

Apolipoprotein B mRNA-Editing Catalytic Polypeptide-Like–Induced Protein Changes in Estrogen Receptor–Positive, Human Epidermal Growth Factor Receptor 2–Negative Breast Cancer Throughout Disease Progression

Manouk K. Bos, MD¹; Marcel Smid, BSc¹; Stefan Sleijfer, MD, PhD^{1,2}; and John W. M. Martens, MD¹

abstract

PURPOSE Apolipoprotein B mRNA-Editing Catalytic Polypeptide-like (APOBEC) enzymes are mutagenic factors contributing to tumor progression and therapy resistance. However, the effects of APOBEC-induced protein changes have not been systematically assessed. Here, we describe the effects of APOBEC on the coding sequence in primary and metastatic estrogen receptor–positive (ER+)/human epidermal growth factor receptor 2–negative (HER2–) breast cancer (BC).

METHODS We determined the enrichment of amino acid (AA) changes resulting from APOBEC mutagenesis in 323 primary BC tumors and 424 metastatic breast cancer (mBC) lesions via comparison with a simulated mutational genomic landscape not under selection pressure. We subsequently explored genes with recurrent APOBEC-associated AA changes and investigated the clonality of individual APOBEC-associated mutations. Using public sequencing data from an independent primary BC and mBC cohort, we further confirm our findings by reporting genes having these enriched AA changes in an APOBEC context.

RESULTS Our analysis demonstrated that several APOBEC-derived AA changes are significantly enriched compared with a simulated AA change distribution drawn at random. Among the enriched AA changes, Glutamate(E)>Lysine(K) and Glutamate(E)>Glutamine(Q) were mostly found at hotspots in oncogenes, whereas termination codons (Glutamine[Q]>STOP[X] and Serine[S]>STOP[X]) occurred in tumor suppressor genes and, mostly, not at hotspot locations. These mutations are found in genes contributing to BC initiation, eg, introduction of termination codons in *TP53*, *MAP3K1*, and *CDH1* (in lobular BC) and two oncogenic hotspots in *PIK3CA* (p.E542K and p.E545K). In endocrine-resistant BC, we observed APOBEC-induced termination codons at ER-modulating genes, *KMT2C*, *ARID1A*, *NF1*, and *ZFH3*. Finally, in mBC, compared with single *PIK3CA* mutations, dual *PIK3CA* mutations occurred more frequently in an APOBEC context (Fisher's exact $P < .001$).

CONCLUSION Our results show that APOBEC mutagenesis recurrently targets various known drivers of BC initiation, progression, and endocrine resistance.

JCO Precis Oncol 6:e2100190. © 2022 by American Society of Clinical Oncology

Creative Commons Attribution Non-Commercial No Derivatives 4.0 License 

ASSOCIATED CONTENT

Data Sharing Statement
Data Supplement

Author affiliations and support information (if applicable) appear at the end of this article.

Accepted on November 16, 2021 and published at ascopubs.org/journal/po on January 20, 2022: DOI <https://doi.org/10.1200/P0.21.00190>

BACKGROUND

Apolipoprotein B mRNA-Editing Catalytic Polypeptide-like (APOBEC) enzymes are important mutagenic factors in multiple human cancers. APOBEC enzymes cause two single base-pair substitution (SBS) signatures that are characterized by C-to-T transitions (SBS2) and C-to-G transversions (SBS13) in predominantly, but not restricted to, TCW trinucleotide contexts (W = A or T).¹ APOBEC mutagenesis affects the evolutionary history of tumors by initiating the expansion of subclones. Consequently, APOBEC mutagenesis can contribute to tumor progression and/or therapy resistance.² Indeed, in ER+/human epidermal

growth factor receptor 2–negative (HER2–) tumors, the number of APOBEC mutations is increased in metastatic breast cancer (mBC) when compared with primary breast cancer (pBC).^{3,4} Although this increase might in part be explained by either functional advantages or selection under treatment, recent work has shown that a subset of APOBEC mutations may be the result of improved spatial availability of the target base enabled by the loop structure within a DNA hairpin.⁵

The most likely process whereby favorable traits are selected will involve amino acid (AA) changes in the derived protein, altering its functionality. Since APOBEC

CONTEXT

Key Objective

Apolipoprotein B mRNA-Editing Catalytic Polypeptide-like (APOBEC) mutagenesis and subsequent differential selection of mutated genes may play an important role in the evolutionary history of different cancer types, including breast cancer (BC).

Here, we systematically assessed the effects of APOBEC-induced protein changes in estrogen receptor–positive (ER+)/human epidermal growth factor receptor 2–negative (HER2–) BC in primary and metastatic diseases.

Knowledge Generated

We demonstrate that APOBEC is a driving force of genomic evolution in ER+/HER2– BC by clonal enrichment of focal oncogenic mutations in *PIK3CA* and tumor-suppressive alterations in various genes that are involved in BC tumor formation and resistance to endocrine therapy.

Relevance

This study provides better knowledge on the effects of APOBEC on the etiology of ER+/HER2– breast tumors. The insight that APOBEC induces mutations that hyperactivate PI3K signaling and mutations in genes that are associated with resistance to endocrine treatment could affect clinical management of tumors with high APOBEC contribution.

is thought to be enzymatically capable of mutating any C>T or C>G in a TCW context, all AA changes that can occur via this process are a priori equally likely to occur if they are not selected by environmental pressure, such as endocrine treatment. However, specific AA changes have been reported; for instance, mutations in *PIK3CA* (eg, p.E545K and p.E542K) are present in an APOBEC context and are found frequently in multiple cancer types with high APOBEC activity.^{6,7} Recently, additional clonal drivers and subclonal passengers within APOBEC-derived hotspots were identified in patients with bladder cancer.⁸ The effects of APOBEC mutagenesis on the full coding sequence and its significance in patients with ER+/HER2– breast cancer (BC), however, have thus far not been systematically assessed.

Here, we determine which of the APOBEC-derived codon changes are significantly enriched in ER+/HER2– pBC and mBC using whole-genome sequencing (WGS) data from previously described cohorts.^{3,9} This enabled us to identify genomic alterations that are likely subjected to differential selection in ER+/HER2– pBC and mBC. Subsequently, we describe in which genes or at which hotspots these AA changes occur most frequently in pBC, in mBC, and in an mBC cohort showing intrinsic or acquired resistance to hormonal therapy, using sequencing data from independent previously described cohorts.^{3,9,10} Using this approach, we provide an overview of the effects of APOBEC mutagenesis on the coding sequence in BC and subsequently describe how these alterations evolve during tumor progression and/or under endocrine treatment.

METHODS

The full methods are described in the Data Supplement. Briefly, we determined which APOBEC-associated AA changes are more frequently observed in pBC and mBC when compared with a distribution of random draws of a mutational repertoire of a genome not under selection pressure. This implies that these enriched AA changes in

pBC or mBC are under differential selection (Fig 1). For defining all possible AA changes that can result from APOBEC-related single-base substitutions (SBS2/SBS13) on the coding strand of the genome (GRCh37), we created a catalog of all possible APOBEC-induced codon changes (Fig 1, top right) that reflect all the possible AA changes if the complete transcriptome would be mutated by APOBEC, here defined as C>T and C>G in a TCW context. By bootstrapping (1,000 random draws with replacement) from this catalog, we can estimate how often AA changes can occur by chance (eg, approximately 17% of the random draws are E>Q). We subsequently used WGS data from 323 ER+/HER2– pBC samples⁹ and from 424 ER+/HER2– mBC samples³ to get the actual observed AA changes. As we assumed that APOBEC mutagenesis occurs at random, we performed the bootstrap with 100,000 iterations (ie, we repeated the bootstrap 100,000 times), resulting in a null distribution for each AA change (Fig 1, bottom middle). The fraction of times that the randomly drawn relative frequency of an AA change was at least as high as the actual observed relative frequency was used to determine the *P* value. We performed three comparisons: pBC versus the catalog of all possible APOBEC-induced codon changes, mBC versus the catalog, and pBC versus mBC. Specifically, for the first two comparisons, the observed frequency of AA changes resulting from APOBEC activity in the pBC and mBC cohort was compared with the randomly drawn sets from the catalog of expected mutations. The third comparison aimed to identify which AA changes occurred more frequently in mBC than in pBC. For this, we used the actually observed AA changes caused by APOBEC in pBC as the catalog of all possible AA changes from which we again used the bootstrap method with 100,000 iterations to identify enriched AA changes in mBC versus pBC. In addition, we used targeted sequencing data from an endocrine-resistant cohort previously described by Razavi et al¹⁰ to compare the presence of APOBEC

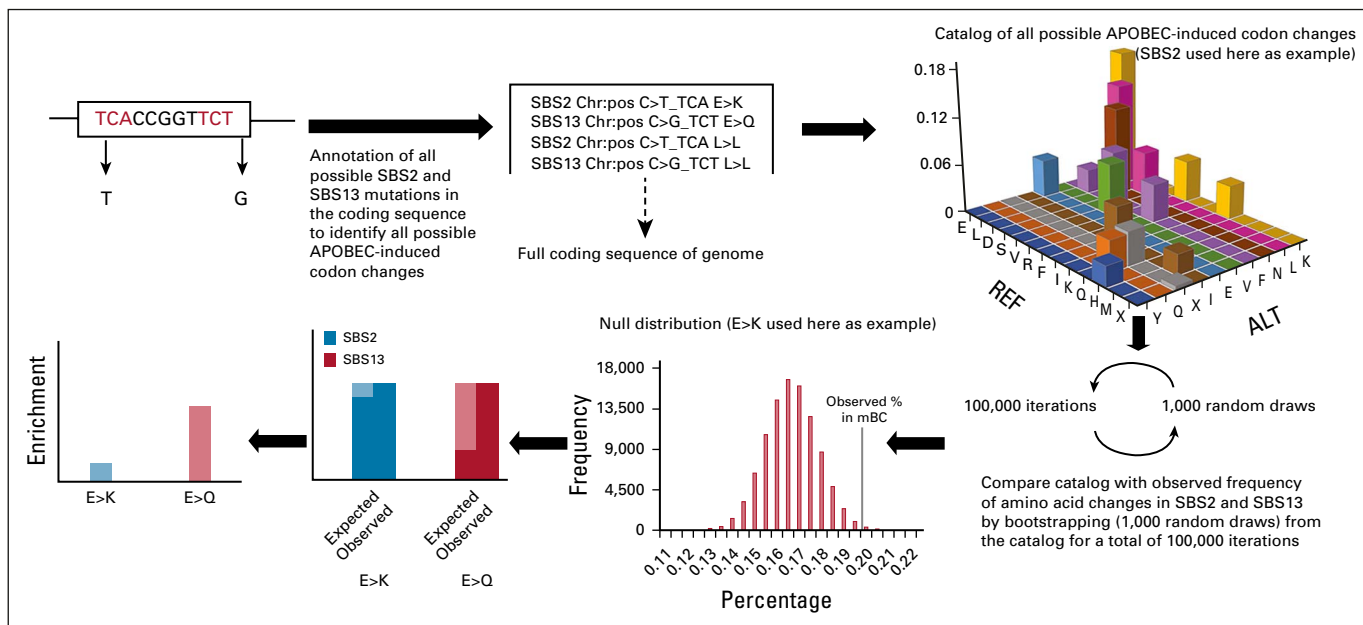


FIG 1. Overview of the methodology used to determine enrichment of APOBEC-derived AA changes. To directly compare which AA changes occurred more frequently in mBC than in pBC, the catalog of all possible APOBEC-induced codon changes was replaced by observed APOBEC-induced codon changes in pBC. AA, amino acid; ALT, alternative base; APOBEC, Apolipoprotein B mRNA-Editing Catalytic Polypeptide-like; C, cysteine; E, glutamate; F, phenylalanine; G, glycine; K, lysine; L, leucine; mBC, metastatic breast cancer; N, asparagine; pBC, primary breast cancer; Q, glutamine; REF, reference base; S, serine; SBS, single base-pair substitution; T, threonine; V, valine; X, STOP (stop codon).

mutations in an ER+/HER2- mBC population irrespective of the treatment line to patients with mBC who are resistant to endocrine therapy.

Single-stranded DNA loops that are part of hairpins are known to be highly targeted by APOBEC enzymes.⁵ To investigate whether hairpins affect our statistical approach, we matched genomic locations of hairpins using annotation of optimal APOBEC3A sites.⁵

We determined whether identified APOBEC-derived mutations in mBC³ were either clonal or subclonal by using WGS data as described before.¹¹

Statistical Evaluation

Statistical tests other than the bootstrap/iterate analysis described above are specified throughout the results and were two-sided and considered statistically significant when $P < .05$. IBM SPSS Statistics 25 (ICM Corp, Armonk, NY) was used for the statistical analyses.

Ethics Approval and Consent to Participate

pBC cohort: Data were publicly available.⁹

mBC cohort: For our analyses, we selected patients with mBC who were included under the protocol of the Center for Personalized Cancer Treatment (CPCT) consortium (CPCT-02 Biopsy Protocol, ClinicalTrials.gov identifier: [NCT01855477](https://clinicaltrials.gov/ct2/show/study/NCT01855477)), which was approved by the medical ethics committee of the University Medical Center Utrecht, the Netherlands. A detailed description of the consortium and whole patient cohort has been described recently.⁴

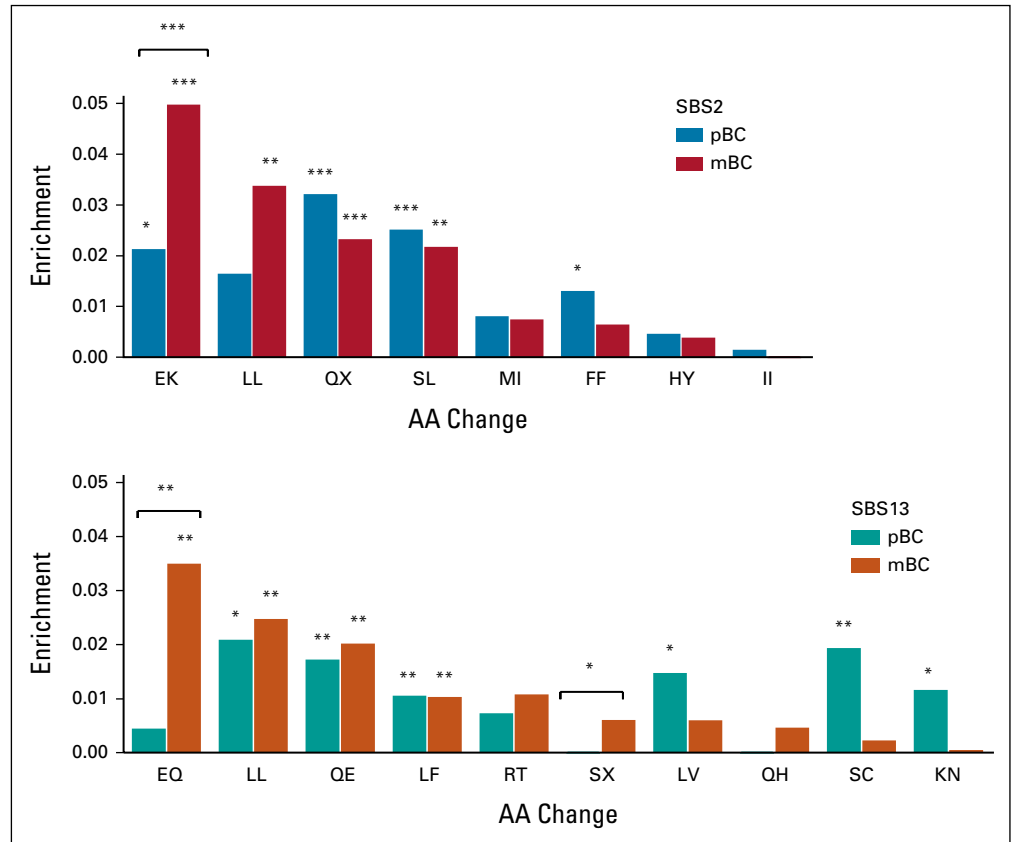
Razavi cohort: Data were publicly available.¹⁰

RESULTS

Identification of APOBEC-Derived Enriched Codon Changes

Our approach to determine enrichment of APOBEC-derived AA changes is presented in [Figure 1](#). In short, we established a catalog of all possible changes that APOBEC is capable of producing in the complete coding sequence of the human genome ([Fig 1](#), top right). By randomly drawing from this catalog, we simulate the distribution of codon changes in a genome when no selection pressure is present. By comparing the actual observed codon changes in pBC and mBC with the randomly drawn sets, specific enriched AA changes are identified that are likely selected for (synonymous events are included here in the definition of AA change, and all single-letter AAs are listed in the abbreviations list). We analyzed WGS data from 323 pBC tumors⁹ and 424 metastatic biopsies from patients with mBC; all patients included were ER+/HER2-.³ In pBC, AA changes E>K, Q>X, S>L, and F>F (SBS2) and L>L, Q>E, L>F, L>V, S>C, and K>N (SBS13) were significantly enriched compared with randomly drawn sets, whereas E>K, L>L, Q>X, and S>L (SBS2) and E>Q, L>L, Q>E, and L>F (SBS13) were enriched in mBC ($P < .05$). When using the data from pBC as the catalog of possible AA changes to draw random sets from, E>K, E>Q, and S>X were enriched in mBC relative to those already observed in pBC ([Fig 2](#)).

FIG 2. Enrichment of AA changes (difference between observed frequency and a random sample) in pBC and mBC and in mBC with pBC as a random sample for SBS2 and SBS13 ($*P \leq .05$, $**P \leq .01$, and $***P \leq .001$). Only AA changes with a frequency $\geq 1\%$ in a random sample are shown. AA, amino acid; C, cysteine; E, glutamate; F, phenylalanine; H, histidine; I, isoleucine; K, lysine; L, leucine; mBC, metastatic breast cancer; mBC, metastatic breast cancer; N, asparagine; pBC, primary breast cancer; Q, glutamine; R, arginine; S, serine; SBS, single base-pair substitution; T, threonine; V, valine; X, STOP (stop codon); Y, tyrosine. APOBEC drives early, metastatic, and endocrine-resistant disease in ER+/HER2- breast cancer



As previously described,⁵ loop structures in hairpins are prone to APOBEC mutagenesis. In total, 1.53% of all APOBEC-derived mutations that were identified in mBC were located within a hairpin, an enrichment when compared with the frequency that is expected on the basis of the catalog of all possible APOBEC-induced AA changes (0.18%, chi-square $P < .001$). To elucidate whether the presence of codons in hairpins biased the observed enrichment of the above, we repeated the bootstrap procedure excluding hairpin locations from the catalog of all possible APOBEC-induced changes that were randomly sampled from. This analysis revealed that all the above-mentioned enriched AA changes remained significant. In addition, the relative frequency of all possible APOBEC AA changes in the catalog was not different with and without hairpin locations (Data Supplement).

Presence and Clonality of APOBEC-Derived Codon Changes in Genes or Hotspots

We investigated at which hotspots or in which genes the enriched APOBEC-derived AA changes occurred recurrently in pBC, mBC, and endocrine-resistant mBC, implying that they are subjected to differential selection, Table 1. We also investigated whether these mutations were clonal. We performed the latter analysis only in the 424 mBC cases for which WGS data were available since the lower sequence coverage in the pBC cohort (median

coverage pBC cohort: 40x; median coverage mBC cohort: 110x) likely yields inferior results.

From all APOBEC-derived mutations in mBC, the majority (90%) was clonal. However, in general, the fraction of APOBEC mutations was not different among all exonic clonal and subclonal mutations that were identified within genes (Fisher's exact $P = .895$, Fig 3).

Helical *PIK3CA* mutations (eg, p.E535K and p.E542K) were the most frequently identified E>K mutations in patients with primary, metastatic, and endocrine-resistant BC (Data Supplement). A subset of patients had dual nonsynonymous mutations in *PIK3CA*, of which the majority (93%) was clonal. Although the prevalence of those dual *PIK3CA* mutations was lower among patients with pBC ($n = 11$ of 323, 3%) than among patients with mBC ($n = 31$ of 424, 7%) in the WGS cohorts (Fisher's exact $P = .024$), this difference was not confirmed in the data set from Razavi. Strikingly, dual *PIK3CA* mutations occurred more frequently in an APOBEC context when compared with single *PIK3CA* mutations in the metastatic setting (Fisher's exact $P < .001$), whereas this difference was not observed in pBC (Fisher's exact $P = 1$, Fig 4) and also in the data set from Razavi.

In pBC, APOBEC-induced inactivating Q>X mutations occurred most frequently in *CDH1* (16%) of all Q>X mutations, *NCOR1* (10%), *TP53* (10%), and *MAP3K1* (11%), all well-

TABLE 1. Results of Enriched Amino Acid Changes in pBC and mBC

Agent	AA Changes	Effect	P		
			pBC v Catalog	mBC v Catalog	pBC v mBC
SBS2	E>K	Increased selection	*	***	***
SBS13	E>Q	Increased selection	NS	**	**
SBS2	Q>X	Stable selection	***	***	NS
SBS2	S>L	Stable selection	***	**	NS
SBS13	Q>E	Stable selection	**	**	NS
SBS13	L>F	Stable selection	**	**	NS
SBS2	L>L	Coenrichment	NS	**	NS
SBS13	S>X	Late selection	NS	NS	*
SBS13	L>L	Unsure	*	**	NS
SBS2	F>F	No role in metastatic	*	NS	NS
SBS13	L>V	No role in metastatic	*	NS	NS
SBS13	S>C	No role in metastatic	**	NS	NS
SBS13	K>N	No role in metastatic	*	NS	NS

Abbreviations: AA, amino acid; C, cysteine; E, glutamate; F, phenylalanine; K, lysine; L, leucine; mBC, metastatic breast cancer; N, asparagine; NS, not significant; pBC, primary breast cancer; Q, glutamine; S, serine; SBS, single base-pair substitution; V, valine; X, STOP (stop codon).

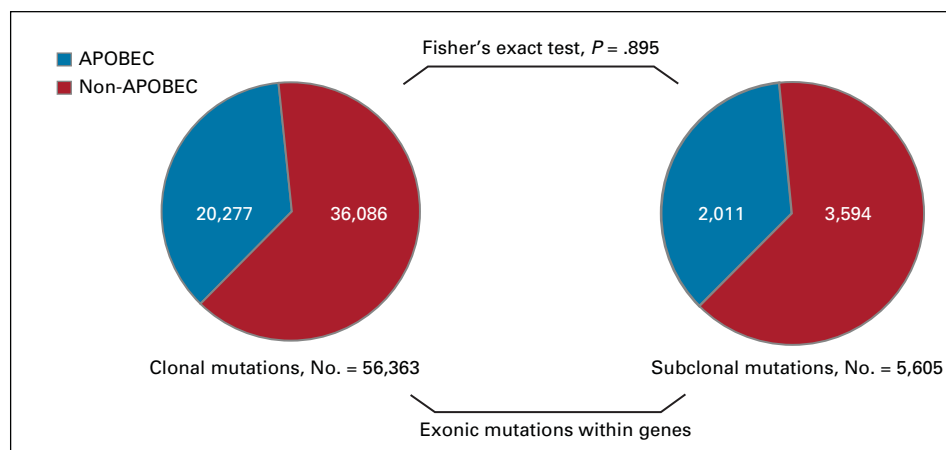
* $P \leq .05$, ** $P \leq .01$, and *** $P \leq .001$.

known drivers of pBC.⁹ In fact, APOBEC-derived Q>X mutations in *CDH1* were the sole inactivating mutation in 6% of all lobular pBC tissues. In mBC, those inactivating mutations in *CDH1* (0.6%), *TP53* (0.5%), and *MAP3K1* (0.5%) remained, although their relative contribution to the total number of APOBEC-induced mutations decreased. Additional widespread inactivating mutations were identified in *KMT2C*, *ZHX3*, *NF1*, *PTEN*, and *RB1* (Fig 5 and Data Supplement). All these mutations were clonal, apart from a single mutation in *PTEN* and *ZFH3*. S>X mutations did not have a high prevalence in pBC and were only recurrently detected in *ARID1A* (11% of all S>X mutations), *BRCA2* (11%), and *KMT2C* (11%) in mBC, Figure 5 and Data Supplement.

Besides some recurrent clonal mutations in *PIK3CA* and *ESR1* p.E380Q, we did not identify additional recurrent

E>Q mutations (Data Supplement). Moreover, we did not find any genes having recurrent L>L, L>F, L>V, S>C, or K>N mutations. To understand why synonymous L>L mutations were unexpectedly found enriched in mBC, we studied whether L>L mutations were coenriched with other enriched codon changes. Therefore, we defined the number of driver mutations resulting from APOBEC mutagenesis for each sample: Q>X in *CDH1*, *NF1*, *TP53*, *KMT2C*, *ARID1A*, *MAP3K1*, and *RB1* and E>K in *PIK3CA*. We associated the fraction of L>L mutations per total number of SBS2 mutations with the number of SBS2-induced driver mutations and observed a significant correlation, suggesting evidence of coenrichment between L>L mutations and other SBS2-induced drivers (Jonckheere-Terpstra test for ordered alternatives: $P = .001$, Data

FIG 3. Fraction of APOBEC mutations among clonal and subclonal mutations. Only exonic mutations within a gene were included in this analysis. APOBEC, Apolipoprotein B mRNA-Editing Catalytic Polypeptide-like.



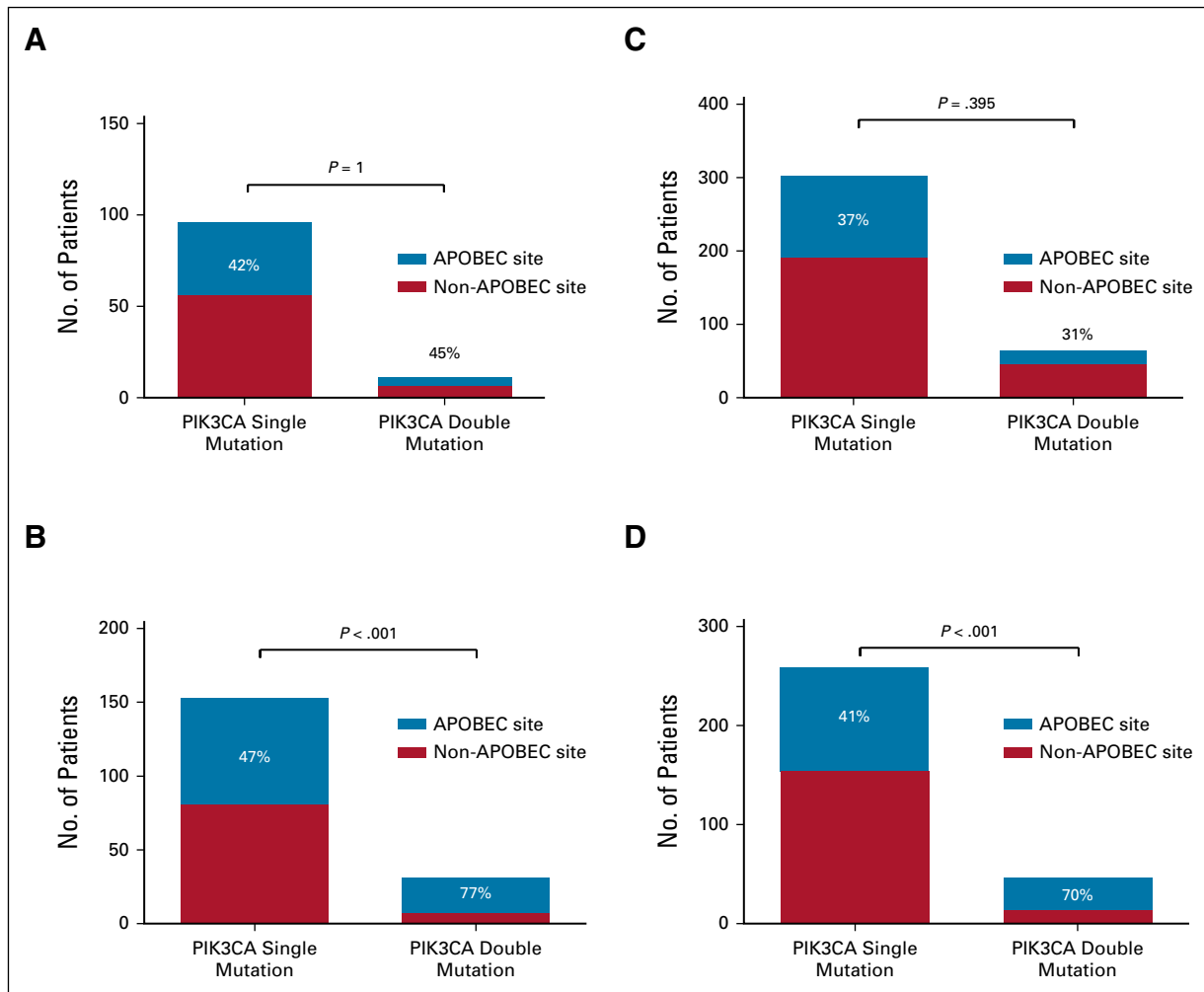


FIG 4. Prevalence of *PIK3CA* mutations in pBC and mBC: (A) pBC, BASIS cohort; (B) mBC, CPCT-02 cohort; (C) pBC, Razavi cohort; and (D) mBC, Razavi cohort. The Fisher's exact test was used to determine differences between the fraction of APOBEC mutations between single and dual *PIK3CA* mutations. For patients with dual *PIK3CA* mutations, at least one mutation occurring at an APOBEC site was required to be classified as 'APOBEC site'. APOBEC, Apolipoprotein B mRNA-Editing Catalytic Polypeptide-like; mBC, metastatic breast cancer; pBC, primary breast cancer.

Supplement). Since no recurrent driver genes in SBS13 were identified, apart from few E>Q mutations in *ESR1* and *PIK3CA*, we were unable to perform a similar analysis for E>Q or L>L in a SBS13 context.

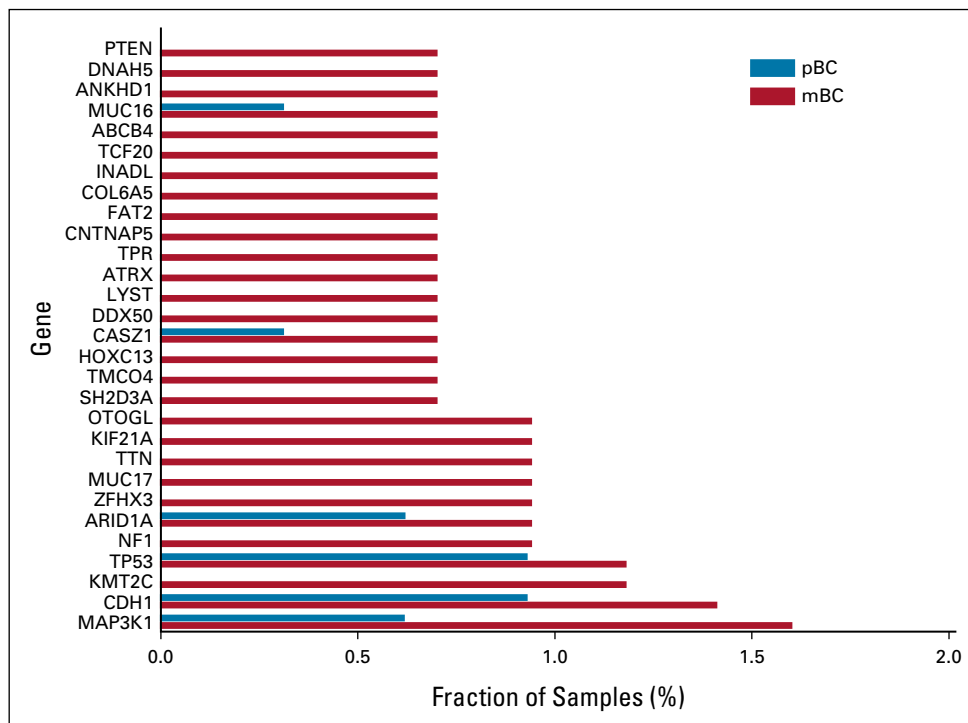
DISCUSSION

APOBEC enzymes are important mutagenic factors driving a subgroup of ER+/HER2-BCs. We used an alternative approach that has been used thus far, in which we draw random sets from all possible codon changes induced by APOBEC, enabling the identification of those codon changes that are enriched in pBC and mBC. Besides confirmation of previously described APOBEC effects, our analysis described the evolution of APOBEC effects over time and pinpointed specific biologic effects of APOBEC mutagenesis in BC such as the presence of dual activating mutations in *PIK3CA* and the widespread accumulation of

inactivating stop codons in tumor suppressor genes, including genes modulating the estrogen signaling pathway. The latter genes were previously reported to be involved in endocrine resistance, mutually exclusive to *ESR1* mutations.

Although several studies have identified APOBEC driver mutations occurring in TCN motifs rather than only in TCW motifs,⁸ we did not include TCN motifs. First, TCW is the vastly dominant contribution¹² in the APOBEC signatures. Second, since TCN motifs also comprise the TCG motif, which is mainly age-related,¹² we expected to falsely attribute certain mutations to APOBEC activity by including TCN motifs. Thus, the definition that we used to characterize a variant as APOBEC results in enriched AA changes that are very likely attributable to APOBEC activity (ie, highly specific). Also, we only analyzed data from ER+/HER2-tumors. Although APOBEC mutations have been identified in

FIG 5. Genes with mutations that induce stop codons (Q>X or S>X) in an APOBEC context (SBS2 or SBS13). Only genes with a mutation frequency of $\geq 0.5\%$ in the metastatic setting are shown. APOBEC, Apolipoprotein B mRNA-Editing Catalytic Polypeptide-like; mBC, metastatic breast cancer; pBC, primary breast cancer; Q, glutamine; S, serine; SBS, single base-pair substitution; X, STOP (stop codon).



ER-negative BC, which were mainly caused by APOBEC3B,¹³ a significant enrichment of APOBEC mutations in mBC when compared with pBC was only observed in the ER+/HER2 subtype. In addition, a validation cohort like the cohort from the study by Razavi et al¹⁰ was only available for ER+ tumors.

Recent findings have suggested that hairpin structures are susceptible to APOBEC mutagenesis and favor enrichment of subclonal passenger mutations.⁵ In our analysis, we show that APOBEC-driven AA changes were rarely located within hairpins in mBC (1.53% of all APOBEC mutations), but this percentage was significantly higher than the frequency that is expected on the basis of the catalog of all possible APOBEC-induced AA changes (0.18%). However, further analysis showed no specifically enriched AA changes in relation to the hairpins (Data Supplement). We conclude that hairpin structures make it somewhat easier for APOBEC to mutate DNA, without showing a selection preference for a specific AA change. In addition, the majority of APOBEC mutations were clonal, as was also seen in bladder cancer.⁸ Taken together, both the clonal nature and the finding that most APOBEC mutations were not located in putative hairpin regions suggest that the enriched APOBEC-induced codon changes are likely driving events. The sequencing depth of our mBC cohort (100x) might have hampered the detection of subclonal events; thus, the significance of subclonal enriched APOBEC AA changes remains unclear in our analysis.

We summarize the AA changes (including synonymous events) that were enriched in pBC and mBC in Table 1 and categorized the implications that the AA changes might

have during evolution of BC. First, we identified codon changes that were significantly enriched in pBC but not in mBC (F>F, L>V, S>C, and K>N), suggesting that these do not provide additional selective advantage for the tumor cell during disease progression. We also did not find genes in which these codon changes were recurrently present, so their significance remains unclear.

The next category includes codon changes that were enriched in mBC only, suggesting that these are late selection events: S>X and L>L. S>X mutations were found recurrently within several genes such as *ARID1A*, *BRCA2*, and *KMT2C*, in which a third of all S>X mutations were found. L>L mutations were the only synonymous mutations that were found enriched in mBC. We did not find evidence supporting a biologic effect of the L>L mutations as they were not recurrently observed in specific genes, nor did we find evidence for enrichment of L>L mutations within hairpins as L>L remained significantly enriched when we bootstrapped from a catalog without hairpin locations. However, although synonymous mutations are considered silent, recent studies have suggested that they might affect mRNA splicing, stability, and translation.¹⁴ In addition, we demonstrated that L>L mutations in SBS2 were in part coenriched with other selected APOBEC drivers in a SBS2 context identified in our analysis. Thus, L>L mutations in a SBS2 context may be passengers that are coselected.

Two AA changes were further enriched in mBC when compared with pBC: E>K and E>Q. As described by us and others,^{6,15} APOBEC-derived E>K changes recurrently occur in the helical domain (p.E542K and p.E545K) of *PIK3CA* in both pBC and mBC. Like kinase domain

mutations, which are not APOBEC-related, *PIK3CA* helical domain mutations are known drivers in BC. Differences in proliferative characteristics between helical and kinase domain mutations affecting clinical outcomes have been suggested^{16,17} and also disputed.^{18,19} A subset of patients had dual nonsynonymous *PIK3CA* mutations. In mBC, dual nonsynonymous *PIK3CA* mutations occurred more frequently at APOBEC sites than single *PIK3CA* mutations, a difference that was not observed in pBC. Independent validation in a second cohort¹⁰ suggests that APOBEC-derived *PIK3CA* mutations accumulate over time, a phenomenon that is likely explained by their added selective advantage for tumor cells. Indeed, dual *PIK3CA* mutations are known to hyperactivate PI3K signaling, which is further supported by their enhanced sensitivity to the recently approved PI3K α selective inhibitors.²⁰

An E>Q change was the most strongly enriched SBS13-derived change. However, a direct explanation for their enrichment could not be clearly identified nor were they enriched through hairpins. Except for *ESR1* p.E380Q and *PIK3CA* p.E453Q, E>Q changes were not recurrent. *ESR1* p.E380Q activates ER to a lesser extent than other activating *ESR1* mutations unrelated to APOBEC, which may explain the absence of strong selection in endocrine-resistant mBC of this particular mutation compared with other activating *ESR1* mutations.²¹ Apart from rare mutations in *ESR1* and *PIK3CA*, we did observe compound heterozygous clonal mutations in *MAP3K13*, *FANCA*, *TP53*, and *SPEN* supportive of a tumor-suppressive function.

Finally, the last category consists of four AA changes, which showed a continuous selection: these were enriched in both pBC and mBC when compared with the random sample, but their enrichment was not augmented in mBC when compared with pBC. Of those AA changes, S>L, Q>E, and L>F were not recurrent at genes nor at hotspots, and we were unable to elucidate the precise reason for their enrichment in BC. By contrast, Q>X was recurrently present in several genes, albeit at different positions. Only in *PTEN* and *TP53*, some positions were frequently affected by APOBEC mutagenesis. The facts that Q>X is enriched in both early and late BC and that S>X appears as a late selection event indicate that another major effect of APOBEC mutagenesis on the coding sequence is the introduction of stop codons, likely resulting in subsequent gene inactivation. Genes with Q>X mutations in pBC and mBC were observed in known tumor suppressor genes *CDH1*, *TP53*, *NCOR1*, and

MAP3K1, likely persistently driving BC. Importantly, our finding that in 6% of all lobular BCs, APOBEC-derived inactivation of *CDH1* is the sole event suggests that APOBEC mutagenesis is directly responsible for a subset of lobular BCs.²² In mBC, Q>X and S>X mutations emerged in genes that have been associated with endocrine resistance like *KMT2C*, *ARID1A*, *ZFH3*, and *NF1*. Thus, complete loss of these loci is frequently a result of APOBEC activity and under differential selection during endocrine treatment. This finding is in line with their established biologic role, ie, loss of ER activity modulators *KMT2C*, *ARID1A*, *NF1*, and *ZFH3* worsens outcomes on antiestrogen therapy.²³⁻²⁷ Of note, our analyses did show that S>X and Q>X were often found inside hairpin structures (Fig 3), possibly rendering these results as less likely driving events. However, of the 65 S>X and Q>X changes located inside hairpins, only a single mutation was present in the genes discussed above (p.Q2054X in *KMT2C* and eight other mutations in this gene outside hairpins).

There are some limitations to our approach. Although mitigated by the sample size, we did not use paired pBC and mBC samples. Instead, for our primary analysis, we used WGS data originating from two cohorts (BASIS cohort and CPCT cohort), in which the tumors were sequenced at a different depth. This might have introduced detection bias of low frequent, subclonal events, mainly in the pBC cohort. However, most findings were confirmed in different data sets.^{8,10} In addition, our cohorts were heterogeneous with regard to the treatment that patients had received. This has potentially complicated the attribution of certain APOBEC effects to the environmental pressure of given treatments.

In conclusion, using an approach on the basis of enrichment of AAs, which has not been used thus far, we demonstrated that the coding sequence of ER+/HER2- BC evolves as a result of APOBEC mutagenesis by introducing accumulating focal oncogenic mutations in *PIK3CA* and tumor-suppressive alterations at nonhotspot locations. These alterations drive early, metastatic, and endocrine-resistant BC. Given the APOBEC-related hyperactivation of the PI3K pathway, BC patients with high APOBEC contribution might substantially benefit from the recently introduced PI3K inhibitors.²⁸ This would be a first step toward selecting optimal treatment for patients with BC tumors with profound APOBEC mutagenesis who are also prone to develop resistance to endocrine treatment by inactivation of negative modulators of ER activity.

AFFILIATIONS

¹Department of Medical Oncology, Erasmus MC Cancer Institute, Erasmus University Medical Center, Rotterdam, the Netherlands

²Center for Personalized Cancer Treatment, Rotterdam, the Netherlands

CORRESPONDING AUTHOR

Manouk K. Bos, MD, Department of Medical Oncology, Erasmus MC Cancer Institute, Erasmus University Medical Center, Dr Molewaterplein

40, 3015 GD, Rotterdam, the Netherlands; e-mail: m.k.bos@erasmusmc.nl.

EQUAL CONTRIBUTION

M.K.B. and M.S. contributed equally to this work.

PRIOR PRESENTATION

Presented at the virtual European Breast Cancer Conference (EBCC-12), October 2-3, 2020.

SUPPORT

M.K.B. Research funding: Dutch Cancer Society (no. NKB-EMCR-2016-108154). S.S. Research funding: Cancer Genomics Netherlands (CGC.nl), funded by the Netherlands Organization for Scientific Research (NWO). J.W.M.M. Consulting honorarium: Novartis, Research funding: Cancer Genomics Netherlands (CGC.nl), funded by the Netherlands Organization for Scientific Research (NWO), Research funding: Dutch Cancer Society (No. NKB-EMCR-2016-10270).

DATA SHARING STATEMENT

pBC cohort: The somatic mutations for the BASIS cohort were extracted from the European Genome-phenome Archive (accession code EGAS00001001178).

mBC cohort: The WGS and corresponding clinical data were requested from the Hartwig Medical Foundation and provided under data request No. DR-068. Both WGS and clinical data are freely available for academic use from the Hartwig Medical Foundation through standardized procedures; request forms can be found at <https://www.hartwigmedicalfoundation.nl>.

Razavi cohort: Breast cancer data (primary, n = 869 and metastatic, n = 965) can be downloaded from the Data Supplement: <https://www.sciencedirect.com/science/article/pii/S1535610818303684?via%3Dihub>.

REFERENCES

- Swanton C, McGranahan N, Starrett GJ, et al: APOBEC enzymes: Mutagenic fuel for cancer evolution and heterogeneity. *Cancer Discov* 5:704-712, 2015
- Jamal-Hanjani M, Wilson GA, McGranahan N, et al: Tracking the evolution of non-small-cell lung cancer. *N Engl J Med* 376:2109-2121, 2017
- Angus L, Smid M, Wilting SM, et al: The genomic landscape of metastatic breast cancer highlights changes in mutation and signature frequencies. *Nat Genet* 51:1450-1458, 2019
- Bertucci F, Ng CKY, Patsouris A, et al: Genomic characterization of metastatic breast cancers. *Nature* 569:560-564, 2019
- Buisson R, Langenbucher A, Bowen D, et al: Passenger hotspot mutations in cancer driven by APOBEC3A and mesoscale genomic features. *Science* 364:eaaw2872, 2019
- Henderson S, Chakravarthy A, Su X, et al: APOBEC-mediated cytosine deamination links PIK3CA helical domain mutations to human papillomavirus-driven tumor development. *Cell Rep* 7:1833-1841, 2014
- Glaser AP, Fantini D, Wang Y, et al: APOBEC-mediated mutagenesis in urothelial carcinoma is associated with improved survival, mutations in DNA damage response genes, and immune response. *Oncotarget* 9:4537-4548, 2017
- Shi M-J, Meng X-Y, Fontugne J, et al: Identification of new driver and passenger mutations within APOBEC-induced hotspot mutations in bladder cancer. *Genome Med* 12:85, 2020
- Nik-Zainal S, Davies H, Staaf J, et al: Landscape of somatic mutations in 560 breast cancer whole-genome sequences. *Nature* 534:47-54, 2016
- Razavi P, Chang MT, Xu G, et al: The genomic landscape of endocrine-resistant advanced breast cancers. *Cancer Cell* 34:427-438, 2018
- Priestley P, Baber J, Lolkema MP, et al: Pan-cancer whole-genome analyses of metastatic solid tumours. *Nature* 575:210-216, 2019
- Alexandrov LB, Nik-Zainal S, Wedge DC, et al: Signatures of mutational processes in human cancer. *Nature* 500:415-421, 2013
- Jalili P, Bowen D, Langenbucher A, et al: Quantification of ongoing APOBEC3A activity in tumor cells by monitoring RNA editing at hotspots. *Nat Commun* 11:2971, 2020
- Sharma Y, Miladi M, Dukare S, et al: A pan-cancer analysis of synonymous mutations. *Nat Commun* 10:2569, 2019
- Cannataro VL, Gaffney SG, Sasaki T, et al: APOBEC-induced mutations and their cancer effect size in head and neck squamous cell carcinoma. *Oncogene* 38:3475-3487, 2019
- Pang H, Flinn R, Patsialou A, et al: Differential enhancement of breast cancer cell motility and metastasis by helical and kinase domain mutations of class IA phosphoinositide 3-kinase. *Cancer Res* 69:8868-8876, 2009
- Barbareschi M, Buttitta F, Felicioni L, et al: Different prognostic roles of mutations in the helical and kinase domains of the PIK3CA gene in breast carcinomas. *Clin Cancer Res* 13:6064-6069, 2007

AUTHOR CONTRIBUTIONS

Conception and design: All authors

Collection and assembly of data: Manouk K. Bos, Marcel Smid

Data analysis and interpretation: All authors

Manuscript writing: All authors

Final approval of manuscript: All authors

Accountable for all aspects of the work: All authors

AUTHORS' DISCLOSURES OF POTENTIAL CONFLICTS OF INTEREST

The following represents disclosure information provided by authors of this manuscript. All relationships are considered compensated unless otherwise noted. Relationships are self-held unless noted. I = Immediate Family Member, Inst = My Institution. Relationships may not relate to the subject matter of this manuscript. For more information about ASCO's conflict of interest policy, please refer to www.asco.org/rwc or ascopubs.org/po/author-center.

Open Payments is a public database containing information reported by companies about payments made to US-licensed physicians ([Open Payments](http://OpenPayments)).

Stefan Sleijfer

Honoraria: Skyline Diagnostics

Consulting or Advisory Role: Philips Research (Inst)

Research Funding: AB Science (Inst), Sanofi (Inst), Merck KGaA (Inst), Lilly (Inst)

Patents, Royalties, Other Intellectual Property: Test on circulating tumor cells in prostate cancer

Travel, Accommodations, Expenses: AstraZeneca

John W. M. Martens

Consulting or Advisory Role: Novartis/Pfizer

Research Funding: Merck Serono (Inst), CytoTrack, GlaxoSmithKline

No other potential conflicts of interest were reported.

18. Pereira B, Chin SF, Rueda OM, et al: The somatic mutation profiles of 2,433 breast cancers refines their genomic and transcriptomic landscapes. *Nat Commun* 7:11479, 2016
19. Dimitrios Z, Luc te M, Roger LM, et al: Tumor PIK3CA genotype and prognosis in early-stage breast cancer: A pooled analysis of individual patient data. *J Clin Oncol* 36:981-990, 2018
20. Vasan N, Razavi P, Johnson JL, et al: Double PIK3CA mutations in cis increase oncogenicity and sensitivity to PI3K α inhibitors. *Science* 366:714-723, 2019
21. Spoerke JM, Gendreau S, Walter K, et al: Heterogeneity and clinical significance of ESR1 mutations in ER-positive metastatic breast cancer patients receiving fulvestrant. *Nat Commun* 7:11579, 2016
22. Bukholm IK, Nesland JM, Kåresen R, et al: E-cadherin and alpha-, beta-, and gamma-catenin protein expression in relation to metastasis in human breast carcinoma. *J Pathol* 185:262-266, 1998
23. Gala K, Li Q, Sinha A, et al: KMT2C mediates the estrogen dependence of breast cancer through regulation of ERalpha enhancer function. *Oncogene* 37:4692-4710, 2018
24. Xu G, Chhangawala S, Cocco E, et al: ARID1A determines luminal identity and therapeutic response in estrogen-receptor-positive breast cancer. *Nat Genet* 52:198-207, 2020
25. Zheng ZY, Anurag M, Lei JT, et al: Neurofibromin is an estrogen receptor-alpha transcriptional Co-repressor in breast cancer. *Cancer Cell* 37:387-402 e7, 2020
26. Dong X-Y, Sun X, Guo P, et al: ATBF1 inhibits estrogen receptor (ER) function by selectively competing with AIB1 for binding to the ER in ER-positive breast cancer cells. *J Biol Chem* 285:32801-32809, 2010
27. Zhang Z, Yamashita H, Toyama T, et al: ATBF1-A messenger RNA expression is correlated with better prognosis in breast cancer. *Clin Cancer Res* 11:193-198, 2005
28. André F, Ciruelos E, Rubovszky G, et al: Alpelisib for PIK3CA-mutated, hormone receptor–positive advanced breast cancer. *N Engl J Med* 380:1929-1940, 2019

