### **RESEARCH ARTICLE**

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# A comparative analysis of the intrauterine transcriptome in fertile and subfertile mares using cytobrush sampling



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### **Abstract**

**Background:** Subfertility is a major problem in modern horse breeding. Especially, mares without clinical signs of reproductive diseases, without known uterine pathogens and no evidence of inflammation but not becoming pregnant after several breeding attempts are challenging for veterinarians. To obtain new insights into the cause of these fertility problems and aiming at improving diagnosis of subfertile mares, a comparative analysis of the intrauterine transcriptome in subfertile and fertile mares was performed. Uterine cytobrush samples were collected during estrus from 57 mares without clinical signs of uterine diseases. RNA was extracted from the cytobrush samples and samples from 11 selected subfertile and 11 fertile mares were used for Illumina RNA-sequencing.

**Results:** The cytobrush sampling was a suitable technique to isolate enough RNA of high quality for transcriptome analysis. Comparing subfertile and fertile mares, 114 differentially expressed genes (FDR = 10%) were identified. Metascape enrichment analysis revealed that genes with lower mRNA levels in subfertile mares were related to 'extracellular matrix (ECM)', 'ECM-receptor interaction', 'focal adhesion', 'immune response' and 'cytosolic calcium ion concentration', while DEGs with higher levels in subfertile mares were enriched for 'monocarboxyl acid transmembrane transport activity' and 'protein targeting'.

**Conclusion:** Our study revealed significant differences in the uterine transcriptome between fertile and subfertile mares and provides leads for potential uterine molecular biomarkers of subfertility in the mare.

Keywords: Mare, Subfertility, Uterine transcriptome, Cytobrush, RNA-seq, Biomarker

### **Background**

Subfertility represents a substantial problem for the horse breeding industry [1] as it leads to high economic losses for the owners. Subfertile mares do either not conceive or require more examinations, inseminations and treatments to get pregnant than their fertile counterparts. Many factors such as age, reproductive status, gynecological health of the mare, sperm quality, sperm preservation and breeding management have an effect

on fertility [2–4]. Clinical endometritis is one of the most common causes for fertility problems in mares [1] and was ranked in the top three medical problems in equine adult patients [5]. Endometritis can be divided into acute infectious, chronic infectious or non-infectious endometritis. The most common types of endometritis in mares are bacterially infectious endometritis and persistent breeding induced endometritis (PBIE) [6, 7]. Mares susceptible to PBIE show prolonged persistent post breeding uterine inflammation, interfering with the arrival of the embryo in the uterus 5–6 days after breeding [8]. Mares with endometritis have a lower conception rate and a higher risk for early embryonic death and mid-gestational abortion. Clinical signs of endometritis include intrauterine

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fluid, excessive pattern of endometrial edema, vaginitis, vaginal discharge, abnormal estrous cycles and cervicitis. Often endometritis can be diagnosed by detecting clinical signs, uterine inflammation in cytological examination or pathogens in uterine microbial culture [9]. However, there are also mares which don't get pregnant after several breeding attempts with sperm of fertile stallions without showing any pathological signs using these diagnostic methods. Le Blanc and Causey [9] described these disturbances in fertility as hidden cases of endometritis or subclinical endometritis.

Although in many studies the histological examination of uterine biopsy samples was considered as the gold standard for diagnosis endometritis [10-13] and for predicting fertility by using the Kenney and Doig score [14], in practice, currently mostly double-guarded uterine swabs for microbial culture and cytobrushes for cytology are used, as these methods are less invasive than the biopsy and less time consuming than histological examination. The sensitivity of microbial culture and cytology is low and these diagnostic methods have a high incidence of false negative results [6, 10, 13, 15]. Many bacteria are difficult to cultivate in vitro and are therefore not detectable by classical bacteriology [16–18]. Moreover, some bacteria, e.g. gram negative bacteria like Escherichia coli don't induce a cellular immunological reaction with a high amount of neutrophils detected by the cytological examination in contrast to other bacteria, such as Streptococci [1, 19]. Therefore, for mares without clinical signs of uterine diseases, without known pathogens in culture, no evidence of inflammation in cytology but not becoming pregnant after several breeding attempts more accurate diagnostic methods are needed to predict fertility.

It seems likely that underlying mechanisms for subfertility can be found at the molecular level. For instance mares susceptible to persistent endometritis show differences in innate immune response to insemination [8, 20-22] and induced infectious endometritis [23] compared to resistant mares at mRNA expression level. The mRNA expression of pro- inflammatory cytokines (IL6, IL1RN, IL1B, CXCL8), anti-inflammatory cytokines (IL10), tumor necrosis factor (TNF), C-C motif chemokine ligand 2 (CCL2), antimicrobial peptides, secreted phospholipase A2 (PLA2G2A), lipocalin 2 (LCN2) and lactotransferrin (LTF) differ between susceptible and resistant mares [8, 20-23]. Recently, it has been shown that mares susceptible for PBIE show a different expression pattern of genes associated with innate immunity even before breeding and that antimicrobial peptides equine b-defensin 1 (DEFB1), lysozyme (LYZ) and secretory leukoprotease inhibitor (SLPI) can be used as diagnostic marker for susceptibility [22].

Gene expression profiling of the healthy, receptive equine endometrium has shown that the transcriptome differed among estrous cycle stages [24, 25]. Genes

upregulated during estrus were associated with extracellular matrix related categories and immune regulated functions [24, 25]. These physiological changes in uterine gene expression could play an important role in successful reproduction. For instance, the uterine immune system may prepare the uterus for potential foreign material ascending through the open cervix during estrus by upregulation of genes related to immune response [24, 25].

In recent years, gene expression analysis has been applied in several studies to identify genes and their networks associated with receptivity of the human endometrium at the time of implantation by comparing women with recurrent miscarriage [26, 27] or recurrent implantation failure [26, 28–30] and fertile women. Furthermore, in cows, different studies were performed to identify endometrial gene expressions related to fertility [31–35]. However, to our knowledge, no study investigated yet the relationship between the equine uterine transcriptome and fertility in mares using cytobrush samples collected during estrus.

In most of the equine and human studies uterine biopsy samples were taken for transcriptome and mRNA analysis, while in cattle cytobrush samples were often used for mRNA analysis. In different bovine studies, it was shown that cytobrush sampling provides a much less invasive method to isolate RNA of sufficient quantity and quality for gene expression analysis [31, 36] compared to the biopsy of the endometrium.

With the aim to improve the diagnosis of subfertile mares without clinical signs of uterine diseases and to characterize RNA markers to predict fertility, our objective was to perform a comparative analysis of the intrauterine transcriptome at estrus of fertile and subfertile mares without clinical signs of uterine diseases. A second objective was to investigate the suitability of samples collected by cytobrush from the equine uterus for transcriptome analysis.

### **Results**

### Cytology and bacteriology

The cytological examination did not reveal an intrauterine inflammation at the time of sampling in all mares. Bacteria were detected in 33 of 57 mares (57.9%) in microbial culture. Facultative pathogens were obtained in 12 of 57 mares (21.1%). These 12 samples with facultative pathogens were excluded from further analysis. From each group of the fertile mares (FB-P) and subfertile mares (RB-N) 11 mares without facultative pathogens were selected for RNA sequencing.

## Isolation of RNA from cytobrush samples and Illumina RNA-sequencing

The cytobrush sampling was a suitable technique to isolate enough RNA of high quality for transcriptome

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analysis. The concentration of the total RNA was between 40 and  $669 \text{ ng/}\mu\text{l}$ , while the A260/A280 ratio was between 1.95 and 2.09. The obtained RNA integrity numbers (RIN) ranged from 8.9 to 10 in all 57 samples.

The RNA sequencing results revealed after filtering of the fastq files library sizes between 10.9 and 30.9 million reads per sample with an average of 18.4 million reads. After filtering genes with low read counts, in total 15, 318 different genes were detectable and used for differential gene expression analysis.

### Identification of differentially expressed genes

The intrauterine transcriptome differed between subfertile and fertile mares without clinical signs of uterine diseases. Using Edge R analysis, 114 genes were found as differentially expressed between subfertile and fertile mares (FDR < 0.1; Fig. 1) (Additional file 1). Ninety-eight genes were significantly downregulated and 16 genes upregulated in subfertile mares compared to fertile mares. The expression of neuromedin U (NMU), synaptogamin 12 (SYT12), uncharacterized LOC111767890, UL16 binding protein 1 (LOC100063831) were decreased to the greatest extent, while the expression of solute carrier family 10 member 2 (SLC10A2), 40S ribosomal protein S2-like (LOC100147232) and 60S ribosomal protein L26-like (LOC10052427) were increased to the greatest extent in subfertile mares compared to fertile mares.

Hierarchical cluster analysis of the DEGs revealed a separation of DEGs upregulated (cluster 1) or downregulated (clusters 2, 3, 4) in samples derived from subfertile mares (Fig. 1). The downregulated genes were separated

in three clusters. Cluster 2 showed DEGs with increased expression in only 5 of the fertile mares. Differences in cluster 3 and 4 were more consistent above all samples. A few samples of the subfertile and fertile group, respectively, showed expression patterns in part more similar to the respective other group. The DEGs of cluster 1 and the DEGs of clusters 3 and 4 are listed in Tables 1 and 2, respectively.

### Overrepresented functional categories

The DEGs were analyzed for overrepresented functional categories and pathways in fertile or subfertile mares using the Metascape enrichment analysis tool (Table 3, Fig. 2, Additional file 2). The analyses were performed separately for genes upregulated or downregulated in subfertile mares compared to fertile mares, uploading the corresponding human NCBI Entrez gene IDs. Eighty-five genes of the downregulated genes and 12 of the upregulated genes could be assigned to a corresponding human gene symbol.

For genes with lower expression in subfertile compared to fertile mares, functional categories such as 'extracellular matrix (ECM)', 'lymphocyte mediated immunity', 'immune response', 'positive regulation of cytosolic calcium ion concentration' and 'peptidyl-tyrosine phosphorylation' were found as overrepresented. The most significantly enriched KEGG pathways were 'ECM-receptor interaction' (Fig. 3), 'focal adhesion' and 'PI3K-Akt signaling pathway'. DEGs upregulated in subfertile mares were enriched for 'monocarboxyl acid transmembrane transporter activity' and 'protein targeting'.

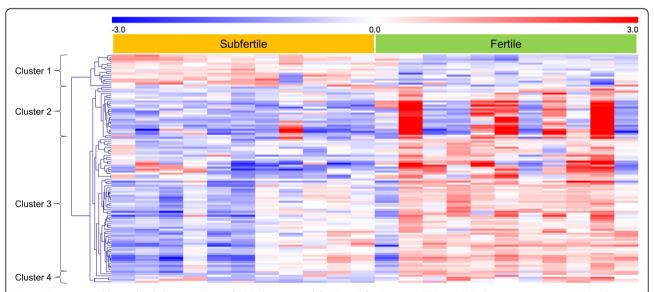


Fig. 1 Heat map and hierarchical cluster analysis of DEGs between subfertile and fertile mares (FDR < 0.1). Each row represents 1 DEG, each column 1 sample. Red color represents higher and blue color lower expression of the gene compared to the mean of all samples (mean-centered values in log2 scale from -3 to 3)

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Table 1 DEGs of Cluster1: DEGs upregulated in subfertile mares compared to fertile mares

Gene symbol	Entrez Gene ID	Gene description	Human gene symbol	log2 FC SUB/FER	P-value	FDR
SLC10A2	100051264	solute carrier family 10 member 2	SLC10A2	1.82	0.0002	0.0591
LOC100147232	100147232	40S ribosomal protein S2 like		1.80	0.0000	0.0012
LOC100052427	100052427	60S ribosomal protein L26-like		1.64	0.0000	0.0200
LOC100051778	100051778	60S ribosomal protein L21	RPL21	1.63	0.0000	0.0035
LOC100065786	100065786	40S ribosomal protein S17	RPS17	1.46	0.0000	0.0014
LOC100067178	100067178	Mesothelin	MSLN	1.13	0.0005	0.0861
SLC16A9	100062703	solute carrier family 16 member 9	SLC16A9	0.98	0.0001	0.0417
ELOVL2	100063624	ELOVL fatty acid elongase 2	ELOVL2	0.96	0.0001	0.0474
LOC111767704	111767704	uncharacterized LOC111767704		0.91	0.0000	0.0179
CRYL1	100054141	crystallin lambda 1	CRYL1	0.89	0.0001	0.0338
CTSE	100055161	cathepsin E	CTSE	0.82	0.0002	0.0591
LOC100072143	100,072,143	centrin-4		0.80	0.0001	0.0318
SLC16A5	100060017	solute carrier family 16 member 5	SLC16A5	0.57	0.0005	0.0861
TOMM7	100630688	translocase of outer mitochondrial membrane 7	TOMM7	0.52	0.0002	0.0591
MYCBP	100068904	MYC binding protein	MYCBP	0.47	0.0002	0.0564
SDHAF4	100629833	succinate dehydrogenase complex assembly factor 4	SDHAF4	0.45	0.0004	0.0763

### Validation of RNA-seq results by quantitative real-time RT-PCR

Expression differences found by RNA-sequencing were confirmed by qRT-PCR for 10 selected DEGs (Table 4). The qRT-PCR and RNA-seq relative expression values correlated well for the 22 analyzed samples (Fig. 4).

### Discussion

To our knowledge, this is the first study investigating the relationship between uterine transcriptome and fertility in mares using cytobrush samples collected during estrus. Our study showed that sufficient amounts of high-quality RNA can be isolated from uterine cytobrush samples collected from mares. All obtained RNA samples showed RINs between 8.9 and 10 and revealed a minimum of 560 ng total RNA. In contrast to biopsy samples, the cytobrush technique does not provide information about gene expression of the whole endometrium as the cytobrush tends to collect only superficial parts of the endometrium and uterine fluid. To our knowledge, there is no study that examined, which material is exactly collected by the cytobrush. However, cytological examinations of uterine cytobrush samples in mares show primarily uterine epithelial cells, white blood cells and red blood cells [17]. In our study, the cytological examination confirmed mainly uterine epithelial cells, erythrocytes and some isolated white blood cells. Comparing biopsy and cytobrush samples in cattle, stromal and endothelial cells were enriched in biopsy samples, while endometrial epithelial cells and immune cell markers were enriched in cytobrush samples [38]. A previous study in mares at the time of recognition of pregnancy showed that the strongest gene expression differences between pregnant and cyclic state are localized in the luminal epithelium [39]. Therefore, we also expected the highest differences between fertile and subfertile mares in the endometrial epithelium, which is collected with the cytobrush samples. Cytobrush samples therefore represent a less invasive sampling alternative to the biopsy sample for transcriptome analysis. However, the different sample compositions of cytobrush and biopsy samples still need to be investigated in more detail and therefore existing fertility and endometritis markers from biopsy samples cannot always be transferred to cytobrush samples.

The comparative transcriptome analysis of cytobrush samples collected during estrus revealed significant differences in the intrauterine gene expression between subfertile mares without clinical signs of reproductive diseases and normal fertile mares. Estrus was selected to allow easy sampling through the open cervix and to develop markers for the evaluation of fertility in mares before insemination based on routine cytobrush sampling. Early diagnosis of subfertile mares gives the possibility to improve the fertility of the mare with an optimized breeding management. In the present study, the mares were divided into fertile and subfertile mares according to pregnancy diagnosis after artificial inseminations during one breeding season. Mares becoming pregnant after only one artificial insemination (AI) were assumed fertile, mares that failed to conceive after at least three AIs were classified as subfertile. However, we are aware that probably not all mares classified as fertile are really fertile. Also, subfertile mares could become pregnant just Weber et al. BMC Genomics (2021) 22:377 Page 5 of 19

**Table 2** DEGs of Clusters 3 and 4: DEGs downregulated in subfertile mares compared to fertile mares

Gene symbol	Entrez Gene ID	Gene description	Human gene symbol	log2 FC SUB/FER	<i>P</i> -value	FDR
ACAP1	100072970	ArfGAP with coiled-coil, ankyrin repeat and PH domains 1	ACAP1	-1.01	0.0000	0.0291
ACKR3	100057501	atypical chemokine receptor 3	ACKR3	-1.60	0.0001	0.0474
ADAMTS7	100059959	ADAM metallopeptidase with thrombospondin type 1 motif 7	ADAMTS7	-1.39	0.0001	0.0318
AKR1E2	100070632	aldo-keto reductase family 1 member E2	AKR1E2	-1.93	0.0000	0.0179
ANKRD10	100066458	ankyrin repeat domain 10	ANKRD10	-0.66	0.0007	0.0998
ANO8	100146761	anoctamin 8	ANO8	-1.24	0.0004	0.0763
APBA3	100146445	amyloid beta precursor protein binding family A member 3	APBA3	-0.62	0.0003	0.0708
C1QA	100058097	complement C1q A chain	C1QA	-0.66	0.0006	0.0861
C1QB	100071667	complement C1q B chain	C1QB	-0.74	0.0002	0.0562
CEP131	100056159	centrosomal protein 131	CEP131	-0.85	0.0002	0.0529
CIAO3	100065271	cytosolic iron-sulfur assembly component 3	CIAO3	-0.57	0.0007	0.0998
CLK1	100067832	CDC like kinase 1	CLK1	-0.94	0.0004	0.0796
CLK2	100063546	CDC like kinase 2	CLK2	-0.69	0.0006	0.0861
COL16A1	100056083	collagen type XVI alpha 1 chain	COL16A1	-1.72	0.0005	0.0847
COL4A1	100066148	collagen type IV alpha 1 chain	COL4A1	-1.16	0.0003	0.0658
COL4A2	100066264	collagen type IV alpha 2 chain	COL4A2	-1.17	0.0001	0.0354
COL6A1	100050035	collagen type VI alpha 1 chain	COL6A1	-1.84	0.0006	0.0897
CYTH4	100069735	cytohesin 4	CYTH4	-0.79	0.0004	0.0798
DENND1C	100065730	DENN domain containing 1C	DENND1C	-0.91	0.0006	0.0861
DLG4	100061544	discs large MAGUK scaffold protein 4	DLG4	-0.98	0.0003	0.0643
DNASE1L3	100057863	deoxyribonuclease 1 like 3	DNASE1L3	-1.66	0.0001	0.0474
EHBP1L1	100057282	EH domain binding protein 1 like 1	EHBP1L1	-0.93	0.0001	0.0417
ENTPD6	100057043	ectonucleoside triphosphate diphosphohydrolase 6	ENTPD6	-0.70	0.0003	0.0620
FER1L5	100062182	fer-1 like family member 5	FER1L5	-1.77	0.0002	0.0591
FN1	100034189	fibronectin 1	FN1	-2.21	0.0001	0.0472
GRAMD1B	100063638	GRAM domain containing 1B	GRAMD1B	-0.61	0.0004	0.0763
IRF8	100056218	interferon regulatory factor 8	IRF8	-0.79	0.0005	0.0861
JAK3	100147451	Janus kinase 3	JAK3	-0.66	0.0003	0.0673
KIF7	100069672	kinesin family member 7	KIF7	-0.82	0.0006	0.0867
LAT	100064430	linker for activation of T cells	LAT	-0.93	0.0001	0.0417
LLGL1	100051856	LLGL1, scribble cell polarity complex component	LLGL1	-0.50	0.0006	0.0861
LOC100054029	100054029	leukocyte immunoglobulin-like receptor subfamily A member 5		-1.26	0.0006	0.0883
LOC100054448	100054448	saoe class I histocompatibility antigen, A alpha chain	HLA-A	-1.26	0.0000	0.0024
LOC100055483	100055483	lg mu chain C region membrane-bound form-like	IGHM	-1.82	0.0003	0.0609
LOC100063097	100063097	mitotic-spindle organizing protein 2B-like	MZT2B	-1.70	0.0001	0.0423
LOC100073089	100073089	ectonucleotide pyrophosphatase/phosphodiesterase family member 3	ENPP3	-1.26	0.0000	0.0200
LOC100629324	100629324	uncharacterized LOC100629324	MEG3	-2.85	0.0001	0.0417
LOC102149846	102149846	immunoglobulin heavy constant gamma 1-like	IGHG1	-2.14	0.0005	0.0861
LOC102150085	102150085	immunoglobulin heavy constant gamma 1-like	IGHG1	-2.67	0.0000	0.0240
LOC102150790	102150790	uncharacterized LOC102150790		-1.44	0.0000	0.0179
LOC106781059	106781059	uncharacterized LOC106781059		-1.46	0.0001	0.0327
LOC106781303	106781303	immunoglobulin heavy constant alpha 2-like	IGHA1	-1.98	0.0005	0.0861

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Table 2 DEGs of Clusters 3 and 4: DEGs downregulated in subfertile mares compared to fertile mares (Continued)

Gene symbol	Entrez Gene ID	Gene description	Human gene symbol	log2 FC SUB/FER	<i>P</i> -value	FDR
LOC106783330	106783330	uncharacterized LOC106783330		-1.67	0.0001	0.0417
LOC111767520	111767520	uncharacterized LOC111767520		-1.60	0.0003	0.0669
LOC111768661	111768661	translation initiation factor IF-2-like		-1.19	0.0006	0.0897
LOC111768809	111768809	uncharacterized LOC111768809		-2.47	0.0000	0.0113
LOC111771758	111771758	GTPase IMAP family member 5-like		-0.92	0.0001	0.0474
LOC111774331	111774331	uncharacterized LOC111774331		-1.17	0.0003	0.0620
MCF2L	100067048	MCF.2 cell line derived transforming sequence like	MCF2L	-0.74	0.0001	0.0405
MICAL1	100066627	microtubule associated monooxygenase, calponin and LIM domain containing 1	MICAL1	-0.90	0.0000	0.0263
MMP25	100068942	matrix metallopeptidase 25	MMP25	-1.10	0.0003	0.0619
NAAA	100057831	N-acylethanolamine acid amidase	NAAA	-1.04	0.0003	0.0642
NUP210L	100056659	nucleoporin 210 like	NUP210L	-1.11	0.0002	0.0553
PDE10A	100050311	phosphodiesterase 10A	PDE10A	-2.44	0.0000	0.0195
PLCB2	100057315	phospholipase C beta 2	PLCB2	-0.93	0.0005	0.0861
PLXNA3	100058349	plexin A3	PLXNA3	-1.31	0.0005	0.0861
PREX1	100071328	phosphatidylinositol-3,4,5-trisphosphate dependent Rac exchange factor 1	PREX1	-0.68	0.0006	0.0861
RAB44	100629655	RAB44, member RAS oncogene family	RAB44	-1.29	0.0005	0.0861
RYR1	100034090	ryanodine receptor 1	RYR1	-1.31	0.0004	0.0737
SLC8B1	100056481	solute carrier family 8 member B1	SLC8B1	-0.66	0.0003	0.0676
SNRNP70	100054907	small nuclear ribonucleoprotein U1 subunit 70	SNRNP70	-0.74	0.0002	0.0591
THBS2	100050044	thrombospondin 2	THBS2	-3.13	0.0000	0.0294
TIA1	100050503	TIA1 cytotoxic granule associated RNA binding protein	TIA 1	-0.55	0.0006	0.0861
TNNT2	100146343	troponin T2, cardiac type	TNNT2	-2.20	0.0001	0.0417
TNXB	100059315	tenascin XB	TNXB	-1.19	0.0000	0.0240
ТОРЗВ	100051153	DNA topoisomerase III beta	TOP3B	-0.92	0.0002	0.0602
TPCN2	102150167	two pore segment channel 2	TPCN2	-0.76	0.0002	0.0591
VGLL3	100069930	vestigial like family member 3	VGLL3	-1.41	0.0006	0.0883
WDR90	100066920	WD repeat domain 90	WDR90	-0.75	0.0005	0.0861
ZBP1	100055754	Z-DNA binding protein 1	ZBP1	-0.96	0.0000	0.0294
ZNF333	100064631	zinc finger protein 333	ZNF333	-0.67	0.0007	0.0998

by chance with the first AI and were considered as fertile in our classification. This could be also a reason why the hierarchical cluster analysis of the identified DEGs did not show a complete and clear separation of the two groups of mares into two clusters. Some mares showed intermediate expression patterns or patterns more similar to the other group. Classification after multiple AIs and pregnancy diagnosis, as in the study of Killeen et al. [40] in cattle, would have been better, but was not possible in the stud farm due to financial, logistical and ethical reasons. Moreover, we cannot exclude, if fertility was affected by the stallion, although we included only mares in our study inseminated with chilled semen from fertile stallions. Furthermore, in the subfertile mares,

samples were collected after at least two unsuccessful inseminations in previous cycles, whereas in the fertile mares the samples were taken before the first insemination in the breeding season. Therefore, previous inseminations in the subfertile mares could have an influence on the intrauterine transcriptome. In addition, the small number of 11 mares per group probably limited the power of the comparative transcriptome analysis results. Further studies have to validate the DEGs found here in a larger number of samples.

In total, 114 genes were found as differentially expressed between subfertile and fertile mares. Quantitative real-time RT-PCR confirmed the results for 10 selected DEGs. The majority of the DEGs showed uniform

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**Table 3** Metascape functional term enrichment analysis of DEGs subfertile vs fertile mares

Most informative categories of Metascape enrichment analysis	Log <sub>10</sub> ( <i>P</i> -value)	Assigned genes
Genes with lower expression in subfertile vs. fertile mares		
Extracellular matrix, ECM-receptor interaction, Focal adhesion, Collagen trimer, PI3-Akt signaling pathway	-7.8	COL4A1,COL4A2,COL6A1,FN1,ITGB3,THBS2,TNXB,COL16A1,C1QA,C1QB, ACHE,MMP25,FGFR1,JAK3,SLC39A8,ADAMTS7,PNPLA2,ANO8,DLG4,TIA1, PLCB2,PLXNA3,LLGL1,ACKR3,PDE2A,RYR1,ERFE,AKR1C4,CLK2
Lymphocyte mediated immunity, complement activation, adaptive immune response	-4.4	C1QA,C1QB,HLAA,IGHA1,IGHG1,IGHM,CLCF1,ULBP3,JAK3,FN1, DLG4,ENPP3,STAC,ACKR3,LAT,PREX1,IRF8,ITGB3
Positive regulation of cytosolic calcium ion concentration, muscle contraction	-3.8	DLG4,PLCB2,RYR1,NMU,ACKR3,SLC8B1,TPCN2,SLC39A8,ERFE,COL6A1, STAC,ITGB3,PNPLA2,FGFR1,SYT12,ATP8B2,ANO8,TNNT2
Glycosaminoglycan binding	-3.8	COL16A1,FGFR1,FN1,IGHM,THBS2,TNXB,ITGB3,PREX1,IGHA1,SLC8B1
Regulation of immune effector process	-3.7	C1QA,C1QB,DNASE1L3,HLA-A,IGHG1,JAK3,ENPP3, CLCF1,ULBP3
Peptidyl-tyrosine phosphorylation	-3.5	DLG4,FGFR1,FN1,ITGB3,JAK3,LAT,CLK1,CLK2,CLCF1,IGHG1,COL16A1,PLCB2
Inorganic anion transport	-3.5	DLG4,FGFR1,FN1,ITGB3,JAK3,LAT,CLK1,CLK2,CLCF1,IGHG1,COL16A1, PLCB2
Phosphoric diester hydrolase activity	-3.4	PDE2A,ENPP3,PLCB2,PDE10A,ENTPD6
Receptor internalization, receptor-mediated endocytosis	-3.1	ACHE,DLG4,ITGB3,ACKR3,IGHA1
Hallmark Myogenesis, calcium ion binding	-3.1	ACHE,COL4A2,RYR1,TNNT2,HSPB8,ENTPD6,SYT12,C1QA,DLG4, DNASE1L3,ENPP3,PLCB2,THBS2,RAB44
Genes with higher expression in subfertile vs. fertile mares		
Monocarboxylic acid transmembrane transport activity	-5.6	SLC10A2, SLC16A5, SLC16A9
Protein targeting	-3.0	RPL21,RPS17, TOMM7

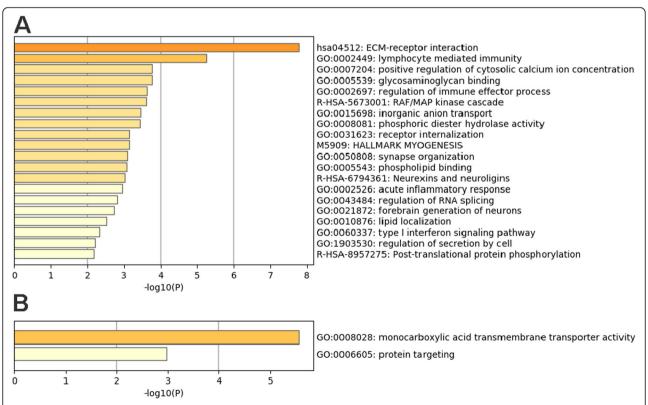
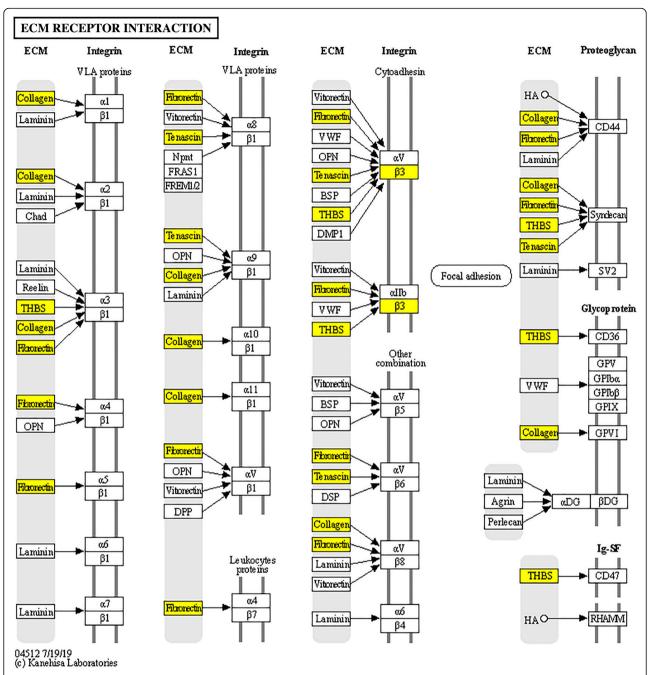


Fig. 2 Metascape analysis: **a** Top 20 most enriched terms in genes downregulated in subfertile mares compared to fertile mares. **b** Enriched terms in genes upregulated in subfertile mares compared to fertile mares

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**Fig. 3** KEGG-Pathway ECM-receptor interaction: Genes belonging related to ECM-receptor interaction were significantly overrepresented for DEGs downregulated in subfertile mares (highlighted in red). Copyright permission for the KEGG pathway hsa04512 ECM-receptor interaction - *Homo sapiens* (human) has been obtained from KEGG [37]

expression in the respective fertility groups suggesting them as good candidates for RNA markers to diagnose subfertile mares without clinical signs of reproductive diseases and to predict fertility. A part of the DEGs (cluster 2 in the hierarchical cluster analysis) showed only increased expression in some of the samples of the fertile group, making these DEGs unsuitable as markers. No similarity could be found in these samples with

respect to data records of these mares, which would distinguish them from the other samples. It seems likely that low mRNA levels of the genes of cluster 2 do not cause subfertility as a sole factor but may decrease fertility in conjunction with other disturbances.

According to the functional enrichment analysis, genes related to 'extracellular matrix', 'ECM-receptor interaction', 'focal adhesion', 'immune response', and 'cytosolic

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**Table 4** Quantification of selected genes with quantitative realtime RT-PCR and comparison with RNA sequencing results

Gene	q-RT-PCR		RNA-Sequencing	
symbol	Log2 FC	<i>P</i> -value	Log2 FC	FDR
SLC10A2	1.7	0.0497	1.8	0.0368
SLC16A9	1.2	0.0127	1.0	0.0200
ITGB3	-1.9	0.0095	-1.3	0.0113
THBS2	-2.1	0.0269	-3.2	0.0080
FN1	-1.6	0.0156	-2.5	0.0065
COL6A1	-1.4	0.0313	-1.9	0.0460
ACKR3	-1.3	0.0084	-1.6	0.0242
PDE10A	-1.7	0.0130	-2.4	0.0080
MMP25	-0.7	0.0388	-1.1	0.0375
ENPP3	-1.2	0.0143	-2.2	0.0200

calcium concentration' may play an important role in fertility, as intrauterine gene expression levels related to these categories were lower in subfertile mares compared to fertile mares. Genes with higher mRNA concentrations in samples derived from subfertile mares were related to 'monocarboxyl acid transmembrane transport activity' and 'protein targeting'. A comparison with human fertility studies is difficult as these studies were often not conducted at estrus like our study. In the following, selected DEGs potentially important for fertility are discussed.

### ECM related genes downregulated in subfertile mares

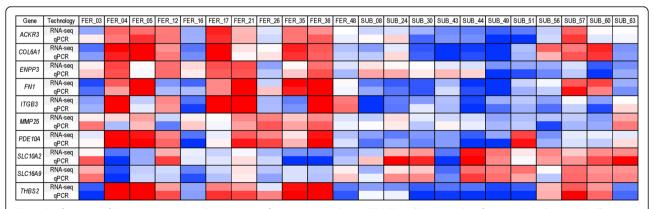
Genes with lower mRNA levels in samples collected from subfertile mares were most significantly enriched for functional categories associated with 'extracellular matrix (ECM)', 'collagen trimer', 'extracellular matrix organization', 'ECM-receptor interaction', 'focal adhesion', and 'angiogenesis'. In our study the mRNA expression of 4 collagens (COL4A1, COL4A2, COL6A1,

COL16A1), 4 ECM glycoproteins (fibronectin 1- FN1, thrombospondin 2 - THBS2, tenascin XB - TNXB, acetylcholinesterase (Cartwright blood group) - ACHE), the ECM receptor integrin subunit beta 3 (ITGB3) and two ECM modifiers (ADAMTS5, MMP25) was lower in subfertile mares compared to fertile mares. The genes ITGB3, THBS2, TNXB, COL4A1, COL6A1, COL4A2 and FN1 are involved in 'ECM receptor interaction' and 'focal adhesion' pathway, referring to the interaction of cells with the ECM, whereby integrins or proteoglycans establish the link between ECM and cells.

Previous studies showed that ECM-related uterine gene expression varied during the equine estrous cycle [24, 25]. Genes related to ECM, focal adhesion and angiogenesis were upregulated during estrus in equine endometrium [24, 25], which suggests an important function of these genes during estrus, that has not been clarified yet. Our study indicates that higher expression levels of genes related to ECM and focal adhesion during estrus might be important for fertility, as subfertile mares showed lower mRNA levels of these genes.

Genes related to ECM and cell adhesion were identified in fertility studies in humans at time of implantation as dysregulated genes in the endometrium of women with unexplained infertility or with recurrent miscarriage [27, 29, 41]. For instance the gene *ITGB3*, one DEG of cluster 2, is a marker of endometrial receptivity at the window of implantation in women and mice [42–44]. However, not much is known about the function of ECM related uterine genes and its relation to fertility at estrus, the time point of our sampling, as most human fertility studies are conducted during secretory phase.

Ectonucleotide pyrophosphatase/phosphodiesterase 3 (ENPP3) protein expression was only found in cyclic and not in postmenopause endometria of women indicating a relation with fertility [45]. In the study of Klein et al. [46], uterine *ENPP3* mRNA was upregulated in pregnant



**Fig. 4** Confirmation of RNA sequencing results: Heatmap of quantitative real-time RT-PCR and RNA-seq data for ten selected genes. To illustrate correlation of RNA seq and qPCR data relative expression levels (mean-centered log2 expression values) are shown as a heatmap. Red color means higher and blue lower expression levels of the gene compared to the mean of all samples, respectively (from 2 over 0 to -2)

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mares compared to cyclic mares during the time of maternal recognition of pregnancy 13.5 days after ovulation. Different DEGs are involved in ECM remodeling and collagen organization. Matrix metallopeptidase 25 (MMP25) and ADAM metallopeptidase with thrombospondin type 1 motif 7 (ADAMTS7), both involved in remodeling and breakdown of ECM, were downregulated in subfertile mares. MMP25 is able to clear the ECM components type IV-collagen, gelatin, fibronectin and fibrin in vitro [47]. The gene TNXB encodes the extracellular matrix glycoprotein tenascin XB. Tenascin plays a role in the organization and formation of elastin and fibrillar collagen in the ECM and is important for tissue structure and elastic fiber stability [48]. Tenascin-deficient women were reported to have a higher risk of complications during pregnancy such as preterm premature rupture of membranes [49, 50], but Tnx knockout mice showed no or only mild pregnancy-related abnormalities [50]. A function of TNXB during estrus regarding fertility was not reported yet. Thrombospondin 2 modulates collagen fibrillogenesis and inhibits angiogenesis [51]. Overall, dysregulations of ECM components involved in focal adhesion could be related to disturbances of endometrial remodeling during the estrous cycle affecting uterine interactions with the embryo and/or sperm.

### Immune-related genes downregulated in subfertile mares

Metascape analysis revealed overrepresentation of DEGs related to 'lymphocyte mediated immunity', 'classical pathway of complement activation', 'adaptive immune response' and 'regulation of immune effector process' in genes downregulated in subfertile mares in comparison to fertile mares. At the time of sampling in midestrus, 1-3 days before insemination, there was no evidence of inflammation neither clinically nor facultative pathogens in the microbial culture or positive findings in the cytological examination in the selected mares for RNA-seq. Marth et al. [25] and Gebhardt et al. [24] described in previous studies that genes associated with immune function are upregulated in the equine uterus during estrus in healthy mares. The authors suspected that the endometrium is preparing for mating during estrus and the required uterine clearance after mating with upregulation of immune-related genes and infiltration by immune cells, respectively. During estrus, the activity of the uterine immune system is increased due to intrauterine inoculation of foreign material such as bacteria, debris and sperm through the open cervix and by mating. A rapid high peak of inflammatory response after invasion of pathogens and a tight balance between pro- and antiinflammatory factors are required to eliminate pathogens and avoid prolonged inflammation [23, 52]. After AI an inflammatory response is important to effectively remove excessive spermatozoa, seminal plasma and other contaminants from the uterus before the embryo reaches the uterus 5-6 days after fertilization [7]. For instance, the innate immune response of mares susceptible to PBIE is altered after breeding or bacterial inoculation, and characterized by abnormal imbalance in proinflammatory and anti-inflammatory cytokines [8, 20, 21, 23]. In our study, the fertile mares with upregulated DEGs related to immune response might therefore be better prepared for these challenges during estrus than the subfertile mares. Clinically or in rectal ultrasound, no differences between the fertile and subfertile mares could be seen in estrus or after insemination. No mares showed prolonged inflammation after insemination in rectal ultrasonic examinations [53]. Also the recently identified diagnostic markers (DEFB1, LYZ, and SLPI) for susceptibility to PBIE were not differentially expressed between subfertile and fertile mares [22], supporting the assumption that subfertility in mares was not due to susceptibility to PBIE. Whereby these diagnostic markers were developed for uterine biopsy samples and not for cytobrush samples. The mRNAs encoding cytokines, which differ in susceptible mares after insemination, were not differentially expressed at estrus in the fertile and subfertile mares.

Different genes encoding proteins involved in activation of lymphocytes were downregulated in subfertile mares. The major histocompatibility complex, class I, A (HLA-A) and linker for activation of T cells (LAT) have a role in T cell activation [54]. The genes IGHG1 (LOC102150085, LOC102149846), *IGHA1* (LOC106781303), (LOC100055483), encoding heavy constants of immunoglobulins, and the DEGs cardiotrophin like cytokine factor 1 (CLCF1) and Janus kinase 3 (JAK3) are involved in Bcell activation [55, 56]. Genes encoding immunoglobulins were also lower expressed in endometrial biopsies of subfertile heifers compared to high fertile heifers on day 14 after estrus [35]. The CLCF1 gene has been found as expressed in the equine adult ovary [56] and in equine endometrium on day 16 of pregnancy [57]. Janus kinase 3 (JAK3) mediates signaling events in innate and adaptive immunity. Mutations in the JAK3 gene leads to severe combined immunodeficiency in humans and mice due to a disturbed T- and B-lymphocyte development and function [58, 59]. In innate immune cells, JAK3 inhibition was reported to enhance the toll like receptor mediated production of pro-inflammatory cytokines while suppressing the anti-inflammatory cytokine IL10 [60]. Besides immune function, in vitro cultured bovine endometrial cell experiments showed that bovine endometrial cells treated with JAK3 had an increased cell viability, suggesting that JAK3/ STAT pathway may also be involved in cell proliferation in endometrial cells [61].

Another downregulated gene of particular interest is the cytomegalovirus UL 16 binding protein 1 gene (LOC100063831), one DEG from Cluster 2. The human Weber et al. BMC Genomics (2021) 22:377 Page 11 of 19

orthologue *ULBP3* gene encodes a ligand of the immunoreceptor NKG2D, which is mainly expressed by natural killer cells (NK) and T cells [62]. As a ligand of NKG2D of natural NK cells, ULBP stimulates cytokine and chemokine production from NK cells. Furthermore, decidual NK cells play a role in early human and mouse pregnancy by regulation trophoblast invasion and vascularization in the decidua [63–65].

Genes involved in the classical pathway of complement activation were downregulated in uterine cytobrush samples of subfertile mares. The genes *C1QA* and *C1QB* encode the A- and B-chain polypeptide of complement component C1q, which is the first component of the classical pathway of complement activation and is activated through binding of immunoglobulins [66]. Genes encoding immunoglobulins were also downregulated in subfertile mares. Besides the function in the complement pathway, C1q also possesses a physiological role in trophoblast invasion, spiral arteries remodeling and placentation in the mouse [67–69]. C1q-deficient mice showed pregnancy disorders characterized by increased fetal death and signs similar to human pre-eclampsia.

Different genes participating in regulation of innate immune cells showed lower uterine mRNA levels in subfertile mares compared to fertile mares. For instance, phosphatidylinositol-3,4,5-triphosphate dependent Rac exchange factor 1 (Prex1) is strongly expressed in leukocytes and is involved in neutrophil recruitment during inflammation [70]. Besides the function in extracellular matrix remodeling, MMPs also participate in regulation of inflammation and innate immunity for example by activating and degrading chemotactic molecules [71]. Previous studies showed that the expression of several MMPs (MMP1, MMP2, MMP3, MMP7, MMP8, MMP9) was upregulated in the endometrium of mares after inoculation of Streptococcus zooepidemicus or E. coli or after insemination [52, 72]. MMP25, which was differentially expressed between subfertile and fertile mares in our study, has not been described previously in the equine uterus. In mice, Mmp25 expression has been found predominantly in peripheral blood leukocytes. It participates in the regulation of innate immune response. Mmp25-deficient mice are fertile but show a deficiency in their innate immune response [73]. The downregulated ACKR3, also known as CXCR7 or decoy receptor D6, regulates innate and adaptive immunity with his activity as a decoy and scavenger receptor for inflammatory chemokines and thus is involved in the control of inflammation [74]. In mares, ACKR3 is expressed significantly higher in endometrium during estrus compared to diestrus [25] and was increased after inoculation of E. coli [52]. ACKR3 might play a role also in the balancing between protection of the developing embryo and tolerance of its hemiallogeneic tissues [74]. Ackr3-deficient mice showed an earlier and exacerbated inflammatory response in a model of skin inflammation, with high levels of inflammatory chemokines [75]. Although Ackr3-deficient mice were fertile, exposure to LPS or antiphospholipid autoantibodies resulted in higher levels of inflammatory CC chemokines and increased leukocyte infiltrate in placenta, causing an increased rate of fetal loss [76]. The higher level of ACKR3 mRNA expression in fertile mares could affect fertility by preventing an excessive inflammatory response to insemination and might also be important in establishment of pregnancy.

Cysteine rich secretory protein 2 mRNA (CRISP2) was not strongly represented in the uterus samples; nevertheless, a significantly lower level of CRISP2 mRNA was observed in subfertile compared to fertile mares. The gene CRISP2 plays an important role in sperm motility, sperm capacitation and sperm-egg fusion and is positively correlated to male fertility in humans [77], mice [78], and bulls [79]. In stallions, only CRISP3 expression correlates with stallion fertility [80]. Equine CRISP3, highly presented in seminal plasma, suppresses binding between PMNs and viable spermatozoa in the reproductive tract of the mare [81]. Cysteine rich secretory proteins expression and proteins were also found in some studies in the female reproductive tract of mice [82] and humans [83]. In vitro experiments showed that epithelial and neutrophil-derived CRISP3 plays a role in mouse postmenstrual endometrial repair and regeneration and CRISP3 increases adhesion and proliferation of human epithelial cells [83]. To our knowledge, it is the first time that CRSIP2 was described in the equine endometrium. In a recently published study, Klein et al. [57] reported that CRISP3 is expressed in conceptus tissue at day 16 of pregnancy.

Taken together, a variety of genes related to activation of lymphocytes and genes involved in regulation of immune cells were identified as differentially expressed in cytobrush samples of subfertile and fertile mares. These findings could indicate a dysregulation of the immune response in the mares of the subfertile group that might interfere with establishment of pregnancy.

## Cytosolic calcium ion concentration related genes downregulated in subfertile mares

Furthermore, DEGs were found to be involved in 'positive regulation of cytosolic calcium ion concentration' and 'muscle contraction'. Calcium ion mobilization in cells occurs via Ca<sup>2+</sup> channels located in the plasma membrane or via intracellular release of calcium from sarcoplasmic reticulum or acidic lysosomal stores [84]. For instance, the DEG *SLC8B1* encodes a mitochondrial Na<sup>+</sup>/Ca<sup>2+</sup> exchanger (NCLX) [85]. The DEG two pore calcium channel 2 (*TPCN2*) encodes two pore segment channel 2 protein, a key component of the NAADP

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receptor, necessary for NAADP-mediated Ca2+ release from lysosome related organelles [84]. Intracellular Ca<sup>2+</sup> release from the sarcoplasmic reticulum occurs via ryanodine receptor, encoded by the DEG RYR1, or inositol 1,4,5-triphospate (IP3)-receptor. Through activation of G protein linked receptor Phospholipase C ß (PLCB2) it hydrolyzes phosphatidylinositol 4,5-biphosphate into diacylglycerol (DAG) and IP3. Increased concentration of IP3 leads to Ca<sup>2+</sup> secretion from the sarcoplasmic reticulum [86]. For example, neuromedin U, encoded by the DEG NMU, binds to the G-protein coupled NMU2receptor, which activates Phospholipase C and has an uterocontractile effect [87]. In accordance with our study, another member of the neuromedin family neuromedin B was upregulated in endometrial biopsy samples of fertile cows compared to infertile ones [32]. The cytosolic calcium concentration controls processes such as metabolism, secretion, fertilization, proliferation, and smooth muscle contraction [88]. Uterine contractility in mares after insemination is important to carry sperm toward the oviduct and to eliminate excessive sperm and contaminants from uterus [89, 90].

### Genes upregulated in subfertile mares

Genes upregulated in subfertile mares without clinical signs of uterine diseases compared to fertile mares were mainly related to 'monocarboxylic acid transmembrane transporter activity' (SLC10A2, SLC16A5, SLC16A9) and protein targeting (RPS17, RPL21, TOMM7, 60S ribosomal protein L26-like pseudogene, 40S ribosomal protein S2 pseudogene). Several genes encoding ribosomal proteins were also more abundant in low-fertility heifers compared to high fertility heifers at day 14 post estrus [35].

The gene *SLC10A2* encodes a sodium dependent bile acid transporter highly expressed in the liver and intestine [91]. Higher abundance of SLC10A2 were observed in bovine follicular fluid of lactating cows than in heifers suggesting that increased bile acids within follicular microenvironment may be the reason for fertility problems in lactating cows [92]. The DEGs SLC16A5 and SLC16A9 encode monocarboxylate transporters MCT6 and MCT9. MCT6, highly expressed in placenta kidney, transports bumetanide, nateglinide, probenecid and PFG2α. The transport of bumetanide is pH dependent and elevated by extracellular acidic pH [93, 94]. MCT9 is involved in transport of pyruvic acid, lactic acid and carnitine [95]. The upregulated crystallin lambda 1 gene (CRYL1) is involved in ß oxidation of fatty acid and the upregulated ELOVL fatty acid elongase 2 (ELOVL2) in elongation of very long fatty acids such as arachidonic acid. Arachidonic acid in turn is a precursor of prostaglandins, which means that ELOVL2 has an influence in prostaglandin metabolism [96, 97]. In our study, higher abundance of uterine *ELOVL2* seems to have a negative effect on fertility in mares.

### **Conclusions**

In conclusion, cytobrush samples provide a useful source for comparative uterine transcriptome analysis in the mare, e.g., for biomarker discovery related to subfertility or other uterine diseases. Our study revealed significant differences in the uterine transcriptome at estrus between fertile and subfertile mares without clinical signs of uterine diseases. We have identified a large number of DEGs, which are potential candidates for RNA biomarkers for the prognosis of subfertility in the mare. In further studies, these results have to be validated in a higher number of mares.

### **Methods**

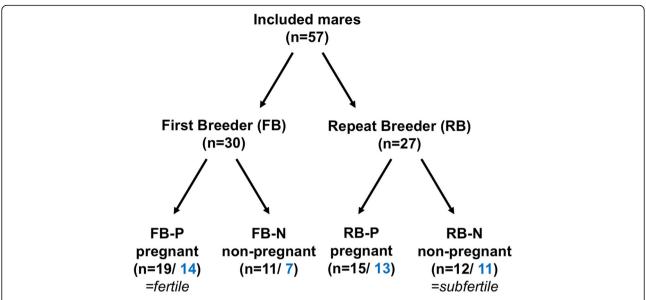
### Mares selected for the study

The study was conducted between July and October 2018 at a large private commercial stud farm in Mecklenburg-Vorpommern, Germany. In total, German warmblood (Oldenburger, Hannoveraner, Westfale, Mecklenburger) mares aged between 5 and 14 years presented for routinely bacteriological examination before artificial insemination (AI) were selected for the study. Mares with foal as well as barren and maiden mares were represented. To avoid subfertility because of age related modifications of the endometrium only mares until age of 14 were included. All mares showed no clinical signs of reproductive disorders and of PBIE after previous inseminations or had no history of being susceptible to PBIE. From these 57 mares 11 fertile and 11 subfertile mares were selected for comparative transcriptome analysis. The cytobrush sample collection (for detailed description see below) was performed during the routine assessments of uterine health of the mares (such as uterine cytobrush for cytology and swab for bacteriology) owned by the Lewitz Stud, Neustadt-Glewe, Germany.

### Study design and classification as fertile or subfertile mares

The 57 mares were initially subdivided according to their breeding history of the breeding season 2018 in mares having their first insemination this year (First Breeders (FB), n=30) and in mares that failed to conceive after at least two consecutive AI (Repeat Breeders (RB), n=27; Fig. 5). During estrus, the reproductive tract of the mares was examined daily by transrectal palpation and ultrasonography (Aloka prosound 2, Hitachi, Japan) to assess the optimal time for sampling and AI and to examine the mares for clinical signs of endometritis including intrauterine fluid, an excessive pattern of endometrial edema, vaginitis, vaginal discharge, abnormal

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**Fig. 5** Grouping of mares according to their breeding history and fertility. First Breeder: uterine samples were taken before first Al during the season; Repeat Breeder = mares failed to conceive after at least two consecutive Als; FB-P = mares pregnant after the first breeding during the season; FB-N = mares not pregnant after the first breeding during the season; RB-N = mares not pregnant after at least three breedings during the season; black numbers indicate the total number of mares in each group; blue numbers indicate the number of mares after exclusion of mares with facultative pathogenic bacteria in uterine swabs. FB-P were defined fertile, RB-N subfertile. Eleven samples of FB-P and 11 samples of RB-N were used for transcriptome analysis

estrous cycles and cervicitis [9, 98]. Only mares with no clinical signs for endometritis or reproductive abnormalities were included in the study. Uterine samples were collected as described later from mares in midestrus (dominant follicle > 35 mm, distinct endometrial edema). Ovulation was induced using human chorionic gonadotropin (hCG, Ovogest 1500 I.U. i.v.) when the follicle reached a diameter of > 40 mm and AI was performed 24 h later. To avoid subfertility because of low sperm quality, only chilled semen from known fertile stallions having a sperm motility > 50% were taken. Twenty-four hours after AI, the mares were examined for ovulation and intrauterine fluid by transrectal ultrasound. The first pregnancy diagnosis was carried out 16 days after singleovulations or 14 days after double-ovulations by transrectal ultrasound. A second pregnancy diagnosis was performed 45 (+/-2) d) days after ovulation. Mares that were positive in both pregnancy examinations were counted as pregnant. According to the results of the pregnancy examinations, mares were finally grouped into FB and RB pregnant (FB-P and RB-P) and not pregnant (FB-N and RB-N). FB-P were considered fertile (n = 19) and RB-N were defined subfertile (n = 12; Fig. 5). Mares with a positive cytological finding or facultative pathogenic bacteria in microbial culture were excluded from further analysis. Eleven mares of the subfertile group (RB-N) with no facultative pathogenic bacteria and negative cytology were used for transcriptome analysis. According to these mares, 11 fertile mares with similar

age and reproductive status, negative cytology and without facultative pathogens in microbial culture were selected from the FB-P group for RNA sequencing.

### **Uterine sample collection**

From the 57 mares, uterine samples were taken in estrus (dominant follicle > 35 mm, distinct endometrial edema). Before sample collection, the rectum was emptied, the tail was wrapped and covered with a glove, the perineum and vulva were cleaned with soap and water and dried with a paper towel. A veterinarian (K.S.W.) wearing a sterile glove inserted manually one double guarded uterine swab (Minitube, Tiefenbach, Germany). After passing the cervix, the inner guard was advanced, and the swab was rolled gently on the endometrium for 15 s. The swab was retracted and removed together with the inner guard from the reproductive tract. The outer guard was left in the reproductive tract to avoid additional manipulation during the following sampling steps. The swab was transferred into Amies medium and sent to a laboratory specialized for bacteriology in equine reproduction (Labor Boese, Harsum, Germany) for conventional microbiological culture. A new inner guard with a cytobrush (Minitube, Tiefenbach, Germany) was inserted through the outer guard into the uterus. The brush was advanced and rolled gently on the endometrium for 15 s. The brush was retracted, removed from the reproductive tract and was inserted directly into a 1.5 ml reaction tube containing 350 µl of lysis buffer (AllPrep Weber et al. BMC Genomics (2021) 22:377 Page 14 of 19

DNA/RNA Kit, Qiagen), rolled for 20 s and then removed. The reaction tubes were snap-frozen in liquid nitrogen until further analysis. In the same way, a second cytobrush sample was collected. The second cytobrush was rolled onto two microscope slides for cytological examination.

### Sample examination

Cytological examination: After air drying, the microscope slides were stained with Diff-Quick (Diff Quick, Labor+Technik Eberhard Lehmann GmbH, Germany). The slides were evaluated under a light microscope (Olympus Ch-2, Olympus, Tokyo, Japan) as described by Ferris [17]. Briefly, at 400 x magnification, 10 high power fields were analyzed, and the number of neutrophil granulocytes was counted. The presence of neutrophil granulocytes defines the following categories: no granulocytes to rare is a negative finding (healthy), 1–2 granulocytes per field indicates a mild inflammation, 3–5 moderate inflammation, > 5 severe inflammation [17].

Bacteriological examination: Bacteriological examination was performed at laboratory Böse (Harsum, Germany) specialized for bacteriology in reproduction. Bacteria were cultured on Columbia agar with 5% sheep blood, Columbia CAP Selective agar with sheep blood and Gassner agar (water blue-metachrome yellow- lactose-agar). Additionally, a mycological examination was performed on Sabouraud-Glucose agar with gentamycin and chloramphenicol and on Kimmig-agar. After incubation at 37 °C for 24 h and 48 h, the bacterial and fungal growth was evaluated. The aerobic microflora was identified by cultural-biochemical conventional methods and mass spectroscopy (MALDI-TOF). The samples were divided into mild (< 30 colonies), moderate (30–100 colonies) and severe (> 100 colonies) growth. The bacteriological results were divided into facultative pathogenic bacteria and questionable pathogenic bacteria. Growth of \( \beta \)-hemolytic Streptococcus, Pseudomonas aeruginosa, Klebsiella pneumoniae, Staphylococcus aureus, Candida albicans, Aspergillus spp. and moderate to severe growth of E. coli were considered as facultative pathogens. Mild growth of E. coli and the growth of other bacteria were considered as questionable pathogens. Samples with facultative pathogens were excluded from further analysis (n = 12).

# Extraction of RNA and estimation of concentration and quality

The total RNA extraction was performed with the AllPrep DNA/RNA micro kit (Qiagen, Hilden, Germany) according to the manufacturer's instructions using the protocol of Simultaneous Purification of Genomic DNA and Total RNA from Animal and Human Tissues. Because of rolling the cytobrush directly in lysis buffer after taking the sample, the initial start of the protocol was at step three of the protocol. RNA and DNA were extracted according to

manufacturer's instructions, instead of step 7 steps F1–F4 were used. RNA was eluted after two five-minute incubations with  $14\,\mu l$  of RNase-free water.

The total RNA concentration and purity were measured by spectrophotometry (Nano Drop One, Thermo Scientific). The quality of the isolated total RNA was assessed using the Agilent 2100 Bioanalyzer RNA 6000 Nano assay (Agilent Technologies, Waldbronn, Germany).

### RNA-sequencing and data analysis

For Illumina RNA-sequencing, 11 samples of subfertile mares (RB-N) and 11 of the fertile mares (FB-P) were selected. The isolated RNA was used for standard Illumina messenger RNA sequencing following the TrueSeq stranded mRNA protocol, which was performed by the Functional Genomic Center Zürich. The samples were barcoded and pooled and the pool was sequenced on an Illumina NovaSeq 6000 (100 bp single-end reads).

The data analysis of the resulting fastq files was performed on a local Galaxy server installation [99, 100]. In Galaxy, as first step and after every fastq file processing step, 'Fast QC' and 'Multi QC' were used to control the quality of the data and the processing steps. At first, 'Trim Galore' was used to trim adapter sequences, low quality ends and to discard reads shorter than 50 bp. To map the reads to the annotated equine genome equCab 3.0 downloaded from the National Center for Biotechnology Information (NCBI), the tool 'HISAT2' [101] was used. With the tool 'Feature Counts', the number of RNA sequence reads for the annotated genes were counted considering the strand specificity of the reads. 'Column Join on data' was used to build a count table containing all samples. This count table was filtered to remove genes with negligible read counts by using the counts per million (CPM) per sample filtering tool [102]. The mean library size and potential CPM cutoff (Counttable statistics, custom Galaxy tool) were calculated and the cutoff set to 1.09 CPM (corresponding to an average of 20 reads per library) for at least 5 out of the 22 libraries. The filtered count table was used in the statistical program R with the package edge R [103] for the identification of differentially expressed genes (DEGs) between subfertile and fertile mares. Genes with an adjusted Pvalue (false discovery rate, FDR) lower than 0.01 (FDR 10%) were considered as differentially expressed.

The web tool MAdb (Gene Symbol match, Ensembl compara database release 95, Blast) (https://madb.ethz.ch/) [104] was used to obtain the corresponding human gene symbols and gene information for the DEGs. Hierarchical clustering of DEGs was performed with the HCL tool of Multi Experiment Viewer (MeV) [105]. Metascape enrichment analysis program (http://metascape.org) [106] was used for identification of overrepresented functional categories and pathways of the

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DEGs. The annotation and enrichment analyses were performed separately for genes upregulated or downregulated in subfertile mares compared to fertile mares based on the corresponding human NCBI gene IDs.

The RNA-seq data presented in this study are openly available at NCBI's Sequence Read Archive (SRA) under the BioProject accession PRJNA667444.

### Quantitative real-time RT-PCR

The same RNA samples (400 ng total RNA) as used for RNA sequencing were reverse transcribed into first-strand cDNA using the RNA to cDNA EcoDry (Double Primed) Premix (Takara Bio Company, USA). The cDNA samples were diluted with RNase/DNase-free water to a total volume of 40  $\mu$ l.

To validate RNA sequencing results, ten DEGs with known gene symbols and with potential role in fertility were selected from the most significantly enriched Metascape categories for quantitative real-time RT-PCR. The DEGs solute carrier family 10 member 2 (*SLC10A2*), solute carrier family 16 member 9 (*SLC16A9*), integrin subunit beta 3 (*ITGB3*), collagen type 6 alpha 1 chain (*COL6A1*), thrombospondin 2 (*THBS2*), fibronectin 1 (*FN1*), matrix metallopeptidase 25 (*MMP25*), ectonucleotide pyrophosphatase/phosphodiesterase 3 (*ENPP3*), atypical chemokine receptor 3 (*ACKR3*) and phosphodiesterase 10 A (*PDE10A*) were selected. The mapping of RNA sequencing reads for these genes were checked with Integrated Genomics Viewer (IGV) [107] and matching primers were designed using Primer-Blast (NCBI) [108]. The primer sequences (ordered from Integrated DNA Technology, Leuven, Belgium) and their annealing temperatures are listed in Table 5.

The mRNA expression of the selected genes was measured by real-time PCR on a Light Cycler 96 (Roche, Mannheim, Germany) with the KAPA HiFi HotStart

**Table 5** Primers used for quantitative real-time RT-PCR. Primers were designed using NCBI's Primer BLAST. Ten DEGs were selected to validate RNA-sequencing results by qRT-PCR. ACTB, GAPDH and 18S rRNA were used as reference genes. The designed primers are listed with product length and annealing temperature. F forward primer, R reverse primer

Gene	Primer sequence 5'-3'	Product length (bp)	Annealing Temp C°	Accession no./reference of target transcript
SLC10A2	F: ATCGTTCACCTACGAGGAGC	191	66	XM_001493450.3
	R: TCACCTTGTGGAGCGATGAC			
SLC16A9	F: TGTTCTTTGCTGGGCTTGGA	110	68	XM_023643589.1
	R: CAGGACGCAGAAGCCACTAA			
ITGB3	F: GCACCCGTTACTGTCGTGAT	145	65	NM_001081802.1
	R: AGGATGGACTTTCCACTGGC			
THBS2	F: TGGCTGGAAAGACTACACCG	107	65	NM_001163117.2
	R: CTGAATCCGCCATGACCTGT			
FN1	F: GGTCGTTACTGTGGGCAACT	101	65	XM_023642280.1
	R: CCTCTCCGATGGCGTAATGG			
COL6A1	F: CCTCCTGGGATAAACGGCAC	184	65	XM_001488351.5
	R: ACTCGTCCATCTCTGGTCGT			
ACKR3	F: ATGCCTGAGTAGCCTGGAGA	113	65	XM_023642191.1
	R: GTCCTGTGGTGATGCAAACG			
LOC100073089 (ENPP3)	F: TAGAATACGTGGTCAACACCAG	190	68	XM_023651094.1
	R: TCAACCCAGTTGGCTTCCTG			
PDE10A	F: GCGTGAATTGTAGCAGCCAG	76	65	XM_023633145.1
	R: ACTGATTGCAGAAAGACACTTCC			
MMP25	F: ATGTCACCGTCAGCAACACAG	189	70	XM_023633145.1
	R: GTCCAGGCTTGAGAGTGGCT			
ACTB	F: TCCCAGCACGATGAAGATCAA	189	68	XM_023655002.1
	R: GGTGGATCGCACTAACAGT			
GAPDH	F: ATTGCCCTCAACGACCACTT	140	70	NM_001163856.1
	R: TCTTGCTGGGTGATTGGTGG			
18S rRNA	F: GCGTGTGCCTACCCTACGCC	165	68	AJ311673.1/ [24]
	R: ATCGTTCACCTACGAGGAGC			

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PCR Kit (Roche, Kapa Biosystems Pty, South Africa) adding EvaGreen® Dye, 20x in water (Biotium). The qPCR was performed in a reaction volume of 10 µl, consisting of 2 µl 5x Kapa HiFi Buffer, 0.3 µl Kapa dNTP mix (0.3 mM each), 0.2 µl Kapa HiFi HotStart DNA polymerase, 0.3 µl of each primer (10 µM), 0.5 µl Eva Green Dye, 5.4 µl water and 1 µl cDNA template. Cycle parameters of the PCR were 95 °C for 3 min, followed by 45 cycles of 98 °C for 20 s, specific annealing temperature for 15 s and 72 °C for 15 s, and then a melting step (95 °C for 10 s, 65 °C for 60 s and 97 °C for 1 s). Melting curves of the amplified PCR products were obtained for confirmation of specific amplification. A no-template control (RNA sample) was included for each primer pair. The  $C_q$  (quantification cycle) values determined for the target genes were normalized against the geometric mean of the reference genes beta actin (ACTB), glyceraldehyde-3-phosphate dehydrogenase (GAPDH) and 18S rRNA [109]. Relative expression differences between subfertile and fertile mares were calculated, and a t-test was performed in Microsoft Excel. P-values < 0.05 were considered significant.

### Abbreviations

Al: Artificial insemination; CPM: Counts per million; DEG: Differentially expressed gene; DNA: Deoxyribonucleic acid; cDNA: Complementary DNA; ECM: Extracellular matrix; FB: First Breeders; FB-P: First Breeder-pregnant; FB-N: First Breeder-not pregnant; FDR: False discovery rate; i.v.: Intravenous; KEGs: Kyoto Encyclopedia of Genes and Genomes; Log2 FC: Log2-fold-change; mRNA: Messenger ribonucleic acid; NCBI: National Center for Biotechnology Information; NAADP: Nicotinic acid adenine dinucleotide phosphate; NKG2D: Natural Killer Group 2D; PBIE: Persistent breeding-induced endometritis; RB: Repeat Breeders; RB-P: Repeat Breeder- pregnant; RB-N: Repeat Breeder- not pregnant; RIN: RNA integrity number; RNA: Ribonucleic acid; RNA-seq: RNA sequencing; RT-PCR: Reverse transcription- Polymerase Chain Reaction; qRT-PCR: Quantitative RT-PCR

### **Supplementary Information**

The online version contains supplementary material available at https://doi.org/10.1186/s12864-021-07701-3.

**Additional file 1.** Differentially expressed genes (DEGs) in cytobrush samples collected from subfertile vs. fertile mares.

**Additional file 2.** Metascape enrichment analysis results of transcripts downregulated or upregulated in cytobrush samples collected from subfertile vs. fertile mares.

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### Authors' contributions

K.S.W. performed the sample collection, isolation of RNA, RNA-seq data analysis, qPCR validation, and was a major contributor in writing the manuscript; K.W. supported mare and sample selection and data interpretation and writing; M.B. contributed to the design of the sample collection procedure, the selection of the mares owned by the Lewitz Stud for the study, and to sample collection; S.B. contributed to the study design, supervised all molecular

biology laboratory analyses, supervised and performed part of the data analysis, supervision of study performance, manuscript writing and editing; H.B. study design, supported design of sample collection procedure, supervision of study performance; all authors read and approved the final manuscript.

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### Availability of data and materials

The datasets generated during the current study are in this published article and the RNA-seq data are openly available at NCBI's Sequence Read Archive (SRA) under the BioProject accession PRJNA667444 https://www.ncbi.nlm.nih.gov/sra/?term=PRJNA667444.

#### **Declarations**

### Ethics approval and consent to participate

The samples were taken as part of routine diagnostics and therefore did not require an animal experiment permit.

### Consent for publication

Not applicable.

### Competing interests

The authors declare that they have no competing interests. Stefan Bauersachs is serving as Associate Editor for BMC Genomics was realized.

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