

## ARTICLE



## Genetics and Genomics

# Exome sequencing of affected duos and trios uncovers *PRUNE2* as a novel prostate cancer predisposition gene

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**BACKGROUND:** Prostate cancer (PrCa) is one of the most heritable human cancers, however, only a small fraction of patients has been shown to carry deleterious variants in known cancer predisposition genes.

**METHODS:** Whole-exome sequencing was performed in multiple affected members of 45 PrCa families to select the best candidate genes behind part of the PrCa missing heritability. Recurrently mutated genes were prioritised, and further investigated by targeted next-generation sequencing in the whole early-onset and/or familial PrCa series of 462 patients.

**RESULTS:** *PRUNE2* stood out from our analysis when also considering the available data on its association with PrCa development. Ten germline pathogenic/likely pathogenic variants in the *PRUNE2* gene were identified in 13 patients. The most frequent variant was found in three unrelated patients and identical-by-descent analysis revealed that the haplotype associated with the variant is shared by all the variant carriers, supporting the existence of a common ancestor.

**DISCUSSION:** This is the first report of pathogenic/likely pathogenic germline variants in *PRUNE2* in PrCa patients, namely in those with early-onset/familial disease. Importantly, *PRUNE2* was the most frequently mutated gene in the whole series, with a deleterious germline variant identified in 2.8% of the patients, representing a novel prostate cancer predisposition gene.

*British Journal of Cancer* (2023) 128:1077–1085; <https://doi.org/10.1038/s41416-022-02125-6>

## BACKGROUND

Prostate cancer (PrCa) is among the top five incident and deadliest cancers in men worldwide, with nearly 1.4 million new cases and 375,000 deaths in 2020, ranking second and fifth regarding incidence and mortality, respectively [1]. Despite being such a common disease, its aetiology remains poorly understood, with only three well-established risk factors, namely, advancing age, African ancestry, and a family history of the disease [1, 2]. Concerning family history, the relative risk of PrCa increases two- to threefold for men having a first-degree relative with PrCa and increases three to fivefold if the affected relative is diagnosed with PrCa before age 60 [3, 4]. In fact, the heritability of PrCa is one of the highest among human cancers, with inherited predisposition estimated to account for 5–15% of all cases [5–7], but, contrarily to other common cancers, very little is known about the causal genetic factors. The scarce knowledge, however, reveals significant genetic heterogeneity, with the contribution of both rare and common germline variants in moderate- to high-risk alleles and in low-risk alleles, respectively [2, 8].

Of the patients presenting familial aggregation and/or early-onset disease, only a few have been shown to carry rare

deleterious variants in the *HOXB13* gene [9–11], in genes predisposing to Hereditary Breast and Ovarian Cancer and Lynch Syndromes [12–14], namely, *BRCA1*, *BRCA2* and the mismatch repair (MMR) genes, or in additional DNA repair genes, such as *ATM*, *CHEK2* and *PALB2* [15–18]. We have previously reported that, altogether, mutations in the *BRCA2*, *MSH2* and *HOXB13* genes account for only around 1.5% of our patients with early-onset and/or familial PrCa [11, 14]. Furthermore, using targeted next-generation sequencing (T-NGS) of 94 genes known to be involved in inherited cancer predisposition, we have identified pathogenic and “likely/potentially pathogenic” germline mutations in 14.9% of 121 PrCa cases selected for the high likelihood of hereditary disease [15]. Notwithstanding, most of our patients with early-onset or/and familial PrCa remain without a molecular diagnosis, and, thus, unveiling the missing heritability of PrCa may require the use of a more comprehensive and genome-wide approach. Populations with a high prevalence of founder effects, which is the case of the population from the north of Portugal, may simplify the identification of new cancer predisposition genes, especially when associated with homogeneous environmental exposures that reduce the non-genetic variance. We have previously

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identified common founder mutations in *BRCA1*, *BRCA2* and in MMR genes [19–21], illustrating well how the structure of our population may help to identify rare variants and prioritise candidate genes involved in inherited cancer predisposition.

Aiming to identify new deleterious germline mutations behind a significant part of the missing PrCa heritability, we performed whole-exome sequencing (WES) in duos and trios of PrCa patients from 45 of the 462 families previously recruited [11]. The best candidate genes were included in a customised NGS gene panel to access the prevalence of germline variants in a validation series of 417 additional PrCa families.

## METHODS

### Patients and samples

This study enrolled 462 index cases from a previously described early-onset and/or familial PrCa series, which were recruited based on two criteria: an early-onset disease with PrCa diagnosis before the age of 56, and/or familial/hereditary PrCa with more than one case with PrCa and at least one family member diagnosed before the age of 66 [11]. The peripheral blood sample obtained from each patient recruited was labelled HPC (denoting the aim of the study to identify hereditary prostate cancer) followed by a sequential number. Regarding the histopathological diagnosis, all patients had prostate adenocarcinoma except one diagnosed with prostatic basal cell carcinoma and one with carcinosarcoma. The average age at onset was 56.6 years.

Germline DNA from all patients was extracted from peripheral blood leucocytes using the MagNA Pure LC DNA Isolation Kit —Large Volume (Roche Diagnostics GmbH, Penzberg, Germany). All DNA samples were quantified using Qubit dsDNA HS Assay (ThermoFisher, Carlsbad, CA, USA), and their integrity was assessed by agarose gel electrophoresis.

**Discovery series.** We hypothesised that sequencing duos and trios of affected relatives would help to identify new PrCa predisposing genes, by allowing prioritisation of variants that segregate with the disease. Forty-nine of the 462 families provided DNA samples from two or three affected relatives (including the proband). Of those, 45 families, specifically, 6 with three available DNA samples and 39 with two available DNA samples, were selected for WES according to the following prioritisation: firstly, families with three available DNA samples; secondly, families with more than two family members diagnosed with PrCa; thirdly, families with probands diagnosed before the age of 61; and, lastly, families with the lowest average age at onset. The initial genetic screening with whole-exome sequencing (the “discovery series”) therefore included 96 patients from 45 families of the 462 families recruited. All the selected families had between two and six affected relatives (Supplementary Table 1), with an average number of 3.3 PrCa diagnoses per family. The degree of relationship between probands and affected relatives is shown in Supplementary Table 2. Demographic and clinicopathological characteristics are shown in Supplementary Table 3.

**Validation series.** To validate the involvement of the most promising candidate genes identified in the discovery series, the germline DNA from the remaining 417 index cases, regardless of the carrier status for variants in known DNA repair genes [14, 15], was sequenced using a customised NGS gene panel. The demographic and clinicopathological characteristics of these patients have already been described [11].

### Sequencing

#### Whole-exome sequencing

**Capture and sequencing:** Approximately 1 µg of genomic DNA was enriched for exonic regions using the SureSelectXT2 Human All Exon v5 kit (Agilent Technologies, Santa Clara, CA, USA), according to the SureSelectXT2 Target Enrichment System for Illumina Multiplexed Sequencing protocol, at the Carvajal-Carmona Laboratory, Genome Center & Department of Biochemistry and Molecular Medicine, University of California, Davis, CA, USA. Sequencing of the pooled enriched libraries was an outsourced service, provided by the Beijing Genomics Institute sequencing facility at the UC Davis campus in Sacramento, CA, USA, and was performed with 100 bp paired-end reads using the Illumina HiSeq 2000 platform (Illumina Inc., San Diego, CA, USA).

**Data processing:** Raw sequence data was received in paired-end FASTQ format and processed at the Carvajal-Carmona Laboratory. Data were demultiplexed and converted to Sanger encoding using seqtk (<https://github.com/lh3/seqtk>). Fastq quality was assessed and checked with FastQC (<http://www.bioinformatics.babraham.ac.uk/projects/fastqc/>). Quality trimming was performed by SICKLE (<https://github.com/najoshi/sickle>). Sequence reads were trimmed and aligned to the Genome Analysis Toolkit (GATK) bundle human genome build GRCh37\_decoy/hg19 using Burrows-Wheeler Alignment (BWA-mem, version 0.7.8-r455) [22, 23] and PCR duplicates were removed using Picard (1.118). GATK (v3.2–2) IndelRealigner and BaseRecalibrator were used for indel realignment and base quality score recalibration, and variants were called with five different callers: FreeBayes [24], GATK HaplotypeCaller algorithm [25, 26], SAMtools [27], SNVer [28] and VarScan [29].

**Variant annotation and prioritisation:** Variants for all callers were combined and filtered according to the following filters: coverage  $\geq 10$ ; variant counts  $\geq 5$ ; variant frequency  $\geq 10\%$ ; average single nucleotide variants (SNV) base quality  $\geq 22$ ; and  $\geq 10\%$  of variant reads on both strands. Variant annotation was carried out with ANNOVAR [30]. For secondary variant filtering, intronic variants at more than 2-bp away from exon-intron boundaries, synonymous, UTR variants, and variants present in more than 10% of the samples were excluded. In addition, an in-house perl-based script adapted from the ANNOVAR software was created to gather information for MAF (minor allele frequency) in non-Finnish European (NFE) and Iberic (IBS) populations, from the Genome Aggregation Database [gnomAD v2.1.1, June 2021] and the 1000 Genomes Project [1000 G, Phase 3 data], and for the pathogenicity predictors available at dbNSFP (v3.5). NFE data from 1000G was obtained by subtracting Finnish (FIN) data from the total of populations with European ancestry (FIN, GBR, CEU, and IBS). Frameshift, nonsense, or splicing variants with MAF  $\leq 0.15\%$  in NFE and IBS were retained in order to reduce the chance of filtering out eventual deleterious founder variants that could be relatively common in our population. Missense variants with MAF  $\leq 0.15\%$  and predicted to be damaging/deleterious by at least 9 of 11 pathogenicity predictors and supported by at least 3 of 4 conservation predictors (Supplementary Table 7), were considered “potentially pathogenic” and were retained, while variants classified as “likely benign” according to the guidelines of the American College of Medical Genetics and Genomics and the Association for Molecular Pathology (ACMG-AMP, source: InterVar [31]) were filtered out.

Since the goal of this study was to find new recurrently mutated genes associated with PrCa inherited predisposition, as a final candidate gene approach, we have prioritised genes with at least two variants identified (at least one frameshift, nonsense or affecting consensus splice sites) segregating with the disease in the families, which had been reported as having a role in PrCa development but not linked with DNA repair. To make sure that the prioritised variants were associated with the disease instead of being populational, all the variants found more frequently in healthy controls than in PrCa cases (described below), were discarded. *PRUNE2* was the single gene fitting all these criteria.

**Targeted next-generation sequencing (T-NGS).** DNA samples from the index patients of both the discovery and the validation series were sequenced using a customised gene panel designed with Agilent SureDesign, covering, among other genes, the coding and splicing regions of *PRUNE2* (NM\_015225.3).

For library preparation, ~50 ng of DNA were enriched for the custom primer regions using the SureSelectQXT protocol, following Agilent’s recommendations. Enriched libraries were pooled and sequencing outsourced by Health[in]Code (Spain, Coruña) in an Illumina HiSeq 2000 platform.

**Data processing:** The NextGENe software (v2.4.2.2; Softgenetics, State College, PA, USA) was used for sequence alignment to the reference genome (GRCh37/hg19) and variant calling. For analysis of single nucleotide variants (SNVs) and INDELS, both BAM and VCF files were imported into GeneticistAssistant (v1.8; Softgenetics) for quality control, variant annotation and primary filtering.

**Variant annotation and prioritisation:** Variants present in more than 10% of the samples in the whole dataset and variants with an alternative allele frequency (VAF)  $< 15\%$  in any given patient were excluded to remove sequencing artefacts and low-level somatic mosaicism (which in any case

**Table 1.** Non-missense variants found in *PRUNE2*.

Variant position (GRCh37)	rs id	cDNA change; protein change	Number of case carriers (%)	Number of control carriers (N = 710)	MAF (gnomAD-NFE)	MAF (1000G-IBS)
9:79469048	N/A	c.111_113dup; p.Thr38dup	1 (0.216%)*	0	NR	NR
9:79461518	rs1324608847	c.421C>T; p.Arg141Ter	1 (0.216%)	1 male	0.001%	NR
9:79441650	rs139658711	c.509-2A>G;?	3 (0.649%)	0	0.135%	NR
9:79325002	N/A	c.2188dup; p.Ile730AsnfsTer6	1 (0.216%)	0	NR	NR
9:79319016	rs755480259	c.7514-1G>A;?	1 (0.216%)*	0	0.001%	NR
9:79318858	rs147789214	c.7669_7671del; p.Glu2557del	1 (0.216%)	0	0.005%	NR

NR not reported.

\*Variants found in the discovery series by WES.

are unlikely to be validated with Sanger sequencing). The performance of the SureSelect custom panel was evaluated by assessing per base coverage using an in-house python-based script, considering the full coding and splicing consensus regions. Variants in *PRUNE2* were filtered as described above for WES data and were validated by Sanger sequencing.

All the variants detected by WES, as well as variants reported in previous studies [11, 14, 15] were also identified by T-NGS, further validating the performance of our custom NGS gene panel.

### Genotyping by KASP technology

To understand if the most promising variants found in the PrCa patients are specifically associated with cancer development or, in opposition, are population-related, all frameshift, nonsense or splicing variants, as well as the most promising missense variants, were genotyped in 710 Portuguese control subjects, previously described [15]. For this purpose, the KASP SNP genotyping chemistry (LGC Genomics, Berlin, Germany) was used, according to the manufacturer's instructions. Assay primers (Supplementary Table 4) were designed using the Primer-Blast [32] and the PCR reactions were run on a Roche LightCycler 480 Real-Time instrument. For data analysis, the LightCycler 480 Software 1.5.0 was used.

### Haplotype analysis

To evaluate if recurrent variants identified in at least three families potentially resulted from founder effects in the population, identical-by-descent and phylogenetic analyses were performed for all carriers, from both the discovery and validation series.

The T-NGS data were phased using BEAGLE 4.1 [33], and identical-by-descent (IBD) haplotypes were determined using BEAGLE Refined IBD algorithm [34]. The lengths of the shared haplotype segments were estimated by the distance between the two last shared markers flanking the variants. Phylogenetic networks were reconstructed based on the median-joining algorithm [35] using PopART v1.7 [36].

A similar IBD and haplotype approach was applied to high-density SNP genotype data from the Portuguese early-onset and/or familial PrCa sample collection (354 PrCa cases and 180 controls) obtained with the Infinium OncoArray-500K BeadChip (Illumina), previously described [37], as part of the PRACTICAL consortium.

## RESULTS

### Variants in *PRUNE2*

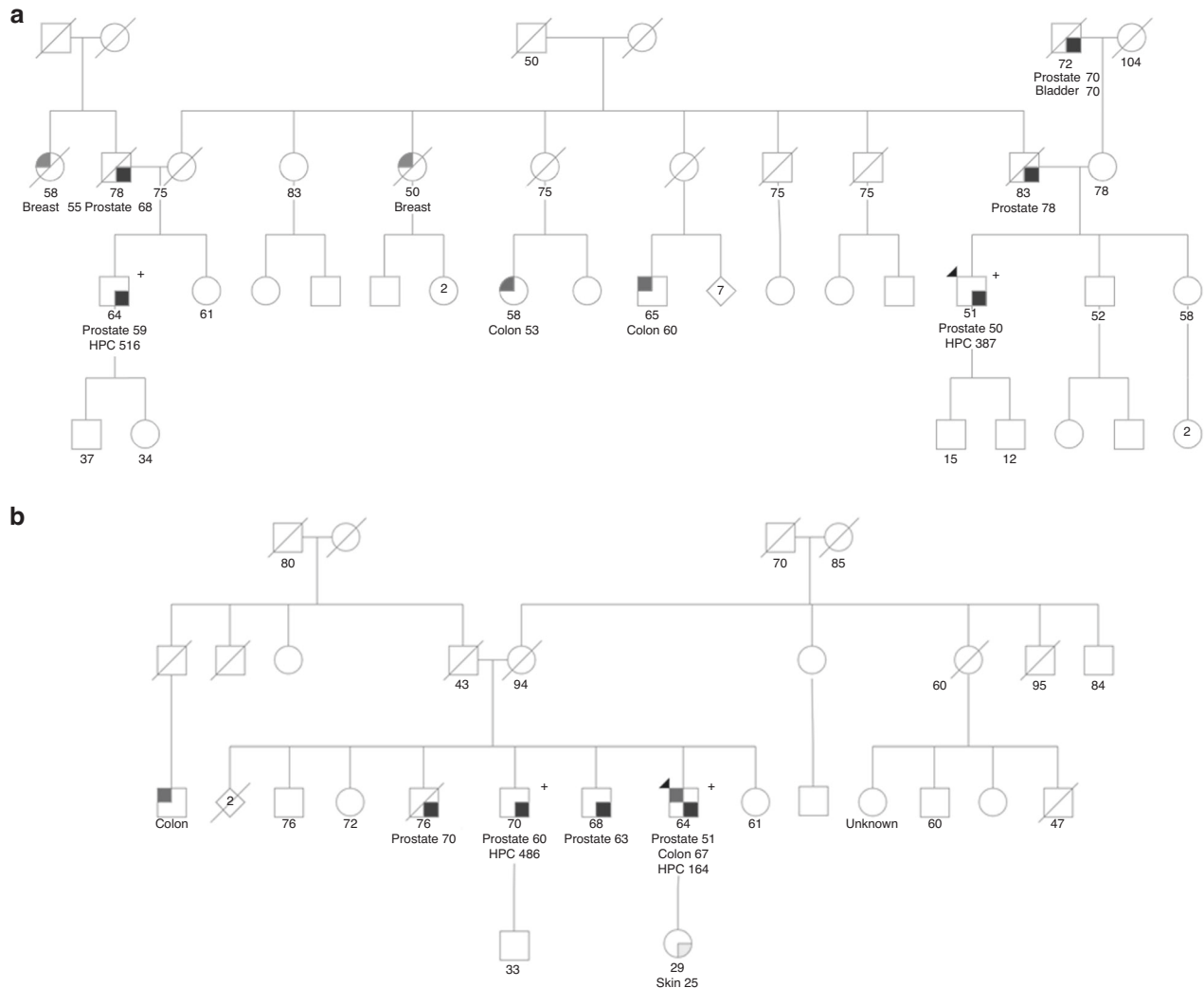
*PRUNE2* was the only candidate gene fitting all the variant annotation and prioritisation criteria indicated above. Six different non-missense variants were identified in the *PRUNE2* gene in eight families, two of which were in patients belonging to the discovery series, and four in patients from the validation series (Table 1). Regarding missense variants, 28 were found, all in patients from the validation series (Supplementary Table 5).

**Non-missense variants.** Two index patients from the discovery series were found to harbour *PRUNE2* non-missense variants. One is an in-frame insertion variant, c.111\_113dup, carried by patient

HPC387 and his affected paternal cousin HPC516, the first having been diagnosed by the age of 50, and the latter by the age of 59 (Fig. 1a). The other is a splicing variant, c.7514-1G>A, shared by HPC164 and his brother, HPC486, who were diagnosed at the age of 51 and 60 years, respectively (Fig. 1b). They have two more affected brothers, however, further segregation analysis was not possible. None of these variants was found in our series of 710 healthy controls.

We identified four additional non-missense variants in patients belonging to the validation series, specifically, one nonsense, one frameshift, one in-frame and one splicing variant. The stop-gain variant, c.421C>T, which leads to a premature stop codon at codon 141, is carried by an early-onset patient, HPC403, diagnosed by the age of 53 and with no family history of PrCa. One healthy male was also found to carry the same variant. Patient HPC493 is the carrier of the frameshift variant c.2188dup and was diagnosed at 55 years, having a deceased paternal uncle with PrCa. This variant, which results in a premature stop codon at codon 735, was not found in non-cancer controls. Apart from the in-frame variant found in the discovery series, a second in-frame deletion variant (c.7669\_7671del) found in a validation series' patient, HPC433, was also absent in controls. The carrier was diagnosed at 58 years and his father also had PrCa, although his sample was not available to test for segregation. Lastly, three non-related patients, HPC119, HPC139, and HPC314, carry the same splicing variant, the c.509-2A>G transition, which was not found in any healthy control subject. The first patient (HPC119) fulfils the two recruitment criteria (Fig. 2a), with PrCa diagnosed at the age of 55, and with a strong family history of the disease, having five affected family members, specifically, the father, two brothers, one paternal cousin and one maternal uncle. Unfortunately, the relatives are either deceased or living abroad, making it unfeasible to perform additional segregation studies. The other carriers of this variant, patients HPC139 and HPC314, were also diagnosed at an early age, at 54 and 55 years, respectively, but had no family history of PrCa (Fig. 2b, c). We have tried to amplify the cDNA of the tumour sample from patient HPC314, the single available at our institution, however, the bad quality of the RNA sample did not allow to pursue additional studies on aberrant splicing events. Moreover, as *PRUNE2* is not expressed in the blood (GTEx Portal accessed in 07/27/21), RNA analysis in a germline sample would not be informative.

To further address if the variants 7514-1G>A and c.509-2A>G, which occur in very conserved splicing regions [38] at -1 and -2 upstream of exon 5 and exon 9, respectively, can interfere with the normal splicing, we queried different in silico software. In fact, both splicing variants were predicted to be disease-causing by MutationTaster [39], and to affect the acceptor splice site, and, consequently, interfere with splicing, by the in silico tools Human



**Fig. 1 Pedigrees of WES families carrying unique *PRUNE2* variants. a** Patient HPC387, harbouring the *PRUNE2* variant c.111\_113dup, which co-segregates with the disease in a paternal cousin, HPC516. **b** Patient HPC164, harbouring the *PRUNE2* splicing variant c.7514-1G>A, segregating with the disease in his brother, HPC486. Males are represented by a square, females by a circle and unspecified gender by a diamond. A diagonal line through a symbol indicates that the individual is deceased, and coloured symbols represent affected individuals. The index case is indicated by an arrow and the cancer type and age at diagnosis are indicated when known.

Splicing Finder V3.0 [40] and MaxEntScan3ss [41] (Supplementary Table 6).

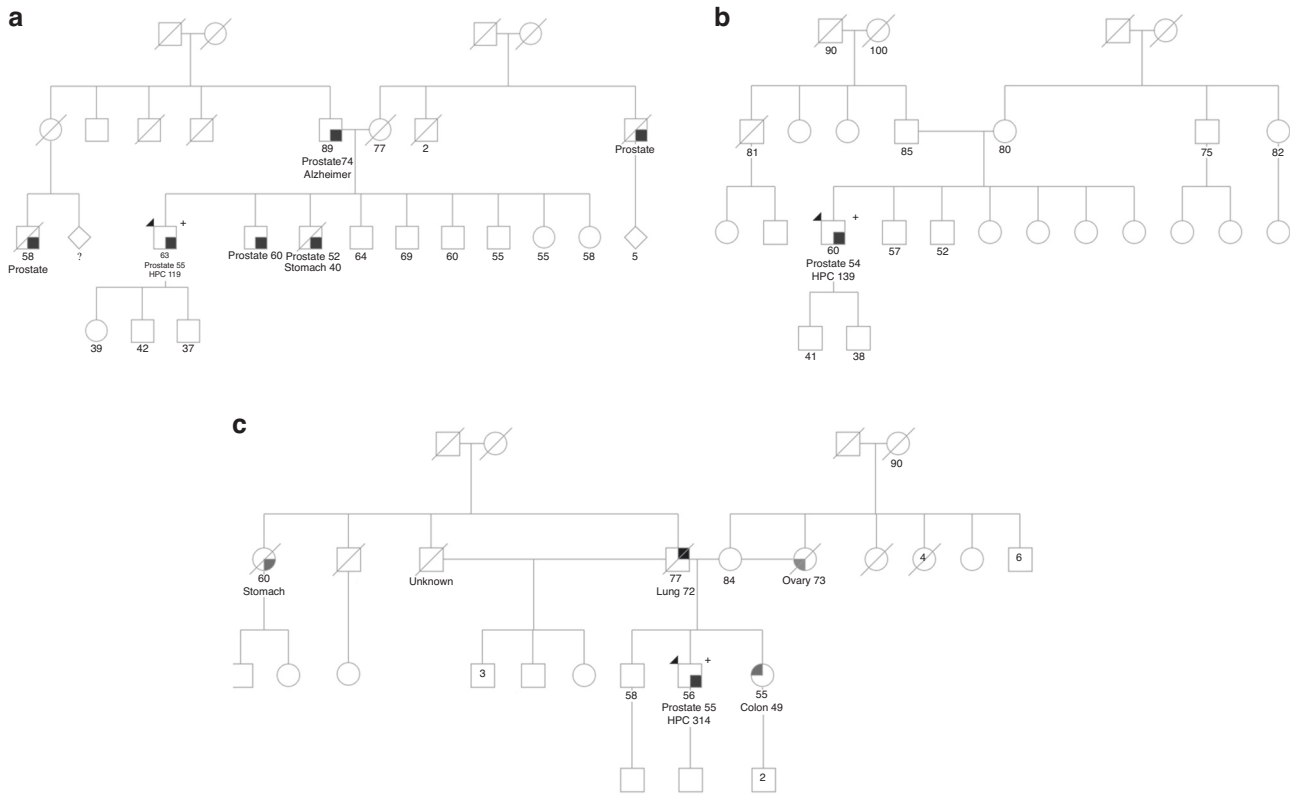
**Missense variants.** Of the 28 missense variants in *PRUNE2* found in our patients, four variants occurred at highly conserved nucleotides (Supplementary Table 7), having been screened in healthy subjects to further clarify an eventual disease association (Table 2). The c.8725G>A variant, considered potentially pathogenic by 10 of the 11 in silico predictors (Supplementary Table 7), was found in HPC342, a patient diagnosed by the age of 53 without family history of PrCa. One healthy control with no family history of cancer was identified as a carrier of the same variant. The remaining three variants were predicted to be pathogenic by 9 of the 11 in silico predictors (Supplementary Table 7). The c.247G>A transition, identified in a patient with early-onset disease (HPC240) was not found in controls, the c.389C>T variant, identified in two patients fulfilling the family history criterion only (HPC178 and HPC268), was found in one male control, and the c.442G>A variant, carried by an early-onset patient with no family history of PrCa (HPC409), was found in one healthy female.

The remaining 24 missense variants were not further explored due to the unconserved nature of the involved nucleotides (Supplementary Table 7).

#### Founder effect of recurrent variants

Following the discovery of the recurrent splice variant c.509-2A>G in three unrelated patients, we performed a preliminary IBD analysis on chromosome 9 using T-NGS genotype data. The haplotype reconstruction revealed a shared ~195.3 kb segment flanking the variant (chr9:7932566–79520913) among all three carriers, highly suggesting a common founder origin (Fig. 3a). An extended shared haplotype spanning the entire targeted genotyped *PRUNE2* gene region (~291.5 Kb) was identified in two of the three carriers (HPC119 and HPC139).

To obtain a better resolution of the variant haplotype and to verify if it extended beyond the *PRUNE2* gene, we performed a similar IBD analysis approach using high-density genome-wide SNP data obtained for the Portuguese patients included in the PRACTICAL consortium [37], which included the three variant carriers. The IBD analysis of the genome-wide SNP data (Oncoarray) corroborated the existence of a smaller core shared



**Fig. 2** Pedigrees of the patients carrying the recurrent *PRUNE2* splicing variant, c.509-2A>G. **a** Patient HPC119, **b** patient HPC139 and **c** patient HPC314.

**Table 2.** Missense variants considered “potentially pathogenic” in *PRUNE2*.

Variant position (GRCh37)	rs id	cDNA change; protein change	Number of case carriers (%)	Number of control carriers (N = 710)	MAF (gnomAD-NFE)	MAF (1000G-IBS)	Total prediction <sup>a</sup>
9:79465476	rs189759245	c.247G>A; p.Glu83Lys	1 (0.216%)	0	0.005%	NR	11/15
9:79461550	rs759877968	c.389C>T; p.Pro130Leu	2 (0.433%)	1 male	0.004%	NR	11/15
9:79461497	rs765205658	c.442G>A; p.Val148Met	1 (0.216%)	1 female	NR	NR	11/15
9:79259658	rs772474129	c.8725G>A; p.Gly2909Arg	1 (0.216%)	1 male	0.010%	NR	14/15

NR not reported.

<sup>a</sup>Fraction of functional predictors where the variant is predicted to be pathogenic.

haplotype, matching the conserved region previously identified in the analysis of the T-NGS data. Furthermore, it also revealed that the larger haplotype identified in the two carriers in the initial analysis extended to ~832 Kb (chr9: 78,682,426–79,514,465) (Fig. 3a). The phylogenetic network reconstruction of this extended haplotype region was consistent with the previous analysis, and revealed a high level of genetic variability, with none of the other genotyped participants of the Portuguese PRACTICAL dataset carrying the haplotype flanking the variant (Fig. 3b), further supporting a common ancestor.

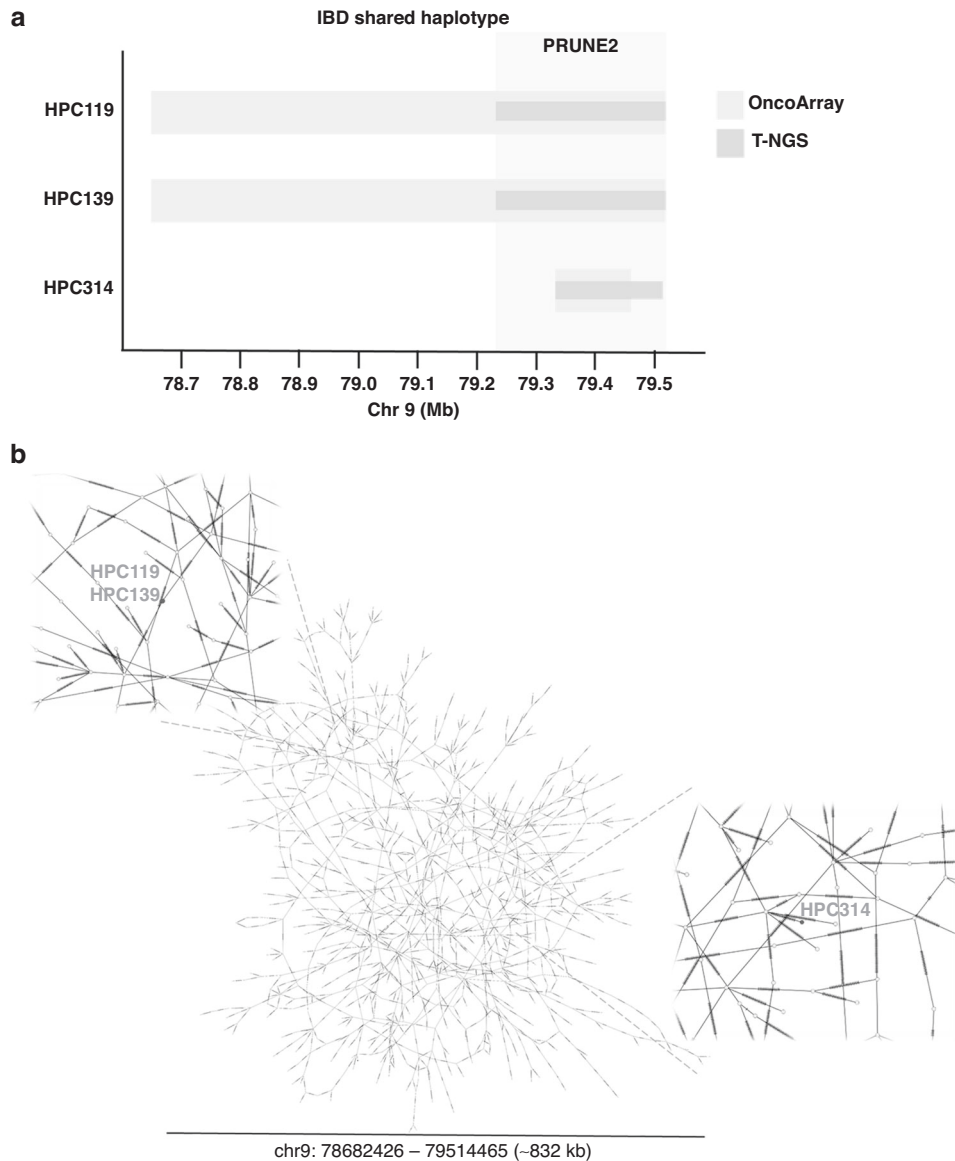
## DISCUSSION

The goal of this work was to identify new genes associated with PrCa genetic susceptibility, so we hypothesised that using a genome-wide approach such as WES in duos and trios of affected relatives, in a relatively homogeneous population, could help us to

prioritise candidate genes. In line with this, we have selected 96 patients from 45 PrCa families of our series of 462 families with early-onset and/or familial/hereditary disease. Recurrently mutated genes with at least one frameshift, nonsense or splicing variant segregating with the disease in the affected family members were prioritised. *PRUNE2*, so far not implicated in PrCa predisposition, stood out as a good candidate gene, due to the significant frequency of variants found in our series and its association with PrCa development [42].

*PRUNE2*, also known as *BMCC1*, was first described by Machida and colleagues, who correlated its increased expression with good prognosis in neuroblastoma patients, attributing to *PRUNE2* a role in cellular transformation, differentiation, and also survival and aggressiveness of tumorigenic cells [43]. *PRUNE2* gained relevance in PrCa due to its association with the well-known non-coding RNA *PCA3* (the most specific PrCa biomarker), which was found to be embedded within intron 6 of *PRUNE2* in the opposite



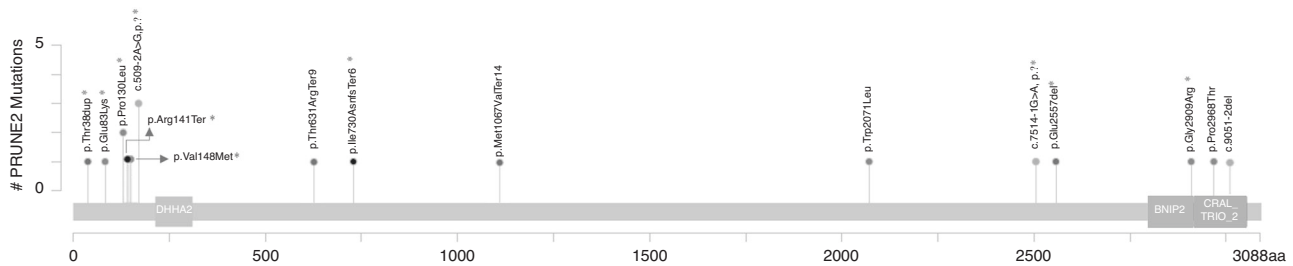


**Fig. 3 IBD analysis for carriers of the splicing variant c.509-2A>G.** **a** Length of the shared haplotype flanking the *PRUNE2* variant c.509-2A>G in the three HPC carriers. The grey shading indicates the entire *PRUNE2* gene. The blue region represents the shared haplotype identified by the analysis of T-NGS data (SureSelect gene panel), whereas the salmon region (which includes also the genes *GCNT1*, *PCSK5* and *RFK*) represents the haplotype identified using the high-density SNP OncoArray genotype data. **b** Median-joining network reconstruction of the extended IBD haplotype region (chr9:78682426–79514465) for the Portuguese PRACTICAL dataset (374 cases and 180 controls). Each circle represents a haplotype, and circle size is proportional to the number of individuals carrying the specific haplotype. The haplotype harbouring the variant is coloured in red and highlighted in detail. Median-joining algorithm was implemented using PopArt software.

orientation [44]. Later, it was shown that *PCA3* and *PRUNE2* negatively regulate each other through a complex post-transcriptional RNA editing mechanism, mediated by adenosine deaminase acting on RNA (ADAR) proteins [42]. The same study reported that *PRUNE2* downregulation increases cell proliferation and transformation. Conversely, *PCA3* knockdown decreases cell proliferation. Furthermore, by using data retrieved from The Cancer Genome Atlas (TCGA), the authors have also demonstrated that in human prostate cancer samples, both the mRNA levels and protein expression of *PCA3* and *PRUNE2*, correlated inversely. High *PRUNE2* and low *PCA3* levels are detected in non-malignant prostate samples, whereas low *PRUNE2* and high *PCA3* are found in prostate carcinomas [42]. For this reason, *PRUNE2* was proposed as a PrCa-specific tumour suppressor gene (TSG).

Here, we report the presence of germline monoallelic variants in *PRUNE2* in early-onset and/or familial PrCa with deleterious and

potentially pathogenic variants being present in 2.8% of the patients (13/462). While a small number of somatic variants have already been reported in PrCa patients in publicly available databases (Fig. 4), to the best of our knowledge, this is the first report of *PRUNE2* germline variants in PrCa patients. Interestingly, most of the variants identified in our patients occur at the 5'- or 3'-terminal regions of the coding sequence (Fig. 4), raising the question to what extent they affect *PRUNE2* expression. Due to the importance of *PRUNE2* in the control of cellular transformation, specifically some of its domains (Fig. 4), it is plausible to assume that these variants may disrupt its normal tumour suppressor function. On the other hand, considering the mutual regulation between *PRUNE2* and *PCA3* [42], it would be interesting to investigate the impact of these germline variants in *PCA3* expression, and how this regulation may contribute to prostate carcinogenesis.



**Fig. 4 Mutation map showing the predicted localisation of the identified *PRUNE2* variants in *PRUNE2* protein.** Variants identified in our patients (marked by an asterisk), as well as variants found in the publicly available databases (source: BioMuta [54]) are shown. Variant circle colour code stands for deleteriousness: black, truncating; red, predicted truncating; yellow, potentially truncating (splicing); and green, missense. Main functional domains are shown: the DHHA2 domain (green) is located at the N-terminal of the protein and interacts with the metastasis suppressor Nm23-H1 [42]; the BNIP2 domain (blue) is important for apoptosis, through the interaction with pro- and anti-apoptotic molecules [55], and the CRAL-TRIO domain (orange), located at the C-terminal of the protein, is involved in actin remodelling, a fundamental process for both cell growth and migration [55].

Using available data from the TCGA Dataset, we also observed that *PRUNE2* expression is decreased in PrCa samples in comparison with adjacent normal prostate (Supplementary Fig. 1), supporting its role as tumour suppressor [42]. However, we also observed that its expression pattern in tumour samples vs normal adjacent tissues is transversal to other tumour types. In fact, two of the 13 patients carrying *PRUNE2* variants, HPC164 (Fig. 1b) and HPC240 (Supplementary Fig. 2), had second neoplasia (colon and kidney, respectively) and several carriers have relatives showing other cancer types (namely, breast and colon), consistent with the decreased *PRUNE2* expression observed in tumour samples of most of the cancers (Supplementary Fig. 1). Moreover, a WES study in patients with parathyroid carcinoma identified one patient with a *PRUNE2* germline variant, along with several other patients carrying somatic variants, altogether representing 18% of the patients [45]. Other authors have also reported inactivating somatic variants in *PRUNE2*, namely in a subset of patients with Merkel cell carcinoma [46], and in patients with solid papillary carcinoma with the reverse polarity of the breast [47]. Altogether, these observations strongly suggest that, as many other TSG, *PRUNE2* might be a pan-cancer TSG.

The identification of recurrent founder variants in clinically relevant genes is important to improve risk assessment in specific populations and may contribute to the development of more cost-effective targeted genetic screening strategies. Therefore, in addition to a genetic screening of early-onset and familial/hereditary PrCa patients to identify pathogenic variants contributing to increased PrCa risk, we sought to investigate whether pathogenic/likely pathogenic variants present in more than two families originated independently or from a single founder mutational event. The haplotype and phylogenetic analyses of the three carriers of the c.509-2A>G *PRUNE2* variant, the only likely pathogenic variant present in three families in this study, revealed a shared and rare haplotype flanking the variant, which corroborates a founder origin instead of multiple independent occurrences. Similarly, several other founder variants in cancer-predisposing genes have been described in distinct populations, including in the Portuguese population [19, 37, 48–50].

In an era of precision and personalised oncology, understanding the molecular basis of hereditary PrCa is paramount for predictive testing and targeted screening, risk evaluation, and ultimately for treatment decision-making [8, 51–53]. By demonstrating that *PRUNE2* is the most frequently mutated gene in our series, occurring in a mutually exclusive manner with deleterious variants in known DNA repair genes (data not shown), we strengthened the association between *PRUNE2* and PrCa development, thereby proposing *PRUNE2* as a novel PrCa predisposition gene.

## DATA AVAILABILITY

Data supporting the results reported in this paper can be found at: <https://hive.biochemistry.gwu.edu/biomuta/proteinview/P38936> and <https://portal.gdc.cancer.gov/>.

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## AUTHOR CONTRIBUTIONS

Conception and design: MT and LGC-C. Data acquisition: MC, SM, PP, AB, RS and NB. Analysis and interpretation of the data: MC, SM, PP, PL and AB. Drafting of the manuscript: MC. Critical revision of the manuscript: MT, PP, LGC-C and AB. Statistical analysis: AB and PL. Funding obtention: MT and LGC-C.

## FUNDING

This work was supported by IPO-Porto Research Center (CI-IPOP-16-2012) and by Fundação para a Ciência e a Tecnologia (FCT); PTDC/DTP-PIC/1308/2014—POCI-01-0145-FEDER-016889). The following authors were funded by FCT with scholarships or research contracts: MC (SFRH/BD/116557/2016), SM (SFRH/BD/71397/2010), AB (PTDC/DTP-PIC/1308/2014—POCI-01-0145-FEDER-016889; POCI-01-FEDER-028245; UIDP/DTP/00776/2020; 2021.03835.CEECIND), and PP (PEst-OE/SAU/UI0776/2014; UID/DTP/00776/2013/POCI-01-0145-FEDER-006868; CEECINST/00091/2018). The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript. Luís Carvajal-Carmona receives funding from The Auburn Community Cancer Endowed Chair on Basic Science and from the National Cancer Institute of the National Institutes of Health (grant P30CA093373). The opinions expressed in this article are the author's own and do not reflect the view of the National Institutes of Health.

## COMPETING INTERESTS

The authors declare no competing interests.

## ETHICS APPROVAL AND CONSENT TO PARTICIPATE

This study was approved by the Institutional Ethics Committee of the Portuguese Oncology Institute-Porto (approval number: 38.010) and performed in accordance with the Declaration of Helsinki. Written consent was obtained from all participants.



## CONSENT TO PUBLISH

Not applicable.

## ADDITIONAL INFORMATION

**Supplementary information** The online version contains supplementary material available at <https://doi.org/10.1038/s41416-022-02125-6>.

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