Significant associations passing a false discovery rate cut-off of 5%. Supplementary Table 6), consistent with the substantial overlap between AR and ERG binding locations in VCaP cells³⁵. (We did not observe significant enrichment of either AR or ERG binding site sequences in the vicinity of these breakpoints.) In the other ERG fusion-positive tumours (PR-0581 or PR-1701), the correlations between breakpoints and ChIP-seq peaks were intermittently apparent, albeit much less significant.

Rearrangement breakpoints from all four ETS fusion-negative tumours were inversely correlated with these same marks of open chromatin and AR/ERG binding (Fig. 3 and Supplementary Fig. 5). In fact, breakpoints from two of four ETS-negative tumours were significantly correlated with marks of histone H3K27 trimethylation (H3K27me3) in VCaP cells, which denote inactive chromatin and transcriptional repression (Fig. 3). This result suggested that somatic rearrangements might occur within closed chromatin in some tumour cells, or that the epigenetic architecture or transcriptional program of some TMPRSS2-ERG fusion-positive cells differs markedly from that of ERG fusion-negative cells. In support of the former, we observed a similar enrichment of PR-2832 rearrangements and depletion of fusion-negative rearrangements near marks of active transcription profiled in several additional cell lines, including fusion-negative prostate cancer cell lines LNCaP and PC-3 as well as three cell lines derived from non-prostate lineages (Supplementary Fig. 5)^{35–37}.

On the basis of these results, we performed similar analyses comparing the chromatin state in VCaP cells to rearrangement patterns of other cancer types. No statistically significant correlations or inverse correlations were observed between VCaP ChIP-seq data and rearrangement breakpoints obtained from a melanoma cell line¹⁸, a small-cell lung cancer cell line¹⁷, or a primary non-small-cell lung tumour³⁸ (Supplementary Fig. 5 and Supplementary Table 6). However, rearrangements from 16 out of 18 breast tumours and cell lines examined²⁸ exhibited a pattern of association similar to that observed in prostate tumour PR-2832 (Supplementary Fig. 6). Notably, breakpoints in these tumours were also strongly associated with oestrogen receptor (ER) binding sites derived from the breast cancer cell line MCF-7 (ref. 39). Furthermore, we observed a strong association between ER ChIP-seq peaks from MCF-7 and all VCaP ChIP-seq peaks corresponding to open chromatin, AR and ERG binding ($P < 10^{-90}$; Supplementary Fig. 6). Thus, patterns of open chromatin may be highly overlapping in some hormone-driven cancer cells. Such regions may correlate significantly with sites of somatic rearrangement in cancers of the prostate, breast, and possibly other tissues.

To examine whether processes linked to chromatin reorganization and DNA rearrangement are also associated with increased mutation frequency, we tested for enrichment of point mutations near regions of ChIP-seq peaks and rearrangement breakpoints. We observed a significantly reduced prevalence of point mutations near marks of VCaP active transcription-and slight enrichment of mutations in closed chromatin-in all seven prostate tumours (Supplementary Fig. 7). This pattern is consistent with both negative selection and transcription-coupled DNA repair. Additionally, we observed a significant enrichment of mutations near rearrangement breakpoints in five out of seven prostate tumours (Supplementary Fig. 7). Although the increased rate of mutations near rearrangements may conceivably reflect activation-induced cytodine deaminase in the double strand break repair process^{31,40}, we did not observe a significant overrepresentation of any one class of mutation among those located near breakpoints.

Recurrent rearrangements involving CADM2

Sixteen genes harboured a somatic rearrangement in at least two prostate tumours (Supplementary Table 7), and four contained rearrangements in three out of seven tumours. In addition to *TMPRSS2* and *ERG*, the latter included *CSMD3* and *CADM2* (cell adhesion molecule 2). These genes were rearranged at a frequency beyond that expected by chance, even after correcting for gene size (Supplementary Table 8). *CSMD3* encodes a giant gene that contains multiple CUB and sushi repeats. However, we did not observe additional *CSMD3* rearrangements by FISH in an independent analysis of 94 prostate tumours (Supplementary Fig. 8).

CADM2 encodes a nectin-like member of the immunoglobulin-like cell adhesion molecules. Several nectin-like proteins exhibit tumour suppressor properties in various contexts. Analysis of single nucleotide polymorphism (SNP) array-derived copy number profiles of tumours and cell lines^{41,42} suggests that CADM2 does not reside near a fragile site (Supplementary Fig. 9). At the same time, the complexity of CADM2 rearrangements (Fig. 4a) suggested that a simple FISH validation approach might prove insufficient to determine the overall frequency of CADM2 disruption. Nevertheless, we screened an independent cohort of 90 additional prostate tumours using a 'breakapart' FISH assay designed to query the CADM2 locus (Supplementary Fig. 8). CADM2 aberrations were detected in 6 out of 90 samples (5 rearrangements and 1 copy gain; Fig. 4b). These results confirmed that CADM2 is recurrently disrupted in prostate cancer, and they are likely to represent a lower bound for the true prevalence of CADM2 alteration in this malignancy.

Rearrangements disrupting PTEN and MAGI2

Two prostate tumours contained breakpoints within the *PTEN* tumour suppressor gene⁶ (Fig. 4c). In both cases, the rearrangements generated heterozygous deletions that were confirmed by FISH analysis (Supplementary Fig. 10). In one tumour (PR-0581), *PTEN* rearrangement co-occurred with a dinucleotide insertion within the *PTEN* coding sequence (described above).

Two additional tumours harboured rearrangements disrupting the *MAGI2* (membrane associated guanylate kinase, WW and PDZ domain containing 2) gene, which encodes a PTEN-interacting protein^{43,44} (Fig. 4c). In one tumour (PR-0508), two independent but closely aligned inversion events (marking both ends of a 450-kb inverted sequence) affected the *MAGI2* locus. In the other tumour (PR-2832), two long-range intrachromosomal inversions were observed, raising the possibility of heterogeneous subclones harbouring independent

MAGI2 rearrangements. Thus, four out of seven tumours harboured rearrangements predicted to inactivate *PTEN* or *MAGI2*, including all three tumours harbouring *TMPRSS2–ERG* rearrangements. Although a tumour suppressor function for *MAGI2* has not been established previously, this gene was recently shown to undergo rearrangement in the genome of a melanoma cell line¹⁸, another tumour type in which PTEN loss is prevalent. In principle, genomic rearrangements that subvert PTEN function either directly or indirectly (for example, through loss of *MAGI2*) might dysregulate the PI3 kinase pathway in prostate cancer.

Whereas both *PTEN* rearrangements involved chromosomal copy loss, the *MAGI2* rearrangements were balanced events (Supplementary Fig. 11). Like *CSMD3* and *CADM2*, *MAGI2* does not appear to reside near a fragile site (Supplementary Fig. 9). We screened 88 independent prostate tumours using FISH inversion probes and identified 3 additional samples harbouring similar inversions, each of which was wild type for PTEN disruption (Fig. 4d and Supplementary Fig. 8). As with *CADM2* above, these FISH findings may underestimate the true frequency of *MAGI2* disruption in prostate cancer.

We further analysed the *PTEN* and *MAGI2* loci using high-density SNP arrays obtained from 66 primary prostate cancers. As shown in Supplementary Fig. 11, focal somatic deletions affecting the *PTEN* locus were commonly observed in these tumours, as expected. Interestingly, no somatic copy number alterations were observed at the *MAGI2* locus in either prostate tumour found to contain *MAGI2* rearrangements by genome sequencing (Supplementary Fig. 11). Conceivably, this region may also harbour genes whose loss would be deleterious to prostate cancer cells. More generally, these findings suggest that extensive shotgun paired-end sequencing (as opposed to lower-resolution approaches) may be required to elaborate the compendium of genes targeted by somatic alterations in prostate cancer.

Discussion

This study represents the first whole genome sequencing analysis of human prostate cancer. Systematic genome characterization efforts have often focused primarily on gene-coding regions to identify 'driver'



Figure 4 | Disruption of *CADM2* and the *PTEN* pathway by rearrangements. a, Location of intragenic breakpoints in *CADM2*. b, *CADM2* break-apart demonstrated by FISH in an independent prostate tumour. c, Location of intragenic breakpoints in *PTEN* (top) and *MAGI2* (bottom).

d, *MAGI2* inversion demonstrated by FISH in an independent prostate tumour, using probes flanking *MAGI2* (red and green) and an external reference probe also on chromosome 7q (green). The probes and strategy for detecting novel rearrangements by FISH are shown in diagram form in Supplementary Fig. 8.

or 'druggable' alterations^{45–47}. In contrast, the high prevalence of recurrent gene fusions has highlighted chromosomal rearrangements as critical initiating events in prostate cancer^{2,3}. Genome sequencing data indicate that complex rearrangements may enact pivotal gain- and loss-of-function driver events in primary prostate carcinogenesis. Moreover, many rearrangements may occur preferentially in genes that are spatially localized together with transcriptional or chromatin compartments, perhaps initiated by DNA strand breaks and erroneous repair. The complexity of 'closed chain' and other rearrangements suggests that complete genome sequencing—as opposed to approaches focused on exons or gene fusions—may be required to elaborate the spectrum of mechanisms directing prostate cancer genesis and progression.

A positive correlation exists between the location of breakpoints in TMPRSS2-ERG-positive tumour cells and open chromatin in VCaP cells, and also between breakpoints present in ETS fusion-negative cells and VCaP regions of closed chromatin. This suggests that breakpoints may preferentially occur within regions of open chromatin in some TMPRSS2-ERG-positive tumour cells while raising alternative possibilities for the genesis of breakpoints in ETS fusion-negative cells. Conceivably, somatic rearrangements may occur within regions of closed chromatin in tumour cells lacking ETS gene fusions. Alternately, such tumour cells may have distinct transcriptional or chromatin patterns, with many regions that are closed in VCaP being open in these cells. Clustering of breakpoints within active regions might also reflect selection for functionally consequential rearrangements during tumorigenesis. The relative contribution of these aspects to tumorigenesis will probably be informed by additional integrative analyses of epigenetic and structural genomic data sets across many tumour types.

Previous studies of genetically engineered mouse models have shown that the combination of ERG dysregulation and PTEN loss triggers the formation of aggressive prostate tumours^{48,49}. This same combination identifies a subtype of human prostate cancer characterized by poor prognosis⁵⁰. The discovery of MAGI2 genomic rearrangements in prostate cancer suggests that interrogating both the PTEN and MAGI2 loci might improve prognostication and patient stratification for clinical trials of PI3 kinase pathway inhibitors. Additional mutated genes discovered in this study also suggest interesting therapeutic avenues. For example, the presence of point mutations involving chromatin modifying genes and the HSP-1 stress response complex (which includes the Hsp90 chaperone protein targeted by several drugs in development) raises the possibility that these cellular processes may represent targetable dependencies in some prostate tumours. Overall, complete genome sequencing of large numbers of relapsing primary and metastatic prostate cancers promises to define a genetic cartography that assists in tumour classification, elaborates mechanisms of carcinogenesis and identifies new targets for therapeutic intervention.

METHODS SUMMARY

The complete genomes of seven prostate tumours and patient-matched normal samples were sequenced to approximately 30-fold haploid coverage on an Illumina GA II sequencer. DNA was extracted from patient blood and from tumours following radical prostatectomy, and was subjected to extensive quality control procedures to monitor DNA structural integrity, genotype concordance, and tumour purity and ploidy. Standard paired-end libraries (~400-bp inserts) were sequenced as 101-bp paired-end reads. Raw sequencing data were processed by Illumina software and passed to the Picard pipeline, which produced a single BAM file for each sample storing all reads with well-calibrated quality scores together with their alignments to the reference genome. BAM files for each tumour/normal sample pair were analysed by the Firehose pipeline to characterize the full spectrum of somatic mutations in each tumour, including base pair substitutions, short insertions and deletions, and large-scale structural rearrangements. A subset of base pair mutations and rearrangements were validated using independent technologies in order to assess the specificity of the detection algorithms. FISH was also performed for selected recurrent rearrangements. The locations of all rearrangement breakpoints were compared to previously published ChIP binding peaks from related cell types to test for global associations

between rearrangements and a range of epigenetic marks. A complete description of the materials and methods is provided in Supplementary Information.

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Author Information All Illumina sequence data have been deposited in dbGaP (http:// www.ncbi.nlm.nih.gov/gap) and are available at accession phs000330.v1.p1. Reprints and permissions information is available at www.nature.com/reprints. This paper is distributed under the terms of the Creative Commons

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