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Non-invasive tape-stripping with high-resolution RNA profiling effectively captures a pre-inflammatory state in nonlesional psoriatic skin.

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Abstract

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AUTHORS CONTRIBUTION STATEMENT

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Tape stripping is a minimally invasive, non-scarring method that can be utilized to assess gene expression in skin but is infrequently used given technical constraints. By comparing different tape stripping technologies and full thickness skin biopsy results of lesional and non-lesional psoriatic skin from the same patients, we demonstrate that tape stripping with optimized high-resolution transcriptomic profiling can be used to effectively assess and characterize inflammatory responses in skin. Upon comparison with single-cell RNA-seq data from psoriatic full thickness skin biopsies, we illustrate that tape-stripping efficiently captures the transcriptome of the upper layers of the epidermis with sufficient resolution to assess the molecular components of the feed-forward immune amplification pathway in psoriasis. Notably, non-lesional psoriatic skin sampled by tape stripping demonstrates activated, pro-inflammatory changes when compared to healthy control skin, suggesting a pre-psoriatic state, which is not captured on full-thickness skin biopsy transcriptome profiling. This work illustrates an approach to assess inflammatory response in the epidermis by combining non-invasive sampling with high throughput RNA sequencing, providing a foundation for biomarker discoveries and mechanism of action studies for inflammatory skin conditions.

Keywords

Psoriasis; tape-stripping; RNA-sequencing; single-cell sequencing; epidermis

INTRODUCTION

Psoriasis is a common chronic inflammatory disease of the skin characterized by keratinocyte hyperproliferation, altered epidermal differentiation, and thickening (acanthosis)(Gudjonsson and Elder, 2007). The majority of the changes detected by gene expression profiling of psoriatic skin are derived from the epidermal compartment(Li *et al.*, 2014). Transcriptomic profiling can provide novel and important insights into disease biology(Lee *et al.*, 2004; Zhou *et al.*, 2003); it can facilitate elucidation of mechanism of action of therapeutic agents(Zaba *et al.*, 2007) and identification of biomarkers for disease or therapeutic response. However, a major limitation of transcriptomic profiling of skin diseases is that it requires an invasive biopsy procedure, usually of both lesional and non-lesional skin, along with the use of an anesthetic agent. Due to the invasive nature of skin biopsies, some patient groups such as children or pregnant women, may be excluded and this may potentially limit the amount of information that can be gathered from larger studies and may preclude identification of robust biomarkers predicting treatment response. Tape-stripping, where an adhesive tape is used to sample the top layer of the epidermis, is a minimally invasive approach that can be used to profile various changes in the skin and has been used for characterization of proteins(Broccardo *et al.*, 2009; Voegeli *et al.*, 2009) and skin lipids(Jungersted *et al.*, 2010). Several studies have used tape-stripping to analyze molecular changes in skin(Guttman-Yassky *et al.*, 2019; He *et al.*, 2020a; Wong *et al.*, 2004), especially for atopic dermatitis(Goleva *et al.*, 2020; He *et al.*, 2020b; Lyubchenko *et al.*, 2021; Olesen *et al.*, 2020; Pavel *et al.*, 2020), but a more comprehensive understanding is needed of how well transcriptomic profiling through tape stripping captures the anatomy and cytokine response of the underlying disease process in inflammatory skin conditions when compared to biopsy-based transcriptomic profiling.

The objective of this study was to provide a comprehensive evaluation of how well tape-stripping paired with high resolution RNA-sequencing captures the global transcriptomic changes in psoriasis. In addition, we examined whether tape-stripping captures elements of the inflammatory infiltrate. We determine from which cellular compartment the majority of the transcriptomic changes were captured and demonstrate that transcriptomic profiling of RNA isolated from tape-stripped lesional psoriatic skin efficiently captures genes expressed in the upper layers of the epidermis and accurately detects active immunological pathways and immune cell-generated cytokines in psoriasis. Furthermore, we demonstrate that tape-stripping is sensitive in capturing pre-psoriatic changes in uninvolved psoriatic skin and highlighting its keratinocyte inflammation, illustrating high sensitivity when coupled with RNA-seq technology. These data suggest that transcriptomic profiling using tape-stripping can be an effective and non-invasive method to assess gene expression and cytokine responses in psoriasis. Thus, as a less invasive and safer way of measuring transcriptomic changes in inflamed skin, tape stripping provides an opportunity to expand mechanism of action and biomarker studies in skin to much larger patient cohorts than has previously been feasible.

RESULTS

We collected lesional (PP), non-lesional (PN), and health control (NN) samples after quality control from: *i*) tape stripping (Takara: 5 NN, 10 PN, and 10 PP; Lexon3: 10 PP); *ii*) full-thickness intact skin biopsy in non-tape-stripped skin (5 NN, 9 PN, and 10 PP); *iii*) full-thickness biopsy from underneath the tape-stripped skin (5 NN, 10 PN, and 10 PP). Transcriptome-wide RNA-sequencing was performed on all samples collected. Principal component analysis (PCA) revealed clear separation between full-thickness skin biopsy samples and tape-stripped samples (Figure 1a). For protocol optimization, we compared two library preparation kits (Lexon3 vs. Takara); while the Lexon3 processing was only able to profile the lesional skin, the Takara library preparation provided consistent high-resolution data for both lesional, non-lesional, and healthy control skin. Significantly, we were able to distinguish the psoriatic skin from the control skin, but the contrast between NN and PN have higher contrast for the tape-stripped samples. Since we profiled psoriatic skin from the same patients with different techniques, we conducted correlation analysis between the expression profiles. Transcriptome-wide, the correlation was highest between those obtained between full-thickness biopsy in non-tape-stripped vs biopsy in tape-stripped areas (median spearman correlation = 0.27). A significantly lower degree of correlation was seen between the library prep samples for tape-stripping compared to intact full-thickness psoriatic skin (median spearman correlation ~ 0.03). However, when focusing on signature genes of the keratinized (*FLG*, *FLG2*), differentiated (*KRT10*), and basal (*KRT14*) compartments of the epidermal layer (Figure 1b) against full thickness biopsy data, we found that the tape-stripped data had stronger correlation with *FLG* and *FLG2* expression (Supplementary Table 3).

The criteria of 2-fold change and a false-discovery-rate (FDR) of 10% as criteria were used for comparison of the differential expression analysis. For the biopsy samples, we found 1,355 genes to be up-regulated in biopsies from full-thickness psoriatic skin, and 1,262 genes down-regulated, compared to healthy control skin. Consistent with previous

studies (Tsoi *et al.*, 2015; Tsoi *et al.*, 2019a), there is less contrast between the non-lesional versus lesional psoriatic skin, with fewer up-(987) and down-(806) regulated genes. DEGs from tape-stripped, lesional psoriatic skin showed 1,586 genes upregulated and 2,432 down regulated compared to tape-stripped healthy control skin (Figure 2a). Interestingly, we identified significant number of differentially expressed genes between healthy control and non-lesional psoriatic skin, with 750 up- and 975 down-regulated genes (Figure 2a). Notably, no differentially expressed genes were observed when comparing healthy control vs. non-lesional skin in the biopsy sample nor in the non-lesional vs. lesional skin comparison from tape-stripping, suggesting that molecular profiles captured from tape-stripped skin samples are more similar between the non-lesional and the lesional skin. We then compared the DEGs across the technologies. Partial overlap in DEGs from healthy controls lesional skin was identified when comparing DEGs from the tape-stripping analysis with the DEGs from full-thickness biopsy (Figure 2a), indicating that tape-stripping can capture a proportion of both increased and decreased DEGs in psoriatic skin.

Several psoriasis-associated pro-inflammatory genes were detected to be more strongly up-regulated in the tape-stripped lesional skin samples, including *S100A12* (600-fold increase, FDR=5.8×10⁻⁵), human beta defensin 2 (*DEFB4*; 376-fold, FDR=1.4×10⁻³), *SPRR2B* (1,311-fold increase, FDR=1.2×10⁻⁵), and *SPRR2A* (1,376-fold increase, FDR=1.4×10⁻⁴). DEGs captured in full-thickness biopsy and not in tape-stripped samples included *WNT5A* (5.4-fold, FDR=1.9×10⁻⁴ in biopsy), interferon response genes including *OAS3* (6.0-fold, FDR=7.9×10⁻⁴), and *KYNU* (12.7-fold, FDR=6.4×10⁻⁴) (further examples of gene expression, see Table 1 and Supplementary Table 4). The correlation between the effect sizes of the NN vs PP comparison in intact lesional and that of from tape-stripping was most prominent for DEGs with the largest fold change magnitude. In stark contrast, there was much less correlation between the tape-stripping NN vs PP effect size with that from the tape-stripping PN vs PP comparison; however robust overlap was seen between the tape-stripping NN vs. PN and the NN vs. PP comparisons (Figure 3). This suggests that subtle pre-psoriatic changes in non-lesional psoriatic skin, previously described by our group (Gudjonsson *et al.*, 2009), are efficiently picked up by the tape-stripping technique.

To reveal the biological functions captured by tape-stripping vs. full thickness biopsies from psoriatic and healthy control skin, we performed functional enrichment analyses for DEGs identified in NN vs. PP skin. The up-regulated genes found in both tape-stripped and biopsied psoriatic vs. normal skin were enriched in processes involving the epidermis, including “keratinocyte differentiation” ($p < 1 \times 10^{-20}$), “keratinization” ($p < 1 \times 10^{-15}$), “peptide cross-linking” ($p < 1 \times 10^{-15}$), “interleukin 1 receptor binding” ($p < 1 \times 10^{-5}$) and “regulation of water loss via skin” ($p < 1 \times 10^{-5}$). Enriched functions in genes elevated only in full-thickness biopsy samples involved cell proliferation, such as: “sister chromatid segregation” ($p < 1 \times 10^{-20}$), “condensed chromosome” ($p < 1 \times 10^{-14}$), “mitotic prometaphase” ($p < 1 \times 10^{-10}$), and other immune-related functions such as “chemokine receptors bind chemokines” ($p < 1 \times 10^{-10}$). Notably, enriched G0 processes in DEGs only found in tape-stripped RNA samples included “antigen presentation folding assembly and peptide loading of class I MHC” ($p < 1 \times 10^{-10}$), “interleukin-12 family signaling” ($p < 1 \times 10^{-8}$), and “gene and protein expression by JAK-STAT signaling” ($p < 1 \times 10^{-5}$) (Figure 4a–c; Supplementary Table 5). Comparison of the functional enrichment of tape-stripped only DEGs and full-thickness

biopsy DEGs showed distinct enrichment patterns (Figure 4d). These results suggest that the tape-stripping approach is efficient in capturing biological processes that are active high up in the epidermis (i.e. cytokine response), but not at capturing gene expression changes associated with proliferative changes, which tend to occur in the basal and suprabasal layers of the psoriatic epidermis (Rijzewijk *et al.*, 1989).

To determine how well tape-stripping captures cytokine-related genes, we assessed cytokine expression across several cytokine families in NN, PN and PP. Tape-stripping detected expression of several cytokines, although this sampling method was less sensitive than sampling intact full-thickness biopsies (Figure 5a; Figure 3e). However, tape-stripping effectively captured cytokine gene expression derived from the epidermis. This included the IL-36 family of cytokines (*IL36G*; FC=775 and FDR= 2×10^{-4}), *IL23A* (FC=188 and FDR= 4.8×10^{-3}), and *IL1B* (FC=36 and FDR= 1.3×10^{-2}), which have all been shown to be expressed by psoriatic keratinocytes (Buerger *et al.*, 2012; Johnston *et al.*, 2013; Li *et al.*, 2018). We then studied the burden of cytokine response as described previously (Tsoi *et al.*, 2019b; Tsoi *et al.*, 2019c) and found prominent signatures of IL-17, TNF, IL-36, and type I and type II IFN in psoriatic skin from full-thickness biopsies as expected (Figure 5b). The *IL17/IL36/IFNa* signatures were also revealed in genes elevated from the tape-stripped samples, particularly the IL-17 and IL-36 responses. Notably, these signatures were present in NN vs PN comparison for tape-stripped samples to the same extent as that in the NN vs PP comparison, with minimal to no difference between tape stripped DEGs from the PN vs PP comparison. Taken together, these data demonstrate that tape-stripping can help elucidate the inflammatory environment of psoriatic skin and can capture genes expressed in cell types other than keratinocytes. Interestingly, these data also suggest that tape-stripping can be more sensitive than full skin biopsy in detecting preclinical transcriptomic changes in non-lesional skin.

Finally, we compared the expression patterns of DEGs in the tape stripped samples against single cell RNA-seq data from epidermal keratinocytes, classified into basal (KRT5⁺/KRT14⁺), differentiated (KRT10⁺), or keratinized (FLG⁺) groups (Figure 6a). This allowed us to determine the expression of DEGs in each epidermal compartment from full-thickness biopsies or tapestripping method. Comparing the genes up-regulated only in full-thickness biopsy of lesional skin vs. those identified to be up-regulated in the tape-stripping samples (i.e. including genes commonly up-regulated in biopsy), the keratinized layer showed the most significant difference in the expression proportion ($p=2.61 \times 10^{-32}$ in PN and $p=6.99 \times 10^{-21}$ in PP), indicating that tape-stripping disproportionately captures genes expressed in the keratinized layer compared to those captured in full-thickness biopsies (Figure 6b). Two of the most highly expressed genes seen in the tape-stripped samples were *SPRR2A* (1375-fold, FDR= 1.4×10^{-4}) and *IL36G* (775-fold, FDR= 2.1×10^{-4}), with their expression being primarily found in the keratinized layer of psoriatic skin (Figure 6c; Supplementary Figure 1).

DISCUSSION

Tape stripping is a minimally invasive, non-scarring method that can be utilized to assess gene expression in skin. Previous studies have used the tape-stripping approach to assess

gene expression changes in atopic dermatitis(Dyjack *et al.*, 2018; Guttman-Yassky *et al.*, 2019; Leung *et al.*, 2019). A challenge in using tape-stripping technique is the limited range of coverage, where gene expression changes might only be restricted to a small number of candidate genes. Therefore, it is critical to provide a comprehensive assessment on how effectively tapestripping captures the complexity of the underlying inflammatory disease process, as well as how far into the epidermis transcriptomic changes are captured, both in terms of keratinocytes and immune cell populations.

Here, we demonstrate that tape-stripping effectively captures transcriptomic changes occurring in differentiated and keratinized layers of the epidermis; however, it is less effective at capturing biological processes that are active in the basal layer of the epidermis, such as cellular proliferation (Figure 4a). While psoriatic skin has marked thinning of the suprapapillary plate, which brings the basal layer close to the surface of the skin, it is unlikely that the surface area of the dermal papilla (as a proportion of the surface captured by tape-stripping) is high enough, or that the tape-stripping goes deep enough, or through combination of the two, to capture substantial number of cells from the basal layer of the epidermis. Consistent with this, proliferative responses were underrepresented in the tape-stripped transcriptomic data, which aligns with proliferation primarily being observed in the basal and suprabasal layers of the psoriatic epidermis(Rijzewijk *et al.*, 1989). In contrast, tape-stripping captures not only inflammatory response, but also up-regulation of genes involved in antigen processing and presentation by MHC class I in the epidermis; genetic analysis of psoriasis has shown these pathways to play a critical role in psoriasis susceptibility(Genetic Analysis of Psoriasis *et al.*, 2010; Nair *et al.*, 2009; Sun *et al.*, 2010). In addition, tape-stripping also captures the feedforward amplification of immune responses in psoriatic skin, which are known to dominate in the upper layers of the epidermis(Hawkes *et al.*, 2017). In this context, it is of interest that data from tape-stripping of non-lesional skin in psoriasis patients was more similar to that obtained from tape-stripped lesional skin. It has been demonstrated by our group(Gudjonsson *et al.*, 2009), and others(Bata-Csorgo *et al.*, 1998), that non-lesional psoriatic skin has subtle prepsoriatic gene expression changes. The data presented here suggest that these changes originate in the upper layers of the epidermis and are characterized by both upregulation of the antigen-presenting machinery as well as increased expression of pro-inflammatory cytokines such as IL-23 and IL-36 family cytokines (Figures 4 and 5).

It is worth noting that several of the cytokine genes shown to be detected, although not significantly increased in the tape-stripping dataset, are primarily expressed by T-cells, including *IL17A* and *IL17F* (Figure 5a). T-cells, particularly CD8+ T-cells are known to infiltrate the epidermis of psoriasis patients, whereas CD4+ T-cells are primarily localized to the upper dermis(Gudjonsson *et al.*, 2004; Onuma, 1994). Consistent with the *IL17A* and *IL17F* being expressed in CD8 T cells within the psoriatic epidermis, expression of *CD8B* was increased by about 2.6-fold in the tape-stripped data from lesional psoriatic skin compared to healthy control, whereas its expression was unchanged in full-thickness biopsy of psoriatic samples relative to healthy control skin. In contrast, *CD4* expression was decreased in the tape-stripped data (about 4-fold) and slightly increased in the full-thickness lesional psoriatic skin compared to healthy control. Thus, tape-stripping can

capture elements of non-keratinocyte cell types but appears to be dependent upon those cells being located within the epidermal compartment.

Notably, IL-23 has been demonstrated to be a critical cytokine in psoriasis pathogenesis (Cargill *et al.*, 2007; Kopp *et al.*, 2015; Nair *et al.*, 2009), and therapeutics targeting IL-23 are highly effective (Gordon *et al.*, 2015; Kopp *et al.*, 2015; Papp *et al.*, 2017; Reich *et al.*, 2017). Tape-stripping was very efficient in capturing expression of *IL23A*, which encodes the p19 subunit of the IL-23 protein (Oppmann *et al.*, 2000). The increase in *IL23A* was much greater in the tape-stripped psoriatic skin (compared to healthy control), compared to its increase in full-thickness biopsies (188-fold vs. 2-fold). *IL12B* mRNA expression was also detectable in tape-stripped psoriatic skin compared to healthy control, but lower than that detected in full-thickness biopsies (2.8-fold vs. 6.5-fold). While dendritic cells and macrophages contribute likely the majority of IL-23 in psoriatic skin (Yawalkar *et al.*, 2009), the epidermis has been demonstrated to be a source of IL-23 in psoriasis (Li *et al.*, 2018; Piskin *et al.*, 2006), and our data is consistent with this scenario and further demonstrates the role and contribution of the epidermis to psoriasis pathogenesis.

It is worth noting the large number of unique differentially expressed genes we find in tape-stripped skin, both increased and decreased (Figure 2c) are not well represented in data obtained from full-thickness biopsies. The likely reason for this is that many of the changes in psoriatic skin are most dramatic in the epidermis. While cellular hyperproliferation seen in psoriasis dominates in the lower epidermal compartments and is not captured by the tapestripping method (Figure 4a), other epidermal changes in psoriasis predominate in the upper layer of the epidermis. This includes the loss of the cornified layer, altered differentiation, dense parakeratosis with thick layer of superficial scale, and marked inflammatory response as part of the feed-forward amplification that is primarily active in the upper epidermal layer (Hawkes *et al.*, 2017). Therefore, it is not unexpected that tape-stripping, which captures disproportionate amounts of RNA from the upper layers of the epidermis, has such marked differences from RNA obtained from full-thickness biopsies, where the transcriptome is diluted by transcripts from the dermal inflammatory infiltrate and dermal resident tissue cells such as fibroblasts and endothelial cells. We also acknowledge that the sequence read mapping rate in the tape-stripped samples is lower than that of skin biopsy (as low as only 13% high quality reads are mapped in tape-stripping vs ~75% for skin biopsy), likely driven by the lower quality of RNA captured on the skin-surface; thus, tape strip sampling itself can also drive the heterogeneity of the assay. However, we believe this limitation can be offset by the non-invasive nature of the technique to profile the transcriptome of psoriatic patients, especially its higher sensitivity on uninvolved skin to capture most of the gene signatures involved in the epidermal differentiation and cytokine signaling in keratinocytes.

In conclusion, our data, despite a small study cohort, demonstrate that tape-stripping can capture essential features of the inflammatory process in psoriasis. Perhaps, most strikingly, it effectively captures subclinical changes in uninvolved psoriatic skin and confirms that uninvolved psoriatic skin is in a state of low-grade inflammation. Our data also indicate the feasibility of using tape-stripping combined with high-resolution sequencing as a non-invasive way to measure changes in psoriatic skin, and suggest that tape-stripping,

particularly when done in large cohorts of patients, could be used to identify biomarkers of disease, and possibly to track treatment response. Of note, patients were off all topical and systemic treatments for at least 2 weeks prior to enrollment, and while we cannot rule out residual effects of prior treatments, the study design and analyses with paired analyzes would minimize confounding effects. Whether transcriptomic analyses of tape-stripped skin are more sensitive or less sensitive to changes in psoriatic skin remains to be determined, but it is evident from the data presented here that tape-stripping can enable capture of high-quality data from patients and can open up the possibility for study of transcriptomic changes in skin in vulnerable patient populations, including children. Thus, tape-stripping in this setting could provide an avenue for future studies where larger samples can be collected in a non-invasive manner from an entire clinical study cohort to provide greater insight into how psoriasis behaves over time and with treatment.

MATERIALS AND METHODS

Patient population:

10 patients with chronic plaque psoriasis and 5 healthy controls were recruited for the tape stripping study. Demographics, including age, gender, ethnicity, were recorded (see Supplementary Table 1). Patients were off systemic treatment and any topical agents for at least 2 weeks prior to enrollment in the study. The study was approved by the University of Michigan Institutional Review Board (IRB). All patients provided written, informed consent. Tape stripping was performed on lesional and distal non-lesional psoriatic skin (buttocks) and on site-matched healthy control skin. Three 6mm punch biopsies were obtained from each patient: 1) an intact psoriatic plaque, 2) underneath the tape-stripped area, and 3) non-lesional skin. For the single-cell RNA-sequencing, 6 different patients with chronic plaque psoriasis were recruited and 6-mm punch biopsies were taken from both lesional and non-lesional skin. The studies were conducted according to the Declaration of Helsinki Principles.

Tape-stripping:

Skin was wiped clean by an alcohol swab. Standard adhesive disks (D100 D-Squame Standard Sampling Discs, CuDerm, Dallas Texas) with a 2.2cm diameter were placed on healthy, non-lesional, or lesional skin under a standard weight of 225 gm/cm² over an area of 22.24mm using D500-D-Square Pressure Instrument for 10 seconds to obtain the stratum corneum. The adhesive disks were then removed from the skin using forceps and snap frozen in liquid nitrogen. Twenty sequential D-Squame disks were taken from each site.

Preparing and storing disks for processing:

At time of removal from the skin, the D-Squame disks were immediately placed inside sequentially labelled (#1–20) 1ml Eppendorf tubes with the adhesive side facing inside. Only one D-Squame disk was placed in each Eppendorf tube to avoid discs to stick to the tube or each other. Each tube was submerged into liquid nitrogen until processing.

Processing:

The processing of RNA was performed using the RNeasy kit (Qiagen, RNeasy plus mini kit, Cat.No.: 74136). 700µl of RLT Lysate buffer with 2% beta-mercaptoethanol was aliquoted into the tube containing the first D-Squame disk (tube#1). The tube was sonicated with Diagenode Picoraptor sonicator (cycle: 30seconds ON, 30 seconds OFF, 3 total cycles). The liquid was then transferred to the next tube (i.e. #2) and the process was repeated for all tubes.

Library prep:

Samples were processed for sequencing using the SMARTer Stranded Total RNA-seq Kit v2 - Pico Input Mammalian (Takara, Cat#634411). Parallel samples were processed using the Lexogen 3' QuantSeq mRNA-seq Library Prep Kit FWD (Lexogen).

RNA-seq processing:

50-nucleotide single-end sequencing reads was generated using Illumina Hi-Seq 4000 sequencing system. Our in-house pipeline was used to perform adapter trimming and other quality control procedures for the RNA-seq samples. Reads were mapped using STAR, and gene expression levels were measured and normalized by HTSeq and DESeq2. The numbers of reads generated/aligned for each sample are listed in Supplementary Table 2. Differential expression analysis was conducted with DESeq2, which uses negative binomial, to model expression data and utilize generalized linear model for differential expression analysis. For analyzes comparing samples from same patient assayed by different techniques, or uninvolved vs involved skin comparison, we adjusted for the individual effect. Multiple testing corrections was performed to identify statistically significant results using a False Discovery Rate (FDR) of 10% and $|\log_2FC| \geq 1$. We observed that mapping rate varied significantly among RNA-seq conducted for tape-stripping samples, therefore we focused only on the differential expression comparisons for skin conditions obtained from same method. Sequencing data is available on GEO: GSE178197

Cytokine responses.

We conducted RNA-seq experiments to profile the transcriptome of cytokine stimulated keratinocytes as described previously(Tsoi *et al.*, 2019a; Tsoi *et al.*, 2019c). For genes that were induced by cytokines, we conducted hypergeometric test to assess the enrichment against genes that are up regulated in different differential expression comparisons.

Single cell RNA-seq.

The sample preparation for scRNA-seq data was described as before(Gudjonsson *et al.*, 2020): Skin was obtained from excisional samples from normal skin. Samples were incubated overnight in 0.4% dispase (Life Technologies) in Hank's Balanced Saline Solution (Gibco) at 4°C. Epidermis and dermis were separated. Epidermis was digested in 0.25% Trypsin-EDTA (Gibco) with 10U/mL DNase I (Thermo Scientific) for 1 hour at 37°C, quenched with FBS (Atlanta Biologicals), and strained through a 70µm mesh. Dermis was minced, digested in 0.2% Collagenase II (Life Technologies) and 0.2% Collagenase V (Sigma) in plain medium for 1.5 hours at 37°C, and strained through a

70µm mesh. Epidermal and dermal cells were recombined and libraries were constructed by the University of Michigan Advanced Genomics Core on the 10X Chromium system. Libraries were then sequenced on the Illumina NovaSeq 6000 sequencer to generate 151-bp paired end reads. Raw reads from the single cell transcriptome analysis of skin was processed using the 10x Genomics Cell Ranger pipeline for quality control, alignment, and quantification. Further read filtering, normalization, and batch correction (by the Canonical Correlation analysis) were conducted using the R library Seurat(Butler *et al.*, 2018). Top principal components were computed using the anchor genes, and in turn to conduct the uniform manifold approximation and project (UMAP) for visualization. We used 15 nearest neighbors and minimum distance=0.01 in the UMAP construction.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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CONFLICT OF INTEREST

This work is supported by AbbVie. JEG received research grants from AbbVie, AnaptysBio, Janssen, Pfizer, Novartis, Celgene/Bristol Myers Squibb (BMS), and Eli Lilly, and serves as an advisory board member for Novartis, AbbVie, Eli Lilly, MiRagen, and Almirall. YH reports grand support from Galderma and Abbvie. JMK has research grants from Celgene/BMS, Janssen, and Q32 Bio and has served on advisory boards for AstraZeneca, GlaxoSmithKlein, VielaBio, Admirex Pharmaceuticals, Eli Lilly, Bristol Myers Squibb, Avion Pharmaceuticals, Provention Bio, Aurinia Pharmaceuticals, Ventus Therapeutics, and Boehringer Ingelheim. KMS and VES are employees of AbbVie.

DATA AVAILABILITY STATEMENT

Datasets related to this article can be found at <https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE178197>. hosted at <http://ncbi.nlm.nih.gov/gds> on Gene Expression Omnibus (GEO) repository: GEO: GSE178197

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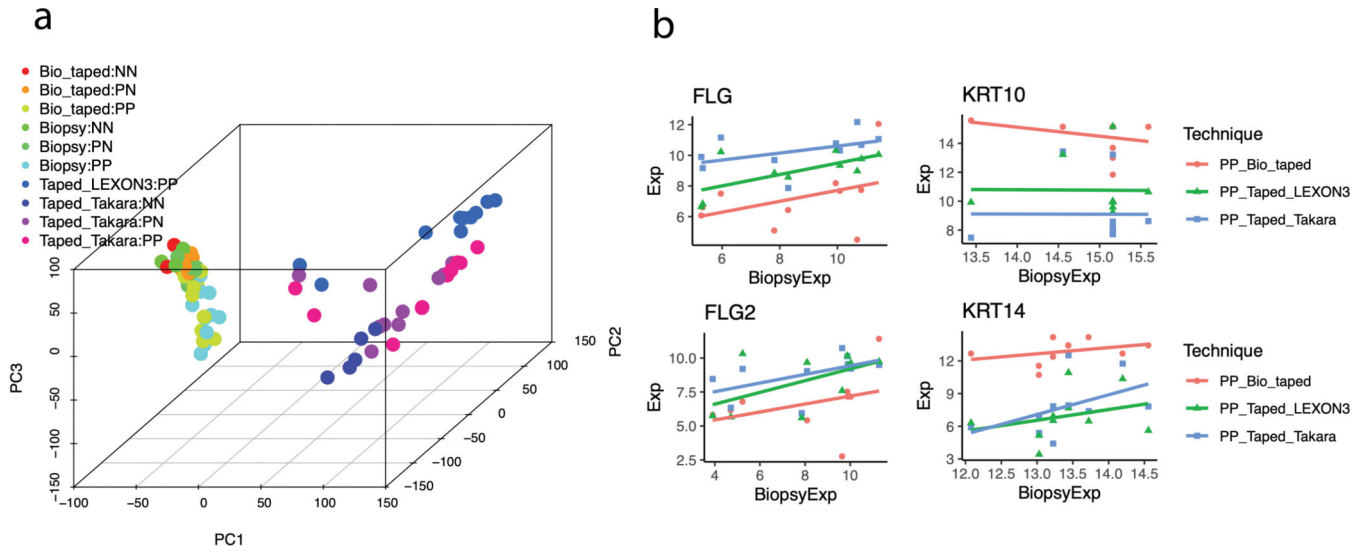
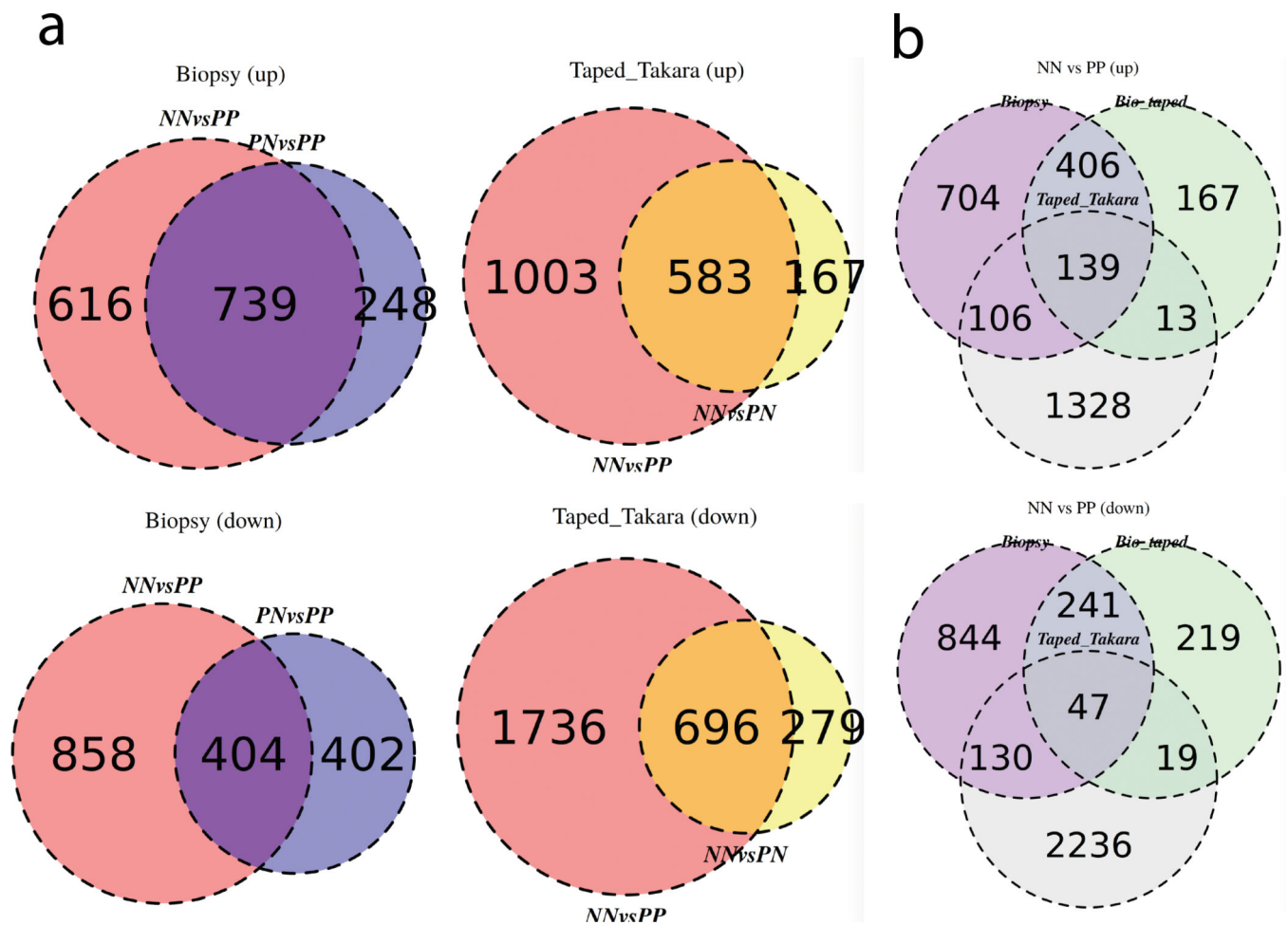


Figure 1. Principal Component Analysis and Gene-gene correlation analyses. (A) Principal component analysis of samples obtained from full-thickness biopsies and tape-stripped samples (representative from two types of library preparation kits - Takara and Lexon3). Lexon3 preparation only yielded usable RNA from a small proportion of lesional skin samples. The PC1 and PC2 explain 25% and 8% of the transcriptome variations, respectively. (B) Correlations of the normalized expression values for signature genes in the epidermal compartments between full-thickness biopsy (x-axis) versus other techniques (y-axis). “Bio_taped”, “Biopsy”, and “Taped” represent biopsy samples taken from tape-stripped area, biopsy samples, and tape- stripped samples, respectively.



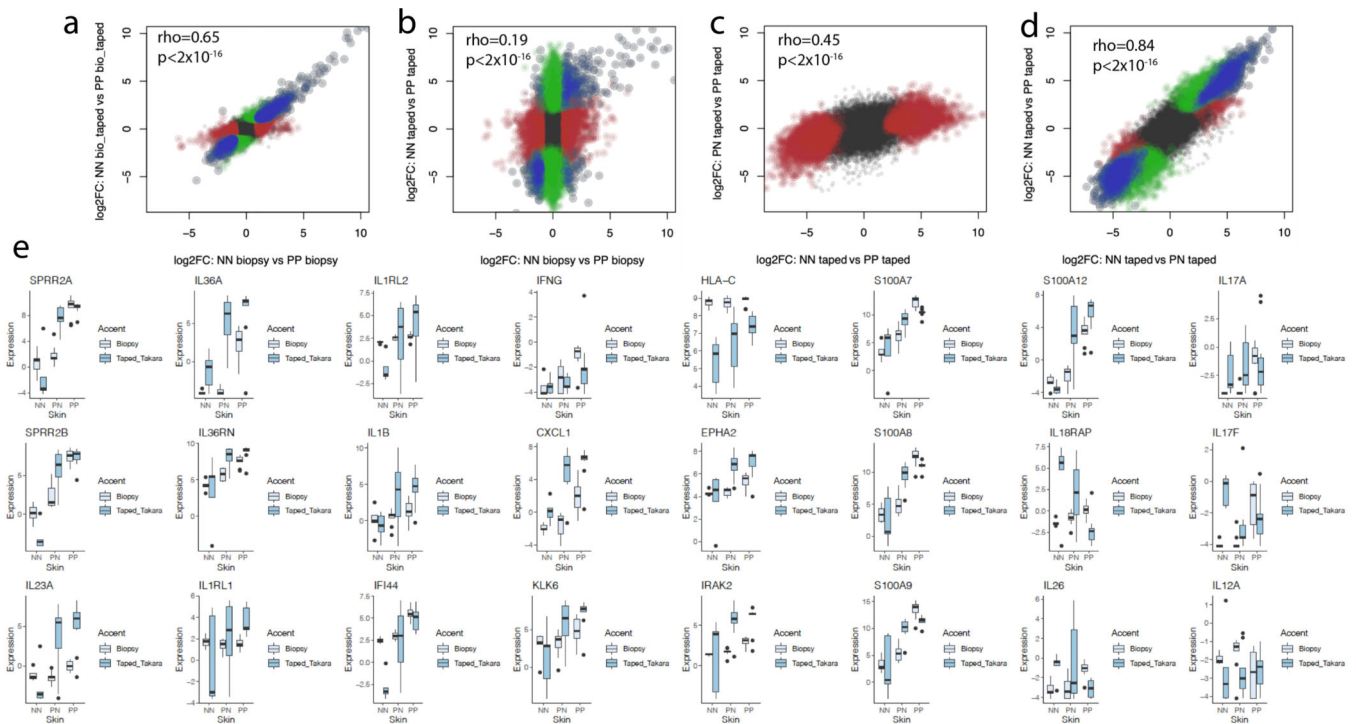


Figure 3. Correlation between effect sizes estimation from biopsy and tapestripping.

(A-D) Correlation between the effect sizes of gene dysregulation from full thickness intact lesional psoriatic (comparing against healthy control) versus full-thickness taped lesional psoriatic skin (left upper figure), and correlation between full-thickness intact lesional versus tape-stripped lesional (right upper figure). For the tape-stripped samples, correlation between lesional vs healthy skin and lesional vs non-lesional skin (left lower figure), and between gene expression in normal vs. uninvolved and normal vs lesional (right lower figure). Red color indicates significant DEGs for the label on the X-axis, green color indicates significant DEGs for the label on the Y-axis. Blue indicates significant DEGs from both. (E) Expression profiles for selected genes highlighting the values captured in different technologies. The lower and upper hinges correspond to the 25th and 75th percentiles; the upper whisker extends from the hinge to the largest value no further than 1.5x Inter-quartile Range (IQR) from the hinge, while the lower whisker extends from the hinge to the smallest value at most 1.5x of the IQR of the hinge.

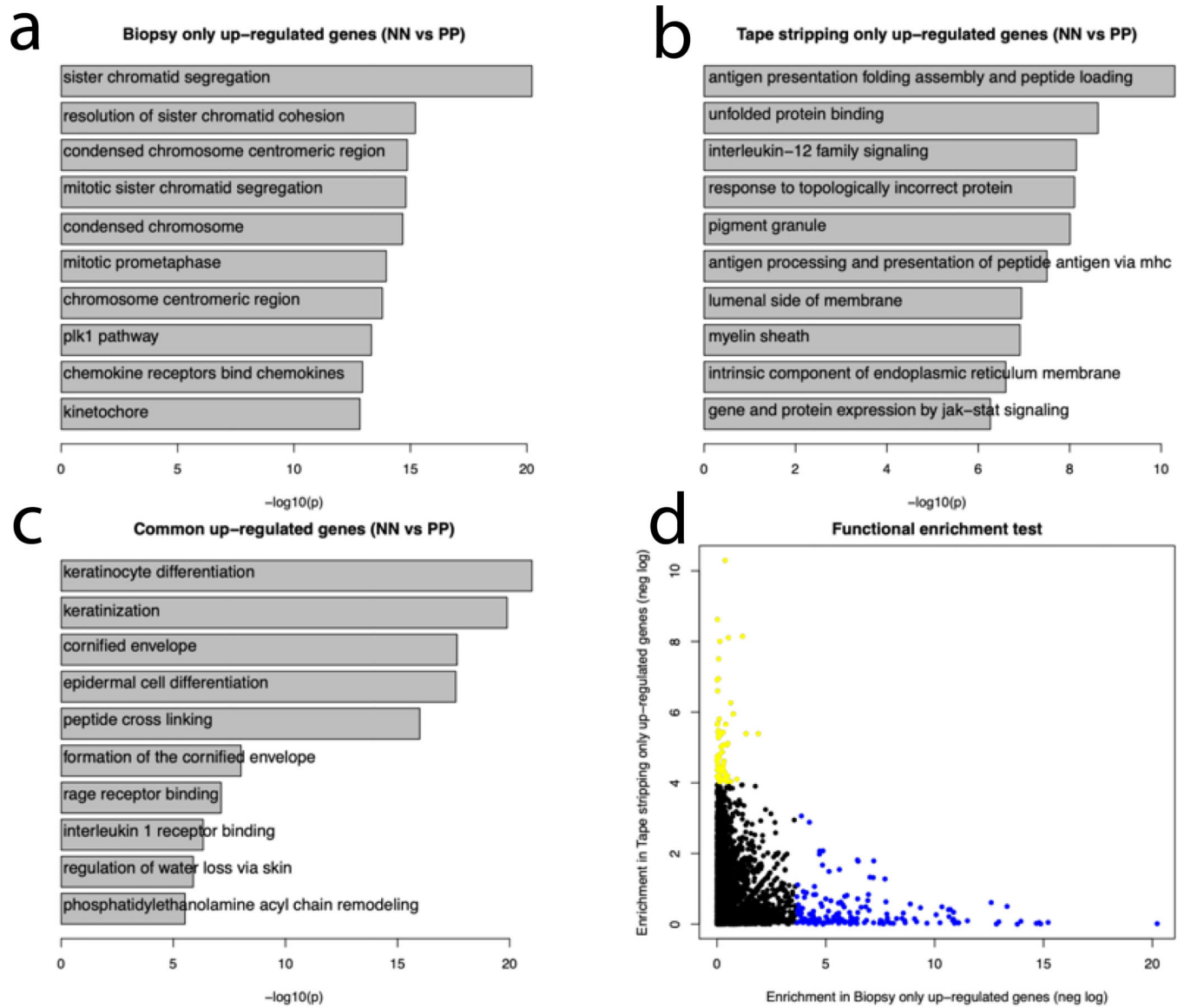


Figure 4. Enrichment of Biological Processes in tape stripped vs. biopsied skin.

(A,B,C) Genes identified in both full-thickness biopsy and tape-stripped skin RNA were enriched for biological functions primarily involving epidermal function such as keratinocyte differentiation, cornified envelop and interleukin-1 receptor binding. Genes only seen in the full-thickness biopsies were enriched for sister chromatic segregation, mitotic prometaphase and kinetochore. Genes only seen in the tape-stripping were enriched for antigen processing and presentation, IL-12 family signaling and JAK-STAT signaling. (D) There was no overlap in the significant functions for DEGs in biopsy only and tape-stripping only. Blue dots represent functions significantly enriched among genes up-regulated in the Biopsy samples only; yellow dots represent functions significantly enriched among genes up-regulated in Tape-stripping samples only.

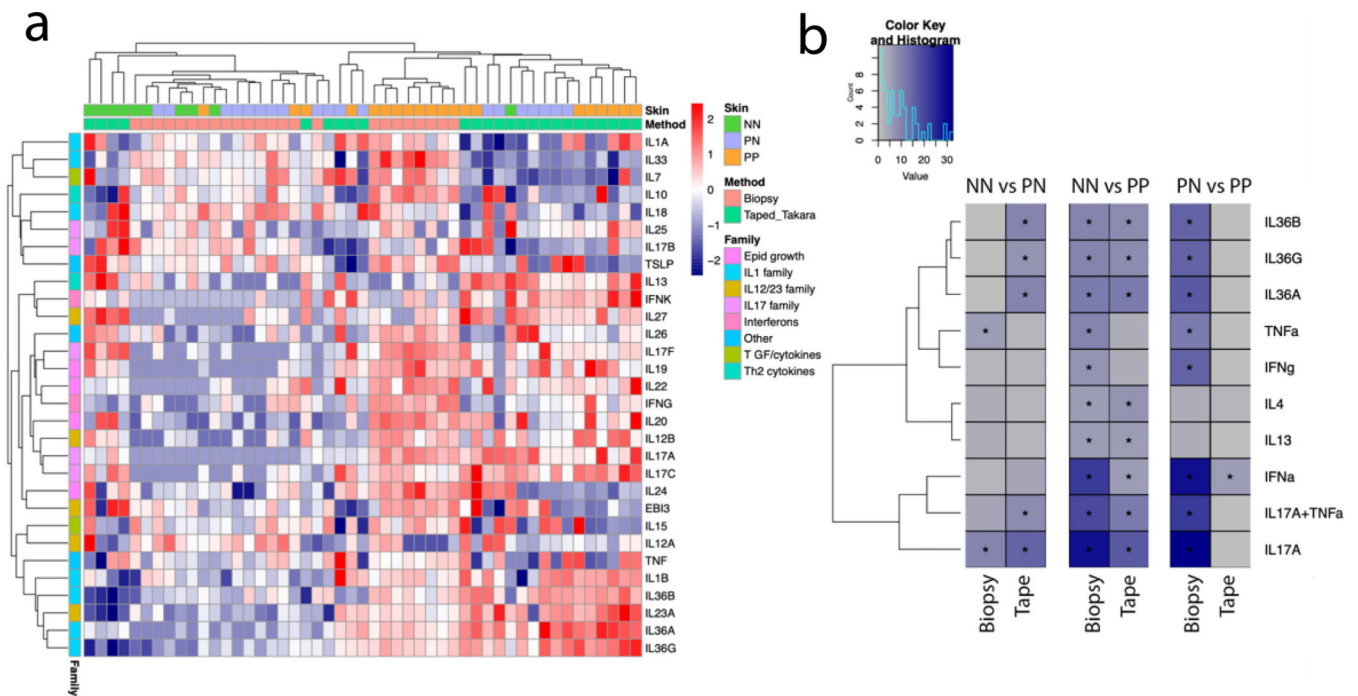


Figure 5. Cytokine expression and signatures in tape stripped vs. biopsied skin.

(A) The heatmap shows inverse normalized gene expression of various cytokines in normal (NN), uninvolved (PN) and lesional psoriatic skin (PP) from full thickness biopsies (pink) or from tape-stripped RNA (green). Hierarchical clustering was used in the dendrograms (B) Cytokine response signatures in full-thickness biopsy samples (first three columns) and from tape-stripped RNA compared against different groups (NN, PN and PP). Significant results are shown (*corrected p-value ≤ 0.05 , and Observed/Expected ratio ≥ 2)

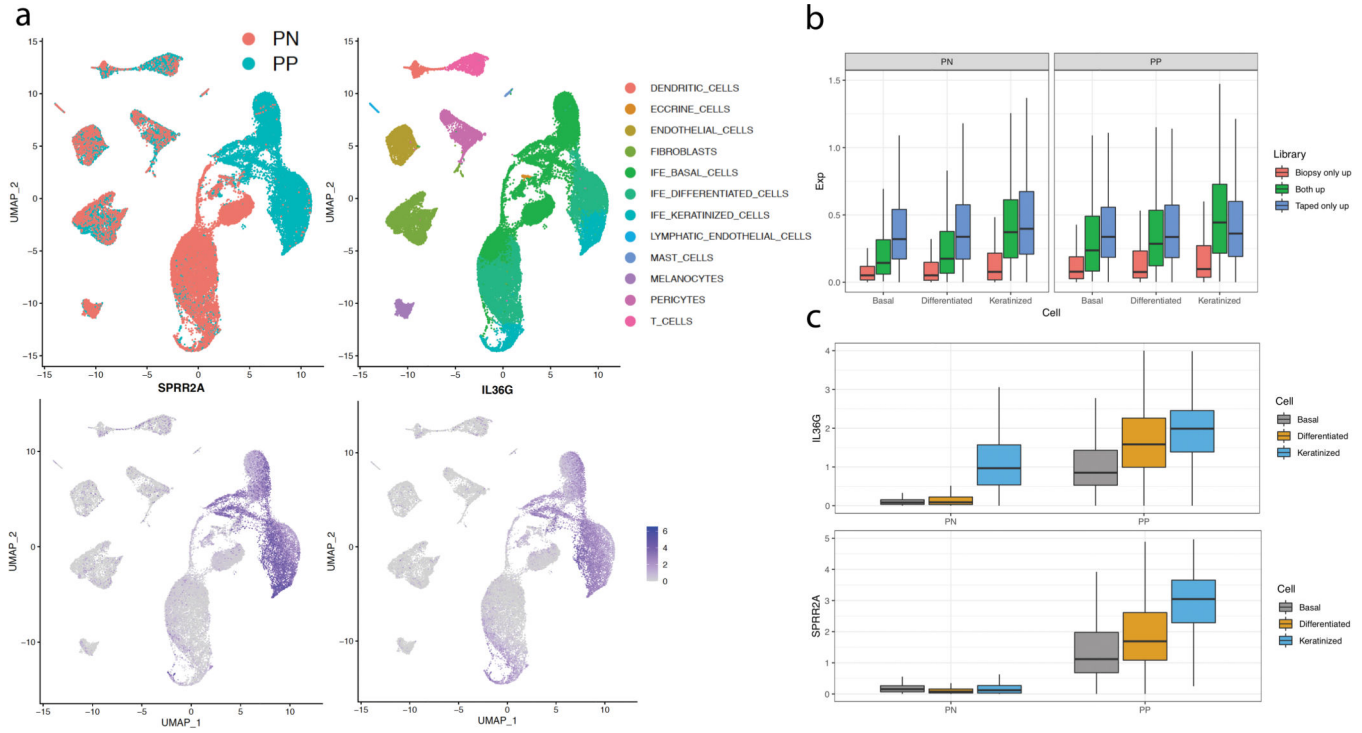


Figure 6. Tape-stripping captures gene expression signatures preferentially from the top layers of the epidermis.

(A) The UMAP shows cell clusters from scRNA-seq from psoriatic and non-psoriatic skin, along with the normalized expression of prominent genes (*SPRR2A* and *IL36G*) captures with tape-stripping. (B) The average normalized expression levels in scRNA-seq for genes identified to be up-regulated in PP skin from different techniques; the expression levels in different epithelial compartments (basal, differentiated/spinous, keratinized/granular) are shown. Genes captured by tape-stripping tend to be localized to the differentiated or keratinized layers of the epidermis. The lower and upper hinges correspond to the 25th and 75th percentiles; the upper whisker extends from the hinge to the largest value no further than 1.5x Inter-quartile Range (IQR) from the hinge, while the lower whisker extends from the hinge to the smallest value at most 1.5x of the IQR of the hinge. (C) Examples of the normalized expression levels of two genes (*IL36G* and *SPRR2A*) in different epithelial compartments.

Table 1.
Selected genes and expression across sample types.

Significant results are bolded.

<i>Gene</i>	Biopsy NN vs. PP		Biopsy under taped area NN vs. PP		Taped NN vs. PP	
	FC	FDR	FC	FDR	FC	FDR
<i>IL36G</i>	54	5.1×10⁻⁰⁵	28	6.1×10⁻⁰⁴	775	2.1×10⁻⁰⁴
<i>IL36A</i>	82	8.7×10⁻⁰⁴	59	6.1×10⁻⁰³	186	1.1×10⁻⁰²
<i>DEFB4A</i>	134	5.4×10⁻⁰⁴	83	3.4×10⁻⁰³	376	1.4×10⁻⁰³
<i>CCL20</i>	11	7.8×10⁻⁰³	15	6.0×10⁻⁰⁴	7.3	2.63×10 ⁻⁰¹
<i>IL1B</i>	2.4	3.8×10 ⁻⁰¹	2.9	1.2×10 ⁻⁰¹	36	1.3×10⁻⁰²
<i>IL17A</i>	7.5	1.8×10⁻⁰²	6.7	1.2×10⁻⁰²	1.9	7.2×10 ⁻⁰¹
<i>IFNG</i>	5.6	5.5×10⁻⁰³	5.1	1.4×10⁻⁰²	2.9	4.0×10 ⁻⁰¹
<i>S100A12</i>	68	1.4×10⁻⁰⁴	87	2.4×10⁻⁰⁴	607	5.8×10⁻⁰⁵
<i>SPRR2B</i>	156	1.4×10⁻⁰⁵	157	1.3×10⁻⁰⁴	1311	1.2×10⁻⁰⁵
<i>SPRR2A</i>	417	9.4×10⁻⁰⁵	725	1.7×10⁻⁰⁵	1376	1.4×10⁻⁰⁴