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## Genomic and transcriptomic correlates of thyroid carcinoma evolution after BRAF inhibitor therapy

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### Abstract

Targeted inhibition of BRAF V600E achieves tumor control in a subset of advanced thyroid tumors. Nearly all tumors develop resistance, and some have been observed to subsequently undergo dedifferentiation. The molecular alterations associated with thyroid cancer dedifferentiation in the setting of BRAF inhibition are unknown. We analyzed targeted next-generation sequencing data from 639 advanced, recurrent and/or metastatic thyroid carcinomas, including 15 tumors that were treated with BRAF inhibitor drugs and had tissue sampled during or post treatment, 8 of which had matched pre-therapy samples. Pre- and post-therapy tissues from one additional patient were profiled with whole exome sequencing and RNA expression profiling. Mutations in genes comprising the SWI/SNF chromatin remodeling complex and the PI3K/AKT/mTOR, MAPK, and JAK/STAT pathways all increased in prevalence across more dedifferentiated thyroid cancer histologies. Of 7 thyroid cancers that dedifferentiated after BRAF inhibition, 6 had mutations in these pathways. These mutations were mostly absent from matched pre-treatment samples and were rarely detected in tumors that did not dedifferentiate. Additional analyses in one of the vemurafenib-treated tumors before and after anaplastic transformation revealed the emergence of an oncogenic *PIK3CA* mutation, activation of ERK signaling, dedifferentiation, and development of an immunosuppressive tumor microenvironment. These findings validate earlier preclinical data implicating these genetic pathways in resistance to BRAF inhibitors, and suggest that genetic alterations mediating acquired drug resistance may also promote thyroid tumor dedifferentiation.

## Keywords

Thyroid cancer; Anaplastic transformation; BRAF inhibitors

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## Introduction

The vast majority of cancers arising from the thyroid gland are papillary thyroid carcinomas (PTC), a disease with generally indolent course and a high rate of cure after standard therapy. However, through a process of gradual microevolution, aggressive variants of PTC can develop and transition to dedifferentiated histologies with poorer prognoses, such as poorly differentiated thyroid carcinoma (PDTC) and anaplastic thyroid carcinoma (ATC) (1,2). After evolution to anaplastic histology, the disease generally becomes incurable, with 1-year overall survival rates of 35% in the era of concurrent chemoradiation therapy (3,4).

A deeper understanding of the genetic alterations underlying thyroid cancer has facilitated the development of targeted therapies for clinically aggressive tumors; for example, inhibition of oncogenic drivers such as the BRAF V600E oncoprotein. Tumor responses to these drugs are often short-lived and drug resistance is inevitable. Many tumors harbor genetic alterations that may confer primary resistance. Alternatively, other tumors develop acquired resistance, either via restoration of MAPK signaling via mutations in RAS (5) or other genes (6), or via pathway bypass by signaling through alternative pathways such as PI3K/AKT (7), JAK/STAT (8), EGFR (9) or HER2/HER3 (10).

A third mechanism of resistance to targeted therapy is the development of an alternative cell state, often involving tumor dedifferentiation as a result of selective pressures exerted by pathway blockade (11). Dedifferentiation has been demonstrated to occur after BRAF inhibition in melanoma (12,13) and thyroid tumors (9). Although rare, there have been a small number of reported cases of differentiated thyroid cancers transforming to ATC after BRAF inhibition (14). The mechanism underlying this phenomenon is unclear. While past studies have evaluated the molecular correlates of anaplastic evolution (15) and BRAF inhibitor resistance separately (16), anaplastic transformation in the setting of BRAF inhibitor therapy has yet to be specifically explored, to our knowledge.

To better understand possible mechanisms of this phenomenon, we performed genomic analyses in thyroid cancers across the spectrum of histologic differentiation, and in matched samples before and after exposure to BRAF inhibitors for thyroid cancers harboring *BRAF* V600E mutations, some of which underwent dedifferentiation.

## MATERIALS AND METHODS

### Study Oversight

This study was approved by the Memorial Sloan Kettering Cancer Center (MSKCC) Institutional Review Board. Patients provided written informed consent for collection and analysis of tumor and blood samples.

## Specimen Collection

DNA was extracted from 639 formalin-fixed, paraffin-embedded advanced, recurrent and/or metastatic thyroid cancers treated at MSKCC between April 2015 and September 2020. Tumor DNA and patient-matched normal samples were profiled on the MSK-IMPACT (Integrated Mutational Profiling of Actionable Cancer Targets) targeted next-generation sequencing platform (details below).

Tumors from one additional patient (MSK-THY1), whose tumor underwent anaplastic transformation subsequent to vemurafenib therapy, were profiled with whole exome sequencing (WES) and RNA expression profiling. One specimen was collected 25 months prior to the first dose of vemurafenib, at which time the pathologic diagnosis was histologically confirmed to be PTC. Two additional specimens were collected 11 months after the start of vemurafenib therapy, at which time the tumor had transformed to ATC. Samples from MSK-THY1 were all immediately snap frozen in liquid nitrogen and stored at  $-80^{\circ}\text{C}$ . For pathologic confirmation of diagnoses, specimens were formalin fixed, paraffin embedded and sectioned onto glass slides at 4- $\mu\text{m}$  thickness. Slides were prepared with hematoxylin and eosin stains by standard procedures and reviewed by board-certified subspecialty thyroid pathologists at our institution. Histologic diagnoses were made according to the World Health Organization's classification of endocrine tumors (17). Briefly, PTCs are characterized by two cardinal morphologic features including the presence of papillae and alterations in nuclei (e.g., characteristic changes in size or shape, nuclear membrane, and/or chromosomal features). PDTCs are tumors of follicular cell origin that have solid, trabecular, or insular growth pattern, absence of typical nuclear features of PTC, and at least one of the following: convoluted nuclei,  $\geq 3$  mitoses per 10 high-power fields, and tumor necrosis. ATCs are undifferentiated at the histologic level, having lost the ability to form follicles, papillae or even solid nests of follicular monomorphic cells.

Of the 639 MSK-IMPACT profiled tumors, there were 15 (designated MSK-THY2 through MSK-THY16) that received treatment with the BRAF inhibitors vemurafenib or dabrafenib for non-ATC differentiated thyroid cancer and had tissue sampled during or after treatment available for sequencing. Of these 15 patients, 5 had tissue profiled on-treatment (median time from first BRAF inhibitor dose to tumor sampling: 9.9 months, range 0.1-66.5) and 10 had tissue profiled after treatment (median time from BRAF inhibitor end of treatment to tumor sampling: 20.8 months, range 0.2-44.4).

## DNA Sequencing

DNA was extracted from tumor specimens of MSK-THY1 using the Blood and Tissue Kit (Qiagen) and assessed for quality and integrity with BioAnalyzer (Agilent Technologies). The SureSelectXT Library Preparation Kit (Agilent) was used to prepare WES libraries per manufacturer's specifications. Extracted DNA was sheared using a LE220 Focused Ultrasonicator (Covaris). DNA fragments were end repaired, adenylated, ligated to Illumina sequencing adaptors, and amplified by PCR. The SureSelectXT v4 51 Mb capture probe set (Agilent) was used to build captured exome libraries, which were then amplified by PCR. The final libraries were quantified using the KAPA Library Quantification Kit (KAPA Biosystems), Qubit Fluorometer (Life Technologies), and 2100 BioAnalyzer

(Agilent). Sequencing was performed using  $2 \times 125$  bp cycles. Mutations were called using a previously described algorithm (18) and allele-specific copy-number analyses were performed using FACETS (19). All mutations were orthogonally validated with next-generation sequencing using a custom Ion AmpliSeq panel on the IonTorrent PGM sequencer at mean target coverage of  $9546\times$ . Intratumor genetic heterogeneity was analyzed based on cancer cell fractions in the validated mutations as determined using PyClone as previously described (20,21). To determine cancer cell fractions, we used aberrant cell fraction and major and minor allele copy number data from FACETS, and variant allele frequencies for validated somatic mutations. These data were inputted into PyClone, which estimates the cancer cell prevalence for each somatic mutation in each tumor sample, and subsequently uses Bayesian methodology to cluster cancer cell prevalence estimates into clonal populations. Intratumor heterogeneity was depicted as the number of clusters, or (sub)clonal populations.

DNA from 639 thyroid tumors treated at MSK was sequenced with MSK-IMPACT. The technical details for tumor collection, processing and sequencing by MSK-IMPACT have been previously described (22). MSK-IMPACT profiles matched tumor and normal (peripheral blood-derived) DNA samples for 341, 410 or 468 genes with known roles in oncogenesis and/or targeted therapy. Of 639 thyroid cancer cases profiled with MSK-IMPACT, there were 369 with PTC (mean target coverage:  $575\times$ ), 164 with PDTC ( $627\times$ ), and 106 with ATC ( $724\times$ ). The prevalence of mutations with described roles in BRAF inhibitor resistance and/or ATC pathogenesis were compared between PTCs, PDTCs, and ATCs. Of the subset of 15 patients treated with BRAF inhibitors for non-ATC differentiated thyroid cancers, mean target coverage was  $661\times$ .

### Transcriptomic Analyses

RNA was extracted from tumor specimens from patient MSK-THY1 using the RNeasy Plus Mini Kit (Qiagen), in vitro transcribed to cRNA using the Affymetrix IVT Kit, hybridized to Affymetrix U133 plus 2.0 microarrays, and data RMA normalized and analyzed in Partek Genomics Suite 6.1, as previously described (23).

Thyroid Differentiation Scores (TDS) were calculated using the normalized expression levels of 16 thyroid metabolism and function genes as previously described (24). TDS scores have been shown to accurately identify thyroid tumor dedifferentiation (25). Pathway analyses were performed using Gene Set Enrichment Analysis (GSEA) and Qiagen Ingenuity Pathway Analysis (IPA) with Benjamini-Hochberg false-discovery rate correction.

### Tumor Immune Infiltration and Activity

Tumor microenvironment immune infiltration and immune activity were evaluated using several tools. Cell-type Identification by Estimating Relative Subsets of RNA Transcripts (CIBERSORT) estimates the prevalence of various cell types within complex tissues using a linear support vector regression to adaptively select genes from a reference gene expression signature (26). Single-Sample Gene Set Enrichment Analysis (ssGSEA) estimates infiltration levels of 24 immune cell types by calculating enrichment scores for sample and gene set pairs (27), also inferring aggregate immune infiltration scores (IIS)

based on both innate and adaptive cell populations and T-cell infiltration scores (TIS) based on nine T-cell subtypes. Estimation of Stromal and Immune Cells in Malignant Tumor Tissues using Expression Data (ESTIMATE) is based on ssGSEA and infers the proportion of stromal and immune cells in tumor samples using a 141-gene signature derived from differential expression analysis of tumors with high and low immune cell infiltration (28). Tumor Immune Dysfunction and Exclusion (TIDE) models two primary mechanisms of immune evasion, T-cell dysfunction and exclusion, by applying genetic signatures of these two processes to batch-corrected normalized data (29).

### Data Availability Statement

The sequencing variant calls and gene expression data used in this paper are provided in Supplementary Tables.

## RESULTS

### Genomic evolution during dedifferentiation to anaplastic carcinoma

The timeline of clinical events for patient MSK-THY1 is shown in Figure 1A–C. This patient was first diagnosed with classic PTC in 2001 at age 55 and treated with total thyroidectomy and adjuvant radioactive iodine (RAI) therapy. Between 2004 and 2010, she underwent additional surgical resections and RAI therapy for recurrences in regional lymph nodes in the neck, all of which revealed classic PTC on surgical pathology. One sample from the PTC nodal metastasis in 2010 was snap frozen for WES and RNA sequencing. In 2011, lung metastases were diagnosed, and she was treated with sorafenib and temsirolimus (30), with tumor experiencing partial response (31). Treatment was continued for 13 months until disease progression. In 2012, a *BRAFV600E* mutation was identified and vemurafenib therapy was initiated (32). Best response on vemurafenib was stable disease (–20% tumor regression from baseline) and treatment was discontinued after five months due to progression of disease. Subsequently, she was started on pazopanib, but was treated for less than one week before it was discontinued for toxicity. Two months after discontinuation of vemurafenib, she was first noted to have metastatic tumor in soft tissues, which quickly progressed to biopsy-proven ATC in multiple regions, including scalp, upper extremities, kidneys and brain. At this time, tissue from biopsies of 2 separate scalp metastases were snap-frozen for correlative studies.

WES of the pre-treatment PTC nodal metastasis and post-transformation ATC distant metastases, followed by orthogonal next-generation deep sequencing (9,546× mean target coverage) for validation of mutations, demonstrated aspects of genomic evolution during the course of anaplastic transformation (Figures 1D–E, Supplemental Tables 1–2). The *BRAFV600E* mutation was identified in all samples, as was a *TERT* promoter mutation (at position 1,295,228). In addition, 17 new mutations emerged in the ATC metastases, including genes involved in PI3K/AKT/mTOR signaling (*PIK3CA* H1047R, *KIAA1024* P412Q), cell-cell adhesion (*CTNNA3* M568I), cell division (*GORAB* P119L, *NCAPH2* N533S), epigenetic regulation (*MBD1* I550N), transcriptional regulation (*ZNF90* A321V), RNA splicing and editing (*CELF3* T392N), cell survival (*MANFM1I*), and DNA repair (*PALB2* R753Q).

*PIK3CA* mutations have been previously described as a mechanism of resistance to BRAF inhibition in thyroid carcinoma (33) and melanoma (34). In both ATC metastases, the *PIK3CA* H1047R mutation was observed to have high cancer cell fraction (0.90 and 0.97). Orthogonal next-generation sequencing of the index PTC tumor did not identify *PIK3CA* mutations in the PTC tumor, despite high-depth coverage of this gene target (>15,000×). These data suggest that the *PIK3CA* mutation was likely to have been present, but spatially heterogeneous, in the original PTC tumor and that subclonal populations containing the *PIK3CA* mutation later seeded the ATC metastases. It is possible that selective pressure exerted by BRAF inhibitor therapy may have contributed to the outgrowth of cellular subpopulations that were initially spatially constrained, such as *PIK3CA*-mutated cells.

To examine this more broadly, we performed analyses of intra-tumor genetic heterogeneity (Supplemental Figure 1), which demonstrated limited genetic heterogeneity in the PTC sample (2 clonal populations), which increased during the course of anaplastic evolution (ATC Metastasis 1 had 5 clonal populations; ATC Metastasis 2 had 4 clonal populations). In concert with the increase in mutations in the ATC tumors, many more copy number alterations were observed in the ATC metastases (mean ploidy 2.88 and 1.75, total copy number altered segments 311 and 108), compared to the PTC primary tumor, which exhibited fewer copy number alterations (mean ploidy 1.91, total copy number altered segments 63; Supplemental Figure 2), indicative of increased chromosomal instability.

### Transcriptomic changes during dedifferentiation to anaplastic carcinoma

Gene expression data confirmed that cell cycle and DNA replication pathways were enriched in ATC metastases compared to the pre-treatment PTC, consistent with increased cellular proliferation (Supplemental Figure 3, Supplemental Table 3). Transcriptomic data were used to determine the degree of thyroid cellular differentiation. The TDS (Thyroid Differentiation Score), consisting of 16 thyroid metabolism and function genes (24), was significantly lower (difference in z-scores:  $p < 0.001$ ) in the ATC metastases compared to the pre-treatment PTC sample (Figure 2A), consistent with the histologic observation of dedifferentiation. Nearly all 16 genes were markedly downregulated in the ATC metastases, with the exception of 2 genes that were low at baseline and did not change: *SLC5A5* (encoding the sodium-iodide symporter) and *THRB* (thyroid hormone receptor beta) (Figure 2A). While iodine uptake and retention are governed by multiple genes within the TDS, the low baseline expression of *SLC5A5* was observed in all samples, consistent with its downregulation by *BRAF* V600E signaling (24). Of note, *DUOX1*, *DUOX2*, and *TPO*—all of which play key roles in thyroid hormone production—were amongst the genes markedly downregulated in the ATC metastases.

Confirming the functional relevance of the *PIK3CA* mutations in the ATC samples, Ingenuity Pathway Analysis of transcriptomic data indicated that the ATC metastases had undergone coordinate enrichment in signaling through the PI3K/AKT (FDR-corrected  $p = 3.8 \times 10^{-5}$ ) and mTOR (FDR-corrected  $p = 4.9 \times 10^{-9}$ ) pathways, together with the gene set regulating downstream targets eIF4E binding protein and p70 ribosomal protein S6 kinase (p70S6K; FDR-corrected  $p = 4.5 \times 10^{-8}$ ) (Figure 2F). Hippo signaling ( $p = 9.5 \times 10^{-7}$ ) was

also one of the most significantly enriched pathways. Both PI3K and Hippo signaling play key roles in the dedifferentiation, and aggressive behavior, of thyroid cancers (25,35).

Despite therapy with BRAF inhibition, the post-treatment ATC tumors demonstrated enrichment of the 52-gene thyroid-specific ERK signaling signature (24) which was derived from *BRAF*V600E-mutated thyroid cells and evaluated in thyroid cancers (Supplemental Figure 3). ERK signaling activity was enriched in the ATC metastases (FDR-corrected  $q = 0.005$ ), in line with prior findings in mouse models that ERK signaling can be paradoxically upregulated by BRAF inhibition in the setting of upstream activating mutations, such as *PIK3CA* (33,36,37). Taken together, these data reveal upregulated signaling through several pathways in concert with BRAF inhibition and the expansion of *PIK3CA*-mutated cells during the evolution of this thyroid cancer.

### Immune microenvironmental evolution during dedifferentiation to anaplastic carcinoma

Gene expression data were then used for deconvolution of infiltrating immune populations (Figures 2B–2E). Overall, there was a mixed picture of change in immune infiltration during the evolution from PTC to ATC. The ATC tumors had an increased presence of infiltrating M0 and M2 macrophages, myeloid-derived suppressor cells, as well as fibroblasts, all of which are consistent with an immune-suppressive environment. M1 macrophage prevalence was similar in both pre-vemurafenib and post-anaplastic transformation specimens, and CD8+ T-cells became less prevalent in ATC metastases. Despite a higher degree of CD8+ T-cell exclusion, T cell dysfunction scores were also lower in ATC metastases compared to pre-vemurafenib PTC. Overall, infiltration by immunosuppressive cell types may have contributed to immune evasion during the evolution of this thyroid cancer.

### Mutations associated with dedifferentiated thyroid cancers

Given the potential mechanistic role of *PIK3CA* mutations in resistance to BRAF inhibitors, further analyses in an expanded cohort were conducted to investigate the association between *PIK3CA* mutations and thyroid cancer dedifferentiation. We examined *PIK3CA* mutations in 496 patients with primary PTC from The Cancer Genome Atlas cohort (24) and compared these primary tumors to 639 advanced, recurrent and/or metastatic thyroid cancers (including PTC, PDTC, and ATC) undergoing targeted next-generation sequencing on the MSK-IMPACT platform.

In the primary PTCs in the TCGA cohort, *PIK3CA* mutations were uncommon (2/496; 0.4%, Supplemental Figure 4, Supplemental Table 4). *PIK3CA* mutations were more than 10 times as common in advanced/recurrent/metastatic PTCs in the MSK-IMPACT cohort (19/369, 5.1%;  $OR = 13.4$ ,  $p < 0.001$ ) and in PDTCs (9/164, 5.5%;  $OR = 14.3$ ,  $p < 0.001$ ); and over 40 times as common in ATCs (17/106, 16.0%;  $OR = 47.2$ ,  $p < 0.001$ ).

The prevalence of other previously described alterations linked to BRAF inhibitor primary or acquired resistance or ATC pathogenesis (25,35,36,38–42) were also explored in these cohorts (Supplemental Figure 4, Supplemental Table 4). Mutations in *ARID2*, *MTOR*, *NF2*, *NRAS*, and *PBRM1* were all observed to increase in prevalence in more dedifferentiated categories of thyroid cancers, consistent with prior findings (25,38).

## Mutations in BRAF inhibitor-treated thyroid cancers

Of the 639 advanced, recurrent, and/or metastatic thyroid tumors, 77 were cases of PTC or PDTC that were treated with BRAF inhibitor targeted therapy (vemurafenib or dabrafenib). Of these, 15 had tissue sampled during or after treatment available for sequencing on the MSK-IMPACT platform (MSK-THY2 through MSK-THY16). Of these 15 patients, 8 also had matched pre-therapy tissue available for sequencing.

Subsequent to BRAF inhibitor therapy, 6 of 15 patients had tumors that underwent transformation to more dedifferentiated histology, which was confirmed with biopsy (Table 1, Supplemental Figure 5), and 9 patients had no clinical or histological evidence of dedifferentiation. It is important to clarify that this proportion (6/15) does not necessarily represent the rate of transformation among all treated patients. Additional biopsies after BRAF inhibitor therapy are not routine and are often prompted by observations of disease progression. As such, patients for whom such biopsies are pursued may be enriched for dedifferentiated tumors. Also, 1 of the patients (MSK-THY3) also received systemic therapies other than BRAF inhibitors prior to post-therapy sequencing. Therefore, genomic changes in these patients may be in part attributable to these other agents.

The mutational landscapes (Figure 3, Supplementary Figure 6A, Supplemental Table 5) of these dedifferentiated tumors were reviewed for alterations that have been linked to resistance to BRAF inhibition and/or ATC pathogenesis. These tumors underwent high coverage next-generation sequencing (mean target coverage 659×) which offered high sensitivity for the detection of subclonal variants with low allelic fraction. As expected in a cohort of thyroid tumors with aggressive clinical behavior and treated with BRAF inhibitor drugs, all tumors had mutations in *BRAF* as well as the *TERT* promoter (43–47). Genetic alterations of potential relevance identified in this cohort include mutations in genes involved in the SWI/SNF chromatin remodeling complex (*ARID2*, *PBRM1*), PI3K/AKT/mTOR pathway (*MTOR*, *PIK3CA*), MAPK/ERK pathway (*MET* amplification, *NF2*, *NRAS*, *RASA1*), and JAK/STAT pathway (*JAK1*).

The data from these 15 patients are summarized in Figure 3. Including patient MSK-THY1 (in Table 1), a total of 6 of 7 (86%) tumors that dedifferentiated after BRAF inhibition were observed to harbor mutations in one or more of these genes. In the dedifferentiated tumors with matched sequencing (MSK-THY1-2 & 5-7), 8 of the 9 (89%) mutations appeared to be acquired in on-therapy or post-therapy tissues, with the exception of 1 pre-treatment tumor that also had a mutation in *MTOR*. Notably, 1 tumor had a *PIK3CA* mutation before BRAF inhibition that was not detected in subsequent sequencing. In contrast, among tumors that did not undergo dedifferentiation (Figure 3, Supplementary Figure 6B), fewer tumors (3 of 9, 33%) had mutations in any of these genes, including one sample with a mutation in *ARID2* and two samples with mutations in *KRAS* (9). The rate of mutations in these genes was enriched, although not to a statistically significant degree (RR=2.57, 95%CI 0.97-6.80, p=.06), in those tumors that de-differentiated. These data indicate that among tumors exposed to BRAF inhibitor therapy, mutations associated with resistance to BRAF inhibition were more frequently observed in those that evolved to more dedifferentiated states.



## DISCUSSION

Papillary thyroid cancers are genetically defined by alterations that converge on the mitogen-activated protein kinase (MAPK) pathway (24), most commonly (60%) mutations in *BRAF*, followed by mutations in RAS genes (15%), and less commonly, rearrangements affecting other kinase genes such as *RET* and *NTRK*. Most aggressive variants of PTC have mutations in both *BRAF* and the *TERT* promoter (43–47), and this combination is commonly associated with evolution of differentiated thyroid carcinoma to more aggressive, poorly differentiated histology. The accumulation of additional genetic alterations such as *TP53* mutation and alterations in the PI3K/AKT/MTOR pathway, the SWI/SNF complex and other epigenetic regulators, are associated with the evolution to ATC (25,39). At the same time, these genetic alterations are also associated with thyroid cancer resistance to BRAF inhibition (25,35,36,38–42). Here, by examining tumors that were treated with BRAF inhibitor drugs, we describe the evolution of genetic alterations, gene expression landscape, and immune microenvironment that occurs among tumors that undergo transformation to dedifferentiated or ATC histology.

We found that these genetic alterations were associated with both resistance to therapy and dedifferentiation after BRAF inhibitor therapy. Our findings in clinical samples validate a large body of preclinical research implicating several genetic programs and pathways. Thyroid tumors that dedifferentiated commonly had, or acquired, mutations in genes comprising the SWI/SNF chromatin remodeling complex (25,39) and PI3K/AKT/mTOR (33), MAPK/ERK (35,36,40,41), and JAK/STAT signaling pathways (42). In contrast, tumors that were not observed to undergo dedifferentiation did not commonly harbor these mutations. Mutations in these pathways, uncommon in PTC, were also observed to increase in prevalence in a stepwise fashion across the spectrum of more clinically aggressive and histologically dedifferentiated thyroid carcinomas.

It is unknown whether the mechanisms of drug resistance and microevolution to more dedifferentiated histologies are related, and whether BRAF inhibition promotes these processes. One mechanism of resistance to targeted therapy is the development of an alternative cell state, such as tumor dedifferentiation, as a result of selective pressures exerted by pathway blockade (11). After BRAF inhibition, dedifferentiation has been demonstrated to occur in melanoma (12,13). The findings in this study lend themselves to a hypothesis that inhibition of BRAF may, in some cases, drive the acquisition of aberrant oncogenic signaling that can both mediate drug resistance and accelerate the outgrowth of more aggressive subclonal cellular populations.

The transformation of differentiated thyroid cancer in the context of BRAF inhibition is a rare event, which to our knowledge, has only been formally reported in 2 prior cases (14). The 7 cases in this study were drawn from a cohort of 639 genomically profiled advanced thyroid cancers and represent a reasonably sized cohort of a rare phenotype.

This phenotype was most comprehensively examined in patient MSK-THY1. In this patient's tumor, after treatment with BRAF inhibition, a *PIK3CA* H1047R-mutated cellular population was observed to undergo clonal expansion, driving PI3K/AKT/mTOR

signaling in the tumor. At the same time, the tumor concomitantly underwent marked dedifferentiation, as evidenced by the downregulation of thyroid metabolism and function genes, and morphologic transformation to anaplastic thyroid carcinoma. Confirming the importance of this pathway, we found mutations affecting the PI3K/AKT/mTOR pathway to be present in tumors transforming subsequent to BRAF inhibition, with 2 of 7 (29%) dedifferentiating tumors in this series harboring alterations in *PIK3CA* or *MTOR*, compared to 0 of 9 (0%) in the non-dedifferentiating group. Across the spectrum of progressively less differentiated thyroid carcinoma histologies, we found that mutations in *PIK3CA* increased markedly from a low prevalence in localized PTC (0.4%) to higher rates in advanced/recurrent/metastatic PTC (5.1%), PDTC (5.5%) and ATC (16.0%).

These clinical and genomic data validate an earlier preclinical finding that *PIK3CA* contributes both to therapeutic resistance and the evolution of ATC. Roelli and colleagues used a transgenic mouse model of thyroid cancer with conditional tamoxifen-inducible Cre-mediated *Braf*V600E and *Pik3ca* H1047R mutations under a thyroid-specific promoter, and found these tumors to be resistant to treatment with PLX-4720, a BRAF inhibitor (33). After BRAF inhibition, these tumors were observed to develop paradoxically increased ERK pathway activation. This is attributable to release of feedback inhibition of ERK after BRAF V600E inhibition, which can then facilitate enhanced signaling of an upstream signal, such as activated PI3 kinase, through the wild-type *BRAF* allele and *CRAF* (48). Interestingly, these *Braf/Pik3ca* co-mutated thyroid tumors treated with PLX-4720 were observed to develop foci of ATC, which were also observed, but to a lesser degree, in the *Braf/Pik3ca* co-mutated tumors that did not receive BRAF inhibitor therapy.

Because of the overlap in molecular alterations that contribute to resistance to *BRAF* inhibitors and occur during thyroid tumor dedifferentiation (16), mutation in *PIK3CA* is only one of multiple potential mechanisms for this observed phenotype. In addition to *PIK3CA* mutations, a number of other resistance mechanisms have been described in prior preclinical literature. For example, mutations affecting the SWI/SNF chromatin remodeling complex (e.g., *ARID2*, *PBRM1*) are suspected to promote stem-cell like properties, negating the effects of *BRAF* inhibitors in re-establishing regular thyroid iodine metabolism and function (25,39). Mutations of *NF2* (35), *RASAI* (40), and *NRAS* (41), and amplification of *MET* (36) have been shown to reactivate MAPK/ERK signaling. *JAK1* deregulation through inhibition of *RNF125* has been described as a mechanism of resistance to *BRAF* inhibitors in melanoma (42). The results of this study, albeit derived from a small cohort of a rare phenotype, confirm these earlier findings and illustrate the suite of genetic alterations that can converge on these three pathways.

These findings have potential implications for the management of thyroid malignancies, particularly related to current areas of active investigation, including combination targeted therapies and immunotherapy. Given the near inevitable progression of disease with single-agent targeted therapy (49), consistent with the diversity of molecular alterations that may lead to resistance and/or dedifferentiation observed in our cohort, recent studies have focused on addressing complimentary pathways concurrently. A number of the resistance mechanisms described above are potentially targetable, including: *MTOR* with everolimus, *PI3K* with alpelisib and buparlisib, *MET* with crizotinib, and *JAK1/2* with momelotinib. In

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addition, based on gene expression data, cell-cycle targeted therapies such as palbociclib, targeting CDK4 and CDK6, may have utility, possibly when combined with PI3K inhibition (50). Consistent with computational models (49) and experience with dual therapy in other cancer types (51,52), combination therapy may provide superior disease control in thyroid cancer. In *BRAF*V600E-mutated ATC, the combination of dabrafenib with trametinib is now commonly used, achieving high rates of partial response, albeit with few complete responses (53,54). However, the benefit of combination therapy is not clear in PTC—a randomized phase II study in radioiodine-refractory PTC did not show clinical benefit to the addition of trametinib compared to dabrafenib alone (55). Importantly, it is not known whether such approaches would mitigate the selective pressure that may drive dedifferentiation or anaplastic transformation. For example, in the study of *Braf* and *Pik3ca* co-mutated mouse tumors, treatment with dual inhibition of *Braf* and *Pik3ca* with PLX-4072 and GDC-0941 was more effective at achieving tumor size reduction, but not in preventing the development of ATC foci (33). These data suggest a treatment strategy of combination targeted therapy in the neoadjuvant setting to achieve tumor volume reduction, followed by complete surgical resection, an approach that is being investigated in localized but unresectable, aggressive thyroid cancers.

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Combination therapy with BRAF inhibition and immunotherapy is currently under investigation (56); in addition to data with BRAF inhibitors, the widely used multi-kinase inhibitor lenvatinib has also been shown to increase CD8+ T-cell infiltration (57). In the serial analyses of the tumor immune microenvironment in patient MSK-THY1, we observed evidence of immune escape as well as infiltration by immunosuppressive cellular populations. These findings may reflect mechanisms of immune escape during dedifferentiation of this thyroid tumor but may also in part represent effects of BRAF inhibition on the tumor immune microenvironment. While BRAF inhibition is generally associated with a shift toward stronger anti-tumor immunity, such as enhanced T cell infiltration and function (58), it also drives an increase in infiltration by macrophages, which are able to mediate resistance to BRAF inhibition via macrophage-derived secreted factors TNF- $\alpha$  and VEGF (59). Ongoing clinical investigation will help determine whether enhanced immune surveillance can potentially constrain the transformation of PTCs to more dedifferentiated forms.

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There are several important caveats to these findings; because of these limitations, we note that our data do not prove a causal link between BRAF inhibition and thyroid tumor dedifferentiation. Although our data do provide clinical validation of the prior mouse data indicating the role of *PIK3CA* mutations in both mediating resistance to BRAF inhibition as well as driving anaplastic transformation of PTC, conclusive data for other pathways is currently incomplete. While it is quite plausible that BRAF inhibition promoted the upregulation of these compensatory signaling pathways, it is also possible that these mutations and signaling pathways were already active in the primary tumor and were merely unmasked by undergoing clonal expansion during treatment with BRAF inhibitors. With these data, we cannot conclusively distinguish between dedifferentiation that was an inevitable part of the natural history of these tumors, as opposed to a phenomenon that was driven by BRAF inhibition. For example, the interval between the development of dedifferentiation and the last dose of BRAF inhibitor therapy was close for most, but not all

patients—2 patients had an interval of over 2 years. In some cases, other factors may have in part contributed to the observed genomic changes, such as other systemic therapies in two patients.

Nevertheless, these data suggest that those genetic pathways that mediate resistance to BRAF inhibition may also be linked to transformation to ATC. The genetic alterations in the above pathways, which were observed in nearly all dedifferentiating tumors, were not commonly observed in the heavily-treated BRAF-mutated thyroid tumors that did not undergo dedifferentiation after BRAF inhibitor therapy. An additional important caveat is that this is a selected cohort, and these data should not be extrapolated to estimate the frequency of dedifferentiation after BRAF inhibition, since the decision to re-biopsy after therapy was generally performed after tumor progression, and not universally performed. Lastly, insights into tumor immune microenvironment were made by deconvolution of immune cells with transcriptomic data rather than immunohistochemical markers; however, these methods have been shown to be highly correlated in prior studies (26–29).

In conclusion, we have analyzed genomic data from thyroid cancers that progressed to more advanced histologies subsequent to BRAF inhibitor targeted therapy, and found that this event is associated with a diverse array of genetic alterations with known roles in either BRAF inhibitor resistance or ATC pathogenesis. These data indicate that alterations in SWI/SNF, PI3K/AKT/MTOR, MAPK/ERK and JAK/STAT may underlie both the processes of drug resistance and dedifferentiation to ATC. The diversity of potential mechanisms that may lead to resistance and/or dedifferentiation may explain the elusiveness of disease control with single-agent targeted therapy for advanced thyroid malignancies, and emphasizes the need to investigate combination therapies. Further research will be needed to determine the degree to which these genomic changes can be attributed to BRAF inhibitor therapies and resulting selective pressure. To this end, studies that incorporate long term clinical outcomes and genomic analyses in thyroid cancer patients with BRAF mutations will be informative.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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**Implications:**

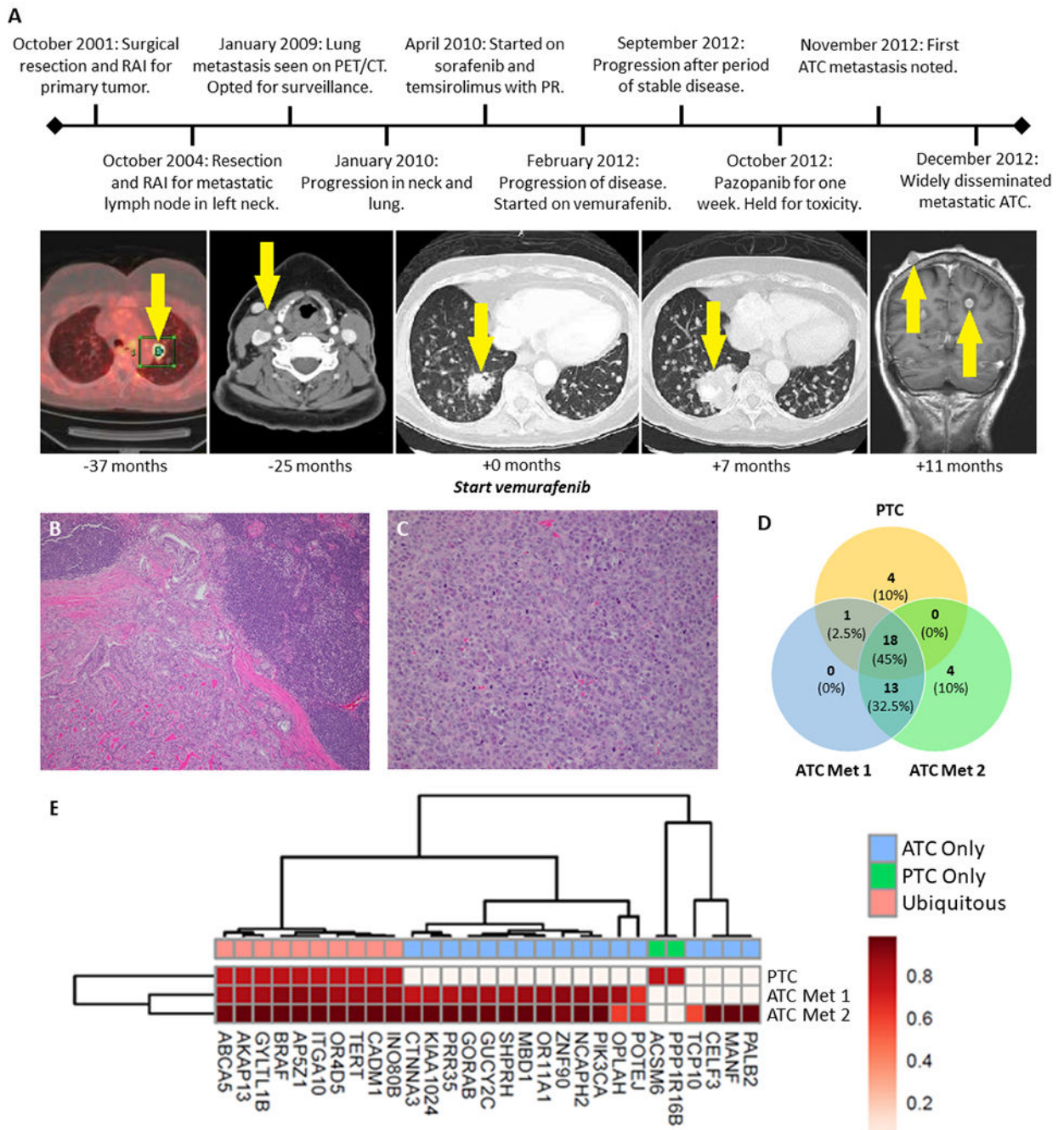
The possibility that thyroid cancer dedifferentiation may be attributed to selective pressure applied by BRAF inhibitor targeted therapy should be investigated further.

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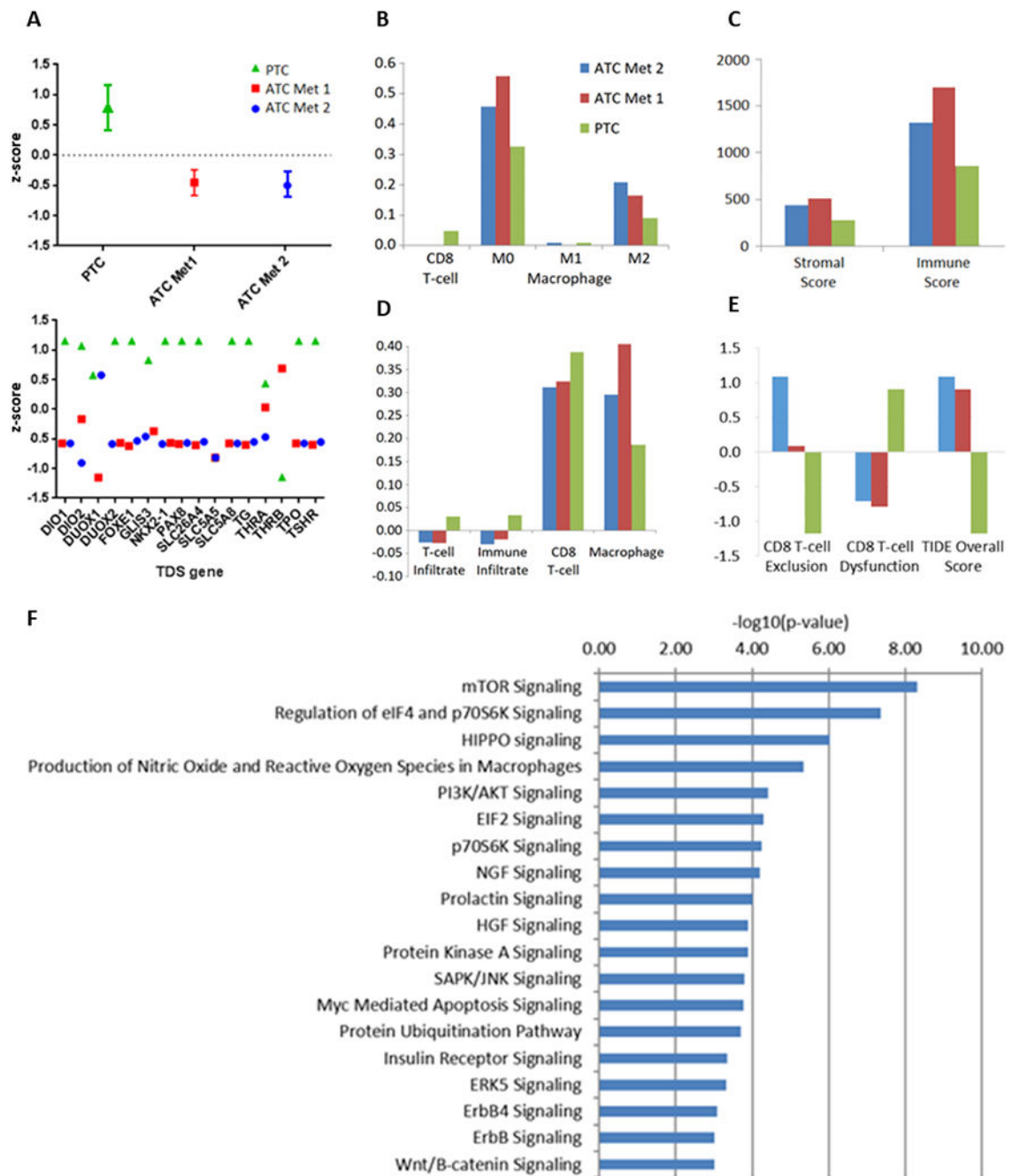
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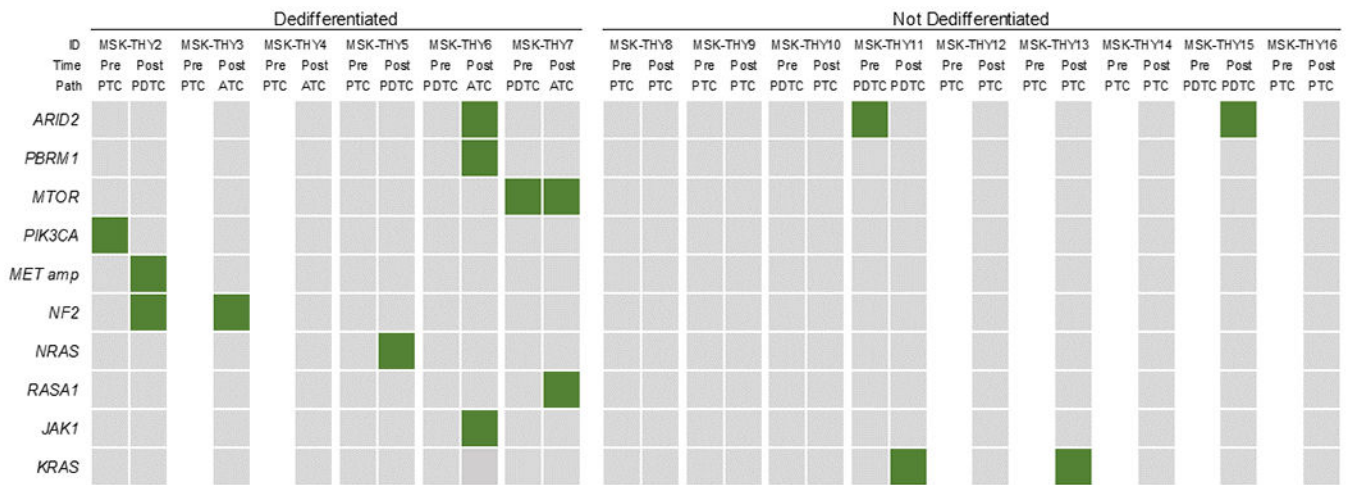


**Figure 1.** Clinical and genomic features of patient MSK-THY1 with differentiated thyroid cancer that underwent anaplastic transformation subsequent to treatment with vemurafenib. **A**, Clinical timeline with major events indicated. Serial radiographic images illustrate progression of papillary thyroid cancer to widely disseminated anaplastic malignancy. Time of imaging relative to vemurafenib start date is provided for each image and areas of disease are indicated by arrows. Panel 1: PET/CT, Panels 2-4: CT with contrast, Panel 5: T1-weighted MRI with contrast, RAI: radioactive iodine, PR: partial response, ATC: anaplastic thyroid

cancer. **B & C**, Pre-treatment and post-transformation hematoxylin-and-eosin-stained slides show histologic transformation from papillary to anaplastic thyroid carcinoma. **D**, Number of shared and exclusive mutations in classic-type papillary thyroid cancer (PTC) compared to anaplastic metastases (ATC Met 1 & ATC Met 2). **E**, Landscape of single nucleotide variants of the PTC tumor and ATC metastases. Each mutation color coded by cancer cell fraction (CCF). Unsupervised hierarchical clustering identified subsets of related samples and mutations.



**Figure 2.** RNA expression profiling for MSK-THY1. **A**, Thyroid differentiation scores (TDS), overall and stratified by gene, for the papillary thyroid carcinoma (PTC) sample and anaplastic metastases (ATC Met 1 and ATC Met 2). Immune deconvolution by CIBERSORT (**B**), ESTIMATE (**C**), ssGSEA (**D**), and T cell dysfunction and exclusion (TIDE) (**E**) for the PTC and ATC samples. **F**, Most enriched molecular pathways among alterations in ATC metastases compared to the PTC sample



**Figure 3.** Frequency of genetic alterations linked to BRAF inhibitor resistance and/or anaplastic thyroid cancer pathogenesis for tumors that dedifferentiated after vemurafenib or dabrafenib (MSK-THY2-7) compared to those that did not dedifferentiate (MSK-THY8-16). Filled in squares represent mutated genes, with the exception of *MET* amp, indicating amplification. Pre: before BRAF inhibition, Post: during or after BRAF inhibition, PTC: Papillary Thyroid Cancer, PDTC: Poorly Differentiated Thyroid Cancer, ATC: Anaplastic Thyroid Cancer

**Table 1.**

Clinical and genomic features of patients whose tumors dedifferentiated after BRAF inhibitor targeted therapy. Genes listed represented mutated genes unless otherwise noted. PTC: Papillary Thyroid Cancer; PDTC: Poorly Differentiated Thyroid Cancer; ATC: Anaplastic Thyroid Cancer

ID	Age <sup>1</sup>	Gender	Timing <sup>2</sup>	Intervening systemic therapies <sup>3</sup>	Radiation <sup>3</sup>	Initial Pathology	Final Pathology	Potential Mechanisms of Resistance
MSK-THY1	66	F	After / +4 months	Pazopanib	No	PTC	ATC	<i>PIK3CA</i>
MSK-THY2	70	F	During / +5 months	None	No	PTC	PDTC	<i>NF2, MET</i> amplification
MSK-THY3	68	M	After / +31 months	Lenvatinib	Yes	PTC	ATC	<i>NF2</i>
MSK-THY4	68	M	After / +34 months	None	No	PTC	ATC	None
MSK-THY5	68	F	During / +40 months	None	No	PTC	PDTC	<i>NRAS</i>
MSK-THY6	52	M	After / +7 months	None	No	PDTC	ATC	<i>ARID2, JAK1, PBRM1</i>
MSK-THY7	66	M	After / +3 months	None	Yes	PDTC	ATC	<i>RASAL, MTOR</i>

<sup>1</sup> Age at first dose of BRAF inhibitor

<sup>2</sup> When sequencing was performed relative to course of BRAF inhibition; duration from BRAF inhibitor start date reported for those sequenced during BRAF inhibition, and duration from BRAF inhibitor stop date for those sequenced after BRAF inhibition.

<sup>3</sup> Therapies administered between BRAF inhibition and subsequent treatment sequencing