#### **ORIGINAL PAPER**



## Unravelling morphoea aetiopathogenesis by next-generation sequencing of paired skin biopsies

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#### Abstract

**Background** Morphoea can have a significant disease burden. Actiopathogenesis remains poorly understood, with very limited existing genetic studies. Linear morphoea (LM) may follow Blascho's lines of epidermal development, providing potential pathogenic clues.

**Objective** The first objective of this study was to identify the presence of primary somatic epidermal mosaicism in LM. The second objective was tTo explore differential gene expression in morphoea epidermis and dermis to identify potential pathogenic molecular pathways and tissue layer cross-talk.

**Methodology** Skin biopsies from paired affected and contralateral unaffected skin were taken from 16 patients with LM. Epidermis and dermis were isolated using a 2-step chemical-physical separation protocol. Whole Genome Sequencing (WGS; n=4 epidermal) and RNA-seq (n=5-epidermal, n=5-dermal) with gene expression analysis via GSEA-MSigDBv6.3 and PANTHER-v14.1 pathway analyses, were performed. RTqPCR and immunohistochemistry were used to replicate key results. **Results** Sixteen participants (93.8% female, mean age 27.7 yrs disease-onset) were included. Epidermal WGS identified no single affected gene or SNV. However, many potential disease-relevant pathogenic variants were present, including ADAMTSL1 and ADAMTS16. A highly proliferative, inflammatory and profibrotic epidermis was seen, with significantly-overexpressed TNF $\alpha$ -via-NFkB, TGF $\beta$ , IL6/JAKSTAT and IFN-signaling, apoptosis, p53 and KRAS-responses. Upregulated IFI27 and downregulated LAMA4 potentially represent initiating epidermal 'damage' signals and enhanced epidermal-dermal communication. Morphoea dermis exhibited significant profibrotic, B-cell and IFN-signatures, and upregulated morphogenic patterning pathways such as Wnt.

**Conclusion** This study supports the absence of somatic epidermal mosaicism in LM, and identifies potential disease-driving epidermal mechanisms, epidermal-dermal interactions and disease-specific dermal differential-gene-expression in morphoea. We propose a potential molecular narrative for morphoea aetiopathogenesis which could help guide future targeted studies and therapies.

Keywords Morphoea  $\cdot$  Linear morphoea  $\cdot$  Localised scleroderma  $\cdot$  Actiopathogenesis  $\cdot$  Next-generation sequencing  $\cdot$  Genomics  $\cdot$  Transcriptomics  $\cdot$  Gene expression

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#### Abbreviations BGI **Beijing Genomics Institute** С Control skin (denoting a skin sample taken from a site unaffected by morphoea; contralateral site-matched pair) CADD Combined annotation-dependent depletion CCL CC chemokine ligand CNS Central nervous system COMP Cartilage oligomeric matrix protein Counts per million CPM CTGF Connective tissue growth factor CXCL Chemokine C-X-C (motif) ligand DE Differentially expressed DGE Differential gene expression DNA Deoxyribonucleic acid **ECM** Extracellular matrix/extracutaneous manifestations EMT Epithelial to mesenchymal transition ES Enrichment score ET-1 Endothelin 1 ExAC Exonerated aggregation consortium FC Fold change FDR False discovery rate FGF Fibroblast growth factor Fli1 Friend leukaemia virus integration 1 **GSEA** Gene set enrichment analysis H&E Haematoxylin and eosin IFN Interferon IHC Immunohistochemistry IL Interleukin LoSCAT Localised scleroderma cutaneous assessment tool LM Linear morphoea LTBP Latent transforming growth factor beta binding protein Μ Morphoea-affected skin (denoting a sample from skin affected by morphoea) MAC Morphoea in adults and children cohort MAF Minor allele frequency mLoSDI Modified localised scleroderma damage index mLoSSI Modified localised scleroderma severity index MMF Mycophenolate mofetil MMP Matrix metalloproteinase mRSS Modified Rodnan skin score MTX Methotrexate NGS Next-generation sequencing NES Normalised enrichment score

NES Normalised enrichment score NFkB Nuclear factor kappa-light-chain-enhancer of activated B cells ng Nanogram

NLRP3	NACHT, LRR and PYD domains-contain-
	ing protein 3
PANTHER	Protein analysis through evolutionary
	relationships
PCR	Polymerase chain reaction
PDGF	Platelet-derived growth factor
PI	Positional identity
PPAR-γ	Peroxisome proliferator-activated receptor
	gamma
PROVEAN	Protein variation effect analyser
PUVA	Psoralen ultraviolet-A
QC	Quality control
qPCR	Quantitative polymerase chain reaction
QoL	Quality of life
RNA	Ribonucleic acid
RNA seq	RNA sequencing
RT-qPCR	Reverse transcriptase quantitative polymer-
	ase chain reaction
SIFT	Sorting intolerant from tolerant
SNP	Single nucleotide polymorphism
SNV	Single nucleotide variant
SSc	Systemic sclerosis
TGF-β	Transforming growth factor beta
TIMP	Tissue inhibitor of metalloproteinase
TNF-α	Tumour necrosis factor alpha
μL	Microlitre
WES	Whole exome sequencing
WGS	Whole genome sequencing

### Introduction

Morphoea is characterised by fibrosis of the skin and/or underlying connective tissues, with the potential for significant functional and psychological impact. It is suggested that environmental triggers [1–3], occurring in a genetically susceptible individual, underpin the inflammation and deregulated tissue injury response in morphoea [4]. However, precise genetic susceptibility factors, inciting and propagating molecular mechanisms, remain unclear.

Linear morphoea (LM) may follow Blaschko's lines of epidermal development, and hence may represent epidermal somatic mosaicism for a mutation conferring increased risk of disease at specific sites [5–9]. Accordingly, keratinocytederived signals and epidermal-dermal communication pathways vital to normal skin development and wound repair, are also key to pathological skin fibrosis and highly active, proliferative keratinocytes are seen in systemic sclerosis (SSc) [4, 10, 11].

However, LM is a non-congenital and morphologically heterogeneous dermal pathology, potentially suggesting more complex underlying aetiopathogenic mechanisms. Correspondingly, non-linear morphoea subtypes show alternative, but often symmetrical and somewhat predictably patterned skin involvement. As such, dermal fibroblasts have site-specific gene expression, known as positional identity (PI). Many molecular pathways instrumental in developmental patterning, regional-specific mesenchymal differentiation and epidermal fate, such as FGFs, TGF- $\beta$  and Wnt [12, 13], are also involved in pathogenic fibrosis and SSc [14, 15]. Similarly, morphogenic and epidermal–dermal signaling pathways, including Wnt, Hedgehog [14, 16] and Notch [14, 17, 18], are deregulated in fibrosis and SSc [17, 19–23].

Morphoea's morphological heterogeneity, clinical symmetry, patterning and possibly Blaschkoid distribution, may therefore provide clinical clues to potential underlying epidermal and dermal genetic aetiopathogenic and diseasedriving mechanisms [4].

The goals of this study were to identify the presence or absence of primary somatic epidermal genomic variation (as a common single nucleotide variant (SNV), or differing SNVs in a commonly affected gene, across all study samples) in LM, and to explore differential gene expression (DGE) in isolated epidermal and dermal site-matched tissue pairs, to identify potential inciting and pathogenic pathways in the epidermis and dermis. We aimed to correlate our data with the very limited current genetic data in morphoea, to propose a possible genetic and molecular narrative underlying morphoea aetiopathogenesis and hence identify potential future study and therapeutic targets.

#### Methodology

This study was approved by the National Research Ethics Service (London-Hampstead, MREC Reference 6398). Tissue specimens were obtained with written informed consent as part of an ongoing programme of research into the pathogenesis of scleroderma.

#### Specimen source

Patients with LM involving the limb(s) and/or trunk identified from our previously characterised morphoea cohort were eligible for specimen collection [24]. A total of 16 patients were enrolled (Table 1). Details regarding sample selection for each molecular (DNA/RNA) and tissue layer (epidermal/dermal) dataset are described in the Supplemental Methods section.

Paired 4 mm whole skin punch-biopsies were taken from each participant; one or two from morphoea affected (lesional) skin, and one or two from site-matched contralateral unaffected skin. For tissues samples utilised for DNA/ RNA isolation, epidermis was immediately chemically separated from the dermis utilising 3.8% ammonium thiocyanate (Sigma-Alrich USA) in Dulbecco's phosphate-buffered saline pH 7.4 at room temperature for 25 min. Residual epidermal tissue was gently curetted off the superficial dermal surface using a scalpel blade (no. 15) [25].

## DNA isolation, whole genome sequencing and analysis; epidermis

DNA was isolated from paired epidermal tissue and four selected paired samples underwent WGS. All identified genes with SNVs underwent network analysis utilising STRING online database (v11). Identified SNVs were then classified; graded according to disease relevance and subclassified according to MAF (using ExAC) and pathogenicity (according to PolyPhen-2, PROVEAN, SIFT and CADD scores) (Supplemental Methods and Fig. 1).

### RNA isolation, sequencing and analysis; epidermis and dermis

Total RNA was isolated from paired epidermal and dermal tissue, and selected samples underwent RNA-seq. Epidermal and dermal differentially expressed genes (DEG) were further analysed via Gene Set Enrichment Analysis (GSEA), using MSigDB Hallmark gene sets [26, 27]. Enrichment was reported as significant if the false discovery rate (FDR) was less than 0.25 [28] and each GSEA set was ranked according to log2 fold change (log2FC).

For dermal RNA-seq data, further complimentary analysis via PANTHER (PANTHER Gene Ontology (GO)-Slim Biological Process) [29] was completed. An adjusted *P*-value was calculated using Bonferroni correction, with a statistical significance cut-off of < 0.05. STRING database was utilised to review protein–protein interactions between products of particular DEGs of interest. (Supplemental Methods).

#### RT-qPCR and IHC of selected epidermal and dermal gene candidates derived from epidermal RNA-seq

Details can be found in the relevant Supplemental Methods sections.

#### Results

#### Epidermal protein coding single nucleotide variants

861 SNVs were identified in morphoea-affected epidermis, but absent in paired unaffected epidermis. Of these, 119 were protein-coding exonic and 72 nonsynonymous. No single common SNV or commonly affected gene was identified across all four sequenced epidermal tissue pairs.

Study no	Sex, age onset (yrs)	Epidermal WGS	Epidermal/ dermal RNA- seq	Validation studies	Disease status	Biopsy site activity	Site and phenotype biopsied	Cutaneous symptoms	Current treat- ment
1	F, 26	Yes	Epidermal*, dermal	Epidermal RT-qPCR	Stable	Yes	Upper limb; inflammatory, sclerotic	Pruritus, tingling	Topical
2	F, 18		Epidermal		Stable	No	Lower limb; inflammatory, sclerotic	Pruritus	Systemic
3	F, 19	Yes	Epidermal*, dermal	Epidermal RT-qPCR	Active	Yes	Upper limb; inflammatory	Pruritus	Topical
4	F, 19	Yes	Epidermal, dermal		Active	Yes	Upper limb; inflammatory, sclerotic	Tingling	Systemic
5	F, 51		Epidermal		Active	No	Lower limb; atrophic, pigmented	Nil	Nil; treatment naive
6	F, 32		Epidermal		Stable	No	Lower limb; atrophic, pigmented	Pain	Systemic
7	F, 21	Yes; failed sequencing	Epidermal, dermal		Active	Yes	Upper limb; inflammatory, sclerotic	Pruritus, pain	Systemic
8	F, 29	Yes	Epidermal*, dermal	Epidermal RT-qPCR	Active	Yes	Upper limb; inflammatory	Tingling	Systemic
9	F, 54			Epidermal RT-qPCR	Remission	No	Trunk; atrophic, pigmented	Nil	Nil; previous systemic
10	F, 26			Epidermal RT-qPCR	Remission	No	Lower limb; atrophic, pigmented	Pain	Nil, previous topical and systemic
11	F, 45			Epidermal RT-qPCR	Remission	No	Lower limb; atrophic, pigmented	Tingling	Nil, previous systemic
12	F, 12			Whole skin IHC	Active	Yes	Lower limb; pigmented	Pruritus	Topical, systemic
13	M, 8			Whole skin IHC	Stable	No	Sclerotic	Pain	Systemic
14	F, 10			Whole skin IHC	Active	Yes	Upper limb; sclerotic, pigmented	Nil	Systemic
15	F, 32			Whole skin IHC	Active	Yes	Lower limb; pigmented	Pruritus	Topical, systemic
16	F, 14			Whole skin IHC	Active	Yes	Trunk; sclerotic	pruritus, tingling	Topical, systemic

Table 1 Study cohort; experimental studies and clinical characteristic

\*Failed quality control with Beijing Genomics Institute for RNA-seq, alternative epidermal samples for RNA-seq selected (Study No. 2, 5 and 6)

A number of nonsynonymous protein-coding SNVs had high CADD scores (> 20) and pathogenicity rated as damaging or possibly damaging by at least two of PolyPhen-2, PROVEAN and SIFT algorithms, including; *ADAMTS16*, *ADAMTSL1* and *CBX2* (Table 2). STRING network analyses of these variants yielded no noteworthy gene clusters.

#### Disease relevance of epidermal genomic variants

No protein coding nonsynonymous SNVs were graded as very high for disease relevance. Variants in the genes *ADAMTS16* and *ADAMTSL1* were graded as high for disease relevance and Level 1 for potential pathogenicity and rarity. All other protein-coding nonsynonymous variants were graded as medium disease relevance (Table 3).

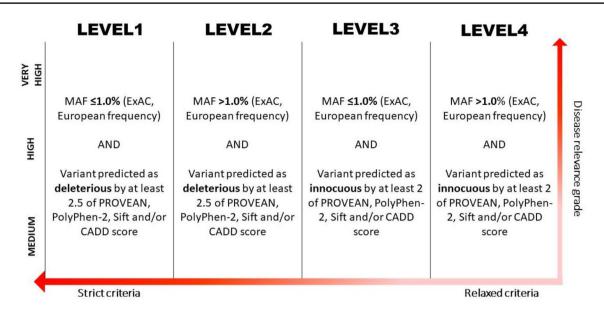


Fig. 1 Classification strategy for disease relevant gene candidates (graded as very high, high or medium according to functional relevance to morphoea aetiopathogenesis; vertical grading) and for path-

ogenicity (according to allele frequency and pathogenicity criteria; horizontal classification ranking)

#### **Epidermal gene expression**

Only three gene transcripts were significantly upregulated, including gene paralogs *SPRR4* (FDR = 0.011, Log2FC 1.266) and *SPRR1B* (FDR = 0.026, log2FC 1.252), and four were significantly downregulated including *LAMA4* (FDR = 0.026, log2FC -1.263) and *PAX8* (FDR = 0.029, log2FC -0.785). Despite FDR > 0.05, *IFI27* (log2FC 1.565) and *WNT2* (log2FC 1.351) were noted with log2FC > 1.

## Epidermal gene signatures; gene set enrichment analysis

Thirty-six Hallmark gene sets had significant enrichment; 16 with positive and 20 with negative enrichment. TNF- $\alpha$ signalling via NFkB (NES = 2.514, FDR = <0.001), TGF- $\beta$ signalling (NES = 2.006, FDR = 0.001) and IL-6/JAKSTAT3 signalling (NES = 1.961, FDR = 0.001) were the most strongly positively enriched (Fig. 2 and Table 4).

#### **Dermal gene expression**

Ninety-three gene transcripts were significantly upregulated, 263 downregulation and 15,206 had nonsignificant differential expression (DE). A number of immunoglobulinrelated genes were amongst the most strongly DEGs [(all FDR < 0.001, log2FC > 2.927). Other genes with significant positive DE included *SFRP4* (log2FC 3.277), *CXCL9* (log2FC 2.709), *COMP* (log2FC 1.664), WNT16 (log2FC 0.742), *CCL2* (log2FC 0.701), *WNT2B* (log2FC 0.576), *NOTCH4* (log2FC 0.500)]; while *MMP7* (log2FC -2.861) and *NR4A1* (log2FC -0.630) were negatively expressed.

#### Dermal gene signatures; gene set enrichment analysis and PANTHER statistical enrichment analysis

Seventeen GSEA Hallmark gene sets were significantly enriched; 9 with positive and 8 with negative enrichment (Fig. 2 and Table 5). Sixteen biological processes were statistically enriched on PANTHER statistical enrichment testing; 7 with positive and 9 with negative enrichment (Fig. 3).

Two distinct gene expression clusters were evident from analyses; inflammatory [GSEA: IFNa response (NES = 1.465, FDR = 0.162) and IFN $\gamma$  response (NES = 1.402, FDR = 0.145), and PANTHER: Humoral immune response (P < 0.001) and Positive regulation of lymphocyte reactivation (P = 0.001) see Table 6], and; profibrotic, morphogenic signatures [GSEA: Epithelial to mesenchymal transition (NES = 1.536, FDR = 0.125) and Angiogenesis (NES = 1.422, FDR = 0.147), as well as nonsignificant positive enrichment of Hedgehog signalling (NES = 1.217, FDR = 0.291), Notch signalling (NES = 0.981, FDR = 0.655) and Wnt signalling (NES = 0.453, FDR = 0.999), and PANTHER: Multicellular organism development (P = 0.007); 434 contributory genes including WNT (WNT16, WNT10B, WNT2B), hedgehog (HHAT, HHATL), disheveled (DVL1, DVL2, DVL3) and frizzled (SMO), HOX (HOXA1a HOXA3, HOXA4, HOXA5, HOXA6, HOXA7, HOXA13, HOXB3, HOXB4, HOXB5,

Gene symbol	Variant	Study participant	PolyPhen-2	PolyPhen-2	PROVEAN	PROVEAN PROVEAN	SIFT	SIFT	CADD score	ExAC European fre- quency (%)
ADAMTS16	p.C1206V	4	0.999	Damaging	- 9.08	Damaging	0	Damaging	30	0
ADAMTSLI	p.A322T	3	666.0	Damaging	-2.78	Damaging	0.005	Damaging	33	0
C6orf15	p.R27Q	8	0.955	Damaging	-3.71	Damaging	0	Damaging	26	0.001522
CACNAID	p.K776R, p.K796R	1	0.023	Benign	-1.91	Neutral	0.064	Tolerated	24	0
CAD	p.E1420K, p.E1483K	1	0.190	Benign	-2.58	Damaging	0.197	Tolerated	27	0
CBX2	p.G367R	8	0.561	Possibly damaging	-2.21	Neutral	0	Damaging	24	0
CBX2	p.G367E	8	0.360	Benign	-1.98	Neutral	0	Damaging	22	0
CNTNAP3	p.G1195R	3	666.0	Damaging	-5.11	Damaging	0.015	Damaging	23	0
CNTNAP3B	p.D281H	1	N/A	NA	N/A	N/A	N/A	N/A	N/A	0
CNTNAP3B	p.V275I	1	0.191	Benign	-0.80	Neutral	0.020	Damaging	6	0
DEF8	p.P71L, p.P131L, p.P121L, p.P192L	1	0.264	Benign	-1.57	Neutral	0.262	Tolerated	24	0
DEF8	p.P71S, p.P131S, p.P121S, p.P192S	1	0.692	Possibly damaging	- 2.60	Damaging	0.029	Damaging	25	0
DENNDIC	p.R515H	б	0.001	Benign	-0.43	Neutral	0.545	Tolerated	7	0
EFCCI	p.A165T	4	0.118	Benign	N/A	N/A	N/A	N/A	22	0
FAM186A	p.T1377P	3	0	Benign	2.78	Neutral	1.000	Tolerated	< <u>-</u>	0
FAM231B	p.S38T	ю	N/A	N/A	N/A	N/A	N/A	N/A	$\sim 1$	2.20
FANI	p.F866S	4	0.007	Benign	-0.79	Neutral	0.457	Tolerated	3	0
GOLGA6B	p.G648D	3	0.017	Benign	1.40	Neutral	1.000	Tolerated	1	0
HCFCI	p.A934T	8	0.995	Damaging	-1.68	Neutral	0.001	Damaging	32	0.0021
HES6	p.R49Q	8	0.737	Possibly damaging	-2.68	Damaging	0.008	Damaging	24	0
HRNR	p.L1722S	8	0	Benign	1.80	Neutral	0.125	Tolerated	2	0.11
HS6ST1	p.V114G	3	0.679	Possibly damaging	0.32	Neutral	0.262	Tolerated	23	26.27
IGSF3	p.660Q, p.R680Q	8	0.345	Benign	-1.71	Neutral	0.095	Tolerated	16	4.97
IMPG2	p.G2386A	4	0.109	Benign	-1.73	Neutral	0.01	Damaging	20	0
KIF21B	p.R1371W, p.R1384W	1	0.993	Damaging	-5.51	Damaging	0.001	Damaging	33	0
KRT8	p.S31A, p.S59A	8	0.001	Benign	0.27	Neutral	1.000	Tolerated	<1	0.03
MSTIL	p.R483C	3	N/A	N/A	N/A	N/A	N/A	N/A	N/A	0.02
MUC12	p.T3428I	8	N/A	N/A	-2.00	Neutral	0.006	Damaging	4	0
MUC20	p.S182G	8	0.475	Possibly damaging	- 0.97	Neutral	0.411	Tolerated	<1	0.03
MUC4	p.I2761V	4	0.001	Benign	-0.12	Neutral	1.000	Tolerated	$\sim$	4.30
MUC5B	p.M2869T	1	0	Benign	1.03	Neutral	1.000	Tolerated	<ul> <li></li> <li><td>15.68</td></li></ul>	15.68
NBPF20	p.D3013E	4	N/A	N/A	N/A	N/A	N/A	N/A	< <u>-</u>	0
		Ţ		4	00 0		.000			1.000

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Table 2 (continued)										
Gene symbol	Variant	Study participant	PolyPhen-2 PolyPhen-2	PolyPhen-2	PROVEAN	PROVEAN PROVEAN SIFT	SIFT	SIFT	CADD score	ExAC European fre- quency (%)
NOSIAP	p.A31V, p.A321V, p.A326V	3	0.511	Possibly damaging	-2.35	Neutral	0.017	Damaging	30	0.00301
NR2F2	p.Y179S, p.Y159S, p.Y312S	4	0.944	Damaging	-7.31	Damaging	0	Damaging	24	0
OR11H12	p.W68R	8	0	Benign	2.67	Neutral	0.475	Tolerated	< <u>-</u>	0.001648
OR2T6	p.G151S	1	0.971	Damaging	-1.61	Neutral	0.032	Damaging	23	0.001502
PACSI	p.Q35P	8	N/A	N/A	0.02	Neutral	0.364	Tolerated	~~~	0.06
PARG	p.R377W, p.R403W, p.R485W	8	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
PAX2	p.Q255R, p.Q286R, p.Q278R	4	0.104	Benign	- 1.49	Neutral	0.149	Tolerated	14	0
PAX3	p.G15D	1	0.025	Benign	-1.37	Neutral	0.002	Damaging	24	0
PAX3	p.G15D	1	0.001	Benign	0.05	Neutral	0.251	Tolerated	22	0.006088
PRAMEF10	p.N459T	3	0	Benign	-1.45	Neutral	0.254	Tolerated	<1	0.007823
PRAMEF6	p.N381T	8	0	Benign	1.42	Neutral	1.000	Tolerated	<1	0
PRAMEF6	p.S375N	8	0.996	Damaging	-2.22	Neutral	0.017	Damaging	4	0
PRDM9	p.T713R	4	0.513	Possibly damaging	-4.51	Damaging	0.001	Damaging	23	0.001675
RFPL4A	p.V179E	1	0.018	Benign	1.37	Neutral	0.910	Tolerated	<1	17.13
RGPD5;RGPD8	p.R952S	3	0	Benign	2.33	Neutral	1.000	Tolerated	<1	0
RMDN3	p.K285R	1	N/A	N/A	N/A	N/A	N/A	N/A	N/A	N/A
RYRI	p.D1377E	3	0.231	Benign	-2.08	Neutral	0.193	Tolerated	23	0
SAA2; SAA2-SAA4	p.S156	8	0	Benign	2.70	Neutral	1.000	Tolerated	5	0
SDR39U1	p.D115Y, p.D89Y, p.D197Y	8	1.000	Damaging	-8.85	Damaging	0	Damaging	32	0
SGIP1	p.G427R, p.G431R	8	0.999	Damaging	-2.06	Neutral	0.031	Damaging	25	0
SLC17A7	p.F8V	1	0.002	Benign	-0.53	Neutral	0.610	Tolerated	14	0
SMGI	p.I612K	8	0	Benign	-3.00	Damaging	0.028	Damaging	17	3.57
SPATA31D1	p.A192P	3	0	Benign	3.61	Neutral	1.000	Tolerated	<1	0.004496
SPTBNI	p.R1741H, p.R1754H	3	0.987	Damaging	-4.60	Damaging	0.001	Damaging	31	0
SYNEI	p.V5268I, p.V5339I	1	0.006	Benign	0.36	Neutral	1.000	Tolerated	13	0
TBCID3B;TBCID3D;TBCID 3G;TBCID3H;TBCID3I;TB CID3L	p.1117T	c	0.349	Benign	N/A	N/A	N/A	N/A	6	0
TBCID3D;TBCID3H;TBCID3I p.R399W	p.R399W	3	0	Benign	N/A	N/A	N/A	N/A	12	0
TCP10	p.A256S	1	0	Benign	0.69	Neutral	0.807	Tolerated	~	5.39
TCP10	p.R262W	8	0.035	Benign	0.52	Neutral	0.078	Tolerated	12	0.66
TNS3	p.S120Y	8	0.997	Damaging	- 3.34	Damaging	0	Damaging	31	0
UFSP2	p.E440K	8	0.074	Benign	- 1.13	Neutral	0.244	Tolerated	24	0
URBI	p.H967Y	1	0.469	Possibly damaging	- 0.49	Neutral	0.050	Damaging	25	0
USP22	p.F428S	3	0.998	Damaging	- 7.53	Damaging	0	Damaging	34	0

Gene symbol	Variant	Study		PolyPhen-2 PolyPhen-2	PROVEAN	PROVEAN PROVEAN SIFT SIFT	SIFT SIF		CADD score ExAC
		participant	t						European fre- quency (%)
WWC3	pQ827K	1	0.108	Benign	-0.73	Neutral	0.421 Tolerated 19	stated 19	0
ZNF608	p.S1287L	1	0.716	Possibly damaging	- 1.31	Neutral	0.011 Dar	0.011 Damaging 23	0.001498
ZNF614	p.I201T	ŝ	0.005	Benign – 1.24	-1.24	Neutral	0.275 Tol	0.275 Tolerated < 1	0
ZNF705E	p.Q67R	4	N/A	N/A	N/A	N/A	N/A N/A	N/A	0
ZNF862	p.R923K	4	0.001	Benign	0.35	Neutral	0.463 Tol	0.463 Tolerated <1	0
ZP3	p.s264P	4	0	Benign	0.71	Neutral	1.000 Told	1.000 Tolerated <1	54.05

HOXB6, HOXB7, HOXC4, HOXC6, HOXC13) and PAX (PAX3, PAX6, PAX8)] (Fig. 4).

Many HOX, PAX, SOX and CBX genes were impacted across all three epidermal/dermal and genomic/transcriptomic datasets (Fig. 5).

Thirty-two members of the ADAM, ADAMTS and ADAMTSL super-family were nonsignificantly DE in the dermis (13 downregulated and 19 upregulated) and 12 in the epidermis (6 upregulated and 6 downregulated). Overall, 50 ADAM/ADAMTS-family genes were affected across all three datasets, including the potentially highly pathogenic (according to criteria described in Fig. 1) nonsynonymous SNVs in *ADAMTS16* and *ADAMSTL1* (Fig. 6).

# Candidate genes and pathways based on epidermal genomic and epidermal and dermal transcriptomic profiles

Based on the WGS and RNA-seq results, a number of gene candidates were selected; some for further study. Selected epidermal candidate genes included *ADAMTS16*, *ADAMTSL1* and the inflammatory and profibrotic *TGF-\beta1* and *JUNB*. Selected dermal candidates included members of some developmental and morphogenic signaling pathways; *SFRP4*, *SIX1*, *WNT2* and *NOTCH4*. Key characteristics of these genes and justification for their selection as candidates are detailed in Table 7.

## RT-qPCR and immunohistochemistry validation of selected epidermal and dermal gene candidates

Two key candidate genes were validated by RT-pPCR in this study; TGF- $\beta$ 1 and JUNB. These were from the strongly over-expressed and highly disease-relevant TGF- $\beta$  signaling gene set. *TGF-\beta1* is the recognised orchestrator of fibrosis and the role of its epidermal production and expression have not been specifically investigated in morphoea. *JUNB* is also a key player in TGF- $\beta$  signaling and hence with its relatively high log2CPM, *JUNB* was selected as the second validation candidate, keeping both genes for qPCR from the TGF- $\beta$  signaling gene set (NES = 2.006, FDR = 0.001).

Expression of TGF- $\beta$ 1 and JUNB was higher in morphoea affected epidermis compared to the contralateral sitematched unaffected epidermis in all samples, but this trend was not significant (TGF- $\beta$ 1; P=0.476, JUNB; P=0.105, Fig. 7).

WNT2 was selected for validation via IHC on formalinfixed, wax-embedded paraffin whole skin sections. WNT2 was highlighted by dermal transcriptomic profiling, subsequent pathway analysis and is a member of the developmental morphogenic pathways which are of particular relevance to the anatomical patterning in morphoea and its

Table 3         Potential gene candidates from epidermal whole genome sequencing as selected by network analyses and disease relevance; graded by
potential relevance to morphea pathogenesis, and sub-categorised by Level, based on potential pathogenicity

Disease/ functional rel- evance grade	Level 1	Level 2	Level 3	Level 4	Non-coding variants
Very high					CCL5, FGF9, HBEGF, SMAD4, SMAD6
High	ADAMTS16, ADAMTSL1				ACTN4, ADAM9, ADAMTS14, ADAMTS6, DTX2, FLRT2, ITGB1, LTBP1, MAP3K7, MAP3K13, MTOR, NANOG, NFE2L2, PIAS1, PIK3CA, POU5F1, PTEN, RB1CC1, ROCK1, SPRTN
Medium	C6orf15, CBX2 (p.G367R), HES6, CNTNAP3, DEF8*, HCFC1, NDST2, NOS1AP, NR2F2, OR2T6, PRDM9, SDR39U1, SGIP1, SMG1, SPTBN1, TNS3, URB1, USP22, ZNF608		CAD, CBX2 (G367E), CNTNAP3B, DEF8 <sup>°</sup> , DENNDIC, EFCCI, FAM186A, FAN1, GOGLA6B, HRNR, MUC4, MUC20, NBPF20, OR11H12, PACS1, PARG, PAX2, PAX3, PRAMEF10, PRAMEF6, RGPDS;RGPD8, RYR1, SAA2;SAA2-SAA4, SLC17A7, SPATA31D1, SYNE1, TBC1D 3B;TBC1D3D;TBC1D3G;TB C1D3H;TBC1D31;TBC1D3L, TBC1D3D;TBC1D3H;TBC1D3I, WWC3, ZNF614, ZNF705E, ZNF862	FAM231B, HS6ST1, MST1L, MUC5B, MUC12, RFP44A, ZP3	ATR, BCL2L11, BMF, CBL, CRTAP, CTBP2, EHMT1, EPS1SL1, ERBIN, FBX027, FBXW8, GNAQ, IGF1, IGF2, MAG11, MAG13, MOB1A, MOB1B, NEURL, VCL, VPS37C

\*p.P71S, p.P131S, p.P121S, p.P192S; ^p.P71L, p.P131L, p.P121L, p.P192L

pathogenesis. Of note, *WNT2* was also highlighted by epidermal RNA-seq.

In the dermis, *WNT2* was the only Wnt signaling gene with log2FC > 1.5 (log2FC = 1.79), its FDR approached significance (FDR = 0.061), it was a leading edge gene (highest ranked) within the positively enriched Notch signaling Hallmark gene set within dermal GSEA data and was also present within the significantly enriched Multicellular organism development gene set (PANTHER GO-Slim Biological Process; P = 0.007).

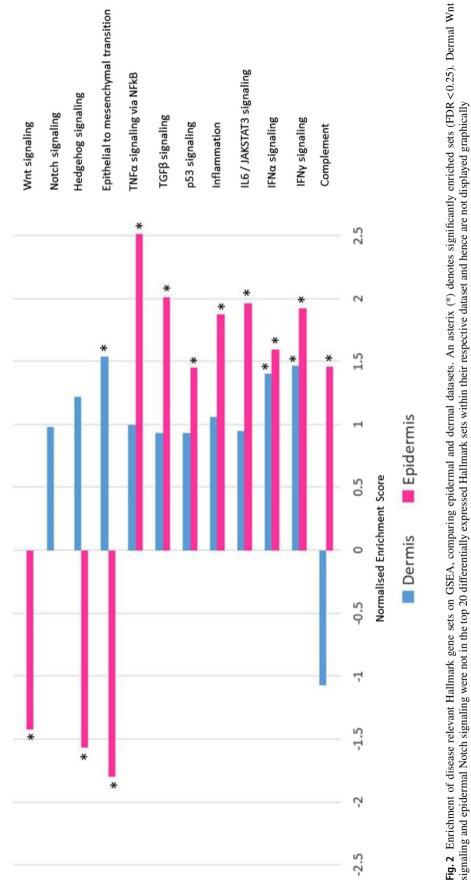
*WNT2* staining demonstrated discernible staining differences between morphpea-affected and unaffected control skin in both epidermis (4 of 5) and dermis (3 of 5) (Fig. 8).

#### Discussion

In this study, WGS did not identify a single common somatic mutation occurring in all four epidermal samples taken from LM-affected skin, or a commonly affected gene across all study samples. To our knowledge, this is the first study to investigate the presence of primary genomic variation in morphoea skin. This critical finding provides robust evidence against primary genomic epidermal segmental mosaicism-related aetiology in adult-onset LM. There are several clinical complexities of LM supporting more multifaceted aetiopathogenesis. LM may not be truly Blaschkoid [8], morphoea is a dermal pathology, has vast clinical heterogeneity with complex patterning and morphology [4, 30] and is not congenital.

Accordingly, we identified 861 epidermal SNVs, including 119 protein-coding variants, many with medium to high disease relevance and potential pathogenicity, providing possible support for complex polygenic epidermal mosaicism in LM [31, 32].

The ADAM/ADAMTS-family genes were widely affected across all three datasets, including potentially highly pathogenic nonsynonymous SNVs in *ADAMTS16* and *ADAMSTL1*, possibly pointing to their pathogenic role in morphoea. These proteins/proteases are ECM-regulators implicated in embryological morphogenesis, skin development, wound healing, fibrosis [33–36], rare primary fibrotic



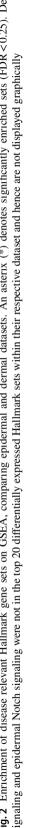


 Table 4
 Epidermal RNA sequencing: Hallmark gene sets with significant positive or negative enrichment on GSEA, listed by NES

Hallmark gene set	NES	FDR
Positively enriched sets		
TNF-α signaling via NFkB	2.514	< 0.001
TGF-β signaling	2.006	0.001
IL-6/JAKSTAT3 signaling	1.961	0.001
IFNa response	1.942	0.001
Inflammatory response	1.874	0.002
Androgen response	1.821	0.002
Early estrogen response	1.800	0.003
Protein secretion	1.664	0.009
IFNy response	1.591	0.014
Heme metabolism	1.564	0.016
KRAS signaling ↑	1.515	0.022
Complement	1.456	0.032
p53 pathway	1.451	0.031
Late estrogen response	1.438	0.032
Apoptosis	1.268	0.109
mTOR-C1 signaling	1.178	0.191
Negatively enriched sets		
E2F targets	-2.596	< 0.001
G2M check point	-2.375	< 0.001
Myogenesis	-1.800	0.005
Epithelial to mesenchymal transition	-1.796	0.005
MYC targets-V2	-1.754	0.006
Angiogenesis	-1.732	0.006
KRAS signaling $\downarrow$	-1.724	0.006
MYC targets-V1	-1.671	0.010
Glycolysis	-1.606	0.017
Apical surface	-1.581	0.020
DNA repair	-1.580	0.018
Hedgehog signaling	-1.571	0.018
Spermatogenesis	-1.506	0.030
Нурохіа	-1.497	0.030
Wnt-β-catenin signaling	-1.424	0.054
Mitotic spindle	-1.298	0.141
Apical junction	-1.268	0.167
Coagulation	-1.267	0.159
Oxidative phosphorylation	-1.205	0.232
Xenobiotic metabolism	-1.189	0.245

genetic disorders [37, 38], SSc and keiloidal morphoea [39, 40]. Using site-matched tissue-pair methodology, Badshah et.al. recently demonstrated upregulated *ADAMTS8* in LM fibroblasts and whole-skin, hypothesising *ADAMTS8*'s role in tissue atrophy [41]. Whilst links between the ADAMTS/

 Table 5
 Dermal RNA sequencing: Hallmark gene sets with significant positive or negative enrichment on GSEA, listed by NES

Hallmark gene set	NES	FDR
Positively enriched sets		
Bile acid metabolism	1.617	0.095
Adipogenesis	1.699	0.098
Epithelial to mesenchymal transition	1.536	0.125
Xenobiotic metabolism	1.464	0.131
Cholesterol metabolism	1.389	0.136
IFNy response	1.402	0.145
Angiogenesis	1.422	0.147
IFNa response	1.465	0.162
Peroxisome	1.292	0.227
Negatively enriched sets		
Androgen response	-1.760	0.052
Oxidative phosphorylation	-1.675	0.071
Early estrogen response	-1.539	0.071
Protein secretion	-1.549	0.075
MYC targets, V1	-1.571	0.076
KRAS signaling (down)	-1.574	0.094
G2M checkpoint	-1.592	0.108
Late estrogen response	-1.468	0.113

ADAMTSL's and their precise functions in morphoea are unclear, their possible role in LM is further supported by our findings.

Corroborating the potential key role of the epidermis in morphoea pathogenesis, we demonstrated a structurally active, proliferative and differentiating epidermis, with significant overexpression of *SPPRs, PALLD, WNT2*, other cell cycle/cell division (such as p53 and KRAS signalling) and apoptosis-related gene pathways, along with significant down-regulation of checkpoint and DNA repair-related genes (such as G2M DNA checkpoint and E2F targets) (Fig. 9).

We also demonstrated an inflammatory and profibrotic epidermal gene signature, which corresponds to the early inflammatory and profibrotic disease phases previously mapped by blood cytokine profiles [42–46]. A Th1 response (IL-2, TNF- $\alpha$  and IL-6) seen in the first year, is followed by a Th17 response (*IL-1, IL-17, IL-22* and *TGF-\beta*) and Th2 cytokines (*IL-4* and *IL-13*) [47]. Accordingly, the three Hallmark gene sets with the strongest significant positive enrichment in this study were TNF- $\alpha$  signalling via NFkB, TGF- $\beta$ signalling and IL-6/JAKSTAT3 signalling; all suggesting early active inflammatory and fibrotic phase disease (Fig. 9). This was despite study samples being from LM of at least

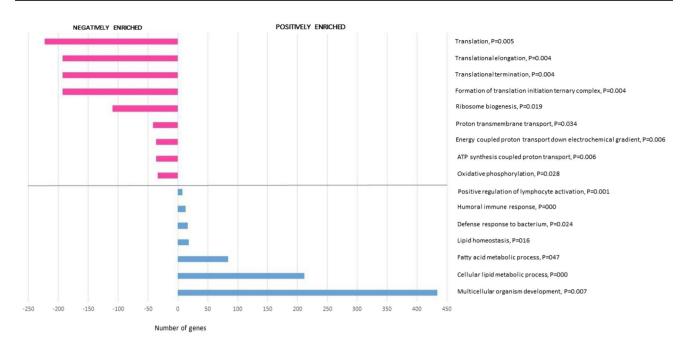


Fig. 3 PANTHER Gene Ontology biological processes with significant positive and negative enrichment according to PANTHER enrichment test (Bonferroni correction, adjusted P-values listed next to biological process name)

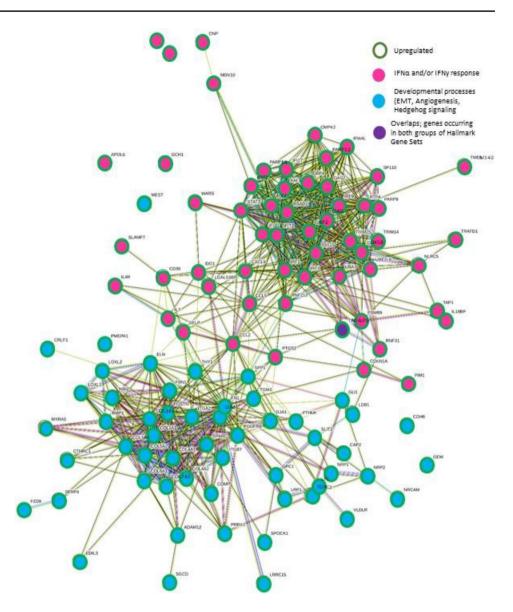
Table 6 Dermal RNA sequencing: transcripts contributing to the three key selected positively enriched PANTHER GO-Slim Biological Processes (multicellular organism development, humoral immune response and positive regulation of lymphocyte activation) with significant upregulation

Gene symbol	Description	FDR	Log2FC	Log2CPM
IGHG2	Immunoglobulin heavy constant gamma 2 (G2m marker)	< 0.001	5.508	4.426
IGHG1	Immunoglobulin heavy constant gamma 1 (G1m marker)	< 0.001	5.162	7.118
IGLC2	Immunoglobulin lambda constant 2	< 0.001	4.302	4.821
IGHG4	Immunoglobulin heavy constant gamma 4 (G4m marker)	0.037	4.112	2.760
IGHM	Immunoglobulin heavy constant mu	< 0.001	4.027	5.798
IGHA1	Immunoglobulin heavy constant alpha 1	< 0.001	3.794	6.702
IGLC3	Immunoglobulin lambda constant 3 (Kern-Oz marker)	< 0.001	3.215	4.507
IGHA2	Immunoglobulin heavy constant alpha 2 (A2m marker)	< 0.001	2.927	4.098
CXCL9	C-X-C motif chemokine ligand 9	< 0.001	2.709	3.880
SULF1	Sulfatase 1	< 0.001	0.976	5.124
WNT10B	Wnt family member 10B	0.024	0.895	2.714
WNT16	Wnt family member 16	0.001	0.742	5.145
COL14A1	Collagen type XIV alpha 1 chain	0.003	0.723	7.332
TENM4	Teneurin transmembrane protein 4	0.032	0.668	5.754
JCAD	Junctional cadherin 5 associated	0.028	0.655	6.112
NREP	Neuronal regeneration related protein	0.017	0.613	5.547
WNT2B	Wnt family member 2B	0.048	0.576	5.703
SULF2	Sulfatase 2	0.006	0.546	7.069

3-years duration and not all demonstrating an inflammatory clinical phenotype; supporting an ongoing disease-driving role of the epidermis.

Importantly, in recently published work evaluating transcriptomic whole-skin profiles of pediatric-onset morphoea, healthy controls, active and inactive disease were compared, and JAK/STATs were highlighted as the most prevalent DE pathway [48]. By separating the epidermis and dermis, we have highlighted that this signature may originate from the epidermis, promoting ongoing dermal disease activity. These findings provide further support for future studies to better elucidate precise pathogenic JAK/STAT-related mechanisms

Fig. 4 Interactions between leading edge genes within inflammatory gene sets IFN-signaling ( $\alpha$  and  $\gamma$ ), and developmental related gene sets of epithelial to mesenchymal transition, Angiogenesis and Hedgehog signaling, demonstrating clustering and inter-pathway interactions. Default STRING criteria used: nodes linked by evidence, with medium confidence level of 0.4



in morphoea and the use of therapeutic JAK-inhibitors in sclerotic skin disease [49].

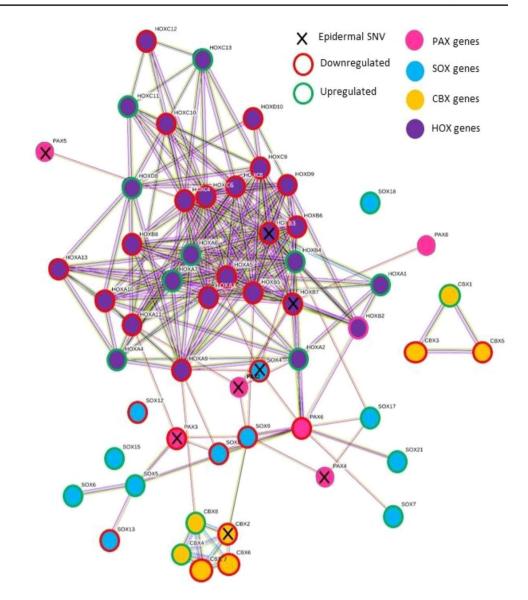
Finally, the epidermal molecular picture was also that of a 'wounded epidermis', similar to the epidermal phenotype demonstrated in SSc [10, 50, 51]. *TGF-* $\beta$  is a key orchestrator of wound healing responses, also propagating pathological fibrosis [52]. Isolating a strongly enriched *TGF-* $\beta$ signature in morphoea epidermis is unique, significant, and could provide impetus for further study of local *TGF-* $\beta$ inhibition in appropriate clinical scenarios of superficial disease (e.g. with pirfenidone) [53]. However, precisely whether these signals are originating in the epidermis, or due to secondary unchecked positive feedback from the dermis, remains unclear.

Relevantly, epidermal *IF127* was upregulated (nonsignificant, but with the dataset's highest log2FC). It is known to induce IFN $\gamma$ -related epidermal apoptosis. We saw significant upregulation of the epidermal Apoptosis gene set, and epidermal and dermal IFN $\alpha$  and IFN $\gamma$ responses. IFN-signalling has been widely implicated in SSc and morphoea [11, 48, 54]. IFN $\gamma$ -related chemokines and their receptors may stimulate fibroblasts, including in morphoea [46, 48, 55]. *CXCL9* was significantly upregulated in morphoea dermis in our study, and it has previously been suggested as a disease biomarker [46, 55].

Importantly, *IF127* negatively regulates *NR4A1* [54], which was significantly downregulated in the dermal dataset. In turn, *NR4A1* is an endogenous *TGF-* $\beta$  inhibitor [56]. Fibrotic diseases appear to utilise this *NR4A1*-dependent mechanism to enable persistent *TGF-* $\beta$  signaling and deregulated fibrosis and *NR4A1* agonists inhibit laboratory-induced fibrosis of the skin, lung, liver, and kidney in mice [56, 57].

Clues to another potential inciting epidermal 'damage' signal in morphoea lie in the significant downregulation of

Fig. 5 STRING network diagram demonstrating multiple strong and overlapping interactions between PAX, HOX, SOX and CBX genes with protein or non-protein coding epidermal SNVs on WGS and/ or differential epidermal or dermal expression on RNA-seq. Nodes linked by evidence with medium confidence level of 0.4 (default STRING criteria)



*LAMA4*. Laminins are extracellular matrix (ECM) glycoproteins involved in differentiation, cell adhesion, signaling, migration, and form a key non-collagen component of the dermo-epidermal junction (DEJ) [54]. Related DEJ disruption could plausibly enhance epidermal-dermal communication and/or act as an initiating 'damage' signal, inciting proinflammatory and profibrotic dermal responses. Correspondingly, *LAMA4*-deficiency has been linked to cardiac [58–60] and renal fibrosis [61].

Individual dermal-genes demonstrated far greater DGE compared to the epidermis, suggesting dermal factors are more disease-specific in morphoea; in keeping with its predominantly dermal pathology. Two distinct DGE clusters were identified; inflammatory and profibrotic. The inflammatory signature, with significant upregulation of Humoral immunity, Lymphocyte activation and IFN-response-related genes, validates and adds to the limited morphoea gene expression data currently available [11, 48, 62]. This corroborated over-expression of IFN-signalling has an immediate foreseeable opportunity for potential therapeutic exploitation via anifrolimab, FDA-approved for systemic lupus erythematosus. Interestingly, KRAS-signalling has been identified as a potential biomarker for disease activity [48]. We demonstrated significant downregulation of inhibitory KRASsignalling in the dermis and upregulated KRAS-signalling in the epidermis also. All our cases had disease activity as demonstrated by LoScAT-activity scores of greater than zero (progressive or stable disease activity) (Tables 1, 4 and 5).

In the profibrotic DGE cluster, upregulated genes involved in embryogenesis and oncogenesis was seen such as Wnt, Hedgehog, dishevelled, frizzled family, HOX and PAX. PAX and HOX genes were specifically highlighted by PANTHER pathway analysis of dermal RNA-seq data. These families of biologically and functionally related developmental genes

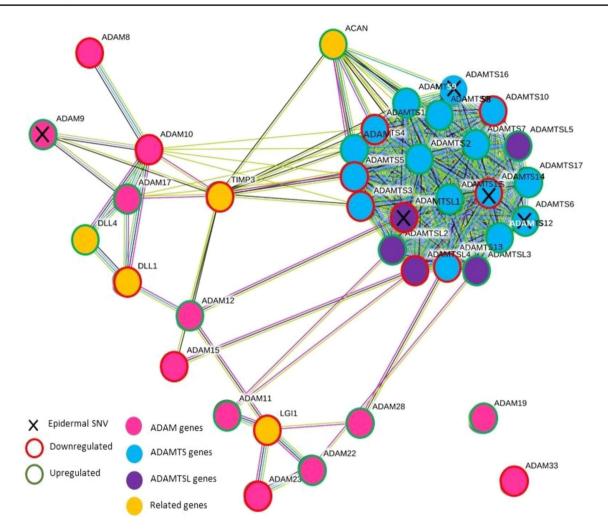


Fig.6 STRING network diagram of all ADAM, ADAMTS and ADAMTSL proteases with epidermal SNVs and/or epidermal and/or dermal differential RNA expression. Nodes linked by evidence, with medium confidence level of 0.4 (default STRING criteria). Further

were collectively impacted in all three data sets (epidermal WGS, epidermal RNA-seq and dermal RNA-seq). HOX genes are the key orchestrating genes involved in fibroblast PI [12, 13, 63–65]. Related location-specific gene signatures confer developmental patterning, position and help determine downstream differentiation of site-specific mesenchymal cells [13, 66]. The genetic origin of fibroblasts can also alter their crosstalk with overlying keratinocytes [67]. Several HOX genes have shown significant DE in affected SSc-skin compared to unaffected skin [68] and related SOX genes have also been implicated in fibrosis and SSc [23, 69]. Accordingly, one can deduce the feasible role HOX and related developmental and patterning genes could play in morphoea aetiopathogenesis and observed clinical patterning of non-linear subtypes. Indeed, their involvement in 'dermal mosaicism' has been suggested.

genes with strong links to the ADAM, ADAMTS and/or ADAMTSL proteins were also included (via STRING extended analysis); two of which were the 'delta like canonical notch ligands' (1 and 4); linking the ADAM, ADAMTS and ADAMTSL proteins, to notch signalin

It is also suggested that via its regulation of dermal development, epidermal Wnt- signalling could account for the Blaschkoid distribution of dermal dermatoses, including Focal Dermal Hypoplasia [70]. Twelve Wnt-signalling genes contributed to the upregulation of the GO-Slim Biological Process of Multicellular organism development; WNT2B, WNT10B and WNT16 with significant DE. WNT2 was significantly upregulated in the epidermis, approached significance in the dermis (FDR = 0.061) and both these RNA-seq results were validated with IHC whole skin staining. Correspondingly, WNT2, WNT3A and  $\beta$ -catenin have previously demonstrated increased activity via IHC staining in both SSc and morphoea [71] and the role of Wnt-signalling in morphoea is established [20, 55, 71–75]. Dermal SFRP4 was also significantly upregulated and recent data demonstrated the upregulation of SFRP2 in morphoea dermal fibroblasts [55]. SFRPs are homologous to the Wnt-binding site on

 Table 7
 Descriptive and statistical characteristics of selected gene candidates in epidermal and dermal tissue

Gene symbol	Description	FDR	Log2FC	Log2CPM	Notes/data related Justification
Epidermal car	ndidates				
ADAMTS16	ADAM Metallopeptidase With Thrombospondin Type 1 Motif 16	N/A	N/A	N/A	WGS data: Novel variant Denoted deleterious by PolyPhen2,PROVENA and SIFT scores. CADD score 33 Only variants graded as High and subcategorised as Level 1 for disease relevance and pathogenicity Known links to fibrosis
ADAMTSL1	ADAMTS Like 1	N/A	N/A	N/A	WGS data only: Novel variant Denoted deleterious by PolyPhen2,PROVENA and SIFT scores. CADD score 30 Only variants graded as High and subcategorised as Level 1 for disease relevance and pathogenicity Known links to fibrosis
LAMA4	Laminin subunit alpha 4	0.026	- 1.26	2.21	RNA-seq data: Significant FDR, log2FC <-1 Known links to fibrosis in other organs Plausible involvement in epidermal-dermal interactions in pathogenic mechanisms
IFI27	Interferon Alpha Inducible Protein 27	0.952	1.565	5.721	Only epidermal transcript with log2FC > 1.5 Epidermal GSEA, Hallmark gene set leading edge gene: IFN $\alpha$ signaling (NES = 1.924, FDR = 0.0011) IFN $\gamma$ signaling (NES = 1.591, FDR = 0.014) Plausible epidermal early 'damage' signal, with links to downregulation of NR4A1
TGF-β1	Transforming Growth Factor Beta 1	0.990	-0.036	5.362	Key initiator and mediator of fibrosis Epidermal expression never specifically investigated in morphoea Overall signaling (TGF-β signaling Hallmark set) strongly positively enriched via GSEA analysis (NES = 2.006, FDR = 0.001)
JUNB	JunB Proto-Oncogene, AP-1 Transcription Factor Subunit	0.952	0.424	7.939	Relatively high log2CPM of 7.939 Epidermal GSEA, Hallmark gene set leading edge gene in TGF- $\beta$ signaling Hallmark set (NES = 2.006, FDR = 0.001)
PAX3	Paired box gene 3	N/A	N/A	N/A	Epidermal WGS: nonsynonymous protein coding deleterious SNV Links to epidermal upregulation of PAX8 as well as many other PAX, HOX, SOX and CB2 genes in both epidermal and dermal datasets; many with links to fibrosis and SSc
Dermal candi SFRP4	dates Secreted Frizzled Related Protein 4	< 0.001	3 277	5.582	Frizzled related protein with significant
<i>Sr Kr</i> 4	Secreted Frizzied Kelated Protein 4	< 0.001	3.211	3.382	<ul> <li>Frizzled related protein with significant differential expression and log2FC &gt; 3</li> <li>Dermal GSEA, Hallmark gene set leading edge gene:</li> <li>Epithelial to mesenchymal transition (NES = 1.536, FDR = 0.125), highest ranked leading edge gene</li> </ul>
				2.529	-00-0

Gene symbol	Description	FDR	Log2FC	Log2CPM	Notes/data related Justification
WNT2	Wnt Family Member 2	0.061	1.793	2.283	Only Wnt signaling with log2FC > 1.5 Differential expression approaching significance Dermal GSEA, Hallmark gene set leading edge gene: Notch signaling, top 20 positively enriched sets (NES = 0.980, FDR = 0.655), highest ranked leading edge gene PANTHER statistical enrichment test: Present within the significantly enriched Multicellular organism development gene set (PANTHER GO-Slim Biological Process), P = 0.007
NOTCH4	Notch Receptor 4	0.008	0.500	5.631	Only significantly differentially expressed NOTCH gene Relatively high log2CPM
NR4A1	Nuclear Receptor Subfamily 4 Group A Member 1	0.003	-0.63	4.81	Significant dermal downregulation Downregulated by IFI27 (see above) Endogenous regulator of TGF-β1 signaling and known involvement in fibrotic processes
CXCL9	C-X-C Motif Chemokine Ligand 9	< 0.001	2.71	3.88	Inflammatory IFN response related gene with significant and strong differential expression Dermal (and epidermal) GSEA, Hallmark gene set leading edge gene: Contribution to the leading edge gene profile for IFNγ signaling in both the dermis and epidermis Suggested as a biomarker in morphoea
CCL2	C-C Motif Chemokine Ligand 2	0.034	0.7	4.34	Inflammatory IFN response related gene with significant differential expression Dermal (and epidermal) GSEA, Hallmark gene set leading edge gene: Contribution to the leading edge gene profile for IFNγ signaling in both the dermis and epidermis Over-expressed amongst morphoea patients included in the Milano et al. 'intrinsic gene subset' scleroderma study and has been isolated to dermal macrophages in morphoea

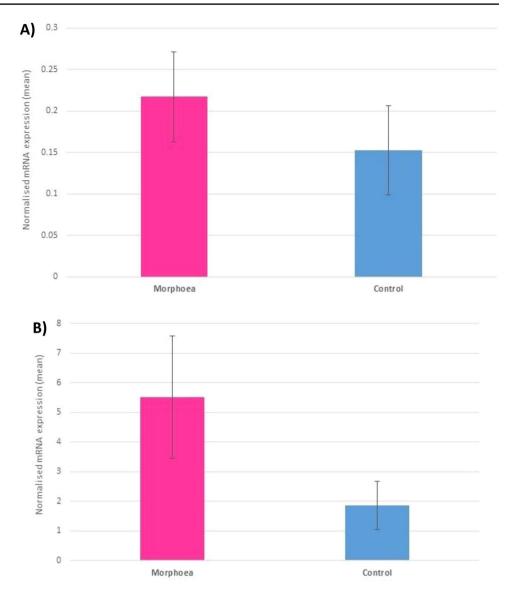
frizzled proteins and, therefore, modulate Wnt-signalling via direct interactions [54]. Interestingly, *SFRP4* expression in the myocardium is associated with an apoptotic-related gene expression profile [54], feasibly associating its overexpression in morphoea to a disease-related damage signal.

Limitations of this study include its cross-sectional nature, small datasets and limited validation of transcriptomic data. It is also impossible to differentiate primary from secondary gene expression changes or to adjust for treatment effect.

In summary, despite the often assumed Blaschkoid distribution of LM, data from this study indicate the absence of a single epidermal developmental somatic mutation responsible for disease causation. Instead, this study's molecular (genomic and transcriptomic) and tissue (epidermis and dermis) layered approach highlights possible polygenic epidermal mosaicism in initiating a complex multicomponent disease aetiopathogenesis. A wounded epidermal phenotype could, perhaps via Wnt-signalling, depletion of NR4A1 and other complex tissue layer crosstalk, contribute to the consequent inflammatory dermal fibrosis of morphoea, with its variable patterning possibly explained, at least in part, by the involvement of HOX, SOX, PAX and WNT developmental patterning genes (Fig. 9).

Supplementary Information The online version contains supplementary material available at https://doi.org/10.1007/s00403-023-02541-5.

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Author contributions All authors contributed to the study's conception and design. Material preparation, data collection and analysis were performed by AS, AG, GO, DK, CD and DA. The first draft of the manuscript was written by AS and all authors commented on previous versions of the manuscript. All authors read and approved the final manuscript.

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**Data availability** The data that support the findings of this study are available upon reasonable request to the corresponding author, after validation by co-authors.

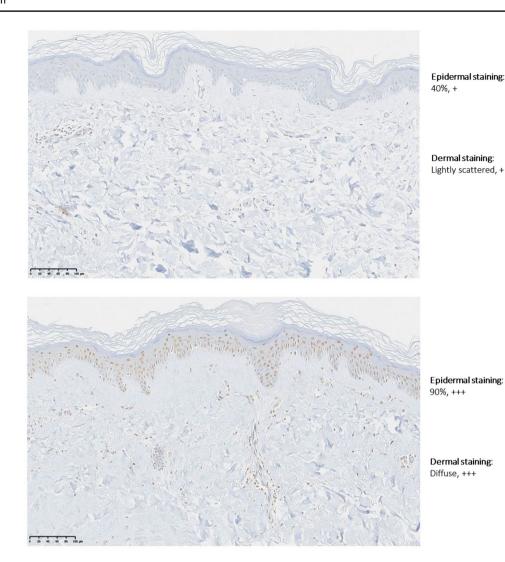
#### Declarations

**Conflict of interest** AMS: has received honoraria from UCB outside the submitted work. DK: nil. GWO: nil. AG: nil. DJA: nil. CPD: reports personal fees or research grants to his institution from GlaxoSmithKline, Galapagos, Boehringer Ingelheim, Roche, CSL Behring, Corbus, Horizon, and Arxx Therapeutics outside the submitted work.

**Ethics approval** This study was approved by the National Research Ethics Service (London-Hampstead, MREC Reference 6398). Tissue specimens were obtained with written informed consent as part of an ongoing programme of research into the pathogenesis of scleroderma.

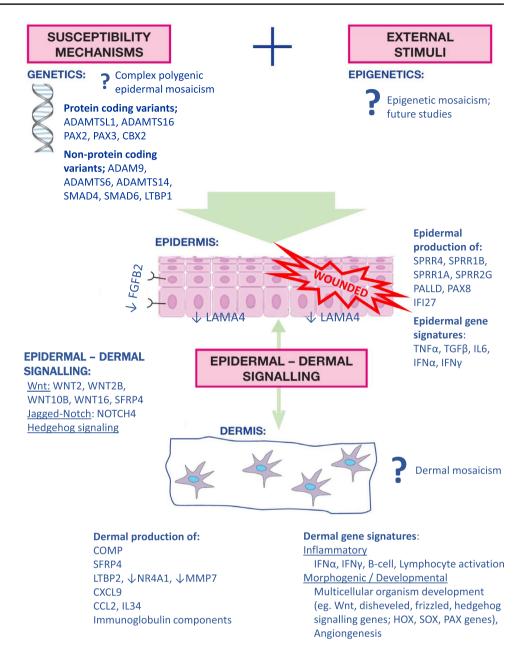
**Informed consent** Written informed consent to participate in the study and publication was obtained from all participants.

**Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, **Fig. 8** High power images of immunohistochemical staining with WNT2 antibody; unaffected control skin (above) and morphoea affected contralateral site-matched skin (below); study participant 15



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included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons. org/licenses/by/4.0/. **Fig. 9** Multicomponent morphea etiopathogenesis; summary of key epidermal and dermal genes involved in morphea, as highlighted by NGS of paired epidermal and dermal tissue samples in this study



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