The metabolomics of psoriatic disease

Di Yan
Ladan Afifi
Caleb Jeon
Megha Trivedi
Hsin Wen Chang
Kristina Lee
Wilson Liao
Department of Dermatology,
University of California-San Francisco,
San Francisco, CA, USA

Abstract: Metabolomics is an emerging new “omics” field involving the systematic analysis of the metabolites in a biologic system. These metabolites provide a molecular snapshot of cellular activity and are thus important for understanding the functional changes in metabolic pathways that drive disease. Recently, metabolomics has been used to study the local and systemic metabolic changes in psoriasis and its cardiometabolic comorbidities. Such studies have revealed novel insights into disease pathogenesis and suggest new biochemical signatures that may be used as a marker of psoriatic disease. This review will discuss common strategies in metabolomics analysis, current findings in the metabolomics of psoriasis, and emerging trends in psoriatic metabolomics.

Keywords: metabolome, psoriasis, psoriatic arthritis, skin, urine, metabolites

Introduction

Metabolites are the small molecules that serve as the substrates, intermediates, and products of cellular pathways. Collectively, the full spectrum of metabolites in a biologic system forms the metabolome, which represents the ultimate culmination of gene expression, epigenetics, protein activity, and environmental influences. As such, metabolites are a direct, functional reflection of the biochemical processes occurring in a particular phenotype. The study of metabolites has long been integral to our understanding of human health and disease. The importance of metabolites in medicine was first noted by Chinese and Hindu practitioners in the 15th century BC who observed that the presence of a sweet compound in urine was associated with the disease now known as diabetes. Modern methods of metabolite analysis were pioneered thousands of years later in 1971 by Linus Pauling, who used gas chromatography (GC) to analyze the composition of breath and urine vapor. Despite the history of metabolites in medicine, the term “metabolomics” was not formally coined until 1998, when researchers led by Oliver et al2 and Tweeddale et al3 separately described the emergence of a new “omics” field dedicated to the systematic identification and quantification of the metabolome.

Since then, the role of modern metabolomics in medical research has continued to evolve and the metabolome has been increasingly recognized as an essential aspect of our understanding of human disease. The profound relationship between health and the metabolome is driven by the ability of small shifts in biochemical pathways to produce dramatic changes in cellular metabolites. In disorders with clear metabolic causes, such as diabetes and heart disease, metabolomics has provided key insights into disease pathogenesis. Yet, even when metabolic derangements do not overtly
drive the disease process, the effects of disease can still provoke insightful alterations in the metabolome. For instance, inflammatory conditions,7–9 neurodegenerative disease,10 infections,11,12 and cancer13–15 can all fundamentally change cellular metabolism, allowing for the identification of novel biomarkers that aid in the prediction, diagnosis, and understanding of disease. More recently, metabolomics has been applied to dermatology, where it has been used to identify characteristic biomarker profiles in metastatic melanoma,16,17 basal cell carcinoma,18 acute intermittent porphyria,19 and atopic dermatitis.20

However, one of the most promising areas of skin research has been the application of metabolomics to the study of psoriatic disease. Several features of psoriasis suggest that it has metabolic underpinnings important to disease pathogenesis, outcomes, and treatment. Most interestingly, psoriasis is strongly associated with various cardiometabolic comorbidities including atherosclerosis, diabetes, and obesity. Metabolomic studies of these psoriatic comorbidities have revealed heightened activity of inflammatory pathways21,22 and a previously unappreciated pathogenic role of metabolites derived from the gut microbiome.6,23,24 Metabolomics is, therefore, an ideal approach for investigating the link between psoriasis, cardiometabolic comorbidities, and the microbiome. Furthermore, unlike genomics and proteomics, metabolomics can capture the downstream effects of environmental factors, such as diet on psoriasis. This review will provide an overview of common analytic strategies used in metabolomics, summarize the findings of metabolomic studies in psoriasis, and discuss emerging trends in psoriasis metabolomics.

Materials and methods

We conducted a systematic review of the literature in PubMed and Embase using the Medical Subject Headings terms provided in Table S1. References from the assembled articles were also reviewed. We included only published articles from peer-reviewed journals. This search strategy yielded 126 PubMed and 141 Embase abstracts, which were then evaluated by the study team members based on predetermined exclusion and inclusion criteria: 1) study involved subjects with either psoriasis or psoriatic arthritis and 2) study quantified endogenous metabolites in human subjects. We excluded case reports, in vitro or ex vivo experiments, methodology papers, redundant studies, and pharmacokinetic or toxicity studies that looked exclusively at the metabolism of specific drug or xenobiotic substance. Thirty-eight abstracts were selected for review, full-text articles could not be found for 2 potentially qualifying abstracts, and 16 articles met all criteria (Tables 3–5).

Approaches and techniques

Studies of the metabolome can be broadly divided into targeted and untargeted approaches. Targeted metabolomics involves the analysis of a prespecified set of metabolites, often related to a particular pathway or network of pathways of interest. Metabolomic studies can also be untargeted, that is, they aim to generate a global picture of metabolic activity without focusing on particular metabolites that have been defined a priori. One type of approach in untargeted metabolomics is metabolic fingerprinting, which uses a pattern of metabolite composition to categorize or identify samples. Another untargeted approach is metabolite profiling, which refers to the simultaneous measurement of as many metabolites as possible to produce a comprehensive “snapshot” of metabolic activity in a biologic system. The data generated by untargeted metabolomics are very complex and high volume, typically requiring processing with specialized bioinformatics software, such as various forms (X) of chromatography mass spectrometry25 and comparison to metabolite databases, such as METLIN26 and the Human Metabolome Database.27 To interpret the processed data in a meaningful way, it must then be mapped onto metabolic pathway databases, such as the Kyoto Encyclopedia of Genes and Genomes.28 This requires sophisticated statistical tools, such as MetaboAnalyst29 and MetaMapR30 to perform pathway and network analyses.

Sample analysis involves the separation of the mixture into its biochemical constituents followed by the identification and quantification of each component. The most commonly used instruments for identification and quantification in the study of metabolomics are mass spectrometry (MS) and nuclear magnetic resonance (NMR) spectroscopy. Each analytical platform has distinct advantages and limitations (Table 1). MS ionizes analytes and separates the ions based on mass to charge ratio. Although samples can be directly injected into a mass spectrometer, MS-based analysis is usually coupled to a variety of analyze separation techniques, which can influence the accuracy and sensitivity of MS-based methods (Table 2). These separation methods include GC, capillary electrophoresis (CE), and liquid chromatography (LC) and its variations, such as high performance liquid chromatography (HPLC) and ultra-high performance liquid chromatography (UPLC).

Although ideal for volatile and thermally stable compounds, GC requires that the nonvolatile constituents of a sample be chemically derivatized to a volatile form for
injection into the gas phase. Components of the sample mixture are then separated based on volatility and size. Derivatization is a significant drawback to the GC separation method because it can render sample preparation excessively complex and expensive and introduce experimental artifacts (Table 2). Because analytes must be volatile, GC is not effective for separating large, highly polar, or charged compounds and cannot be used on solid samples. Other limitations of GC–MS include its interbatch variability and the time-consuming nature of its sample analysis (20–40 minutes per sample). Despite its drawbacks, all the analytic methods discussed, GC–MS is the most mature technology with established fragmentation libraries for the identification of separated sample constituents.

In contrast to GC, LC-based methods perform the separation process in the liquid phase and do not require derivatization for biologic fluid samples. LC offers a far broader range of metabolite coverage than GC, encompassing both polar and nonpolar compounds. Unlike GC, LC can process solid samples in addition to liquid samples. Modern LC-based techniques, such as HPLC and UPLC, can detect analytes present in concentrations <5 parts per billion. However, LC-based approaches are hampered by the lack of MS fragmentation libraries against which analytes can be compared and identified. Furthermore, GC, LC, and its variations are time-consuming, requiring ~15–40 minutes per sample. LC–MS also has limited quantification capabilities compared to NMR.

A third option is CE, which separates sample components by charge and size. CE can thus only be used to separate charged and polar metabolites. However, compared to other separation techniques, CE is faster, requiring <20 minutes per sample and a significantly smaller sample volume (1–20 nL). CE also offers higher resolution separation (plate numbers on the order of 100,000–1,000,000) and can analyze a wider range of metabolites than GC.

In general, MS-based approaches offer higher sensitivity compared to NMR. Modern MS platforms can detect metabolite on the order of picomole to femtomole concentrations. MS can also analyze a broader range of metabolites simultaneously, allowing for high throughput analyses of the metabolome. These advantages make MS-based methods more ideal for untargeted metabolomic analyses. However, MS-based analyses generate data that are less reproducible than NMR results and consume the sample, preventing repeat testing. Additionally, most MS techniques offer less detailed structural information than NMR, rendering novel metabolite identification difficult.

Unlike MS, NMR simultaneously separates, identifies, and quantifies sample components based on characteristic resonance patterns generated by individual constituents. Consequently, NMR does not require prior sample separation

### Table 1: Comparison of NMR and MS based platforms for metabolite analysis

<table>
<thead>
<tr>
<th>Sample</th>
<th>NMR</th>
<th>MS</th>
</tr>
</thead>
<tbody>
<tr>
<td>Recovery</td>
<td>Preservation of sample</td>
<td>Sample destroyed</td>
</tr>
<tr>
<td>Separation</td>
<td>Not needed-simultaneously separates and identifies</td>
<td>Usually needs to be coupled to separation technique</td>
</tr>
<tr>
<td>Derivatization</td>
<td>Not needed</td>
<td>Yes, if separating by GC</td>
</tr>
<tr>
<td>Volume</td>
<td>Large (0.1–0.5 mL)</td>
<td>Small-Moderate (10–100 µL)</td>
</tr>
<tr>
<td>Sensitivity</td>
<td>Lower (LOD 0.5 µM)</td>
<td>Higher (LOD up to 0.5 nM with LC–MS)</td>
</tr>
<tr>
<td>Selectivity</td>
<td>Mostly nonselective analysis</td>
<td>Selective and nonselective analysis</td>
</tr>
<tr>
<td>Identification of unknowns</td>
<td>More structural information, better identification of unknowns</td>
<td>Difficult to identify new metabolites</td>
</tr>
<tr>
<td>Detection range</td>
<td>40–200 metabolites simultaneously</td>
<td>500+ metabolites simultaneously</td>
</tr>
<tr>
<td>Analysis time</td>
<td>Fast (2–3 minutes/sample)</td>
<td>Slow (15–40 minutes/sample)</td>
</tr>
<tr>
<td>In vivo</td>
<td>Can be used in vivo</td>
<td>No, requires sample extraction</td>
</tr>
<tr>
<td>Reproducibility</td>
<td>High</td>
<td>Moderate</td>
</tr>
</tbody>
</table>

### Table 2: Comparison of separation methods compatible with mass spectrometry

<table>
<thead>
<tr>
<th>Sample</th>
<th>Gas chromatography</th>
<th>Capillary electrophoresis</th>
<th>Liquid chromatography</th>
</tr>
</thead>
<tbody>
<tr>
<td>Derivatization</td>
<td>Yes for nonvolatiles</td>
<td>No</td>
<td>No</td>
</tr>
<tr>
<td>Min volume requirement</td>
<td>Moderate (1 µL)</td>
<td>Small (1–20 nL)</td>
<td>Moderate (15 µL)</td>
</tr>
<tr>
<td>Type</td>
<td>No solids, only volatile compounds</td>
<td>Liquid only</td>
<td>No gas, solids must be solubilized</td>
</tr>
<tr>
<td>Analyte range</td>
<td>Nonpolar and slightly polar</td>
<td>Charged and polar</td>
<td>Polar and nonpolar</td>
</tr>
<tr>
<td>Data interpretation</td>
<td>Established libraries for comparison</td>
<td>Newer technology, many unknowns</td>
<td>Newer technology, many unknowns</td>
</tr>
</tbody>
</table>

### Abbreviations:

- GC, gas chromatography
- LC, liquid chromatography
- LOD, limit of detection
- MS, mass spectrometry
- NMR, nuclear magnetic resonance

### Note:

Data obtained from various review studies. Data obtained from various review studies. Data obtained from various review studies. Data obtained from various review studies.
or derivatization. In general, NMR requires larger sample volumes (0.1–0.5 mL) is a less sensitive technique than MS and has a higher limit of detection (5 μM). As a result, NMR may miss low abundance metabolites. Another disadvantage of NMR is that it can only analyze ~40–200 compounds simultaneously. This is considerably less than LC–MS, which can analyze over 500 species at a time. However, NMR can analyze solid and liquid samples and has the most unbiased coverage of metabolites, although it cannot detect or identify salts, inorganic ions, or nonprotonated compounds. A unique advantage of NMR is that it provides more structural information, facilitating the identification of new metabolites. Although NMR is more expensive, the data are more reproducible with faster sample processing times (2–3 minutes). In addition, NMR is nondestructive and can be done in vivo or in vitro, allowing for noninvasive analysis of living biologic systems.

As new technological innovations arise, the analytic capabilities of NMR and MS-based methods have continued to expand and improve. Recently, the development of metabolite imaging has dramatically expanded the applications of metabolomics. For example, functional magnetic resonance imaging and magnetic resonance spectroscopic imaging use NMR-based technology to map metabolites in vivo, allowing for imaging of sensitive tissues, such as the neonatal brain. Similarity, desorption electrospray ionization has allowed for rapid, intraoperative mapping of oncometabolites to guide neurosurgical excisions of patient tumors. Molecular cartography has also used MS-based approaches to provide three dimension (3D) spatial localization of metabolite distributions on the surface of human skin. Other technologic developments have enhanced the ability of MS and NMR to characterize the structure of metabolites. The use of traditional proton NMR (1H NMR) in metabolomics can now be supplemented with carbon 13 (13C NMR), Phosphorus 31 (31P NMR), and 2D NMR. Likewise, the application of tandem mass spectrometry (MS-MS) provides structural information in MS-based analyses. These innovations can facilitate the identification of unknown metabolites, which may serve as novel biomarkers of disease.

Metabolomics in psoriasis and psoriatic arthritis

Skin

Differences in metabolites within psoriatic skin lesions were identified in several of the studies comparing psoriatic lesions to symptom-free psoriatic and/or healthy control skin (Table 3). Among these metabolites, a few appear to be associated with supporting hyperproliferative or hypermetabolic states: glutamic acid, choline, valine, glucose, and myo-inositol. This parallels cancer metabolic profiles as both diseases are characterized by high cellular proliferation rates. Using NMR and MS techniques, two studies found an increase in glutamic acid and glutamic acid:serine ratio in psoriatic lesions compared to symptom-free psoriatic skin and healthy controls. This increase in glutamic acid may be secondary to an increased demand for glutamine during cellular hyperproliferation, rapid protein synthesis, and cytokine production-conditions that are commonly involved in the pathogenesis of psoriasis. Similarly, choline is a building block needed for cell growth and division and was found to be elevated in psoriatic lesional skin compared to symptom-free psoriatic skin and healthy controls in two studies using NMR and MS analysis. Moreover, both glutamic acid and choline were found to have a positive correlation with psoriasis severity based on the plaque severity scale, likely due to the increasing cellular proliferation and inflammation. Alternatively, decreased levels of glucose, myo-inositol, and valine-leucine/isoleucine ratios were found in psoriatic lesions compared to nonlesional psoriatic skin, which may be due to accelerated turnover of these metabolites in rapidly proliferating cells. Interestingly, a study measuring metabolites following use of glucocorticoid therapy observed changes in choline, glutamic acid, and glucose levels comparable to uninvolved psoriatic skin. This reduction in these metabolites needed for production highlights the antiproliferative effects of steroids. In addition, the anti-inflammatory effects of steroids are noted, as increased levels of choline in inflammatory processes have been observed.

Several metabolites that are altered in psoriatic lesions are believed to be due to changes in the metabolic pathway secondary to inflammation. Phenylalanine was increased in psoriatic lesions compared to symptom-free psoriasis skin and healthy controls, but levels were not correlated with disease severity. Phenylalanine metabolism is interrupted by immune activity and, therefore, the metabolite accumulates. An increase in taurine and taurine:alanine ratio was associated with psoriatic lesions. Taurine is an abundant amino acid in leukocytes and is found in high concentrations in inflammatory lesions and tissues exposed to oxidative stress. A decrease in urocanic acid was observed in psoriatic lesions compared to uninvolved psoriatic skin and healthy control. Urocanic acid, which is predominantly found in the stratum corneum, has been implicated in immunomodulatory effects following ultraviolet light conversion to cis-urocanic
Table 3 Metabolomics studies of psoriasis using skin samples

<table>
<thead>
<tr>
<th>Studies</th>
<th>Study objectives</th>
<th>Subjects</th>
<th>Techniques</th>
<th>Key results</th>
<th>Implications</th>
</tr>
</thead>
<tbody>
<tr>
<td>Sitter et al59</td>
<td>Explore the metabolic pattern of uninvolved skin, psoriatic lesional skin and corticosteroid treated psoriatic skin</td>
<td>10 plaque Ps patients each provided 3 skin samples: 1) Ps lesion, 2) uninvolved skin, 3) Ps lesion treated with clobetasol ointment</td>
<td>1H NMR</td>
<td>Ps lesion versus uninvolved: Increased choline and taurine, decreased myo-inositol, and glucose in lesion In Ps lesion treated versus untreated: Glycerophosphocholine higher in treated skin Improvement versus no improvement after treatment: Patients who improved had higher glucose, myo-inositol, GPC and glycine, and lower choline</td>
<td>Metabolite changes similar to findings in cancer patients and may reflect hyperproliferation Metabolites in skin may be used to monitor or predict treatment response to topical steroids</td>
</tr>
<tr>
<td>Dukiewicz et al65</td>
<td>Determine differences in skin metabolites in Ps skin and how these changes differ with severity of plaques using the PSS</td>
<td>100 Ps patients (2 samples-lesional and uninvolved) 100 healthy volunteers matched for race, age, gender</td>
<td>MS</td>
<td>Lesional Ps versus controls: Higher choline, glutamic acid, phenylalanine and lower lactic acid, uracanic acid, citrulline in lesional Ps Lesional versus nonlesional Ps: Higher choline, glutamic acid, phenylalanine, and lower lactic acid, uracanic acid, citrulline in lesional Ps Correlated with PSS: Choline, glutamic acid positively correlated with severity Urocain acid, citrulline negatively correlated</td>
<td>Metabolic changes may reflect hyperproliferation, reduced immunomodulation, and impairment of phenylalanine metabolism by inflammation</td>
</tr>
<tr>
<td>Kim et al66</td>
<td>Determine whether 1H NMR is sufficiently sensitive to discern differences between normal and diseased skin</td>
<td>6 Ps patients (2 samples-Ps lesion and uninvolved skin) 6 site matched skin from healthy controls</td>
<td>1H NMR, confirmed with GC–MS</td>
<td>Glu, Ser, creatine:Gly, and taurine:Ala were threefold greater in psoriatic lesions compared with symptom free or normal skin Val:Leu/Ile was one-half the normal skin</td>
<td>Similar metabolite changes are seen in melanoma and may reflect hypermetabolic or hyperproliferative state Uninvolved areas of psoriasis patients shared spectral patterns in both psoriatic plaque areas and healthy control skin</td>
</tr>
<tr>
<td>Hammarström et al62</td>
<td>Compare levels of free arachidonic acid, PGE2, PGF2, and HETE in uninvolved and involved epidermis</td>
<td>Uninvolved and involved lesions of psoriasis patients</td>
<td>MS with-deuterium-labeled carriers and multiple ion analysis</td>
<td>Involved epidermis had greater arachidonic acid, 12 HETE, PGE2, and PGF2x compared to uninvolved skin The arachidonic acid and hydroxyeicosatetraenoic acid levels in involved epidermis were strongly correlated</td>
<td>The increased levels of arachidonic acid and 12-HETE in involved epidermis may have diagnostic and pathophysiologic importance Arachidonic pathway metabolites leukotriene B4 and 12-HETE may play role in the pathogenesis of the neutrophil infiltrate in psoriasis</td>
</tr>
<tr>
<td>Brain et al65</td>
<td>Determine whether there are differences in arachidonic acid metabolites between uninvolved lesional psoriasis versus uninvolved skin</td>
<td>11 patients with untreated chronic plaque Ps (2 samples: lesional and uninvolved skin)</td>
<td>HPLC</td>
<td>Lesional skin had higher LTB4 and also contained a biologically active mono-HETE</td>
<td>Similar metabolite changes are seen in melanoma and may reflect hypermetabolic or hyperproliferative state Uninvolved areas of psoriasis patients shared spectral patterns in both psoriatic plaque areas and healthy control skin</td>
</tr>
<tr>
<td>Barr et al63</td>
<td>To determine whether quantitative analysis of several arachidonic acid metabolites within exudate collections of abraded skin differs between involved psoriasis skin, uninvolved psoriasis skin and healthy control skin</td>
<td>5 patients with chronic plaque psoriasis (4 males, 1 female) and 7 healthy controls (6 males and 1 female)</td>
<td>GC–MS</td>
<td>Involved Ps versus normal: Increased arachidonic acid and 12-HETE in involved Ps Involved versus uninvolved Ps: Increased arachidonic acid, 12-HETE in involved Ps No significant differences between healthy normal control and uninvolved skin No significant differences in PGE2</td>
<td>Supports a role of lipoygenase pathway products in the pathogenesis of psoriasis</td>
</tr>
</tbody>
</table>

Abbreviations: GC, gas chromatography; GPC, glycerophosphorylcholine; HETE, hydroxyeicosatetraenoic acid; 1H NMR, proton nuclear magnetic resonance; HPLC, high performance liquid chromatography; LTB4, leukotriene B4; MS, mass spectroscopy; PGE2, prostaglandin E2; PGF2, prostaglandin F2; Ps, psoriasis; PSS, plaque severity scale.
acid, a natural killer cell activity suppressor.\textsuperscript{53} Urocanic acid has been shown to be negatively correlated with disease severity,\textsuperscript{45} possibly indicating a deficit of local immunosuppression by cis-urocanic acid. Other metabolite disturbances are likely due to disruption of normal epidermal structures and function. For example, a reduction in lactic acid is observed in psoriatic lesions compared to nonlesional psoriatic skin and healthy controls, which is most likely a result of altered metabolism in sweat glands and keratinocytes or an obstructed sweat duct.\textsuperscript{45,54} Citrulline was also found to be decreased in psoriatic skin and is generally found attached to proteins, which have been found to be reduced in the hyperproliferative epidermis and may explain the positive correlation with disease severity.\textsuperscript{35,55} While skin metabolomics have provided biochemical evidence of high cell turnover and immune dysregulation in psoriasis, they also offer possible mechanisms for keratinocyte hyperproliferation. Abeyakirthi et al\textsuperscript{56} used HPLC to analyze tape strip samples from healthy controls and patients with psoriasis. Their study demonstrated increased levels of epidermal ornithine and decreased levels of arginine in psoriatic lesions. These perturbations suggest overexpression of arginase 1, an enzyme that competes with inducible nitric oxide synthase (iNOS) for the shared substrate arginine. iNOS is responsible for producing high levels of NO, which is released from keratinocytes and inhibits cell proliferation, whereas promoting differentiation in vivo.\textsuperscript{57} Increased use of arginine by arginase 1, reduces its availability for iNOS, leading to low NO levels, which promotes epidermal hyperproliferation in psoriasis.\textsuperscript{58} Abeyakirthi et al found that treatment with an aqueous NO donor gel reduced psoriatic plaque severity by 65\% compared to a control gel in psoriasis patients.\textsuperscript{56}

Outside of the NOS pathway, arachidonic acid metabolites have been of interest as potential contributors to the pathogenesis of psoriasis and promising therapeutic targets. Arachidonic acid is a polyunsaturated omega-6 fatty acid (PUFA) that can be oxidized to a variety of eicosanoids by cyclooxygenase21, lipooxygenase22 (LOX), and cytochrome P450 enzymes.\textsuperscript{59} In particular, the LOX pathways produce hydroxyeicosatetraenoic acids (HETEs) and leukotriene B4 (LTB4), a leukocyte chemoattractant, that is, thought to induce keratinocyte activation and neutrophil-mediated inflammation in psoriasis.\textsuperscript{60,61} Several skin-based metabolomics studies have found higher concentrations of arachidonic acid,\textsuperscript{42,63} HETEs,\textsuperscript{52,62} and LTB4\textsuperscript{64,65} in lesional psoriatic skin, suggesting that a shift toward LOX-mediated leukotriene production in lesional skin may play a pathogenic role in psoriasis. Indeed, the consumption of fish oil or omega-3 PUFAs may modulate eicosanoid production and has been found to moderately reduce psoriasis symptoms.\textsuperscript{66}

In contrast to the systemic perspective offered by blood and urine samples, skin tissue offers the closest look at the disease process and the local changes caused by psoriasis. Although skin-based metabolomics are the most invasive approach, direct sampling of psoriatic lesions allows for the correlation of metabolomic data with lesion morphology and gene expression data from local inflammatory cells and keratinocytes. Skin-based metabolomics, therefore, has the greatest potential to elucidate the immune mechanisms that drive disease pathogenesis and identify novel therapeutic targets. Other applications of skin metabolomics in psoriasis include investigating the role of the skin microbiome in local immune modulation. More recent technologic innovations have enabled the possibility of combining skin metabolomics with in vivo NMR and metabolomic imaging to correlate metabolite changes with disease activity and tissue architecture. This approach has already been applied to prostate cancer, where it has demonstrated promise in visualizing biochemical changes during disease progression and evaluating cancer aggressiveness.\textsuperscript{67}

**Blood**

The psoriatic metabolome has not only been studied at the level of the skin, but plasma sampling and chromatographic techniques have allowed for further exploration of systemic perturbations of metabolic processes (Table 4). Blood ratios and relative concentrations of key metabolites including amino acids, lipids, and fatty-acid derivatives have been assessed for their role in the pathogenesis, prognosis, and treatment of psoriasis and other autoimmune conditions.

Protein metabolites are often the final products of complex metabolic pathways and therefore are the most closely correlated with phenotypic manifestations of disease. Therefore, understanding the amino acid profiles of psoriasis patients can better inform the disease process. Understanding the pathogenesis of psoriasis at the molecular level has been an ongoing effort in the field of psoriasis research. For example, Armstrong et al analyzed metabolite differences in psoriasis, psoriatic arthritis, and healthy control sera to elucidate the pathogenic processes, such as keratinocyte hyperproliferation and immune overactivation that underlie psoriasis.\textsuperscript{37} Armstrong’s study found that psoriasis patients exhibited lower overall levels of glutamine and asparagine compared to healthy controls. The authors suggested that glutamine, which plays
<table>
<thead>
<tr>
<th>Studies</th>
<th>Study objectives</th>
<th>Subjects</th>
<th>Techniques</th>
<th>Results</th>
<th>Implications</th>
</tr>
</thead>
<tbody>
<tr>
<td>Armstrong et al</td>
<td>Differences in metabolite profiles among psoriasis patients with and without</td>
<td>10 Ps only; 10 Ps and PsA; 10 healthy controls</td>
<td>GC–MS</td>
<td>Ps versus control: Ps had higher alpha ketoglutaric acid, lower asparagine, lower glutamine;</td>
<td>Metabolite changes may reflect hyperproliferation, hyperfunctioning of immune cells, and increased oxidative stress</td>
</tr>
<tr>
<td></td>
<td>psoriatic arthritis and healthy controls</td>
<td></td>
<td></td>
<td>Ps and PsA versus control: Ps and PsA had higher glucuronic acid</td>
<td>High glucuronic acid may be due to joint involvement in PsA</td>
</tr>
<tr>
<td>Kamleh et al</td>
<td>To determine the plasma metabolite differences in mild and severe psoriasis</td>
<td>Pretreatment: 32 with mild Ps, 32 with severe Ps, 32 healthy control</td>
<td>LC–HRMS</td>
<td>Anti-TNFα treatment normalized metabolite changes</td>
<td>Elevated lignoceric acid in both Ps and PsA may reflect systemic inflammation and metabolic syndrome</td>
</tr>
<tr>
<td></td>
<td>compared to healthy controls and the effect of the anti-TNFα drug etanercept on</td>
<td>Posttreatment: 16 severe patients with 12 weeks</td>
<td></td>
<td>Perturbed pathways associated with psoriasis: 1) Arginine and proline;</td>
<td></td>
</tr>
<tr>
<td></td>
<td>the metabolite profiles of severe psoriasis patients</td>
<td></td>
<td></td>
<td>2) Glycine, serine, and threonine;</td>
<td></td>
</tr>
<tr>
<td>Izaki et al</td>
<td>To determine the differences in platelet-activating factor and arachidonic acid</td>
<td>12 healthy controls; Pretreatment: 25 Ps adults and children;</td>
<td>Radioimmuno</td>
<td>3) Alanine, aspartate, and glutamate</td>
<td>PAF may contribute to the acute phase of inflammation in psoriasis by bolstering the inflammatory response of leukocytes and endothelial cells</td>
</tr>
<tr>
<td></td>
<td>metabolites in the plasma of psoriasis and palmoplantar pustulosis ps compared to</td>
<td>33 adults with palmoplantar pustulosis; Posttreatment: 16 Ps patients; 11</td>
<td>assay</td>
<td>Ps versus control: PAF, LTB4 higher in Ps</td>
<td></td>
</tr>
<tr>
<td></td>
<td>healthy controls</td>
<td>palmoplantar pustulosis patients</td>
<td></td>
<td>No difference in TXB2 and PGE2</td>
<td></td>
</tr>
<tr>
<td>Kang et al</td>
<td>To determine differences in serum metabolomic profiles between Ps patients and</td>
<td>14 Ps patients – 15 age- and gender-matched healthy controls</td>
<td>GC–MS</td>
<td>Palmoplantar pustulosis versus control: Similar, but statistically insignificant, increases in PAF, LTB4</td>
<td></td>
</tr>
<tr>
<td></td>
<td>healthy controls and identify biomarkers for Ps</td>
<td></td>
<td></td>
<td></td>
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</tr>
<tr>
<td>Grattan et al</td>
<td>To determine whether low blood levels of certain essential fatty acids and their</td>
<td>21 chronic plaque Ps (12 mild, 6 moderate, 3 severe, 17 on topicalis);</td>
<td>GC</td>
<td>Ps had higher asparagine, aspartic acid, isoleucine, phenylalanine, ornithine and proline;</td>
<td>Glycolysis pathway and amino acid metabolic activity are increased in Ps</td>
</tr>
<tr>
<td></td>
<td>metabolites are correlated with Ps, acne vulgaris, and ichthyosis vulgaris</td>
<td>20 acne; 13 ichthyosis vulgaris; 35 healthy volunteers</td>
<td></td>
<td>Ps also had higher lactic acid, urea</td>
<td>Metabolite changes likely due to increased demand for protein biosynthesis and keratinocyte hyperproliferation</td>
</tr>
<tr>
<td>Madsen et al</td>
<td>To determine whether metabolite concentration variations in RA can lead to</td>
<td>25 adults with RA; 20 adults with PsA; 10 healthy controls</td>
<td>LC–MS, GC–MS</td>
<td>Docosapentaenoic acid in all 3 study groups compared to controls</td>
<td>Although certain EFA abnormalities are shared by various skin disease, the overall pattern of EFA metabolism abnormalities seem to be unique for each disease state</td>
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<td>biomarker discovery which can increase specificity of diagnosis in early RA</td>
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<td>Docosapentaenoic acid in all 3 study groups compared to controls</td>
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<td>DGLA was increased in Ps, normal in acn, and decreased in ichthyosis</td>
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(Continued)
a paramount role in cellular protein synthesis and growth, may experience higher rates of consumption by overactive immune cells in psoriasis patients. However, asparagine experiences spontaneous deamidation and breakdown in environments of high oxidative stress, such as the psoriatic inflammatory milieu. Therefore, lower levels of asparagine in psoriasis patients may reflect the high cell turnover and chronic inflammatory state seen in psoriatic disease.

Another key finding of the Armstrong study was the level of alpha-ketoglutaric acid, which was higher in psoriasis, but lower in psoriatic arthritis. In addition to its role as a citric acid cycle intermediate, alpha-ketoglutarate can be converted to glutamate, which may then be used to produce proline, a major substrate of collagen synthesis. Thus, alpha-ketoglutaric acid may be high in psoriasis as a result of increased energy demand secondary to hyperproliferation, but low in psoriatic arthritis due to rapid consumption for collagen synthesis.

Similarly, other serum-based metabolomic studies have found amino acid changes consistent with the model of high cell turnover suggested by Armstrong. A 2015 LC–MS study conducted by Kamleh et al69 and a 2016 GC–MS study by Kang et al70 revealed increased activity in the urea cycle and the arginine and proline pathway. This pattern is also found in other hyperproliferative states, such as wound healing. Together, these studies show that psoriasis has metabolic effects that are not limited to the skin, but are appreciable at a systemic level. Interestingly, Kamleh et al saw increased levels of isoleucine69 and Kang et al found elevations in isoleucine, leucine, and valine. Incidentally, these branched chain fatty acids are also elevated in diabetes and cardiovascular disease and may provide a biochemical link between psoriasis and its systemic cardiometabolic comorbidities.

Serum amino acids in psoriasis patients not only provided insights into disease pathogenesis, but may also be useful as biomarkers for disease severity and monitoring of therapeutic response. For example, the Kamleh group correlated increases in urea cycle amino acids, such as ornithine, arginine, and citrulline with psoriasis severity as measured by psoriasis area and severity index (PASI) score. In addition, increases in proline, and hydroxyproline, amino acids important for collagen synthesis, were also correlated with disease severity and authors suggested that hydroxyproline may be an indicator of psoriatic arthritis. Furthermore, Kamleh et al69 found that etanercept therapy normalized the concentrations of ornithine, arginine, threonine, methionine, glutamine, glycine, citrulline, and proline in psoriasis patients to that of healthy controls. These results suggest that amino acid biomarkers may be used to guide therapy and identify patients at risk of psoriatic arthritis and complications from more severe disease.

Serum-based metabolomics has also been used to distinguish psoriatic disease from other autoimmune conditions. Using a combination of LC–MS and GC–MS, Madsen et al compared serum metabolites between patients with rheumatoid arthritis, psoriatic arthritis, and healthy controls. Their study identified characteristic profiles of metabolite changes that could be used to differentiate the serum of psoriatic arthritis from rheumatoid arthritis with a sensitivity of 90% and a specificity of 94%. Among other metabolite changes, patients with psoriatic arthritis were found to have higher levels of glutamic acid and serine and lower levels of glutamine relative to rheumatoid arthritis. This study, like the one reported by Kamleh et al, also found statistically different concentrations of metabolites in study group patients.
versus control patients, further underscoring the potential of metabolomic biomarkers in detecting and classifying disease. Studying the metabolic profiles of these patients and standardizing concentration criteria could lead to novel diagnostic techniques with improved specificity in clinically equivocal cases.

Understanding metabolic perturbations in psoriasis can also inform disease prognosis and comorbidities. In recent years, cardiovascular disease has been identified as a significant comorbidity in the psoriatic population, perhaps related to high levels of inflammation. The amino acid, homocysteine, has been independently associated with an increased risk of cardiovascular events, which is thought to be mediated by the accumulation of asymmetrical dimethyl arginine (ADMA), a NOS inhibitor that causes endothelial dysfunction. A 2015 study by Bilgiç et al measured plasma homocysteine, ADMA, and other NOS pathway metabolites in psoriasis patients to further define the relationship between hyperhomocysteinemia, psoriasis, and cardiovascular risk. Results from this study demonstrated that although both homocysteine and ADMA concentrations were significantly increased in psoriasis patients versus healthy controls, the severity of psoriasis (assessed with PASI scoring) was only positively correlated with ADMA and the ratio of ADMA to L-arginine, but not homocysteine. Thus, while ADMA's inhibitory effects on cutaneous NOS may reduce epidermal NO, thereby promoting keratinocyte hyperproliferation in psoriasis, its inhibition of endothelial NOS may contribute to the increased cardiovascular risk in psoriasis patients. Consequently, serum ADMA has the potential to be a useful predictor of subclinical cardiovascular disease in psoriasis patients.

In addition to lipids and amino acids, arachidonic acid metabolites have also been investigated in the serum of psoriasis patients. In contrast to skin metabolomics studies, several blood-based studies have found that arachidonic acid levels were lower in psoriasis. However, another study found LTb4 and platelet activating factor, a chemotactic agent and stimulator of the arachidonic acid pathway, were present at higher concentrations in psoriasis patients. Platelet activating factor is thought to bolster the inflammatory response of leukocytes and endothelial cells in both psoriasis and palmoplantar pustulosis. Overall, blood-based metabolomics offers a global picture of how psoriatic disease affects the body’s metabolic pathways. Although it may be difficult to determine if circulating biochemical shifts are the cause or effect of psoriatic disease, blood metabolomics can be used to understand the systemic changes in psoriasis that lead to metabolic comorbidities.

This avenue of research is particularly interesting because psoriasis patients had elevated levels of phenalanine, isoleucine, which have been implicated in obesity, diabetes, and cardiovascular disease. Increased levels of these metabolites could potentially serve as a marker of future cardiometabolic disease and guide the management of psoriatic comorbidities. The blood is also an excellent medium for detecting exogenous metabolites from the gut or skin microbiome that may influence host inflammatory pathways. Blood-based metabolome studies in cardiovascular and diabetes research have already revealed bacterial metabolites that are transferred to the host and promote insulin resistance and atherosclerotic plaque formation. Thus, the profile of bacterial metabolites may be a more reliable indicator of disease risk than shifts in particular microbial species. In addition to the microbiome, the effects of other exogenous factors, such as diet and stress, can also be assessed through blood metabolomics. A better understanding of the mechanistic links between the microbiome, diet, psoriasis, and its metabolic comorbidities can lead to new strategies for cardiometabolic screening and disease management.

Urine

The utility of a urine-based approach to metabolomic analyses can be appreciated for its easy, noninvasive collection method, and its richness in body metabolites and other noncellular products. Currently in the biomedical literature, only a small number of metabolomics studies analyze urine from psoriasis and/or psoriatic arthritis patients using proton NMR (1H NMR) or LC–MS attempting to identify distinct biomarkers that indicate psoriatic disease activity and/or severity and distinct biomarkers to predict and monitor response to the treatment (Table 5).

In 2015, a study by Setkowicz et al identified baseline biomarkers in patients with psoriasis and psoriatic arthritis by analyzing the urinary metabolites of 12(S)-HETE in relation to the severity of their skin lesions. LC–MS showed significantly higher tetranor-12(S)-HETE metabolite excretion in urine of patients with psoriasis whereas 12(S)-HETE was decreased relative to controls. The study proposed that an altered, accelerated metabolism of 12(S)-HETE in psoriasis patients explained the increase in the urinary metabolite product. 12(S)-HETE is an arachidonate LOX product that acts as a potent leukocyte chemoattractant, which has been shown to be found in increased amounts in lesional skin in psoriasis. The accelerated metabolism theory at least partly supports the levels of 12(S)-HETE and tetranor-12(S)-HETE found in psoriasis patients. This metabolic profile and levels,
However, did not correlate with disease activity or severity. The study concluded that the accelerated conversion of 12(S)-HETE to tetranor-12(S)-HETE may be secondary to skin inflammation-induced microsomal beta-oxidation and may be useful as a marker for psoriasis.80

Other potential urinary biomarkers were investigated by Alonso et al who compared the metabolite profiles of psoriasis, psoriatic arthritis, rheumatoid arthritis, Crohn’s disease, ulcerative colitis, and systemic lupus erythematosus. Psoriasis and psoriatic arthritis were found to have lower levels of citrate, alanine, methylsuccinate, trigonelline, carnitine, and hippurate relative to controls.81 In psoriatic arthritis patients, citrate levels were inversely correlated with disease activity81 and may be useful for monitoring of therapeutic response and disease severity. Subsequent clustering analysis demonstrated that the urine metabolite profiles could be divided into three main groups. Psoriasis and psoriatic arthritis comprised one group, sharing five metabolite associations, whereas the second group of Crohn’s disease and ulcerative colitis shared six metabolite associations.81 The third group, composed of rheumatoid arthritis and lupus samples, shared three metabolite associations. Like the blood-based study conducted by Madsen’s group, these results suggest that psoriatic disease and rheumatoid arthritis have distinct metabolite profiles that may be used to aid in differential diagnosis.

Urinary biomarkers may also help predict or monitor treatment response. A 2013 study by Kapoor et al analyzed changes in urinary metabolic profiles before and during therapy with anti-tumor necrosis factor-alpha (anti-TNFα) medications infliximab or etanercept in 20 psoriatic arthritis patients and 16 rheumatoid arthritis patients by 1H NMR. Both psoriatic arthritis and rheumatoid arthritis patients had higher levels of glutamine, phenylacetic acid, and histamine in baseline urine samples and higher levels of methylamine and creatinine in the 12-week urine samples during treatment.82 Elevated levels of these amino acids and their byproducts can be explained by increased cell turnover and accelerated muscle breakdown due to chronic TNFα stimulation causing a cachexia-like effect.82 Urinary metabolite profiles may, therefore, be used to predict and monitor treatment response. Differences in metabolic changes between rheumatoid arthritis and psoriatic arthritis with anti-TNFα were not investigated due to small patient numbers. However, it was found that infliximab and etanercept alter metabolites in the urine differently. With infliximab treatment, there were high urinary metabolite levels of hippuric acid, citrate, and lactic acid; whereas with etanercept treatment, there were high urinary metabolite levels of choline, phenylacetic acid, urea, creatine, and methylamine.82 Although infliximab and etanercept were previously thought to act primarily on TNFα, the unexpected difference in urinary metabolite profiles may reflect differences in unknown additional mechanisms of action.82 Although etanercept and infliximab share immunomodulating effects, they were found to induce different patterns of gene suppression. Infliximab downregulated many Th1 genes, whereas etanercept suppressed genes promoting follicular dendritic cell development and lymphoid neo-organogenesis.83

The overall conclusions of these studies highlight the possible role of urine metabolomics as a convenient, non-invasive method of identifying biomarker profiles, predicting therapeutic response, and monitoring long-term treatment outcomes. Urine metabolomics is thus, exceptionally well suited for application to personalized medicine. In the future, the urine metabolome may be used to biochemically characterize and distinguish between psoriatic subtypes and tailor treatment to individual metabolic phenotypes. However, investigations on urinary metabolomics analyses in psoriasis and psoriatic arthritis patients are scarce and current data on discriminating urinary biomarkers for psoriasis and psoriatic arthritis are not specific. Further research is warranted involving a greater number of cohorts to identify characteristic urinary metabolic profiles in psoriasis and psoriatic arthritis.

Conclusion

Metabolomics has the potential to greatly transform our understanding of psoriatic disease. Already, investigations of the metabolome in skin, blood, and urine samples have revealed interesting trends in metabolite differences between healthy individuals and those with psoriasis. Targeted analyses of the arachidonic acid pathway demonstrate increases in leukotriene branch intermediates in psoriatic skin,82,63,65 and urine,80 although findings in blood samples were mixed.89,77,79 These results suggest that leukotrienes may play an important role in the local inflammatory milieu, but may not be a significant driver of systemic inflammation.

While targeted analyses have enhanced our understanding of known inflammatory pathways intermediates in psoriasis, untargeted metabolomics studies have uncovered new metabolites linked to psoriatic disease. For example, untargeted studies in both blood and skin samples have reported increased levels of taurine,46,49,69 glutamic acid,45,46,69 and phenylalanine.45,69,70 These perturbations in endogenous metabolites have not previously been described in association with psoriasis and represent some of the unique contributions untargeted metabolomics has made to psoriasis research.
Table 5 Metabolomics studies of psoriasis using urine samples

<table>
<thead>
<tr>
<th>Studies</th>
<th>Study objectives</th>
<th>Subjects</th>
<th>Techniques</th>
<th>Key results</th>
<th>Implications</th>
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<tr>
<td>Alonso et al⑧</td>
<td>Identification of diagnostic biomarkers in urine metabolome of RA, Ps, PsA, UC, CD, and SLE</td>
<td>Discovery: 200 in each of 6 disease cohorts (RA, PsA, Ps, UC, CD, and SLE) 100 healthy controls</td>
<td>1H NMR</td>
<td>Metabolite profiles cluster into 3 groups (Ps and PsA, CD and UC, and RA and SLE) Ps and PsA had lower citrate, alanine, methylsuccinate, trigonelline, carnitine, hippurate compared to controls</td>
<td>Metabolite profiles can be used to diagnose and distinguish between autoimmune diseases, such as PsA and RA</td>
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<td>Kapoor et al⑨</td>
<td>Determining changes in urine metabolic profiles in RA and PsA patients before and during therapy with anti-TNF to predict response</td>
<td>16 RA patients 20 PsA patients before and during therapy with infliximab or etanercept</td>
<td>1H NMR</td>
<td>Citrate inverse correlated with disease activity in PsA Baseline RA, PsA Higher glutamine, phenylacetic acid, histamine After treatment in RA, PsA Infliximab treatment increased hippuric acid, citrate, lactic acid Etanercept increased choline, phenylacetic acid, urea, creatine, and methylamine Higher levels of methylamine and creatinine at 12 weeks</td>
<td>Metabolomic profiles may be used to predict and monitor response to anti-TNF therapy in PsA and RA</td>
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<td>Setkowicz et al⑩</td>
<td>Determine frequencies of the genetic variants ALOX12 rs1126667 and ALOX15 rs11568070 in cases and controls, and compare urinary metabolites of 12(S)-HETE in Ps and healthy controls</td>
<td>200 Patients Ps stratified by severity</td>
<td>HPLC–MS–MS</td>
<td>Tetrano-12(S)-HETE, lower 12(S)-HETE, but levels did not correlate severity No difference in genotype and allelic distributions of ALOX12 rs1126667 and ALOX15 rs11568070 in Ps and controls</td>
<td>Systemic metabolism of 12(S)-HETE is accelerated in psoriasis and this cannot be explained by genetic differences in ALOX12 rs1126667 and ALOX15 rs11568070 polymorphisms</td>
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Abbreviations: CD, Crohn’s disease; HETE, hydroxyeicosatetraenoic acid; 1H NMR, proton nuclear magnetic resonance; HPLC, high performance liquid chromatography; MS–MS, tandem mass spectrometry; Ps, psoriasis; PsA, psoriatic arthritis; RA, rheumatoid arthritis; UC, systemic lupus erythematosus; SLE, systemic lupus erythematosus; TNF, tumor necrosis factor; UC, ulcerative colitis.

The findings not only provide a new layer of information about disease processes, such as local and systemic increases in cell proliferation, inflammation, and cell turnover, but also suggest novel biomarkers that can help us characterize psoriatic subtypes and differentiate psoriasis and psoriatic arthritis from similar conditions. As Madsen et al have demonstrated, panels of metabolites can potentially aid in next generation diagnosis with high sensitivity and specificity. Furthermore, the untargeted metabolomics approach has revealed new avenues for therapeutic advancement. Despite improved efficacy over topicals and nonselective traditional systemics, expensive biologics have notoriously high rates of relapse. Currently, anti-TNFβX biologics, such as etanercept, infliximab, and adalimumab have relapse rates of 85%, 72%, 62%, respectively. Studying the metabolites that did not normalize with topical corticosteroids and anti-TNF therapies⁶⁹,⁷² may offer insight into the mechanisms for disease relapse and help identify new pathways that can be targeted for a sustained cure.

Although metabolomics has proved to be a valuable research tool in psoriasis research, it has important limitations, such as cost, lack of standard diagnostic concentration criteria, and need for mechanistic validation. For example, the development of a standard set of concentration criteria has been hampered by technical challenges in absolute metabolite quantification. In LC–MS, a metabolite’s signal intensity depends not only on concentration but also on the matrix in which the sample is analyzed.³³ Ion suppression and other matrix effects can cause inaccurate measurements of metabolite concentration.³³ Stable isotope standards can
be a potential solution, but costs are often prohibitive for large scale metabolomics. As absolute quantification capabilities, it is less sensitive and its use in untargeted metabolomics suffers from problems relating to peak overlap, which can compromise accurate determinations of peak area in NMR spectra. Consequently, untargeted metabolomics studies are, generally, only semiquantitative and typically report findings in terms of relative quantification (i.e., fold change) instead of absolute concentration. It is relatively easier, although still costly, to determine absolute metabolite quantities in targeted metabolomics. Recently, the development of commercial kits with standard mixtures of stable isotope labeled internal standards have allowed for a more standardized and cost-effective approach to metabolomics. As absolute quantification capabilities improve, diagnostic standards can be developed for clinical use. Another key limitation of metabolomics data are the potential for overinterpretation. While pathway and network analyses have provided crucial biologic context to metabolomics data, it is important to note that these data provide evidence of association and not necessarily causation. Further mechanistic studies are needed to understand its role in the pathogenesis of psoriatic disease.

One powerful way to understanding the pathogenic role of metabolite perturbations is to combine metabolomics datasets from other “-omics” fields. An integrated “-omics” approach would allow researchers to account for influences from genetic, environmental, dietary, and microbial factors in a multilevel biologic phenotype that can be used for personalized medicine. Already, several different approaches have been developed for the integration of multiple dimensions of “-omics” data, such as concatenation-based integration, transformation-based integration, and model-based integration. For example, Bayesian networks are a concatenation-based integration strategy that can be used to model conditional dependencies between gene expression, proteins, and metabolites. Recently, Guo et al have used a combination of blood-based metabolomics and whole exome sequencing to assess the biologic significance and penetrance of genetic mutations in a cohort of 80 healthy volunteers who were free of diagnosed disease at the time of sampling. This study identified abnormalities in metabolites involved in lipolysis, glycolysis, and branched chain amino acid metabolism in subjects with genetic mutations associated with diabetes who were later diagnosed with the disease. Guo’s study provides an example of how metabolomics data can provide insight into the clinical significance of other “-omics” data especially in detecting preclinical disease and assessing personalized disease risk. A similar strategy can be useful for individualized medical management in psoriasis, which has complex, multifactorial determinants of disease risk and phenotype. Moving forward, the next challenge of personalized medicine in psoriatic disease will lie in translating massive, multidimensional files of individualized data to better patient care in the clinical setting.

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Disclosure
The authors report no conflicts of interest in this work.

References


Supplementary material

Table S1 Medical subject headings terms used for literature search

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