### Transcriptional analysis-based alterations affecting neuritogenesis of the peripheral nervous system in psoriasis

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#### **Abstract**

An increasing amount of evidence indicates the critical role of the cutaneous nervous system in the initiation and maintenance of psoriatic skin lesions by neurogenic inflammation. However, molecular mechanisms affecting cutaneous neurons are largely uncharacterized. Therefore, we reanalyzed a psoriatic RNA sequencing dataset from published transcriptome experiments of nearly 300 individuals. Using the Ingenuity Pathway Analysis software, we associated several hundreds of differentially expressed transcripts (DETs) to nervous system development and functions. Since neuronal projections were previously reported to be affected in psoriasis, we performed an in-depth analysis of neurite formation-related processed. Our *in silico* analysis suggests that SEMA-PLXN and ROBO-DCC-UNC5 regulating axonal growth and repulsion are differentially affected in non-lesional and lesional skin samples. We identified opposing expressional alterations in secreted ligands for axonal guidance signaling (RTN4/NOGOA, NTNs, SEMAs, SLITs) and non-conventional axon guidance regulating ligands, including WNT5A and their receptors, modulating axon formation.

These differences in neuritogenesis may explain the abnormal cutaneous nerve filament formation described in psoriatic skin. The processes also influence T cell activation and infiltration, thus highlighting an additional angle of the crosstalk between the cutaneous nervous system and the immune responses in psoriasis pathogenesis, in addition to the known neurogenic pro-inflammatory mediators.

#### **Keywords:**

psoriasis, cutaneous nervous system, axon development, myelination

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#### Introduction

Psoriasis is a chronic inflammatory skin disease affecting approximately 1-3% of the human population worldwide. It is characterized mainly as an abnormal skin reaction to various internal and external stimuli, leading to keratinocyte hyperproliferation and chronic immunological responses<sup>1</sup>. Despite the large amount of work, the exact pathomechanism of psoriasis remains unclear, and currently available therapies only manage the symptoms. Therefore, a deeper understanding of the disease-causing alterations is important, to develop new treatment options that not only treat the existing symptoms but also interfere with their development.

In psoriasis, the macroscopically healthy-looking non-lesional (NL) skin already carries alterations that in combination with various abiotic and biotic stimuli lead to the appearance of symptoms<sup>2,3</sup>. One of the widely known characteristics of the NL skin is the Köbner phenomenon, the development of lesions in response to mechanical provocations or stress<sup>4</sup> due to elevated immune response and increased keratinocyte proliferation<sup>5,6</sup>. External, potentially dangerous stimuli are not only sensed by keratinocytes but also by cutaneous neurons, among other cells. Skin cells become activated by these insults, produce pro-inflammatory cytokines<sup>7</sup>, and may also activate and modulate the neuronal functions of nociceptors<sup>8</sup>. An example of this is an altered thermosensation in psoriatic tissues<sup>9</sup>.

Peripheral nervous system (PNS) abnormalities resulting in the loss of sensory abilities can lead to the remission of psoriatic lesions, including I. superficial cutaneous nerve injury<sup>10</sup>, II. poliomyelitis associated flaccid paralysis<sup>11</sup>, III. loss of intercostobrachial nerve function<sup>12</sup>, IV. permanent severance of the left lateral cutaneous nerve<sup>13</sup>, V. traumatic unilateral brachial plexus palsy<sup>14</sup>, VI. loss of finger sensation due to peripheral denervation<sup>15</sup> and VII. partial axonal and demyelinating neuropathy<sup>16</sup>. Damages affecting the central nervous system (and thereby also the PNS) *e.g.* hemiparesis<sup>17</sup> and hemiplegia<sup>18</sup> or stroke<sup>19</sup> were reported to cause the clearance of psoriatic plaques at the neuronal dysfunction-affected peripheral areas. Moreover, in cases when the nerve injury-associated anesthesia was only temporary, psoriatic symptoms reappeared following nerve function recovery<sup>14</sup>. These case reports were recently summarized in depth by Bi Qin and colleagues<sup>20</sup> and by Tian Hao Zhu and coworkers<sup>21</sup>.

Apart from the nervous system-related injuries, several studies showed near-complete remission of psoriatic lesions following botulinum toxin treatment<sup>22,23</sup> that further supports the role of the nervous system both in the formation, as well as in the maintenance of psoriatic plaques. In a psoriasiform animal model, botulinum toxin treatment was suggested to exert its effect through the inhibition of neuropeptides<sup>24</sup>. In 1986, researchers suggested the influence of

cutaneous neurons and neuro-immune factors in the pathogenesis of psoriasis<sup>25</sup>. Since then, numerous studies indicated the role of neuropeptides both in the inflammatory and the proliferative processes in psoriasis pathogenesis. As a result, we may consider psoriasis, at least in part, as a neurogenic inflammatory disease<sup>26</sup>. Studies reported increased expression of several neuropeptides in the lesional (L) skin, including CGRP (calcitonin gene-related protein)<sup>27,28</sup>, NGF (nerve growth factor)<sup>29</sup>, SP (substance P)<sup>30,31</sup>, VIP (vasoactive intestinal peptide)<sup>32</sup>. Apart from their neural functions, these molecules also display pro-inflammatory activities and thereby may contribute to inflammation<sup>33</sup>, highlighting an important role of the nervous system in psoriasis pathomechanism.

The majority of psoriatic patients are troubled by itch at their L skin<sup>34,35</sup>. In these areas, neurogenic pro-inflammatory mediators, e.g., CGRP, NGF, and SP can contribute to itching (pruritus) development<sup>36,37,38</sup>. The patients may also suffer from aching, burning, cramping, stinging, tenderness, and tingling at the L areas<sup>39</sup>, suggesting that cutaneous neuronal sensation mechanisms are affected at multiple levels.

While our knowledge of how neurons affect the immune system is continuously increasing, there is much less know about how the cutaneous nervous system itself is affected in psoriasis. Several large-scale studies, including proteomics<sup>40,41</sup>, RNA microarray<sup>42</sup> and sequencing<sup>43,44</sup>, GWAS<sup>45</sup>, and DNA methylation profiling<sup>46</sup> analyses have been performed to gain a deeper insight into the pathomechanism of the disease<sup>47</sup>. However, our mechanistic knowledge on how the peripheral nervous system is involved and how the cutaneous nervous system is affected in psoriasis remains limited.

We combined the transcriptome sequencing results of nearly 300 individuals from three major published psoriatic datasets, uniformly reanalyzed the data and used the Ingenuity Pathway Analysis software for their downstream enrichment analysis<sup>44,48,49</sup>. Using an unbiased annotation, we found 347 and 885 differentially expressed transcripts (DETs) in NL and L skin samples, respectively. They were associated with nervous system development and functions, in particular, with neuritogenesis regulating mechanisms. This may seem peculiar, knowing that the cell body of neurons does not locate in the skin. However, earlier studies indicate that a large quantity of RNA transport and translation is taking place in the axons that runs in the cutaneous tissues<sup>50,51</sup>. This may explain why and how it is still possible to pinpoint transcriptome differences of different nervous system functions. Therefore, we decided to focus on these mechanisms and analyzed neuritogenesis-related alterations in depth.

#### **Materials and Methods**

#### RNA sequencing data processing

The RNA sequencing datasets from three papers were uniformly reprocessed<sup>44,48,49</sup>. We downloaded the data from SRA (SRP035988, SRP050971 and SRP055813) using SRA-tools (version 2.9.2). We quantified transcript level expression using Kallisto (version 0.43.0) and the full GENCODE v27 transcriptome annotation. Kallisto was run with the following options: --bias --single -1 120 -s 20 -b 100.

#### Differential expression analysis

Transcript-level length-scaled TPM expression estimates from Kallisto were imported into the R statistical environment (version 3.4.3), using the tximport package (version 1.6.0). The data was TMM normalized and voom transformed. We used edgeR (version 3.20.9) for the TMM normalization and the voomWithQualityWeights() function from limma (version 3.34.9) for the voom transformation. Limma was also used to test for differential expression between lesional and non-lesional, lesional and healthy, or non-lesional and healthy sample groups. A linear model was fitted with the limma lmFit function, and the moderated t-statistics was calculated with the eBayes function. Transcripts were defined as differentially expressed if they had an FDR corrected p-value < 0.05 and an absolute log2 fold-change larger than 1.

#### Functional annotation, enrichment analysis and statistics

Differentially expressed transcripts (DETs) from NL vs. H and L vs. H comparison was analyzed using Ingenuity Pathway Analysis (IPA) software (IngenuityH Systems, www.ingenuity.com) to identify pathways that are enriched. DET sets were mapped to the HUGO gene symbols within IPA software and those that did not map to any HUGO gene were discarded. For 'Diseases and Biological funtions' annotation, the p-value was calculated using Fisher's exact test to measure the significance of DET enrichment of a given pathway. For the Gene Ontology enrichment analysis and visualization (Gorilla) tool, the enrichment analysis p-value was calculated according to the mHG or HG model; p-value correction for multiple testing was done according to the Benjamini and Hochberg method (FDR correction). Enrichment was defined as: (b/n) / (B/N), where N: total number of genes, B: total number of genes associated with a given specific GO term, n: number of genes in the top of the user's input list or in the target set when appropriate, b: number of genes in the intersection.

#### Results

#### Peripheral nervous system-associated transcript expression alterations in psoriasis

Based on our psoriasis transcriptome analysis, 2681 transcripts showed altered expression level in the NL and healthy (H) skin comparison (Supplementary Table 1. A), whereas the number of transcripts with altered expression in L vs. H skin was 12314 (Supplementary Table 1. B). Ingenuity Pathway Analysis (IPA) software identified DETs coded by 347 and 885 genes in association with nervous system development and function in NL and L skin, respectively (Supplementary Table 1. C and 1. D). These DETs are predicted to affect neuronal morphogenesis, including neuritogenesis, which represented the most specific group in the analysis (Table 1. and Supplementary table 1. E and F).

Table 1. Functional annotation of nervous system related DETs in non-lesional and lesional psoriatic skin. (H: healthy, L: lesional, NL: non-lesional skin).

Categories	Functions	Comparison	P-value	Number of Molecules
Nervous System Development and Function	Morphology of	NL vs. H	4.11E-17	236
	nervous system	L vs. H	5.28E-32	637
Nervous System Development and Function, Neurological Disease	Abnormal	NL vs. H	4.95E-13	188
Nervous system beveropment and runction, Neurological bisease	morphology of	L <i>vs.</i> H	2.80E-20	495
Nervous System Development and Function, Tissue Morphology	Morphology of	NL vs. H	1.11E-12	165
	nervous tissue	L vs. H	5.25E-22	439
Nervous System Development and Function, Organismal	Morphogenesis of	NL vs. H	4.70E-10	144
Development, Tissue Development	nervous tissue	L vs. H	4.46E-22	405
Cell Morphology, Cellular Assembly and Organization, Cellular Development, Cellular Function and Maintenance, Cellular Growth		NL vs. H	5.26E-10	142
and Proliferation, Nervous System Development and Function, Organismal Development, Tissue Development	•		6.62E-22	399
Cell Morphology, Cellular Development, Cellular Growth and	Morphogenesis of	NL vs. H	6.60E-10	143
Proliferation, Nervous System Development and Function, Organismal Development, Tissue Development	neurons	L <i>vs.</i> H	6.85E-22	403
Cellular Development, Cellular Growth and Proliferation, Nervous	Development of	NL vs. H	1.12E-09	177
System Development and Function, Tissue Development	neurons	L vs. H	2.14E-24	517

# Differentially expressed transcripts affecting axon-related alterations in non-lesional and lesional psoriatic skin

Since only neurites penetrate the skin, we wanted to gain further insight into how neuron projections are likely to be affected in the skin. For this, we performed gene ontology (GO) functional enrichment analysis using neuron projection GO:0043005 as a background in Gorilla (Gene Ontology enrichment analysis and visualization tool) on the neuritogenesis-associated DETs from the original IPA analysis. This analysis revealed biological processes linked to the

regulation of neuron projection development and the semaphorin-plexin signaling pathway. According to our results, these pathways are likely to be affected already in the NL skin, and to a greater extent in L samples, as suggested by a higher number of DETs in the latter group (Table 2. and Supplementary Table 1. G and H).

Table 2. Gene ontology (GO) functional enrichment analysis of DETs associated with neuritogenesis in non-lesional and lesional skin. (H: healthy, L: lesional, NL: non-lesional skin).

GO Term	Description	Comparsion	P-value	FDR q-value	Enrichment (N, B, n, b)
GO:0010975	regulation of neuron projection	NL vs. H	1.98E-4	2.74E-2	1.72 (1442, 229, 139, 38)
	development	L <i>vs.</i> H	6.66E-10	2.79E-7	1.64 (1594, 260, 389, 104)
GO:0045664	regulation of neuron	NL vs. H	2.68E-4	3.35E-2	1.67 (1442, 249, 139, 40)
	differentiation	L <i>vs.</i> H	6.63E-11	4.07E-8	1.64 (1594, 285, 389, 114)
GO:0071526	semaphorin-plexin signaling	NL vs. H	4.09E-4	4.07E-2	5.19 (1442, 12, 139, 6)
	pathway	L <i>vs.</i> H	2.3E-5	1.37E-3	2.96 (1594, 18, 389, 13)

In addition, neuron projection morphogenesis, development, and guidance (Table 3. and Supplementary Table 1. I and J) were predicted to be affected only in psoriatic lesions (Table 4. and Supplementary Table 1. K and L). Among axon formation-associated regulatory processes, negative regulation of axonogenesis and axon guidance are predicted to be affected in psoriatic lesions (Table 4. and Supplementary Table 1. K and L).

Table 3. Gene ontology (GO) functional enrichment analysis of DETs associated with neuritogenesis reveals neuron projection-related biological processes in lesional but not in non-lesional skin. (H: healthy, L: lesional).

GO Term	Description	Comparsion	P-value	FDR q-value	Enrichment (N, B, n, b)
GO:0048812	neuron projection morphogenesis		2.94E-10	1.43E-7	1.96 (1594, 138, 389, 66)
GO:0097485	neuron projection guidance	_	8.37E-7	9.17E-5	1.78 (1594, 124, 389, 54)
GO:0031175	neuron projection development	- Lvs. H	9.31E-7	9.74E-5	1.68 (1594, 159, 389, 65)
GO:0010976	positive regulation of neuron projection development	∟ из. п	3.15E-6	2.54E-4	1.69 (1594, 141, 389, 58)
GO:0010977	negative regulation of neuron projection development		9.99E-5	4.76E-3	1.74 (1594, 87, 389, 37)

Table 4. Gene ontology (GO) functional enrichment analysis of DETs associated with neuritogenesis reveals axon formation-related biological processes only in lesional psoriatic skin. (H: healthy, L: lesional).

GO Term	Description	Comparsion	P-value	FDR q-value	Enrichment (N, B, n, b)
GO:0050770	regulation of axonogenesis		6.36E-7	7.32E-5	1.89 (1594, 102, 389, 47)
GO:0007411	axon guidance	_	8.37E-7	9.06E-5	1.78 (1594, 124, 389, 54)
GO:1902668	negative regulation of axon	_	8.36E-5	-5 4.2E-3	3.00 (1594, 15, 389, 11)
	guidance				
GO:0048843	negative regulation of axon	L vs. H			
	extension involved in axon		9.41E-5	4.56E-3	3.15 (1594, 13, 389, 10)
	guidance				
GO:0050771	negative regulation of		2.61E-4	1.07E-2	2.00 (1594, 45, 389, 22)
	axonogenesis				
GO:0008045	motor neuron axon guidance		6.07E-4	2.21E-2	2.73 (1594, 15, 389, 10)
GO:0048841	regulation of axon extension	6	6.07E-4	2.2E-2	2.73 (1594, 15, 389, 10)
	involved in axon guidance				
GO:1902667	regulation of axon guidance		9.35E-4	3.19E-2	2.50 (1594, 18, 389, 11)

Axon formation is strongly associated with Schwann cell myelination in the peripheral nervous system. Despite that functional enrichment analysis did not reveal any associated processes, skin tissue expression analysis (tissues.jensenlab.org) integrated into the STRING database (version:11.5) revealed some interesting associations. Four molecules (MBP, MPZ, PMP22, and EGR2) out of the DETs coded by 347 genes in NL were assigned to Schwann cells (BTO:0001220, 4 of 6 molecules), and another four (MBP, MPZ, PMP22, and RTN4) to myelin (BTO:0000894, 4 of 6 molecules). A similar analysis also pointed out four (MBP, MPZ, EGR2, and PRX) Schwann cell-associated molecules in L skin samples (out of the DETs coded by 885 genes), while myelin-related molecules were MBP, MPZ, PLP1, and RTN4 (Supplementary Table 1. M). Our analysis suggests that a common molecule that emerges is RTN4 (also known as Nogo), thus myelin-associated inhibitory regulation of axon formation via RTN4 appears as a general mechanism both in NL and L skin samples.

## Semaphorin-Plexin signaling, an important regulator of axon formation, is differentially affected in non-lesional and lesional psoriatic skin

Since both IPA and GOrilla enrichment analysis suggested that Semaphorin-Plexin signaling is affected (Semaphorin Neuronal Repulsive Signaling Pathway: p-value<sub>NL vs. H</sub>=1,52E-03 and p-value<sub>L vs. H</sub>=1.45E-02 and Table 2., respectively) in psoriasis pathogenesis, we analyzed these mechanisms in depth. Type 3 semaphorins (Sema3) play a role in neurite formation by regulating axon attraction and repulsion. Among the Sema3 family members that inhibit axon extension, we found DETs coded by Sema3B and Sema3F genes both in NL and L skin, while in L skin, we also detected Sema3D, Sema3E, and Sema3G expression (Figure 1. and

Supplementary Table 1. N). Sema3A is not affected by DETs in NL or L skin. Among semaphorin3 receptors and coreceptors, L1CAM, Nrp1and PlxnD1 are only affected by DETs in NL skin, while in L samples gene expressional differences are associated with Nrp2 and PlxnA3 (Figure 1.). Transcripts of downstream signaling molecules Fyn, Crpm1, Mapk3, Mknk1, and Paks are differentially expressed both in NL and L skin. Fes and AKT expression are altered only in NL, while DETs of eIF4E, Farp2, Limk2, MsrB1, PI3K, and Rnd1 are present in lesions (Figure 1.). These abnormalities may suggest that axon repulsion and the negative regulation of axon attraction is likely to be highly affected in L in contrast to NL skin, where PI3K mediated negative regulation of axon attraction does not seem to play a role when compared to H skin samples.

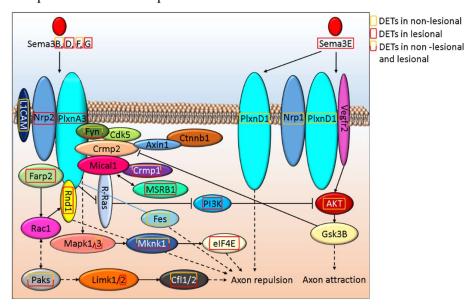


Figure 1. *In silico* model of how Sema3 signaling alterations regulate axon morphogenesis in NL and L psoriatic skin.

Sema4D is important in axon regeneration not only by modulating axon elongation but also by inhibiting neuron myelination<sup>52</sup>. SEMA4D encoding DETs are present in L but not in NL skin. Sema4D cell surface receptors (PlxnD1 and ErbB2), as well as downstream signaling proteins (Paks, Cfl1, and Cfl29) expression is altered in NL and L skin. Whereas in NL skin, AKT, Arhgef11, and RAF, while in L samples Mlc1, PI3K, Rnd1, Rock2, and Shc are affected by DETs (Figure 2. and Supplementary Table 1. O).

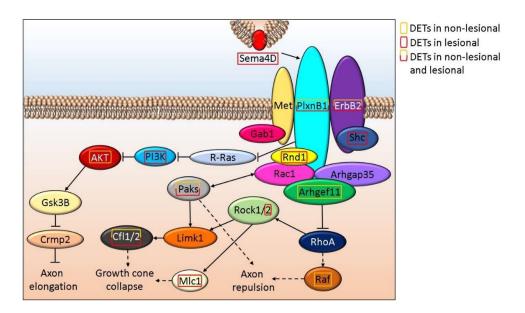


Figure 2. Schematic *in silico* model of the role Sema4D signaling play in axon elongation/repulsion in NL and L skin.

Sema6A and 6D gene expression is affected in lesions that share receptors of Sema3A, as well as CSPG, the receptor of Sema5A. These alterations may also affect axon repulsion. The schematic *in silico* model of the potential crosstalk between Sema3-Sema4-Sema5-Sema6 signaling is shown in (Supplementary Figure 1. and Supplementary Table 1. P), while (Supplementary Figure 2. and Supplementary Table 1. Q) shows the interaction of Sema4 and Sema7A signaling, which only affected in L samples.

## ROBO-DCC-UNC5 signaling regulates axon formation and differentially affected in non-lesional and lesional psoriatic skin

Axon dynamics is also regulated through Slit and Ntn signaling via Robo and Dcc, respectively. Slit and Ntn signaling via Robo and Dcc were found as part of the general canonical signaling pathway term Axonal Guidance Signaling that also included Wnt5a and semaphorins and were suggested to be affected both in NL and Lesional skin (p-value=3.21E-5 and 5.03E-06, respectively). SLIT2 and its receptor ROBO2 are affected only in L skin, while ROBO1 expression is altered in NL and L samples (Figure 3. and Supplementary Table 1. R). The expression of NTN1, as well as its receptors DCC (Figure 3.) and UNC5A (Figure 4. and Supplementary Table 1. S) are affected in L but not in NL skin, where only some of the downstream proteins may be differentially expressed.

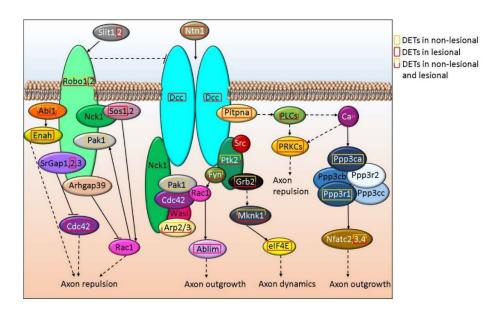


Figure 3. Schematic *in silico* model of axon outgrowth/repulsion regulation via Robo-DCC signaling-related alterations in NL and L skin.

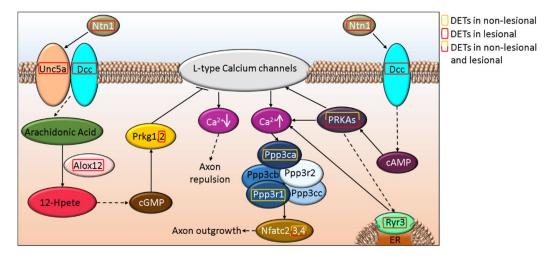


Figure 4. Schematic *in silico* model of axon outgrowth/repulsion regulation by UNC5A-DCC signaling-related alterations in NL and L skin.

#### Abnormal WNT5A signaling potentially affect cutaneous axon growth in psoriasis

We found that WNT5A is affected in psoriatic lesions, and the FZD3 and FZD5 receptor-mediated (also affected in L skin) signaling pathway may play a role in axon growth/repulsion (Figure 5. and Supplementary Table 1. T). In contrast, we only found DETs of downstream molecules in the NL skin, and these were mostly affecting axon outgrowth (Figure 5.).

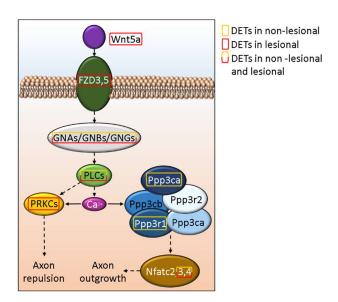


Figure 5. *In silico* model of the effect of Wnt5a signaling on axon growth and retention in psoriasis.

#### **Discussion**

Psoriasis is a chronic inflammatory skin disease where interleukin (IL)-17 is the major driver of inflammatory responses<sup>53</sup>. Studies, including the imiquimod-induced psoriasis-like skin inflammation models in mice<sup>54</sup>, suggest that the peripheral nervous system may have a role in the initiation and maintenance of the inflammatory and hyperproliferative responses through the release of neuropeptides<sup>30,26</sup>. Cutaneous nerves can activate dermal dendritic cells' IL-23 production, and IL-23 triggers IL-17 expression and release by T cells<sup>54</sup>. Therefore, peripheral nervous system-related abnormalities may be important to understand the sequence of events in the pathomechanism of psoriasis.

During the reanalysis of public RNA-sequencing data, we identified that neuritogenesis is one of the processes that is affected in the patients. Semaphorin-Plexin signaling cascades regulate various features of neuronal projection formation-related processes <sup>55</sup>. Semaphorins were originally identified as neuronal and axon growth guidance molecules. Today it is clear that the superfamily of semaphorins counting over 20 members of soluble extracellular and cell surface transmembrane signaling proteins, can modulate the development and function of several organs, including the cardiovascular<sup>56</sup>, immune<sup>57,58</sup>, and the nervous system<sup>59</sup>, among others<sup>60,61</sup>. Despite their massive role in innate immune responses and inflammation<sup>62</sup>, we have limited data about the semaphorins' involvement in psoriasis pathogenesis 63,64,65, but no information on axon formation-related processes in the context of this disease. Since neuritogenesis is affected<sup>66</sup> in psoriasis, it is not surprising that DETs of semaphorins (Semas) were identified in our study, given their clear role in axon guidance. Most of the molecules, like SemaB and SemaF, were implicated in both axon attraction or repulsion<sup>67</sup>. These antagonistic functions may be due to the differences in their local concentrations, or the receptor repertoire on the interacting cells. For example, Sema3E stimulates axon growth of PLXND1 and NRP1 expressing neurons, but when PlexinD1 is expressed without NRP1, Sema3E has an opposite effect<sup>68</sup>. In addition, Sema3E interaction with its co-receptor VEGFR2 may also stimulate axon extension<sup>69</sup>. Despite that, VEGFR2 was not affected in our analyzed dataset, the expression of other Sema receptors, including NRP1, NRP2, PLXNA3, PLXNB1, PLXNB3, PLXND1, as well as L1CAM and ERBB2 were differentially expressed in psoriatic samples. The decrease in Sema3D can negatively influence both the numbers and the branching of peripheral axons<sup>70</sup>. Interestingly, the expression of this molecule was affected in lesions, which may be a reason why the number of neurites and axonal branching is reduced in the patients<sup>66</sup>. NRP1was suggested to play in the pathomechanism of psoriasis by several studies in context with

keratinocyte proliferation and differentiation, angiogenesis and lymphangiogenesis among others (reviewed by Sunhyo Ryu and colleagues<sup>65</sup>).

Class IV semaphorins are transmembrane proteins<sup>62</sup>. The cell surface Sema4D is known to influence axon regeneration, and its overexpression can inhibit neuron myelination<sup>52</sup>. Sema4D is also expressed by various immune cells, including T cells, and can modulate dendritic cell functions<sup>71</sup>. In psoriasis, T cells infiltrate not only to the dermis, where they may interact with dermal dendritic cells, but also the epidermis, where they can come into contact with Langerhans cells. Sema4D was also suggested to induce keratinocyte mediated inflammatory responses in psoriasis<sup>64</sup>. Moreover, myelination of neurites is the least pronounced in the epidermis, where Sema4D(+) T cells may interrupt the myelination processes, and thereby inhibit axon regeneration. In line with this concept, we found several major myelin-associated proteins<sup>72</sup>, including MBP, MPZ, PMP22, and RTN4 with altered expression in psoriatic lesions. RTN4 (also known as NOGOA) is a myelin-associated inhibitor of axon growth and regeneration following nerve injury<sup>73</sup> and may contribute to the reduction of neurites<sup>66</sup> in lesions.

We also found SLIT2 and its receptor ROBO1, previously shown to be expressed by both axons and Schwann cells, and ROBO2 that is mainly expressed by axons in mice<sup>74</sup> in the lesional samples of our dataset. Schwann cell-expressed NTN1, which participates in axon regeneration following nerve injury<sup>75</sup>, is also affected in psoriatic lesions. NTN1 can also influence neutrophil, macrophage, and T cell infiltration<sup>76</sup>. In addition, dendritic cell-originated Sema4A may play a role in the activation of both Th1 and Th17 cells in the neuroinflammatory demyelinating autoimmune disease, multiple sclerosis<sup>77</sup>,<sup>78</sup>. This molecule is also affected by DETs in psoriatic patients.

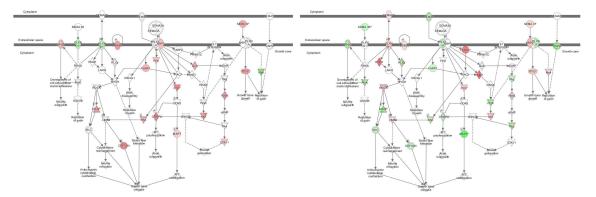
In the nervous system, Sema4B plays a role in synapse formation and maintenance and may influence post-synaptic density<sup>79</sup>. We found altered expression of this molecule only in NL skin. In addition, Sema4B may inhibit basophil-mediated Th2 skewing<sup>80</sup> and contributes to the developing Th1/Th2 imbalance in psoriasis<sup>81</sup>. Apart from this, circular SEMA4B RNA may decrease the effect of IL-1β through Wnt signaling<sup>82</sup>. This pathway may also influence axon growth/repulsion via WNT5A (and its receptors FZD3 and FZD5) that we found to be affected in psoriatic lesions which is in line with previous observation<sup>83</sup>. It may also act as a suppressor of axonal regeneration<sup>84</sup>, and at the same time, facilitate CXCL12-CXCR4-mediated T cell infiltration<sup>85</sup>, with the latter being known to be important in chronic inflammatory skin diseases<sup>86</sup>.

Therefore, we suggest that the expressional dysregulation in 12 different semaphorins and many of their main receptors and co-receptors can contribute to the abnormal neuron projection formation described earlier in psoriasis<sup>66</sup>. Semaphorin signaling can also greatly influence other major hallmarks of psoriasis, the innate immune and inflammatory processes<sup>62</sup>. Therefore, our study can highlight an additional angle of the crosstalk between the neuro-immune system, another important mechanism in psoriasis pathomechanism, in addition to the neurogenic proinflammatory mediators. Our study provides a strong base and novel directions in psoriatic research since due to the discrepancy between RNA and protein level our results must be examined and validated by future studies.

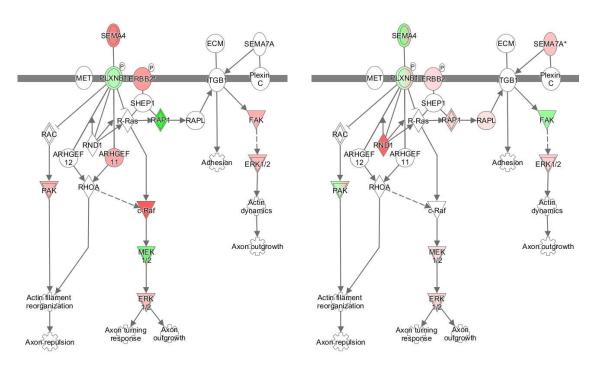
It is important to note that the vast majority of semaphorin signaling cascades, as well as SLIT-ROBO and NTN-DCC signaling, exert their effect through the small GTPase RAC1<sup>73</sup>. This molecule not only connects the cutaneous nervous system and the immune cells but also keratinocytes, where it can influence proliferation, differentiation, and innate immune processes<sup>87</sup>. Based on these features, RAC1 is likely to be an important molecule in psoriasis. RAC1 is also known as a Ras-Related C3 Botulinum Toxin Substrate 1, as it is the primary target of botulinum toxin.

Our results together with previous observations provide an explanation why botulinum toxin treatment of patients is so effective and argues for its more extensive clinical application in psoriasis therapy.

### **Supplementary Information**



Supplementary Figure 1. *In silico* model of the potential crosstalk between Sema3-Sema4-Sema5-Sema6 signaling in NL (left panel) and L (right panel) psoriatic skin. DETs are colored according to the extent of the difference compared to healthy samples. Green color depicts decreased and red increased expression levels. (We used QIAGENs Ingenuity Pathway Analysis software to generate the images.)



Supplementary Figure 2. *In silico* model of the interaction between Sema4 and Sema7A signaling in NL (left panel) and L (right panel) psoriatic skin. DETs are colored according to the extent of the difference compared to healthy samples. Green color depicts decreased and red increased expression levels. (We used QIAGENs Ingenuity Pathway Analysis software to generate the images.)

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