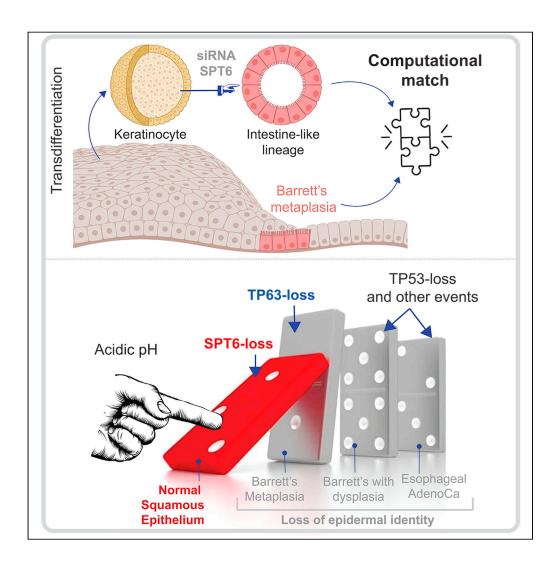
iScience



Article

SPT6 loss permits the transdifferentiation of keratinocytes into an intestinal fate that resembles Barrett's metaplasia



Daniella T. Vo, MacKenzie R. Fuller, Courtney Tindle, Mahitha Shree Anandachar, Soumita Das, Debashis Sahoo, Pradipta Ghosh

dsahoo@ucsd.edu (D.S.) sodas@ucsd.edu (S.D.) prghosh@ucsd.edu (P.G.)

Highlights

Keratinocytes transdifferentiate into a gut lineage upon depletion of SPT6

Such transdifferentiation resembles Barrett's metaplasia not the healthy gut

Acid downregulates SPT6, which inhibits the expression and functions of TP63

Such downregulation precedes the metaplasiadysplasia-neoplasia cascade

Vo et al., iScience 24, 103121 October 22, 2021 © 2021 The Authors. https://doi.org/10.1016/ j.isci.2021.103121

iScience



Article

SPT6 loss permits the transdifferentiation of keratinocytes into an intestinal fate that resembles Barrett's metaplasia

Daniella T. Vo,^{1,5} MacKenzie R. Fuller,^{2,3} Courtney Tindle,^{2,3} Mahitha Shree Anandachar,⁴ Soumita Das,^{3,4,6,*} Debashis Sahoo,^{1,5,6,*} and Pradiota Ghosh^{2,3,6,7,8,*}

SUMMARY

Transient depletion of the transcription elongation factor SPT6 in the keratinocyte has been recently shown to inhibit epidermal differentiation and stratification; instead, they transdifferentiate into a gut-like lineage. We show here that this phenomenon of transdifferentiation recapitulates Barrett's metaplasia, the only human pathophysiologic condition in which a stratified squamous epithelium that is injured due to chronic acid reflux is trans-committed into an intestinal fate. The evidence we present here not only lend support to the notion that the keratinocytes are potentially the cell of origin of Barrett's metaplasia but also provide mechanistic insights linking transient acid exposure, downregulation of SPT6, stalled transcription of the master regulator of epidermal fate TP63, loss of epidermal fate, and metaplastic progression. Because Barrett's metaplasia in the esophagus is a pre-neoplastic condition with no preclinical human models, these findings have a profound impact on the modeling Barrett's metaplasia-in-a-dish.

INTRODUCTION

The stratified squamous epithelium, which is comprised mainly of keratinocytes, acts as a physical barrier and is replaced every few weeks by resident stem cells residing in the basal layer (Gonzales and Fuchs, 2017; Watt, 2014). Besides our skin, stratified squamous epithelia form barriers to antigens in the oral cavity and oral pharynx including the palatine and lingual tonsils, the anal canal, the male foreskin, and the female vagina and ectocervix. Recently, it has been shown (Li et al., 2021) that in epidermal stem and progenitor cells, approximately a third of the genes that are induced during differentiation already contain stalled Pol Il at the promoters which is then released into productive transcription elongation upon differentiation. Using a combination of Pol II ChIP Seq and RNAi screen, SPT6 was identified as one of the critical mediators of such elongation (Li et al., 2021). SPT6-depleted keratinocytes fail to differentiate into stratified squamous epithelium; instead, they transdifferentiate into an "intestine-like" lineage (by morphology and gene expression analysis; Figures 1A and 1B). This claim of transdifferentiation was supported in part by morphological characteristics in 3D growth and in a more definitive way by transcriptomic studies (GSE153129) (Li et al., 2021). The list of genes that were upregulated \geq 10-fold in small interfering RNA (siRNA)-depleted SPT6 samples (SPT6i) compared to controls (CTLi). The resultant SPT6-depleted 472-gene signature was used to query the Human Gene Atlas and ARCHS⁴; the latter is a web-based resource that provides access to human and mouse transcriptomic data sets from gene expression omnibus (GEO) and sequence read archive (SRA) (Li et al., 2021). Mechanistically, depletion of SPT6 resulted in stalled transcription of the master regulator of epidermal fate p63 (Truong et al., 2006; Yang et al., 1999; Senoo et al., 2007, Crum and Mckeon, 2010). Studies in SPT6-depleted keratinocytes that were subsequently rescued with exogenous expression of p63 suggested that SPT6 favors the differentiation into stratified squamous epithelium and arrests the intestinal phenotype through the control of transcriptional elongation of p63 and its targets. Despite the mechanistic insights into how SPT6 regulates keratinocyte fate, the translational relevance of the observed transdifferentiation of keratinocytes into an intestinal fate remained unknown.

Among the various organs that are protected by stratified squamous epithelium, the only human pathophysiologic condition in which a stratified squamous epithelium in adults transdifferentiates into intestinal fate is that described in the foregut, a phenomenon termed Barrett's metaplasia (Mcdonald et al., 2015) of the

¹Department of Pediatrics, University of California San Diego, 9500 Gilman Drive, MC 0703, Leichtag Building 132, La Jolla, CA 92093-0703,

²Departments of Medicine and Cell and Molecular Medicine, University of California San Diego, 9500 Gilman Drive (MC 0651), George E. Palade Bldg, Rm 232, La Jolla, CA 92093, USA

³HUMANOID Center of Research Excellence (CoRE), University of California San Diego, La Jolla, USA

⁴Department of Pathology, University of California San Diego, 9500 Gilman Drive, George E. Palade Bldg, Rm 256, La Jolla, CA 92093, USA

⁵Department of Computer Science and Engineering, Jacob's School of Engineering, University of California San Diego, La Jolla,

⁶Moore Comprehensive Cancer Center, University of California San Diego, La Jolla, USA

⁷Department of Medicine, University of California San Diego, La Jolla, USA

⁸Lead contact

*Correspondence: dsahoo@ucsd.edu (D.S.), sodas@ucsd.edu (S.D.), prghosh@ucsd.edu (P.G.) https://doi.org/10.1016/j.isci. 2021.103121





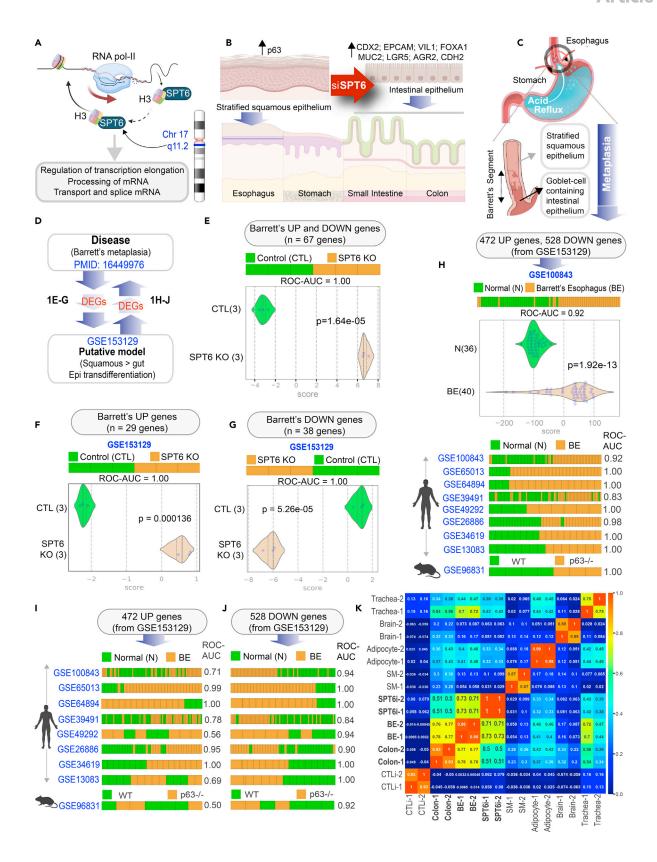






Figure 1. Keratinocyte stem cells depleted of SPT6 trans-differentiates into gut lineage that resembles Barrett's metaplasia

(A) Schematic summarizes the chromosomal location of SPT6 and its known functions in transcriptional elongation and mRNA processing. SPT6 coordinates nucleosome dis- and re-assembly, transcriptional elongation, and mRNA processing. SPT6 is a conserved factor that controls transcription and chromatin structure across the genome.

(B) Schematic summarizing the key findings in gene expression and epithelial morphology observed and reported earlier (Li et al., 2021) upon depletion of SPT6 in keratinocyte stem cells by siRNA (Li et al., 2021). While control keratinocytes formed stratified squamous epithelium, siRNA-mediated transient depletion of SPT6 in keratinocytes (SPT6i) grew as "intestine-like" monolayers.

(C) Schematic showing the only known human pathophysiologic context in which stratified squamous epithelium is known to be replaced by "intestine-like" epithelium.

(D) Summary of computational approach used in (E-J).

(E–G) Differentially expressed genes (DEGs; see Table S1) in Barrett's metaplasia vs. normal esophagus were used to rank order control (CTLi) and SPT6-depleted samples (SPT6i), either using UP genes alone (F), DOWN-genes alone (G) or both UP and DOWN signatures together (E). Results are presented as bar (top) and violin (bottom) plots. ROC-AUC in all cases reflects a perfect strength of classification (1.00). Welch's two sample unpaired t test is performed on the composite gene signature score to compute the p values.

(H–J) Differentially expressed genes (DEGs; see Data S1) between control (CTLi) and SPT6-depleted (SPT6i) samples were used to rank order normal (N) from Barrett's esophageal (BE) samples across 9 publicly available independent cohorts (8 human, 1 mouse), either using UP genes alone (I), DOWN-genes alone (J), or both UP and DOWN signatures together (H). See also Figure S1 for violin plots for each dataset. ROC-AUC in each case is annotated on the right side of the corresponding bar plots.

(K) Pearson correlation matrix showing clustering of control (CTLi) and SPT6-depleted (SPT6i) gene expression signatures with the brain, colon, BE, adipocyte, trachea, and skeletal muscle. Two distinct RNA-Seq samples of adult origin are shown for each tissue (see Table S2 for the list of datasets used to generate the matrix).

esophagus (BE). BE develops when the non-keratinized stratified squamous epithelium in the lower esophagus is replaced by a single layer of "intestine-like" cells after a prolonged phase of injury due to chronic acid reflux (Figure 1C). The origin of BE remains widely debated; theories include a direct origin from the esophageal stratified squamous epithelium or by proximal migration and subsequent intestinalization of the gastric epithelium (Zhang and Wang, 2018; Que et al., 2019; Xian et al., 2012; Gindea et al., 2014, Mcdonald et al., 2015). Alternative proposals include a niche cell at the squamocolumnar junction, or cells lining the esophageal gland ducts, or circulating bone-marrow-derived cells (Que et al., 2019). Much of these theories originate from experimental models, and to date, there are no models that recapitulate the process of transdifferentiation of the epithelial lining that is the pathognomonic feature of BE. In fact, our inability to observe the process of metaplastic conversion in vivo and the lack of reliable physiological models (Fitzgerald, 2006) are cited as the factors limiting our ability to trace the cell of origin for BE. Despite the lack of models, or dispute surrounding the origin of BE, what is undisputed is that it represents a bona fide preneoplastic state; patients with BE have approximately 40-125 times higher risk of esophageal adenocarcinoma than the general population (Wang and Canto, 2010). We hypothesized that the phenomenon of transdifferentiation from stratified squamous to an intestinal fate in SPT6-depleted keratinocytes may resemble and recapitulate the fundamental molecular and cellular aspects of keratinocyte transcommitment in BE.

RESULTS

SPT6 loss resembles Barrett's esophagus

We carried out a comprehensive bidirectional analysis: differentially expressed genes (DEGs), both upregulated and downregulated genes (Wang et al., 2006) in BE vs. normal esophagus (Figure 1D) were used to rank order the control vs. SPT6-depleted samples, and conversely, DEGs in control vs. SPT6-depleted samples were analyzed in all BE datasets publicly available on NCBI as of February 1, 2021 (Figure 1D). We found that the combined DEGs (upregulated and downregulated genes in BE (Wang et al., 2006); Figure 1E; Table S1) as well as the individual upregulated and downregulated genes (Figures 1F and 1G) were able to independently classify the control and SPT6-depleted samples with perfection (area under the Receiver Operator Characteristic (ROC) curve; ROC AUC: 1.00). The converse was also true, i.e., the combined DEGs (upregulated and downregulated genes in SPT6-depleted samples; Figure 1H, Data S1) as well as the individual upregulated/downregulated signatures (Figures 1I and 1J) were independently able to classify the normal esophageal and BE samples across several independent human datasets. Downregulated genes consistently performed better (ROC AUC ranges from 0.56–1.00 in UP-genes, I, and 0.84–1.00 in DOWN-genes, J). The DEGs from the SPT6-depleted samples also perfectly classified the BE samples derived from mice lacking p63 (Figures 1H-1J); p63-/- mice are the only genetic model of BE known to date (Wang et al., 2011). Finally, a Pearson correlation matrix revealed that SPT6-depleted samples clustered much closer to BE tissues than to the colon (correlation coefficient 0.71-0.73 to BE vs. 0.5-0.51 to colon; Figure 1K and Table S2). These findings demonstrate that the transcriptional profile of the SPT6-depleted keratinocyte is more like BE than the colon or any other tissue type tested.



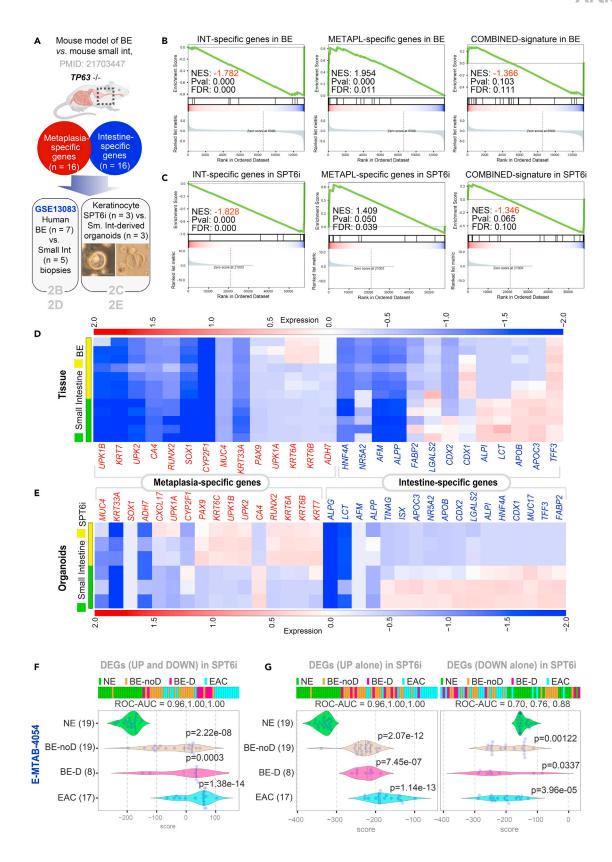






Figure 2. Downregulation of SPT6 enriches metaplasia-specific genes

(A–E) Schematic in (A) summarizing the workflow for distinguishing BE from intestine. Using TP63–/– as a strategy to induce BE in mice, a prior study showed that compared to intestinal tissues, BE tissue was enriched in a 16-gene metaplasia-specific signature and de-enriched in a 16-gene intestine-specific signature (see Table S3 for the list of genes). These gene sets were analyzed for enrichment (Gene Set Enrichment Analysis – GSEA pre-ranked analysis) in human BE vs. small intestine tissues (GSE13083; B) and SPT6-depleted (SPT6i) vs. small intestine-derived organoids (C; scale bar = $100 \, \mu m$). Heatmaps (D and E) display the levels of expression of the individual metaplasia-specific and intestine-specific genes in the BE vs. small intestine tissues (D) and organoids SPT6-depleted keratinocyte (SPT6i) vs. small intestine-derived organoids (E).

(F and G) Differentially expressed genes (DEGs; see Data S1) between control (CTLi) and SPT6-depleted (SPT6i) samples were used to rank order normal squamous esophagus (NE) from non-dysplastic Barrett's esophagus (BE-noD), dysplastic BE (BE-D), and esophageal adenocarcinoma (EAC; n = 12) samples in an RNA seq dataset [E-MTAB-4054] (Maag et al., 2017), either using UP genes alone (G; left), DOWN-genes alone (G; right), or both UP and DOWN signatures together (F). Numbers in parenthesis indicate the number of samples. ROC-AUC in each case is annotated below the bar plots. Welch's two sample unpaired t test is performed on the composite gene signature score to compute the p values. In multi-group setting, each group is compared to the NE control group and only significant p values are displayed.

SPT6 loss resembles intestinal metaplasia, not healthy intestinal differentiation

Prior studies have linked loss of p63, the master regulator of keratinocyte proliferation and differentiation into a stratified lining (Truong et al., 2006; Yang et al., 1999; Senoo et al., 2007, Crum and Mckeon, 2010), as a state that is permissive to the transdifferentiation of stratified squamous epithelium into "intestinelike" metaplasia. In p63-/- mice, the stratified lining of both trachea and esophagus is replaced by a highly ordered, columnar ciliated epithelium that is deficient in basal cells (Daniely et al., 2004). In the same mice, under conditions of programmed damage to the esophageal lining, progenitor cells at the gastroesophageal junction serve as precursors of Barrett's metaplasia (Wang et al., 2011). SPT6 loss in keratinocytes was also associated with a functional loss of p63 (Li et al., 2021); without SPT6, levels of p63 protein were diminished, and p63-binding sites on the genome were closed, as determined using ATAC seq (Li et al., 2021). Thus, both the SPT6-depleted primary human keratinocyte model and the p63-/- mouse model rely upon a final common pathway that escapes an epidermal fate; both lack functional p63. We noted that in the p63-/- mouse model of BE (Wang et al., 2011), the authors had further delineated that despite the overall similarities, BE segment and intestine tissues have key differences: a set of metaplasia-specific genes is enriched in BE, whereas a set of intestine-specific genes is enriched in the intestine (Wang et al., 2011) (Figure 2A; Table S3). Gene set enrichment analyses (GSEA-preranked) (Subramanian et al., 2005; Mootha et al., 2003) found these differences also in human BE vs. small intestine tissues (GSE13083) (Stairs et al., 2008); (Figure 2B) and in the SPT6-depleted keratinocyte organoid models (Li et al., 2021) vs. small intestine-derived organoids (Figure 2C). Visualization of the same analyses as heatmaps confirm that although the metaplasia-specific signature was induced in both BE tissue (Figure 2D) and in SPT6-depleted (SPT6i) organoids (Figure 2E) compared to their respective small intestine-derived samples, there were subtle differences. For example, the fraction of genes induced within each signature was higher in the organoids (Figure 2E) compared to the tissues (Figure 2D). Because the signatures are derived from mouse tissues (Wang et al., 2011), it is possible that their greater representation in human SPT6i organoids than in human BE tissues [which capture the gene expression patterns contributed by non-epithelial (stromal and immune) cells] reflects the species-specific differences in gene expression in the non-epithelial cells. These findings further support our argument that SPT6 depletion does not merely trigger intestinal transdifferentiation; it induces metaplasia-specific genes in the setting of de-enrichment of intestine-specific genes.

We next asked if the metaplastic BE-like signature that is induced upon SPT6 depletion stays induced during the progression of BE to esophageal adenocarcinoma (EAC). To this end, we analyzed the DEGs in SPT6-depleted keratinocytes (SPT6i) in an RNA seq dataset comprising 51 tissue samples, which included normal squamous esophagus, BE metaplasia without dysplasia, BE with low-grade dysplasia (LGD), and EAC [E-MTAB-4054] (Maag et al., 2017); these were collected at endoscopy from 44 patients. We found that the combined DEGs (upregulated and downregulated genes) in SPT6-depleted samples classified normal esophagus nearly perfectly (ROC AUC: 0.96) from BE samples and perfectly (ROC AUC: 1.00) from both dysplastic BE and EAC samples (Figure 3F). When we analyzed the upregulated genes (Figure 3G; left) or the downregulated genes (Figure 3G; right) separately, we found that the individual upregulated/downregulated signatures were independently able to classify the normal esophageal samples from all other esophageal tissues representative of progression through the metaplasia-dysplasianeoplasia cascade. These findings suggest that the BE-like gene expression pattern we observe in SPT6-depleted organoids is conserved during subsequent progression of BE to EAC.



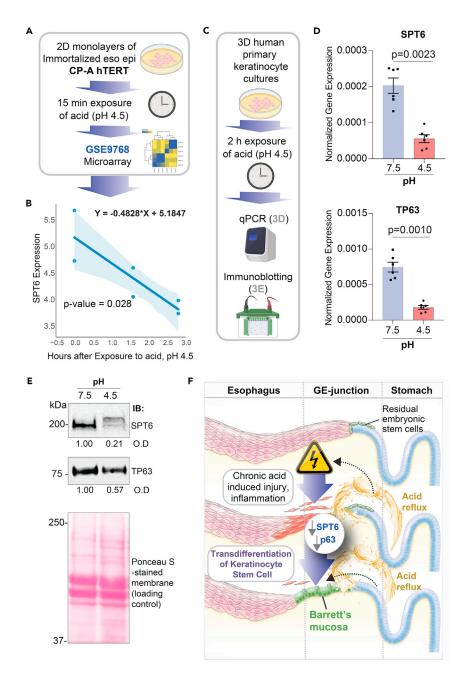


Figure 3. Downregulation of SPT6 can be triggered by exposure to acid

(A) Publicly available microarray dataset from esophageal epithelial cells (immortalized with hTERT) treated with pH 4.5 for 2 and 6 h were analyzed for SPT6 expression.

(B) Graph displays the abundance of SPT6 transcripts; the x axis represents the log2(X + 1) transformation of unexposed (0), 2 and 6 h after exposure to pH 4.5, and the y axis represents log2 normalized SPT6 expression. Significance was determined by linear regression, where Y = -0.4828*X + 5.1847 and p = 0.028.

(C–E) Schematic in (C) shows the workflow for the analyses we did here on human primary keratinocytes in 3D culture, after transiently exposing them to acid. Bar graphs in (D) display the relative expression of SPT6 (top) and TP63 (bottom) in primary keratinocytes exposed to pH 7.5 or 4.5, as determined by qPCR. Error bars represent S.E.M. Significance as determined by t test, n=3. Immunoblots (IBs) in (E) display the abundance of SPT6 and TP63 proteins in equal aliquots (50 μ g) of whole-cell lysates of the keratinocytes. O.D = optical density, as determined by band densitometry. Representative immunoblots from 3 independent repeats are shown.

iScience Article



Figure 3. Continued

(F) Schematic summarizing the evidence we present here, showing the keratinocyte stem cell as the cell of origin of BE; upon chronic acid (low pH) injury, SPT6 is downregulated in the keratinocyte stem cells. SPT6 suppression, either due to acid exposure (physiologic) or transiently with siRNA (experimentally), causes the spontaneous transdifferentiation of epidermal cells into Barrett's metaplasia. Prior work (Li et al., 2021) demonstrated that such transdifferentiation was due to the stalled transcription of the master regulator of epidermal fate p63.

Acid exposure suppresses SPT6 in keratinocytes

Because BE is a consequence of prolonged acid exposure (Mcdonald et al., 2015), we next asked what, if any, might be the impact of low pH on the levels of SPT6 expression in keratinocytes. We found that SPT6 transcripts are downregulated in immortalized esophageal keratinocytes exposed to acid (Figures 3A and 3B). Prior work has also shown that exposure of esophageal keratinocytes to bile and acid causes a reduction in p63 (Roman et al., 2007). When we exposed primary keratinocytes (same cell line used previously in Li et al. (2021)) to pH 4.5 (Figure 3C), we found that both SPT6 and TP63 transcripts were reduced (Figure 3D). Most importantly, reduced SPT6 and TP63 transcripts in these cells translated to reduced SPT6 and, to a lesser extent, TP63 proteins upon acid challenge (Figure 3E). These findings help link the SPT6 \rightarrow p63 mechanism(s) outlined earlier (Li et al., 2021) to one of the most definitive physiologic triggers of BE, i.e., exposure to acid.

DISCUSSION

Our findings augment the impact of the discoveries reported earlier (Li et al., 2021) in three ways: (i) First, they validate transient SPT6-depletion in keratinocytes as an effective strategy for studying origin of BE. Although organoids derived from segments of established BE have been successfully grown in longterm cultures (Sato et al., 2011), attempts to model the initiation of BE had thus far been unsuccessful (Kong et al., 2009). (ii) Second, they weigh in on the long-standing debate surrounding the cell of origin in BE. Controversies exist as to whether BE results from a direct conversion of differentiated cells via a process called transdifferentiation or whether BE develops from niche stem or progenitor cells at the gastroesophageal junction (Dvorak et al., 2011; Chen et al., 2011). Taken together with the evidence presented earlier (Li et al., 2021), our findings argue strongly for keratinocyte transdifferentiation or transcommitment as the mechanism. (iii) Third, our findings in SPT6i keratinocytes suggest a mechanism for initiation of BE while being able to connect the dots between physiological triggers of the disease, i.e., chronic acid reflux (Figure 3F). For example, acid exposure has been shown to promote intestinal differentiation in both BE explants (Fitzgerald et al., 1996) and BE-derived adenocarcinoma cell lines (Souza et al., 2002), and here we show that acid exposure reduces SPT6 mRNA and protein. Another intriguing coincidence is that SPT6 is located on the long arm of Chr 17q11.2, and loss of heterozygosity (LOH) at this locus is frequently encountered in BE-associated adenocarcinomas (Swift et al., 1995; Dunn et al., 2000), representing one of the most frequent LOH in BE (Dunn et al., 1999). Notably, loss of p53, which is located on the short arm of Chr 17p13, signals risk for BE to adenocarcinoma progression (Kastelein et al., 2013). Unlike the timing of loss of tp53, which happens later in BE-to-cancer progression, microdeletions in the distal long arm of Chr 17q has been proposed as early event in BE initiation (Petty et al., 1998). Because microsatellites might be sensitive indicators of disrupted mechanisms and indicate a propensity to mutagenesis, we speculate that microdeletions at Chr17q11.2 could impact SPT6 expression and trigger the transdifferentiation of keratinocytes into BE. It is possible that such microdeletions are a consequence of DNA damage due to repetitive acid injury. Regardless of the exact mechanism by which SPT6 is lost, it appears that its loss is capable of derailing both the expression (this work) and transcriptional activity of TP63 [shown earlier (Li et al., 2021)], a key determinant of keratinocyte fate. While our manuscript was in review, another group (Nowicki-Osuch et al., 2021) has since shown using lineage tracing studies that all EACs arise from BE even if BE is not visible at the time of cancer diagnosis and even if these BE cells had migrated away from the gastroesophageal junction toward the gastric cardia. While here we did not investigate BE to cancer progression, or the precise location of BE cells in the foregut, our conclusions shed light on some of the earliest events that may trigger the initiation of BE from acid-injured esophageal lining. Our studies on human keratinocytes, vetted against numerous human tissue datasets, also lend strong support to the original discoveries made in animal models, wherein the role of TP63+ transitional basal progenitors was reported as the cell of origin for BE in mouse models (Jiang et al., 2017). The BE model described here also upholds the prevailing concept that BE arises from the "transcommitment" or transdifferentiation of esophageal stem cells to produce an intestine-like epithelium (Xian et al., 2019). The importance of our findings are further enhanced in light of recent multiscale computational modeling studies (Curtius et al., 2021) and





now, molecular studies (Nowicki-Osuch et al., 2021), both independently verifying that BE is the invariant precursor to EACs, or in other words, all EACs originate from BE.

Limitations of the study

While the strength of our study lies in the rigorous computational validation of one disease model (SPT6-depleted keratinocyte) against diseased tissues from diverse cohorts, there are some notable limitations. For example, although we showed that the impact of suppressing the SPT6 \rightarrow TP63 axis on the gene expression pattern is widely reflected in most if not all BE data sets, whether SPT6 suppression itself is a major and widely prevalent trigger event in BE initiation remains to be established. Similarly, acid exposure reduced both SPT6 mRNA and protein levels, but head-to-head comparisons of the genetic (SPT6 depletion) and physiologic (repetitive acid challenge) triggers need to be analyzed systematically using gene and pathway overlap assessments to fully understand which model is closest to BE and what role SPT6 depletion may plan in its initiation. Finally, prolonged acid injury was not attempted; such studies in conjunction with genomic and epigenomic studies will be insightful to understand how acid injury may lead to SPT6 loss and/or suppression.

STAR★ METHODS

Detailed methods are provided in the online version of this paper and include the following:

- KEY RESOURCES TABLE
- RESOURCE AVAILABILITY
 - Lead contact
 - Materials availability
 - O Data and code availability
- EXPERIMENTAL MODEL AND SUBJECT DETAILS
 - O Human epidermal keratinocyte culture
- METHOD DETAILS
- Computational methods
- QUANTIFICATION AND STATISTICAL ANALYSIS
 - O Statistical analyses in computational studies
 - O Statistical analyses in experimental studies and replications

SUPPLEMENTAL INFORMATION

Supplemental information can be found online at https://doi.org/10.1016/j.isci.2021.103121.

ACKNOWLEDGMENTS

We thank George Sen for transparent communications and for providing access to reagents. This paper was supported by the National Institute of Health (NIH, United States) R01 Al141630 and R01 CA100768 (to P.G), R01 GM138385 (to D.S), T32 GM8806 (to D.V) and R01 Al155696, UG3TR003355 and UG3TR002968 (to D.S, P.G and S.D).

AUTHOR CONTRIBUTIONS

D.V. carried out the computational analysis, with supervision from D.S and P.G. M.F and C.T carried out the studies on 3D organoids under the supervision of S.D and P.G. D.S., S.D., and P.G. provided transdisciplinary expertise, resources, and wrote and edited the manuscript. P.G conceived and directed the project.

DECLARATION OF INTERESTS

The authors declare no competing interests.

Received: May 10, 2021 Revised: August 13, 2021 Accepted: September 9, 2021 Published: October 22, 2021

iScience

Article



REFERENCES

Barrett, T., Suzek, T.O., Troup, D.B., Wilhite, S.E., Ngau, W.C., Ledoux, P., Rudnev, D., Lash, A.E., Fujibuchi, W., and Edgar, R. (2005). NCBI GEO: mining millions of expression profiles—database and tools. Nucleic Acids Res. 33, D562–D566.

Barrett, T., Wilhite, S.E., Ledoux, P., Evangelista, C., Kim, I.F., Tomashevsky, M., Marshall, K.A., Phillippy, K.H., Sherman, P.M., Holko, M., et al. (2013). NCBI GEO: archive for functional genomics data sets—update. Nucleic Acids Res. 41, D991–D995.

Chen, H., Fang, Y., Tevebaugh, W., Orlando, R.C., Shaheen, N.J., and Chen, X. (2011). Molecular mechanisms of Barrett's esophagus. Dig. Dis. Sci. 56, 3405–3420.

Crum, C.P., and Mckeon, F.D. (2010). p63 in epithelial survival, germ cell surveillance, and neoplasia. Annu. Rev. Pathol. 5, 349–371.

Curtius, K., Rubenstein, J.H., Chak, A., and Inadomi, J.M. (2021). Computational modelling suggests that Barrett's oesophagus may be the precursor of all oesophageal adenocarcinomas. Gut 70, 1435–1440.

Dalerba, P., Kalisky, T., Sahoo, D., Rajendran, P.S., Rothenberg, M.E., Leyrat, A.A., Sim, S., Okamoto, J., Johnston, D.M., Qian, D., et al. (2011). Single-cell dissection of transcriptional heterogeneity in human colon tumors. Nat. Biotechnol. 29, 1120–1127.

Dalerba, P., Sahoo, D., Paik, S., Guo, X., Yothers, G., Song, N., Wilcox-Fogel, N., Forgo, E., Rajendran, P.S., Miranda, S.P., et al. (2016). CDX2 as a prognostic biomarker in stage II and stage III colon cancer. N. Engl. J. Med. 374, 211–222.

Daniely, Y., Liao, G., Dixon, D., Linnoila, R.I., Lori, A., Randell, S.H., Oren, M., and Jetten, A.M. (2004). Critical role of p63 in the development of a normal esophageal and tracheobronchial epithelium. Am. J. Physiol. Cell Physiol. 287, C171–C181.

Dunn, J., Garde, J., Dolan, K., Gosney, J.R., Sutton, R., Meltzer, S.J., and Field, J.K. (1999). Multiple target sites of allelic imbalance on chromosome 17 in Barrett's oesophageal cancer. Oncogene 18, 987–993.

Dunn, J.R., Garde, J., Dolan, K., Gosney, J.R., Oates, B.C., Watson, A.J., Fielding, P., and Field, J.K. (2000). The evolution of loss of heterozygosity on chromosome 17 during the progression to Barrett's adenocarcinoma involves a unique combination of target sites in individual specimens. Clin. Cancer Res. 6, 4033–4042.

Dvorak, K., Goldman, A., Kong, J., Lynch, J.P., Hutchinson, L., Houghton, J.M., Chen, H., Chen, X., Krishnadath, K.K., and Westra, W.M. (2011). Molecular mechanisms of Barrett's esophagus and adenocarcinoma. Ann. N. Y Acad. Sci. *1232*, 381–391.

Edgar, R., Domrachev, M., and Lash, A.E. (2002). Gene Expression Omnibus: NCBI gene expression and hybridization array data repository. Nucleic Acids Res. 30, 207–210.

Fabregat, A., Jupe, S., Matthews, L., Sidiropoulos, K., Gillespie, M., Garapati, P., Haw, R., Jassal, B., Korninger, F., May, B., et al. (2018). The reactome pathway knowledgebase. Nucleic Acids Res. 46, D649–D655.

Fitzgerald, R.C. (2006). Molecular basis of Barrett's oesophagus and oesophageal adenocarcinoma. Gut 55, 1810–1820.

Fitzgerald, R.C., Omary, M.B., and Triadafilopoulos, G. (1996). Dynamic effects of acid on Barrett's esophagus. An ex vivo proliferation and differentiation model. J. Clin. Invest. 98, 2120–2128.

Ghosh, P., Swanson, L., Sayed, I.M., Mittal, Y., Lim, B.B., Ibeawuchi, S.R., Foretz, M., Viollet, B., Sahoo, D., and Das, S. (2020). The stress polarity signaling (SPS) pathway serves as a marker and a target in the leaky gut barrier: implications in aging and cancer. Life Sci Alliance 3, e201900481.

Gindea, C., Birla, R., Hoara, P., Caragui, A., and Constantinoiu, S. (2014). Barrett esophagus: history, definition and etiopathogeny. J. Med. Life 7, 23–30.

Gonzales, K.A.U., and Fuchs, E. (2017). Skin and its regenerative powers: an alliance between stem cells and their niche. Dev. Cell 43, 387–401.

Irizarry, R.A., Bolstad, B.M., Collin, F., Cope, L.M., Hobbs, B., and Speed, T.P. (2003a). Summaries of Affymetrix GeneChip probe level data. Nucleic Acids Res. *31*, e15.

Irizarry, R.A., Hobbs, B., Collin, F., Beazer-Barclay, Y.D., Antonellis, K.J., Scherf, U., and Speed, T.P. (2003b). Exploration, normalization, and summaries of high density oligonucleotide array probe level data. Biostatistics 4, 249–264.

Jiang, M., Li, H., Zhang, Y., Yang, Y., Lu, R., Liu, K., Lin, S., Lan, X., Wang, H., Wu, H., et al. (2017). Transitional basal cells at the squamous-columnar junction generate Barrett's oesophagus. Nature *550*, 529–533.

Kastelein, F., Biermann, K., Steyerberg, E.W., Verheij, J., Kalisvaart, M., Looijenga, L.H., Stoop, H.A., Walter, L., Kuipers, E.J., Spaander, M.C., et al. (2013). Aberrant p53 protein expression is associated with an increased risk of neoplastic progression in patients with Barrett's oesophagus. Gut 62, 1676–1683.

Kong, J., Nakagawa, H., Isariyawongse, B.K., Funakoshi, S., Silberg, D.G., Rustgi, A.K., and Lynch, J.P. (2009). Induction of intestinalization in human esophageal keratinocytes is a multistep process. Carcinogenesis 30, 122–130.

Li, B., and Dewey, C.N. (2011). RSEM: accurate transcript quantification from RNA-Seq data with or without a reference genome. BMC Bioinform. 12, 323.

Li, J., Xu, X., Tiwari, M., Chen, Y., Fuller, M., Bansal, V., Tamayo, P., Das, S., Ghosh, P., and Sen, G.L. (2021). SPT6 promotes epidermal differentiation and blockade of an intestinal-like phenotype through control of transcriptional elongation. Nat. Commun. 12, 784.

Maag, J.L.V., Fisher, O.M., Levert-Mignon, A., Kaczorowski, D.C., Thomas, M.L., Hussey, D.J., Watson, D.I., Wettstein, A., Bobryshev, Y.V., Edwards, M., et al. (2017). Novel aberrations uncovered in Barrett's esophagus and esophageal adenocarcinoma using whole transcriptome sequencing. Mol. Cancer Res. *15*, 1558–1569.

Mcdonald, S.A., Lavery, D., Wright, N.A., and Jansen, M. (2015). Barrett oesophagus: lessons on its origins from the lesion itself. Nat. Rev. Gastroenterol. Hepatol. 12, 50–60.

Miyoshi, H., and Stappenbeck, T.S. (2013). In vitro expansion and genetic modification of gastrointestinal stem cells in spheroid culture. Nat. Protoc. *8*, 2471–2482.

Mootha, V.K., Lindgren, C.M., Eriksson, K.F., Subramanian, A., Sihag, S., Lehar, J., Puigserver, P., Carlsson, E., Ridderstrale, M., Laurila, E., et al. (2003). PGC-1alpha-responsive genes involved in oxidative phosphorylation are coordinately downregulated in human diabetes. Nat. Genet. 34, 267–273.

Nowicki-Osuch, K., Zhuang, L., Jammula, S., Bleaney, C.W., Mahbubani, K.T., Devonshire, G., Katz-Summercorn, A., Eling, N., Wilbrey-Clark, A., Madissoon, E., et al. (2021). Molecular phenotyping reveals the identity of Barrett's esophagus and its malignant transition. Science 373, 760–767.

Pachter, L. (2011). Models for transcript quantification from RNA-Seq, arXiv e-prints. https://ui.adsabs.harvard.edu/abs/ 2011arXiv1104.3889P.

Petty, E.M., Kalikin, L.M., Orringer, M.B., and Beer, D.G. (1998). Distal chromosome 17q loss in Barrett's esophageal and gastric cardia adenocarcinomas: implications for tumorigenesis. Mol. Carcinog. 22, 222–228.

Que, J., Garman, K.S., Souza, R.F., and Spechler, S.J. (2019). Pathogenesis and cells of origin of Barrett's esophagus. Gastroenterology 157, 349–364 e1.

Roman, S., Pétré, A., Thépot, A., Hautefeuille, A., Scoazec, J.Y., Mion, F., and Hainaut, P. (2007). Downregulation of p63 upon exposure to bile salts and acid in normal and cancer esophageal cells in culture. Am. J. Physiol. Gastrointest. Liver Physiol. 293, G45–G53.

Sahoo, D., Dill, D.L., Gentles, A.J., Tibshirani, R., and Plevritis, S.K. (2008). Boolean implication networks derived from large scale, whole genome microarray datasets. Genome Biol. 9, R157.

Sahoo, D., Swanson, L., Sayed, I.M., Katkar, G.D., Ibeawuchi, S.R., Mittal, Y., Pranadinata, R.F., Tindle, C., Fuller, M., Stec, D.L., et al. (2021). Artificial intelligence guided discovery of a barrier-protective therapy in inflammatory bowel disease. Nat. Commun. 12, 4246.

Sato, T., STANGE, D.E., Ferrante, M., Vries, R.G., van Es, J.H., van den Brink, S., van Houdt, W.J., Pronk, A., van Gorp, J., Siersema, P.D., and Clevers, H. (2011). Long-term expansion of epithelial organoids from human colon, adenoma, adenocarcinoma, and Barrett's epithelium. Gastroenterology 141, 1762–1772.

Senoo, M., Pinto, F., Crum, C.P., and Mckeon, F. (2007). p63 Is essential for the proliferative





potential of stem cells in stratified epithelia. Cell 129, 523–536.

Sharma, A., lee, J., Fonseca, A.G., Moshensky, A., Kothari, T., Sayed, I.M., Ibeawuchi, S.R., Pranadinata, R.F., Ear, J., Sahoo, D., et al. (2021). E-cigarettes compromise the gut barrier and trigger inflammation. iScience 24, 102035.

Souza, R.F., Shewmake, K., Terada, L.S., and Spechler, S.J. (2002). Acid exposure activates the mitogen-activated protein kinase pathways in Barrett's esophagus. Gastroenterology 122, 299–307.

Stairs, D.B., Nakagawa, H., Klein-Szanto, A., Mitchell, S.D., Silberg, D.G., Tobias, J.W., Lynch, J.P., and Rustgi, A.K. (2008). Cdx1 and c-Myc foster the initiation of transdifferentiation of the normal esophageal squamous epithelium toward Barrett's esophagus. PLoS One *3*, e3534.

Subramanian, A., Tamayo, P., Mootha, V.K., Mukherjee, S., Ebert, B.L., Gillette, M.A., Paulovich, A., Pomeroy, S.L., Golub, T.R., Lander, E.S., and Mesirov, J.P. (2005). Gene set enrichment analysis: a knowledge-based approach for interpreting genome-wide expression profiles. Proc. Natl. Acad. Sci. U. S. A. 102, 15545–15550.

Swift, A., Risk, J.M., Kingsnorth, A.N., Wright, T.A., Myskow, M., and Field, J.K. (1995). Frequent loss of heterozygosity on chromosome 17 at 17q11.2-q12 in Barrett's adenocarcinoma. Br. J. Cancer 71, 995–998.

Truong, A.B., Kretz, M., Ridky, T.W., Kimmel, R., and Khavari, P.A. (2006). p63 regulates proliferation and differentiation of developmentally mature keratinocytes. Genes Dev. 20, 3185–3197.

Volkmer, J.P., Sahoo, D., Chin, R.K., Ho, P.L., Tang, C., Kurtova, A.V., Willingham, S.B., Pazhanisamy, S.K., Contreras-Trujillo, H., Storm, T.A., et al. (2012). Three differentiation states risk-stratify bladder cancer into distinct subtypes. Proc. Natl. Acad. Sci. U. S. A. 109, 2078–2083.

Wang, J.S., and Canto, M.I. (2010). Predicting neoplastic progression in Barrett's esophagus. Ann. Gastroentol. Hepatol. 1, 1–10.

Wang, S., Zhan, M., Yin, J., Abraham, J.M., Mori, Y., Sato, F., Xu, Y., Olaru, A., Berki, A.T., Li, H., et al. (2006). Transcriptional profiling suggests that Barrett's metaplasia is an early intermediate stage in esophageal adenocarcinogenesis. Oncogene 25, 3346–3356.

Wang, X., Ouyang, H., Yamamoto, Y., Kumar, P.A., Wei, T.S., Dagher, R., Vincent, M., Lu, X.,

Bellizzi, A.M., Ho, K.Y., et al. (2011). Residual embryonic cells as precursors of a Barrett's-like metaplasia. Cell 145, 1023–1035.

Watt, F.M. (2014). Mammalian skin cell biology: at the interface between laboratory and clinic. Science *346*, 937–940.

Xian, W., Duleba, M., Zhang, Y., Yamamoto, Y., Ho, K.Y., Crum, C., and Mckeon, F. (2019). The cellular origin of Barrett's esophagus and its stem cells. Adv. Exp. Med. Biol. *1123*, 55–69.

Xian, W., Ho, K.Y., Crum, C.P., and Mckeon, F. (2012). Cellular origin of Barrett's esophagus: controversy and therapeutic implications. Gastroenterology 142, 1424–1430.

Yang, A., Schweitzer, R., Sun, D., Kaghad, M., Walker, N., Bronson, R.T., Tabin, C., Sharpe, A., Caput, D., Crum, C., and Mckeon, F. (1999). p63 is essential for regenerative proliferation in limb, craniofacial and epithelial development. Nature 398, 714–718.

Zhang, W., and Wang, D.H. (2018). Origins of metaplasia in Barrett's esophagus: is this an esophageal stem or progenitor cell disease? Dig. Dis. Sci. 63, 2005–2012.





STAR★ METHODS

KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
Anti-SPT6	Thermo Fisher Scientific	A300-801A
Anti-TP63	Abcam	ab53039
Rabbit polyclonal anti-β-tubulin	Santa Cruz Biotechnology	sc-9104
Mouse monoclonal anti-GAPDH	Santa Cruz Biotechnology	sc-365062
IRDye 800CW Goat anti-Mouse IgG Secondary	LI-COR Biosciences	926-32210
IRDye 680RD Goat anti-Rabbit IgG Secondary	LI-COR Biosciences	926-68071
Experimental Models: Cells		
Human Epidermal Keratinocyte Culture (from neonatal foreskin)	UC San Diego HUMANOID Center of Research Excellence	Li et al.(2021)
Human intestinal organoids (terminal ileum), adult, male and female	UC San Diego HUMANOID Center of Research Excellence	Sharma et al.(2021)
L-WRN cells	ATCC	CRL-3276 (Miyoshi and Stappenbeck, 2013)
Chemicals, peptides, and recombinant proteins		
PVDF Transfer Membrane, 0.45μM (for blotting)	Thermo Scientific	88518
PowerUp™ SYBR™ Green Master Mix (for qPCR)	Applied Biosciences	A25741
qScript™ cDNA SuperMix (for qPCR)	QuantaBio	101414
Ethanol	Koptec	UN1170
Protease inhibitor cocktail (for cell lysis)	Roche	11 873 580 001
Tyr phosphatase inhibitor cocktail (for cell lysis)	Sigma-Aldrich	P5726
Ser/Thr phosphatase inhibitor cocktail (for cell lysis)	Sigma-Aldrich	P0044
100% Methanol (for priming PVDF membrane)	Supelco	MX0485
Glycine	Fisher Scientific	BP381-5
Bovine Serum Albumin	Sigma-Aldrich	A9647-100G
Triton-X 100 (for cell lysis)	Sigma-Aldrich	X100-500ML
TrypLE Select	Thermo Scientific	12563-011
Advanced DMEM/F-12	Thermo Scientific	12634-010
HEPES Buffer	Life Technologies	15630080
Glutamax	Thermo Scientific	35050-061
Penicillin-Streptomycin	Thermo Scientific	15140-122
Collagenase Type I	Thermo Scientific	17100-017
Matrigel	Corning	354234
3-27	Thermo Scientific	17504044
N-acetyl-L-cysteine	Sigma-Aldrich	A9165
Nicotinamide	Sigma-Aldrich	N0636
FGF-7 (KGF)	PeproTech	100-19-50ug
FGF10	PeproTech	100-26-50ug
A-83-01	Bio-Techne Sales Corp.	2939/50
SB202190	Sigma-Aldrich	S7067-25MG

(Continued on next page)



Continued		
REAGENT or RESOURCE	SOURCE	IDENTIFIER
Y-27632	R&D Systems	1254/50
DPBS	Thermo Scientific	14190-144
Ultrapure Water	Invitrogen	10977-015
EDTA	Thermo Scientific	AM9260G
Hydrocortisone	STEMCELL Technologies	7925
Heparin	Sigma Aldrich	H3149
Fetal Bovine Serum	Sigma-Aldrich	F2442-500ML
EpiVita Media	Cell Applications	141-500a
Animal Component-Free Cell Dissociation Kit	STEMCELL Technologies	5426
Red Blood Cell Lysis Buffer	Invitrogen	00-4333-57
Cell Recovery Solution	Corning	354253
Sodium Azide (for antibody dilutions)	Fisher Scientific	S227I-100
Quick-RNA MicroPrep Kit	Zymo Research	R1051
Quick-RNA MiniPrep Kit	Zymo Research	R1054
Ethyl alcohol, pure	Sigma-Aldrich	E7023
TRI Reagent	Zymo Research	R2050-1-200
2x SYBR Green qPCR Master Mix	Bimake	B21203
qScript cDNA SuperMix	Quanta Biosciences	95048
Applied Biosystems TaqMan Fast Advanced	Thermo Scientific	4444557
Master Mix		
18S, Hs99999901_s1	Thermo Scientific	4331182
Oligonucleotides and Primer Sequences		
Human SPT6; Forward:	This paper	n/a
CCGTGTCCACCCTGAGAC		
Human SPT6; Reverse:		
CATAGCCCTGCCTCTCCA		
Human TP63; Forward:	This paper	n/a
GACAGGAAGGCGGATGAAGATAG Human TP63; Reverse:		
TGTTTCTGAAGTAAGTGCTGGTGC		
Human 18S; Forward:	Thermo Scientific	4331182
GTAACCCGTTGAACCCCATT		
Human 18S; Reverse:		
CCATCCAATCGGTAGTAGCG	<u></u>	
Software and algorithms		
lmageJ	https://imagej.nih.gov/ij/index.html	n/a
GraphPad Prism	https://www.graphpad.com/scientific- software/prism/	n/a
QuantStudio Design & Analysis Software	https://www.thermofisher.com/us/en/home/ global/forms/life-science/quantstudio-3-5- software.html	n/a
Illustrator (ADOBE)	https://www.adobe.com/products/illustrator. html	n/a
ImageStudio Lite (LI-COR Sciences)	https://www.licor.com/bio/image-studio-lite/	n/a
The source code is available at https://github.	This work	n/a

(Continued on next page)





Continued		
REAGENT or RESOURCE	SOURCE	IDENTIFIER
Other		
6-well Tissue Culture Plate	Genesee Scientific	25-105
12-well Tissue Culture Plate	CytoOne	CC7682-7512
Cell Scraper	Millipore Sigma	C5981-100EA
Countess Cell Counting Chamber Slides	Invitrogen	C10312
Trypan Blue Stain	Invitrogen	T10282
70 um Cell Strainer	Thermo Fisher Scientific	22-363-548
100 um Cell Strainer	Corning	352360
RNase Away	Thermo Fisher Scientific	14-375-35
Countess II Automated Cell Counter	Thermo Fisher Scientific	AMQAX1000
Canon Rebel XS DLSR	Canon	n/a
MiniAmp Plus Thermal Cycler	Applied Biosystems	A37835
QuantStudio5	Applied Biosystems	A28140
Light Microscope (brightfield images)	Carl Zeiss LLC	Axio Observer, Inverted; 491917-0001-000
Deposited Data		
RNA Seq dataset for control vs. SPT6i	Publicly released with prior publication (Li	GEO: GSE153129
keratinocytes	et al., 2021).	

RESOURCE AVAILABILITY

Lead contact

Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Pradipta Ghosh (prghosh@ucsd.edu).

Materials availability

- This study did not generate new unique reagents.
- The RNA Seq dataset for control vs. SPT6i keratinocytes was publicly released with prior publication (Li et al., 2021), and can be accessed here: GSE153129.

Data and code availability

The source code is available at https://github.com/sahoo00/BoNE. A bash script scr-be is provided to download all the datasets from our Hegemon web server using a perl script. A Jupyter notebook BE-Analysis.ipynb is provided to perform the analysis and generate the figures in this manuscript. Software programs (listed in Key resources table) are all publicly accessible through valid licenses.

EXPERIMENTAL MODEL AND SUBJECT DETAILS

Human epidermal keratinocyte culture

SPT6 knock-down and wild-type human epidermal keratinocytes were cultured under 3D spheroid conditions (Ghosh et al., 2020) for colon-derived organoids. Briefly, primary human epidermal keratinocytes derived from human neonatal foreskin were used for all cell culture studies. Cells were seeded in Matrigel (Corning, 354234) domes at 5E4 cells per well in a 24 well plate. To allow for complete polymerization of the Matrigel, the plate was inverted and incubated at 37°C for 10 minutes before proliferation media (50% conditioned media prepared from L-WRN cells (ATCC, CRL-3276(Miyoshi and Stappenbeck, 2013)) containing Wnt3a, R-spondin, and noggin) or differentiation media (5% conditioned media) was added to each well. Cells were maintained at 37°C/5% CO2 humidified conditions and media was changed every 2-3 days until spheroids were fully formed, and crypt budding was visible.





METHOD DETAILS

Computational methods

Gene expression databases. Publicly available microarray and gene expression databases were downloaded from the National Center for Biotechnology Information (NCBI) Gene Expression Omnibus website (GEO) (Edgar et al., 2002; Barrett et al., 2005, 2013). If the dataset is not normalized, RMA (Robust Multichip Average) (Irizarry et al., 2003a, 2003b) is used for microarrays and CPM (Counts Per Millions) (Li and Dewey, 2011; Pachter, 2011) is used for RNASeq data for normalization. We used log2(CPM+1) to compute the final log-reduced expression values for RNASeq data. Accession numbers for these crowdsourced datasets are GSE153129, GSE100843, GSE65013, GSE64894, GSE39491, GSE49292, GSE26886, GSE34619, GSE13083, GSE96831, GSE120795, GSE129153, GSE148818, GSE58963, GSE157059, GSE9768 and GSE70051 and are provided in the figures and manuscript (Dalerba et al., 2011, 2016; Volkmer et al., 2012).

Boolean analysis. Boolean logic is a simple mathematic relationship of two values, i.e., high/low, 1/0, or positive/negative. The Boolean analysis of gene expression data requires first the conversion of expression levels into two possible values. The StepMiner algorithm is used to perform Boolean analysis of gene expression data (Sahoo et al., 2008). Boolean analysis is a statistical approach that creates binary logical inferences that explain the relationships between phenomena. Boolean analysis is performed to determine the relationship between the expression levels of pairs of genes. The StepMiner algorithm is applied to gene expression levels to convert them into Boolean values (high and low). In this algorithm, first the expression values are sorted from low to high and a rising step function is fitted to the series to identify the threshold. Middle of the step is used as the StepMiner threshold. This threshold is used to convert gene expression values into Boolean values. A noise margin of 2-fold change is applied around the threshold to determine intermediate values, and these values are ignored during Boolean analysis.

Generation of gene signature scores. Gene expression values were normalized according to a modified Z-score approach centered around StepMiner threshold (formula = (expr - SThr)/3*stddev). The samples were ordered according to average of the normalized gene expression values in the given gene list. Gene signature score is computed as a linear combination of the normalized gene expression values (the modified Z-score as described above). Samples are ordered using the gene signature score and the strength of the association between gene expression and disease annotation is computed using ROC-AUC measurement. A barplot is used to visualize the sample ordering with different color codes for the sample annotation. Additionally, a set of violin plots is used just below the barplot to demonstrate the distribution of the gene signature score across different sample annotations.

Measurement of classification strength or prediction accuracy. Receivers operating characteristic (ROC) curves were computed by simulating a score based on the ordering of samples that illustrates the diagnostic ability of binary classifier system as its discrimination threshold is varied along the sample order. The ROC curves were created by plotting the true positive rate (TPR) against the false positive rate (FPR) at various threshold settings. The area under the curve (often referred to as simply the AUC) is equal to the probability that a classifier will rank a randomly chosen IBD samples higher than a randomly chosen healthy samples. In addition to ROC AUC, other classification metrics such as accuracy ((TP + TN)/N; TP: True Positive; TN: True Negative; N: Total Number), precision (TP/(TP+FP); FP: False Positive), recall (TP/(TP+FN); FN: False Negative) and f1 (2 * (precision * recall)/(precision + recall)) scores were computed. Precision score represents how many selected items are relevant and recall score represents how many relevant items are selected. Fisher exact test is used to examine the significance of the association (contingency) between two different classification systems (one of them can be ground truth as a reference).

Test and validation of Barrett's esophagus datasets. A Boolean Network Explorer (BoNE) computational tool was introduced recently (Sahoo et al., 2021) to model natural progressive time-series changes in major cellular compartments that initiate, propagate and perpetuate inflammation in IBD and are likely to be important for disease progression. BoNE provides an integrated platform for the construction, visualization and querying of a network of progressive changes much like a disease map. A published gene signature for Barrett's Esophagus UP genes and DOWN genes (Wang et al., 2006) were used in BoNE to train Boolean models that distinguish SPT6-depleted and Control samples in GSE153129. Another gene signature for SPT6-depleted versus Control (GSE153129) was found using the differentially expressed gene file provided earlier (Li et al., 2021) (Table S2), where genes were considered significant if they had

iScience Article



a log fold change of greater than 10 or less than -10 and p-value of less than 0.1. The gene signature for SPT6-depleted versus Control samples (GSE153129) was used train Boolean models that distinguish normal esophagus and Barrett's metaplasia in humans (GSE100843, GSE65013, GSE64894, GSE39491, GSE49292, GSE26886, GSE34619, GSE13083, E-MTAB-4054), or WT (wildtype) versus p63-/- in mice (GSE96831). In this model, a path score is computed as mentioned in section "Generation of gene signature scores" that is used to order the samples. The sample ordering is evaluated using the sample annotation (Normal, Barrett's Esophagus) using ROC-AUC.

Correlation analysis. Correlation analysis was performed using Python pandas.DataFrame.corr (version 1.1.5). Normalized counts (that are not log-reduced) for up- and down- regulated genes (filtered by Foldchange (SPT6i vs. CTLi) > 10) were used to recreate the correlation matrix published earlier (Li et al., 2021), with the addition of Barrett's metaplasia samples. The analysis includes a selection of samples from the following GEO datasets: GSE153129 (SPT6-depleted and Control), GSE120795 (colon, brain, skeletal muscle), GSE129153 (adipocyte), GSE148818 (trachea) and GSE58963 (BE) Specific sample numbers used to generate the correlation matrix are provided in Table S1.

GeneSet enrichment analysis (GSEA). GeneSet Enrichment Analysis (GSEA) was performed using Python gseapy (0.10.2 package). Difference in average expression values of two groups is used to compute gene rank file. Metaplasia-specific and intestine-specific mouse genes (Wang et al., 2011) were converted to human genes using BoNE. Intestine-specific genes only, metaplasia-specific genes only, and combined metaplasia-specific and intestine-specific genes correspond to the three genesets tested for Barrett's metaplasia versus small intestine samples (GSE13083), and SPT6-depleted (GSE153129) versus small intestine samples (GSE157059). GSEA pre-ranked analysis is performed on the precomputed rank file to check the significance of geneset enrichment score and generate the enrichment plot. GSEA computes four key statistics for the gene set enrichment analysis report: Enrichment Score (ES), Normalized Enrichment Score (NES), False Discovery Rate (FDR), Nominal P Value.

Isolation and culture of human small intestine organoids. Intestinal organoids were isolated and cultured following methods optimized previously (Sharma et al., 2021) and explained here briefly. Human ileum biopsies were collected from healthy adult male and female subjects undergoing routine colonoscopy for colon cancer screening using the protocol approved by the Human Research Protection Program Institutional Review Board (Project ID# 190105). To isolate organoids, human ileal tissue specimens were digested in collagenase type I at 37°C. Vigorous pipetting was performed every 10 minutes until tissue fragments dissociated into single epithelial units. Subsequently, wash media (DMEM/F12, 1X glutamax, 10% FBS) was added to neutralize the collagenase digestion, and the cell suspension was passed through a 70 μm filter. The cells were seeded in Matrigel domes and cultured in proliferation media in a 37°C/5% CO2 humidified incubator. Media changes were performed every 2 days until organoids formed and reached confluency.

For all the deidentified human subjects, information including age, ethnicity, gender, previous history of the disease, and the use of medications was collected from the chart following the rules of HIPAA. Each human participant was recruited to the study following an approved human research protocol and signed an informed consent form approved by the Human Research Protection Program at the University of California, San Diego. Each donor agrees that their gastro-intestinal specimens will be used to generate an enteroid line at UC San Diego's HUMANOIDTM Center of Research Excellence (CoRE) for functional studies.

Exposure to acid injury. Human epidermal keratinocytes were cultured under 2-D and 3-D conditions in Human EpiVita Media (Cell Applications, 141-500a). Keratinocytes were seeded in monolayers at 2E4 cells per well and in Matrigel at 1E5 cells per well in a 12 well plate. Media changes were performed every 2-3 days. Cultures were maintained at 37°C/5% CO2 humidified conditions for 5-6 days until the monolayers reached confluency, and spheroids formed in the 3D culture. Subsequently, cells were cultured in acidic media with a pH range of 4.5-7.5. The media was prepared by adding 1N HCl drop-wise to EpiVita media until the desired pH was achieved. After 2 hours, the acidic media was removed from the keratinocytes and replaced with fresh EpiVita media. Cells were cultured for an additional 6 hours.





RNA isolation. The Matrigel domes were scraped from the surface of the 12 well plate, and spheroids were collected in cell recovery solution (Corning, 354253) and incubated for 1 h at 4° C under constant rotation. Monolayers and spheroids were lysed in 200 μ l of RNA lysis buffer per well, and RNA Isolation was performed following instructions from the Zymo Research Quick-RNA MicroPrep Kit (R1051).

Quantitative (q)RT-PCR. Gene expression in spheroids and monolayers was measured by qRT-PCR using 2x SYBR Green qPCR Master Mix (Bimake, B21203). cDNA was amplified with gene-specific primer/probe set for SPT6 and Barrett's Esophagus markers and qScript cDNA SuperMix 5x (Quanta Biosciences, 95048). qRT-PCR was performed with the Applied Biosystems QuantStudio 5 Real-Time PCR System. Cycling parameters were as follows: 95°C for 20 s, followed by 40 cycles of 1 s at 95°C and 20 s at 60°C. All samples were assayed in triplicate and eukaryotic 18S ribosomal RNA was used as a reference. Primer sequences are provided in Table of reagents (above).

Quantitative immunoblotting. For immunoblotting, keratinocytes protein samples were boiled in Laemmli sample buffer, separated by SDS-PAGE and transferred onto 0.4mm PVDF membrane (Millipore) prior to blotting. Post transfer, membranes were blocked using 5% Non-fat milk or 5% BSA dissolved in PBS. Primary antibodies (anti-SPT6; Thermo Fisher, A300-801A; dilution 1:500) were prepared in blocking buffer containing 0.1% Tween-20 and incubated with blots, rocking overnight at 4°C. After incubation, blots were incubated with secondary antibodies for one hour at room temperature, washed, and imaged using a dual-color Li-Cor Odyssey imaging system.

QUANTIFICATION AND STATISTICAL ANALYSIS

Statistical analyses in computational studies

All statistical tests were performed using R version 3.2.3 (2015-12-10). Standard t-tests were performed using Python scipy.stats.ttest_ind package (version 0.19.0) with Welch's Two Sample t-test (unpaired, unequal variance (equal_var=False), and unequal sample size) parameters. Linear regression was performed using Python scipy.stats.linregress package (version 1.7.0). Multiple hypothesis correction were performed by adjusting p-values with statsmodels.stats.multitest.multipletests (fdr_bh: Benjamini/Hochberg principles) (Fabregat et al., 2018). Violin, Swarm and Bubble plots are created using Python seaborn package version 0.10.1.

Statistical analyses in experimental studies and replications

All experiments were repeated at least three times, and results were presented either as one representative experiment or as average \pm S.E.M. Statistical significance was assessed with unpaired Student's t test. For all tests, a p-value of 0.05 was used as the cutoff to determine significance. The actual p-values are indicated in each figure. All statistical analysis was performed using GraphPad prism 8.