Whole-genome analysis uncovers recurrent \textit{IKZF1} inactivation and aberrant cell adhesion in blastic plasmacytoid dendritic cell neoplasm

Armando N. Bastidas Torres$^1$ | Davy Cats$^2$ | Hailiang Mei$^2$ | Daniele Fanoni$^3$ | Jessica Gliozzo$^4$ | Laura Corti$^4$ | Marco Paulli$^5$ | Maarten H. Vermeer$^1$ | Rein Willemze$^1$ | Emilio Berti$^4$ | Cornelis P. Tensen$^1$

\textbf{Abstract}

Blastic plasmacytoid dendritic cell neoplasm (BPDCN) is a rare and highly aggressive hematological malignancy with a poorly understood pathobiology and no effective therapeutic options. Despite a few recurrent genetic defects (eg, single nucleotide changes, indels, large chromosomal aberrations) have been identified in BPDCN, none are disease-specific, and more importantly, none explain its genesis or clinical behavior. In this study, we performed the first high resolution whole-genome analysis of BPDCN with a special focus on structural genomic alterations by using whole-genome sequencing and RNA sequencing. Our study, the first to characterize the landscape of genomic rearrangements and copy number alterations of BPDCN at nucleotide-level resolution, revealed that \textit{IKZF1}, a gene encoding a transcription factor required for the differentiation of plasmacytoid dendritic cell precursors, is focally inactivated through recurrent structural alterations in this neoplasm. In concordance with the genomic data, transcriptome analysis revealed that conserved \textit{IKZF1} target genes display a loss-of-\textit{IKZF1} expression pattern. Furthermore, up-regulation of cellular processes responsible for cell-cell and cell-ECM interactions, which is a hallmark of \textit{IKZF1} deficiency, was prominent in BPDCN. Our findings suggest that \textit{IKZF1} inactivation plays a central role in the pathobiology of the disease, and consequently, therapeutic approaches directed at reestablishing the function of this gene might be beneficial for patients.

\textbf{KEYWORDS}

BPDCN, blastic plasmacytoid dendritic cell neoplasm, cell adhesion, cutaneous lymphoma, Ikaros, \textit{IKZF1}, RNA sequencing, whole-genome sequencing
with BPDCN ranges from 12 to 14 months as the disease typically relapses after initial response to chemotherapy.1,2

The pathogenetic basis of BPDCN has been investigated using DNA and RNA array-based methods, and more recently, next generation sequencing (NGS) approaches limited to the exome (whole-exome sequencing) or a panel of genes (targeted sequencing). Recurrent copy number alterations (CNAs) in BPDCN include broad deletions within chromosomes 7, 9, 12, 13, and 15, particularly the regions containing tumor suppressors CDKN2A/B, CDKN1B, and RB1.3-6 Overexpressed genes with pathogenic relevance include BCL2 and CCND1.7 Single nucleotide variants (SNVs) and indels presumed as pathogenic have been observed predominantly in genes involved in cell cycle control (eg, ATM, TP53), chromatin regulation (eg, ASXL1, IDH2, NPM1, TET2), signal transduction (eg, KRAS, NRAS), splicing (eg, ZRSR2) and transcriptional regulation (eg, IKZF1/2/3, ZEB2).8-11 Additionally, cytogenetic studies, most of them performed in the context of case reports, have revealed chromosomal rearrangements involving ALK, ETV6, EWSR1, KMT2A (MLL), MYB, MYC, and SUPT3H in a handful of cases.12-18

Even though these studies have uncovered a variety of genetic abnormalities in BPDCN, none of the reported alterations has provided a clear biological rationale behind neither the genesis of the disease nor its clinical behavior. Furthermore, as yet no study has characterized the landscape of genomic rearrangements and CNAs of BPDCN using high resolution NGS.

Here, we present the first whole-genome analysis of BPDCN with a special emphasis on structural anomalies by using whole-genome sequencing (WGS) and RNA sequencing (RNA-seq). We report recurrent IKZF1 inactivation by focal structural alterations, a loss-of-IKZF1 expression pattern and overexpression of adhesion signatures in BPDCN. Our findings on genome and transcriptome level not only support IKZF1 inactivation as a putative driver event in the development of BPDCN, but also provide a conceptual basis for the pathobiology of the disease.

2 MATERIALS AND METHODS

2.1 Patient material

Frozen tumor biopsies from 10 patients with BPDCN (Table S1) were subjected to WGS. Four samples of this cohort (ie, BDN1, BDN4, BDN5, and BDN6) were additionally subjected to RNA-seq. Diagnosis was performed by an expert panel of dermatologist and pathologists according to the criteria of the WHO-EORTC classification for primary cutaneous lymphomas.2,19,20 Frozen tumor biopsies from 15 additional patients were used for validation purposes (extension cohort) (Table S1). Patient material was approved by the institutional review boards of Fondazione IRCCS Ca’ Granda Ospedale Maggiore Policlinico, Leiden University Medical Center and University of Pavia. Informed consent was obtained from patients in accordance with the declaration of Helsinki.

2.2 Nucleic acid isolation

Genomic DNA was isolated using Genomic-tip 20/G kit (Qiagen). DNA purity was evaluated with a Nanodrop One system (Nanodrop Technologies, Wilmington, California) and DNA integrity was verified by gel electrophoresis (0.7% agarose, ethidium bromide). Total RNA was isolated using RNeasy mini kit (Qiagen). RNA integrity was verified with an Agilent 2100 Bioanalyzer.

2.3 Sequencing and data processing

Sequencing was performed by the Beijing Genomics Institute (BGI) and data was processed at Leiden University Medical Center (LUMC). DNA libraries were subjected to paired-end sequencing (2 × 150 bp) on the Illumina HiSeq X-Ten platform while RNA libraries derived from rRNA-depleted total RNA were subjected to paired-end sequencing (2 × 100 bp) on the Illumina HiSeq 4000 platform. Raw reads (WGS, RNA-seq) were processed using in-house pipelines and clean reads were aligned to human reference genome Hg38 (Table S2). WGS and RNA-seq data have been deposited in the European Genome-Phenome Archive (EGA) under study number EGAS00001003660.

2.4 Detection of genomic rearrangements and fusion transcripts

Detection of structural genomic variants (SV) was performed using an in-house pipeline that included three structural variant callers (Breakdancer-max v1.4.4, CleverSV v2.0rc3 and Delly v0.6.7) (Table S3). SV calls were manually verified and curated using the Integrative Genomic Viewer (IGV, v2.3.78). The expression of fusion transcripts was investigated in four BPDCN samples with available RNA-seq data using an in-house pipeline that included two fusion transcript callers (FusionCatcher v0.99.6a and Star Fusion v0.8.0) (Table S4). Fusion transcript calls were contrasted with genomic SV data and visually verified on DNA level using IGV. Rearranged genes implicated in cancer were identified using the Network of Cancer Genes 6.0 (NCG 6.0)23 and literature search.

2.5 Detection of CNAs

Control-FREEC was used to identify CNAs using a 50 Kb window. The output was subjected to a Wilcoxon rank test and a Kolmogorov-Smirnov test to generate a list of genomic regions with statistically supported CNAs, and the latter were intersected to define recurrent events. As a complement, GISTIC2.0 analysis was performed with segment files derived from Control-FREEC (Figure S1, Table S5). Recurrent CNAs derived from both analyses were visually verified and curated using IGV (Table S6). Only CNAs confirmed after inspection are reported.
2.6 Detection of SNVs and indels

SNVs and indels were detected using GATK (v3.5). Variants filtered out of the output included SNVs present in dbSNP, SNVs with >5% minor allele frequency in the Exome aggregation consortium (ExAC) database, and SNVs present in an in-house cohort formed by 11 healthy volunteers. We searched for deleterious SNVs in 1271 genes taking part in signal transduction pathways, the cell cycle, hematopoietic cell differentiation, and cellular processes previously identified as mutated in BPDCN.8-10 Gene lists were retrieved from the PathCards database (http://pathcards.genecards.org/). Only SNVs predicted to produce highly deleterious amino acid substitutions by both SIFT and PolyPhen-2 were further investigated on ClinVar, COSMIC, Varsome, and literature.

2.7 Differential expression analysis

TMM normalization was applied to raw count data using EdgeR and differential expression analysis was performed using Limma-Voom. BPDCN samples were compared to a control group formed by resting pDCs. RNA-seq data of pDC controls were generated by Alculumbre et al and downloaded from GEO (https://www.ncbi.nlm.nih.gov/geo; GSE84204).22 Genes with a FDR < 0.01 were considered differentially expressed (DE).

2.8 Gene ontology annotation and transcriptome analysis

Gene ontology annotation of rearranged genes and pathway analysis with DE genes were performed using DAVID (v6.8) using default settings.23 Gene set enrichment analysis (GSEA, v2.2.4) was run as a pre-ranked analysis with 1000 permutations using gene set KEEG from the Molecular Signatures Database (MSigDB).24 Normalized enrichment scores (NES) were calculated to determine expression signatures. FDR q values were obtained. Additional functional characterization of the transcriptome (ie, ENCODE and CORUM databases) was performed using Enrichr.25

2.9 Validation of structural genomic alterations and small-scale mutations

Select genomic rearrangements, interstitial deletions, indels, and SNVs were validated by Sanger sequencing. Briefly, target sequences were amplified by PCR, run on a 1% agarose gel, column-purified and sequenced on the Applied Biosystems ABI3730xl platform. Validation of select CNAs was performed using Bio-Rad QX200 droplet digital PCR (ddPCR) system. ddPCR experiments were carried out following the manufacturer’s guidelines. Briefly, 20 to 40 ng of genomic DNA was mixed with a frequent-cutting restriction enzyme, ddPCR supermix, probes against the gene of interest (FAM-labeled) and probes against the reference gene (HEX-labeled). The reaction mix was then partitioned into 20,000 nanodroplets, and subsequently, subjected to the following cycling program: 95°C for 10 minutes, 39 cycles of 94°C for 30 seconds, and 60°C for 1 minute, and 98°C for 10 minutes. Copy number values were determined using Bio-Rad Quantasoft software v1.7.4. Copy number reported for IKZF1 (at exons 1, 5, and 8) in samples from the validation cohort are the average of 3 independent measurements using different reference genes.

3 RESULTS

3.1 Landscape of genomic rearrangements

BPDCN displayed a heterogenous landscape of rearrangements. We detected a total of 86 rearrangements in 10 BPDCN genomes (Figure 1). The number of events per patient ranged from 1 to 18 (mean/patient ± SD, 9 ± 5) (Figures 2A and S2). Intrachromosomal events constituted 66% of all rearrangements (range/patient, 0%-100%) (Figure 2B). We observed events joining either two annotated genes (32% of events), a gene with a nongenic region (36%), two nongenic regions (27%), or rearranging sequences within a single gene (5%) (Figure 2C).

Genomic rearrangements disrupted a total of 54 genes across 10 patients (Table S7). Out of 54 rearranged genes, 13 are implicated in cancer at present (Figure 1, Table S8). The latter group included genes implicated in hematological malignancies (ie, AH11, CD36, IKZF1, MLLT4, MYB, TFG) and other neoplasms (ie, FAT1, IQGAP2, NRG1, PIK3C2G, PMS1, PPFIBP1, PTPRD). Gene ontology analysis showed that rearranged genes primarily encode proteins that participate in cellular component organization (esp. cytoskeleton-related processes), cell adhesion and transcriptional regulation (Figure 2D, Table S9).

We observed two recurrently rearranged genes, MYB and TMTC1, both of them in 2 of 10 patients. The type of MYB rearrangements found in our patients (BDN3 and BDN10) have been previously described in BPDCN and result in a gain-of-function effect due to the loss of the 3’-end of the gene which contains conserved target sites for inhibitory microRNAs (miRNAs).16 In contrast, the observed TMTC1 rearrangements do not seem to have analogous functional consequences (ie, dissimilar breakpoint positions, loss vs gain of DNA, genic vs nongenic partner sequences). We detected additional rearrangements reported in cancer before. An oncogenic rearrangement involving SUPT3H, found in patient BDN1, has been previously described in BPDCN.18 Also, fusion gene NAV2-TCF7L1, found in patient BDN7, is recurrent in colorectal cancer.26

Notably, we identified rearrangements leading to IKZF1 inactivation. Fusion gene TMTC1-IKZF1, found in patient BDN6, had a truncated coding sequence (CDS) encoding a peptide constituted only by the first 77- AA of TMTC1 due to the formation of a premature stop codon; thus, preventing the synthesis of a functional IKZF1 protein (Figures 2E and 5C). Another patient, BDN2, underwent a chromothripsis-like event in chromosome 7 that resulted in the
deletion of several focal areas within 7p and 7q, including a narrow region (450 Kb) containing *IKZF1* (Figure 2F).

### 3.2 Landscape of CNAs

BPDCN exhibited a predominance of large-scale chromosomal imbalances. Broad numerical aberrations (>3 Mb) included monosomy 9 (four patients), as well as deletions within 3p (two patients), 6q (five patients), 7p (three patients), 9p (two patients), 9q (three patients), 12p (three patients), 13q (six patients), 15q (two patients), and Y (two patients). Also, broad gains within 1q (three patients), 7q (two patients) and 12q (two patients) (Figures 3 and 4).

We detected seven focal (<3 Mb) minimal common regions (MCRs) between CNAs affecting our sequenced patients (Table S6). Out of seven focal MCRs, six contained either *bona fide* or candidate cancer genes. These focal MCRs were deletions at 9q21.32, 7p12.2, 13q14.2, 6q25.1, 12p13.1, and 7p14.1-p14.2 observed in eight, seven, six, five, four, and three out of 10 sequenced patients, respectively (Figure 4). Cancer genes residing within these regions are mainly involved in hematopoiesis and cell cycle regulation.

The most common focal MCRs were deletions at 9q21.32 and 7p12.2 which contained, respectively, tumor suppressors *HNRNPK* and *IKZF1*. *HNRNPK* encodes a nuclear ribonucleoprotein that influences multiple cellular functions (eg, cell cycle, chromatin remodeling, RNA synthesis, and processing) in hematopoietic cells.\(^{27}\) *IKZF1*, on the other hand, encodes a transcription factor with critical roles in the development of various hematopoietic lineages, including pDCs.\(^{28-31}\) Remarkably, deletions at 7p12.2 were considerably narrow (<500 Kb) in four of seven affected patients, ranging from loss of *IKZF1* and a few neighboring genes, to loss of the *IKZF1* locus exclusively, to loss of *IKZF1*'s exon 8 only (Figure 5A,B). Patients where deletions did not involve the whole locus, but part of it, enclosed exons encoding *IKZF1*'s functional domains (Figure 5B). For instance, the loss of exon 8 in patient BDN1 generated a CDS encoding an *IKZF1* protein that lacked its C-terminal dimerization domain, which is essential for its functionality (Figure 5D).

Deletions at 13q14.2 and 6q25.1 encompassed, respectively, *RB1* and *SYNE1*. *RB1* encodes an established negative regulator of the cell cycle whereas candidate tumor suppressor *SYNE1*, which is often silenced by hypermethylation in lung cancer,\(^{32}\) encodes a cytoskeleton-associated protein that helps maintain subcellular spatial organization.

Deletion at 12p13.1 included tumor suppressors *CDKN1B*, *DUSP16*, and *ETV6* which play roles in the cell cycle, signal transduction and hematopoiesis, respectively. Finally, deletion at 7p14.1-p14.2 enclosed tumor suppressor *SFRP4*, a negative regulator of WNT signaling.

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**FIGURE 1** Landscape of genomic rearrangements in BPDCN. Circos plot showing 86 genomic rearrangements detected in 10 BPDCN genomes by WGS. The outer ring is formed by human chromosome ideograms arranged circularly end to end. The area at the center of the plot contains arcs representing interchromosomal (blue) and intrachromosomal (red) events. The ring between the chromosome ideograms and the arcs contains rearranged genes with established roles in cancer. BPDCN, blastic plasmacytoid dendritic cell neoplasm; WGS, whole-genome sequencing [Color figure can be viewed at wileyonlinelibrary.com]
3.3 | Small-scale mutations

We looked for small-scale mutations (i.e., indels, SNVs) with potential pathogenic relevance in exonic sequences of genes involved in the cell cycle, hematopoietic cell differentiation, signal transduction (i.e., JAK-STAT, MAPK, NF-κB, and PI-3-K/Akt signaling pathways) and genes that have been previously found to be mutated in BPDCN (Table S10). Two gain-of-function SNVs, BRAF (p.G464V) and NRAS (p.G12A), were observed in patient BDN5. NRAS (p.G12A), a SNV associated with melanoma and lung cancer, was found in patient BDN2. Truncating frameshift mutations in ASXL1 (p.E635Rfs*15, p.V624Gfs*8) were observed in BDN4/9 and BDN7, respectively. Also, seven patients carried indels and SNVs leading either to premature stop codons or amino acid substitutions predicted as deleterious in

**FIGURE 2** Distribution of genomic rearrangements and gene ontology annotation of rearranged genes in BPDCN. A. Number of genomic rearrangements per patient. The distribution of inter- and intrachromosomal rearrangements per patient is shown too; B. Distribution of inter- and intrachromosomal rearrangements (cohort); C. Distribution of genomic rearrangements based on the type of DNA sequences (genic, nongenic) involved in the event (cohort); D. Distribution of rearranged genes according to the biological process their encoded protein participates in; E. Circos plot showing interchromosomal rearrangement t(7;12)(p12;p11) in patient BDN6 which fuses TMT1 with IKZF1, causing the inactivation of the latter. F. Circos plot displaying a chromothripsis-like event in patient BDN2 which mediated the loss of several focal regions in chromosome 7, including a narrow area (450 Kb) containing IKZF1. BPDCN, blastic plasmacytoid dendritic cell neoplasm [Color figure can be viewed at wileyonlinelibrary.com]
Of note, we found mutations in \textit{IKZF1} (i.e., BDN9: p.H421Afs*68, BDN4: p.H480Y) that impacted the dimerization domain of this gene. The former mutation generates an IKZF1 protein with a truncated dimerization domain while the latter leads to an amino acid substitution predicted as deleterious (Figures S3 and S4).

Finally, we found 24 additional patient-specific SNVs of unknown significance in cancer-associated genes, including genes previously implicated in BPDCN (i.e., \textit{ARID1A}, \textit{ASH1L}, \textit{ASXL3}, \textit{ATR}, \textit{CBLC}, \textit{CHD8}, \textit{EP400}, \textit{ETV6}, \textit{PHC2}, \textit{RAD52}, \textit{SMARCD1}, \textit{SRSF2}, and \textit{ZRSR2}) (Table S11).

### 3.4 | DE genes

Prior research using array-based gene expression profiling showed that BPDCN cells appear to originate from pDC precursors that are phenotypically close to resting pDCs.\(^7\) Therefore, to determine DE genes in the disease, we compared gene expression in BPDCN with gene expression in resting pDCs. The analysis uncovered 1827 DE genes (1191 up-regulated, 636 down-regulated, FDR < 0.01) (Figure 6A, Table S12), 272 of which are currently associated with cancer (213 up-regulated, 64 down-regulated) (Table S13). Up-regulated genes included (proto-)oncogenes with roles in apoptosis (i.e., \textit{BCL2}, \textit{TERT}), cell cycle regulation (i.e., \textit{FOXM1}), hematopoietic cell development (i.e., \textit{AFF3}, \textit{MYB}), and signal transduction (i.e., \textit{BCL9}, \textit{FGFR1}, \textit{MET}, \textit{PDGFRB}, \textit{PDGFRB}, \textit{PLCG1}, \textit{RRAS2}) (Figure 6B). Prominent down-regulated genes included cell cycle inhibitors (i.e., \textit{BTG2}, \textit{IFIT3}, \textit{TSPYL2}, \textit{TXNIP}) and tumor suppressors implicated in hematological malignancies (i.e., \textit{PTPRO}, \textit{SAMD9L}) (Figure 6B).
FIGURE 5  Legend on next page.
Transcriptome analysis with Enrichr using ChiP-seq data from ENCODE revealed that genes regulated by EZH2, TCF12, and FOXM1 are greatly overrepresented in the group of up-regulated genes (Figure 6C, Table S14). EZH2 is part of polycomb repressive complex 2 (PRC2), a gene silencing protein complex that influences various cellular processes, including hematopoietic cell differentiation.36 Transcription factor TCF12, on the other hand, participates in T-cell differentiation and is typically lowly expressed in mature pDCs.37 Finally, transcription factor FOXM1, which is overexpressed in numerous cancers, takes part in multiple biological processes (eg, apoptosis, cell cycle, DNA damage response).38

Since IKZF1 deletion was the most focal recurrent CNA in our sequenced cohort, we next looked at the expression of a group of evolutionarily conserved IKZF1 target genes that are associated with the development of BCR-ABL1+ pre-B acute lymphoblastic leukemia (pre-B ALL)39,40 (Table S15), an aggressive hematological cancer characterized by IKZF1 inactivation. We detected 29 DE cancer-associated IKZF1 target genes (25 up-regulated, 4 down-regulated) in BPDCN (Figure 6D). The expression of all IKZF1 target genes matched perfectly the expected consequence of IKZF1 deficiency; that is, genes repressed by IKZF1 were up-regulated while genes activated by IKZF1 were down-regulated. Genes of interest in the group of up-regulated IKZF1 targets included among others, CCND1, CD42BPP, and IFITM3. Cyclin D1 (encoded by CCND1) promotes G1/S transition in the cell cycle and has been previously found to be overexpressed in BPDCN.7 CDC42BPP encodes a serine/threonine kinase with roles in cytoskeletal reorganization and cell migration.41 Interestingly, overexpression of this kinase has been shown to facilitate cancer cell invasion.42 Finally, IFITM3 encodes an antiviral membrane protein that has been shown to trigger CD19-mediated PI-3-K/Akt signaling in pre-B ALL.43

3.5 Deregulated processes/pathways

We performed pathway analysis with DAVID to identify deregulated cellular processes/pathways in BPDCN. The analysis uncovered up-regulation of several adhesion profiles: ECM-receptor interaction (P = 2.51 × 10^{-15}), focal adhesion (P = 5.61 × 10^{-14}), adherens junction (P = 2.64 × 10^{-5}), and Rap1 signaling (P = 4.58 × 10^{-5}). BPDCN also displayed up-regulation of PI-3-K/Akt signaling (P = 6.46 × 10^{-11}) and the cell cycle (P = 8.22 × 10^{-5}) (Figure 6E, Table S16). Down-regulated cellular processes included ribosome synthesis (P = 3.34 × 10^{-7}), oxidative phosphorylation (P = 4.11 × 10^{-12}) and protein processing in the endoplasmic reticulum (ER) (P = 6.98 × 10^{-6}) (Figure 6F, Table S16). To complement DAVID analysis, we performed GSEA using gene set KEEG from MSigDB. GSEA confirmed that BPDCN is characterized by the up-regulation of adhesion signatures (Figure 6G, Table S17). Importantly, these deregulated profiles support an IKZF1-deficient phenotype of BPDCN cells, as previous studies performed by others have established that a hallmark of IKZF1 deficiency in immune cells (ie, pDCs, pre-B cells) is the overexpression of proteins responsible for cell-cell and cell-ECM interactions.29,44

Additionally, we identified a group of up-regulated genes encoding components of the integrin-cytoskeleton network that have been proven to undergo up-regulation as a result of IKZF1 deficiency in murine models of pre-B ALL (Figure 6H).44 One of these genes, THY1 (CD90), encodes a membrane glycoprotein involved in integrin signaling and adhesion. Notably, THY1 is one of the key surface molecules underlying the highly adhesive phenotype of IKZF1-deficient malignant cells in BCR-ABL1+ pre-B ALL.45,46 Another gene, CTTN, encodes cortactin, a cytoplasmic protein that participates in the formation of podosomes in motile cells. Cortactin overexpression occurs in a number of aggressive cancers and promotes the formation of invadopodia (hyperactive podosomes) which make malignant cells highly invasive and migratory.47 Interestingly, transcriptome analysis with Enrichr using CORUM database predicted the existence of protein complex DDEF1-CTTN-PXN in BPDCN cells (Figure 6I, Table S18). This cytoskeleton-associated protein complex has been found exclusively in malignant cells with highly invasive behavior (breast cancer), and not in their noninvasive or normal counterparts.48

3.6 Structural alterations involving IKZF1 are recurrent in BPDCN

Since the findings derived from our genome and transcriptome analyses strongly pointed at IKZF1 as a central player in the pathogenesis of BPDCN, we next used ddPCR to assess the copy number of IKZF1

FIGURE 5 Interstitial deletions and rearrangements inactivate IKZF1 in BPDCN. A. Diagram representing the hemizygous loss of IKZF1 (217 Kb-3.8 Mb) in BPDCN tumors. Blue bars depict deleted areas at 7p12.2 in tumors from three patients with BPDCN. Monallelic IKZF1 deletion occurred through narrow interstitial deletions in patients BDN3 and BDN10, and through a complex intrachromosomal rearrangement in patient BDN2 (see also Figure 2F). B, Diagram showing inactivating structural changes at the IKZF1 locus in BPDCN tumors. These events included narrow interstitial deletions (BDN1/9) and an unbalanced interchromosomal rearrangement (BDN6). The breakpoints of all IKZF1-inactivating structural alterations were validated by Sanger sequencing. Genomic coordinates of breakpoints according to reference genome Hg38. Arrows indicate the direction toward which genomic coordinate numbers increase. Plus (+) and minus (−) signs specify strand polarity; C. The fusion between TMTC1 and IKZF1 in patient BDN6 generated a truncated coding sequence (77-AA) due to the formation of a premature stop codon (shown in RNA-seq reads), rendering IKZF1 inactive on protein level. D, Sashimi plots showing RNA expression at IKZF1 in patient BDN1 (purple) and control sample pDC3 (green). Due to a focal interstitial deletion (blue bar), the transcript of IKZF1 in patient BDN1 lacks exon 8, and instead includes a readthrough sequence starting from exon 7 toward the remaining part of the 3′-UTR and beyond. The resulting transcript encodes a functionally defective IKZF1 protein that lacks its dimerization domain. BPDCN, blastic plasmacytoid dendritic cell neoplasm; CTX, intrachromosomal rearrangement; iDel, interstitial deletion; iTX, intrachromosomal rearrangement [Color figure can be viewed at wileyonlinelibrary.com]
FIGURE 6  Legend on next page.
in tumors from 15 additional patients. Because our genomic data showed that IKZF1-disrupting unbalanced rearrangements and deletions did not affect the entire locus in all patients, but deleted only the 5'-end or the 3'-end of IKZF1 in some of them (Figures 5B and 7A), we evaluated copy number at three different exons (ie, 1, 5, and 8). Exons 1, 5, and 8 encode, respectively, the leader sequence (5'-UTR), two of the four Zn fingers forming the DNA-binding domain, and the dimerization domain of IKZF1.

CNAs involving IKZF1 were detected in 6 of 15 (40%) patients from the extension cohort, 5 of which had deletions (Figure 7B). Interestingly, one patient (BDN15) displayed normal copy number at exon 1 and 8, but a gain at exon 5, suggesting a focal duplication of one or more exons within the IKZF1 locus (Figure 7B). Of note, focal exon duplications in tumor suppressors can generate inactivating frame-shifts, as documented in BRCA1. Overall, combining the sequenced and extension cohorts, 13 of 25 patients (52%) had structural alterations involving IKZF1.

4 | DISCUSSION

In this study we describe the first high resolution whole-genome analysis of BPDCN using WGS. Our analysis, which focused on structural genomic alterations, identified 54 genes disrupted by rearrangements which are predominantly involved in cytoskeleton-associated processes, adhesion and transcriptional regulation. Out of 54 rearranged genes, 13 are involved in malignancies at present, being IKZF1 and MYB the only cancer genes recurrently impacted by rearrangements in our sequenced cohort. We identified 6 recurrently deleted genomic regions enclosing recognized tumor suppressors (ie, CDKN1B, ETV6, HNRNPK, IKZF1, RB1, and SFRP4) with important roles in hematopoiesis and cell cycle regulation. In addition, deleterious indels and SNVs in ASXL1, IKZF1, NRAS, and TET2 were recurrent in our patients.

IKZF1 inactivation, which mainly occurred through narrow interstitial deletions (9.5 Kb-3.8 Mb) and unbalanced rearrangements, was the most prominent alteration in BPDCN due to its focality, recurrence, and likely adverse effects during early development of pDCs. The latter is supported by the fact that IKZF1 deficiency keeps pDC precursors stuck at an early differentiation stage whereas function-imparing changes in both IKZF1 alleles lead to absence of pDCs in murine models. Using an independent cohort, we confirmed by ddPCR that structural alterations at the IKZF1 locus are recurrent in BPDCN. Although the incidence of CNAs involving IKZF1 was lower in the extension cohort compared to the sequenced cohort (difference not statistically significant, \( P > .05 \)), patients with normal IKZF1 copy number might still carry inactivating balanced rearrangements, indels or SNVs which do not entail numerical changes. In agreement with the recurrent IKZF1 inactivation observed in BPDCN, transcriptome analysis revealed that conserved IKZF1 target genes show a clear loss-of-IKZF1 expression pattern.

Even though the roles of IKZF1 in hematopoiesis and leukemogenesis are only starting to be understood, it is currently well-established that insufficiency of functional IKZF1 proteins leads to overexpression of adhesion molecules, surface receptors and ECM proteins in immune cells, as demonstrated in murine pDC precursors carrying hypomorphic \textit{ikzf1} alleles (eg, \textit{Iglf1}, \textit{Mmp14}, \textit{Ncam1} \[\textit{Cd56}\], \textit{Thy1}, etc.\). Murine B cell precursors engineered to produce Ikzf1 proteins lacking DNA-binding ability (eg, \textit{Igta9}, \textit{Igzb3}, \textit{Lamb1}, \textit{Mmp14}, etc.) and malignant cells derived from murine models of BCR-ABL1+ pre-B ALL carrying loss-of-function mutations in \textit{ikzf1} (eg, \textit{Cd28}, \textit{Igta5}, \textit{Thy1}, etc.) have shown that IKZF1 deficiency in BPDCN might underlie or contribute to the observed overactivation of PI-3-K/Akt pathway. Hence, IKZF1 deficiency in BPDCN might underlie or contribute to the observed overactivation of the PI-3-K/Akt pathway. In contrast, the Rap1 pathway regulates cell motility and integrin-mediated adhesion in leukocytes, lymphocytes and dendritic cells, both of which are processes hijacked by neoplastic cells to disseminate to other body sites. In fact, activation of Rap1 signaling has been shown to trigger migration of T-acute lymphoblastic leukemia and B-cell lymphoma cells, in vitro and in vivo, respectively.

We found that genes silenced by PRC2 (EZH2) were the most overrepresented in the group of up-regulated genes in BPDCN. This agrees with the observed up-regulation of adhesion profiles in BPDCN.

BPDCN displayed up-regulation of the PI-3-K/Akt pathway and the Rap1 pathway. The PI-3-K/Akt pathway, often overactivated in human cancers, promotes cancer cell proliferation. Notably, IKZF1 has been shown to transcriptionally repress components of the PI-3-K/Akt pathway (eg, \textit{PIK3CD}, \textit{PIK3CB}, \textit{PIK4CB2}) and, conversely, IKZF1-deficient malignant cells from murine models of pre-B ALL show overactivation of PI-3-K/Akt signaling. Hence, IKZF1 deficiency in BPDCN might underlie or contribute to the observed overactivation of the PI-3-K/Akt pathway. In contrast, the Rap1 pathway regulates cell motility and integrin-mediated adhesion in leukocytes, lymphocytes and dendritic cells, both of which are processes hijacked by neoplastic cells to disseminate to other body sites. In fact, activation of Rap1 signaling has been shown to trigger migration of T-acute lymphoblastic leukemia and B-cell lymphoma cells, in vitro and in vivo, respectively.

We found that genes silenced by PRC2 (EZH2) were the most overrepresented in the group of up-regulated genes in BPDCN. This agrees
with a previous report of a loss-of-EZH2 expression signature in tumor cells from patients with highly aggressive BPDCN. Remarkably, it has been established that IKZF1, which predominantly acts as a transcriptional repressor, silences genes in erythroid and T-cell precursors by recruiting PRC2 to target sites. Thus, up-regulation of genes silenced by PRC2 in BPDCN might result from shortage of functional IKZF1 molecules, which in turn, would hinder PRC2 recruitment to target sites.

Interestingly, analysis of DE genes in BPDCN not only confirmed up-regulation of \(BCL2\) and \(MYB\) as described in previous studies, but also uncovered additional up-regulated (proto-) oncogenes of interest. \(AFF3\), for instance, encodes a transcriptional activator expressed in early lymphoid development which appears to be leukemogenic in patients with pre-B ALL carrying MLL-AFF3 fusions.\(^{57}\) FOXM1, on the other hand, promotes cell proliferation and dissemination in a plethora of neoplasms by inducing cell cycle progression (esp. at G2/M) and the acquisition of an invasive phenotype.\(^{38}\) RRAS2, which encodes a small GTPase involved in PI-3-K/Akt signaling, has been found to be overexpressed in a number of lymphoid malignancies, including cutaneous T cell lymphoma (CTCL).\(^{58}\) Other prominent up-regulated oncogenes encode receptors (ie, \(FGFR1\), \(MET\), and \(PDGFRA/\beta\)) that signal through the PI-3-K/Akt pathway.

In addition, we identified in BPDCN a group of down-regulated genes encoding cell proliferation inhibitors. BTG2, a member of the BTG/Tob family, stops the cell cycle at G1/S by down-regulating...
cyclin D1, or at G2/M by preventing binding between cyclin B1 and CDK1.\textsuperscript{59} IFIT3 and TXNIP, which increase expression of p21/p27 and p27, respectively, promote cell cycle arrest at G0/G1.\textsuperscript{60,61} TSPYL2 triggers the inhibition of several cell cycle kinases (ie, CDK1, 2, 4, 6), halting the cell cycle at multiple phases (G1 to M).\textsuperscript{62}

It has not escaped our notice the apparent parallelism between BPDCN and BCR-ABL1+ pre-B ALL in terms of deregulated genes and cellular processes. We hypothesize that these similarities are rooted in the recurrent inactivation of IKZF1 occurring in both neoplasms. This may also explain the positive effects of ALL-like therapy for the treatment of patients with BPDCN.

In summary, our data strongly supports IKZF1 inactivation as a key event in the development of BPDCN. First, IKZF1 was found to be inactivated by structural alterations in 7 of 10 patients from our sequenced cohort, and recurrent IKZF1 inactivation was confirmed in an extension cohort. Secondly, expression of conserved IKZF1 target genes in BPDCN was fully consistent with a loss-of-IKZF1 phenotype. Thirdly, expression signatures in BPDCN matched known physiological consequences of IKZF1 deficiency (ie, aberrant adhesion, activation of the PI-3-K/Akt pathway) in immune cells. Finally, since IKZF1 is critical for pDC differentiation, its abrogation can be expected to derail normal development of pDC precursors, conceivably leading to their malignization.

Based on our findings, we suggest that counteracting the pathogenic loss-of-IKZF1 phenotype of malignant cells in BPDCN through pharmacological induction of the wild-type IKZF1 allele (eg, by using retinoids)\textsuperscript{65} might have beneficial therapeutic effects on patients with BPDCN.

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CONFLICT OF INTEREST

The authors declare no conflicts of interest.

AUTHOR CONTRIBUTIONS

A.N.B.T., D.F., E.B., and C.P.T. designed the project. A.N.B.T. and C.P.T. wrote the manuscript. A.N.B.T., D.C., and H.M. performed the bioinformatic analyses. A.N.B.T. interpreted the data, performed the experiments and produced figures and tables. D.F., J.G., L.C., M.P., M.V., R.W., and E.B. provided valuable biological specimens. A.N.B.T., D.F., E.B., and C.P.T. designed the project. A.N.B.T. and C.P.T. revised and approved the final manuscript.

DATA AVAILABILITY STATEMENT

The data that support the findings of this study are openly available in the European Genome-Phenome Archive (EGA) at https://www.ebi.ac.uk/ega/home, reference number [EGAS00001003660].

ORCID

Armando N. Bastidas Torres @ https://orcid.org/0000-0003-1579-917X

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**SUPPORTING INFORMATION**

Additional supporting information may be found online in the Supporting Information section at the end of this article.

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