1	Associations between IFI44L gene variants and rates of respiratory tract infections during
2	early childhood

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50 ABSTRACT Background. Genetic heterogeneity in type I interferon related gene IFI44L may account for 51 52 variable susceptibility to respiratory tract infections (RTIs) in children. *Methods*. In two prospective, population-based birth cohorts, the STEPS Study and the FinnBrain 53 54 Birth Cohort Study, IFI44L genotypes for rs273259 and rs1333969 were determined in relation to 55 the development of RTIs until one and two years of age, respectively. At age 3 months, whole blood transcriptional profiles were analyzed and nasal samples were tested for respiratory viruses in 56 57 a subset of children. 58 *Results*. In the STEPS Study (n=1135), IFI44L minor/minor gene variants were associated with lower rates of acute otitis media episodes (adjusted incidence rate ratio [aIRR], 0.77 [95% CI, 0.61-59 60 0.96] for rs273259 and 0.74 [0.55-0.99] for rs1333969) and courses of antibiotics for RTIs (aIRR, 61 0.76 [0.62-0.95] and 0.73 [0.56-0.97], respectively. In the FinnBrain cohort (n=971), IFI44L 62 variants were associated with lower rates of RTIs and courses of antibiotics for RTIs. In respiratory 63 virus-positive 3-month-old children, IFI44L gene variants were associated with decreased 64 expression levels of IFI44L and several other interferon related genes. 65 *Conclusions*. Variant forms of IFI44L gene were protective against early-childhood RTIs or acute 66 otitis media, and they attenuated interferon pathway activation by respiratory viruses. 67 Words 199 68 69 70 *Key words*. acute otitis media; interferon pathway; polymorphisms; respiratory tract infections; 71 transcriptome 72 73

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- 74 Capsule Summary: Common IFI44L gene variants were protective against early-childhood
- respiratory tract infections or acute otitis media in two independent birth cohorts. These
- 76 polymorphisms attenuated interferon pathway activation by respiratory viruses.
- 77
- 78 Key words: acute otitis media; interferon pathway; polymorphisms; respiratory tract infections;
- 79 transcriptome
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# 82

# 83 ABBREVIATIONS

- 84 DEG: Differentially expressed gene
- 85 GO: Gene Ontology
- 86 IFI44L: Interferon-induced protein 44-like
- 87 IFN: Type I interferon
- 88 ISG: Interferon-stimulated gene
- 89 MBL: Mannose-binding lectin
- 90 mRNA: Messenger RNA
- 91 RTI: Respiratory tract infection
- 92 SNP: Single nucleotide polymorphism
- 93 STEPS: Steps to the Healthy Development and Well-being of Children
- 94 TLR: Toll-like receptor

#### 95 INTRODUCTION

96 Children younger than 2 years of age have the highest frequency of respiratory tract infections 97 (RTIs) with an average of 6 episodes per year.<sup>1,2, 3</sup> RTIs are mostly caused by viruses and are 98 frequently complicated by acute otitis media, where both viruses and bacteria play a role. Some 99 children suffer from higher numbers of RTIs and acute otitis media episodes than others,<sup>4</sup> but 100 reasons for these individual differences are not fully understood.

101Risk factors for RTIs include the presence of older siblings, day care attendance, male102sex, passive smoke-exposure, and lack of breastfeeding.<sup>2,4,5,6</sup> Recently, genetic susceptibility to103RTIs or acute otitis media has been recognized. Single nucleotide polymorphisms (SNPs) and other104genetic variants affecting the functions of essential proteins of innate immunity such as toll-like105receptors (TLR), mannose-binding lectin (MBL), tumor necrosis factor (TNF) alpha, interleukin106(IL)-6, and IL-10 have been associated with increased susceptibility to RTIs. <sup>7,8,9,10,11,12,13</sup> Effects of107these common polymorphisms are especially important during early childhood.<sup>14</sup>

108 Interferon (IFN) pathways are of key importance in innate immune responses. Type I IFNs (including IFN- $\alpha$  and IFN- $\beta$ ) are secreted by infected cells after recognition of microbial 109 (particularly viral) products by cell surface and intracellular pattern recognition receptors.<sup>15</sup> IFNs 110 111 induce cell-intrinsic antiviral states leading to transcription of IFN-stimulated genes (ISGs) in 112 infected and neighboring cells. Type I IFNs promote antigen presentation and development of antigen-specific T- and B-cell responses but simultaneously restrain pro-inflammatory pathways.<sup>15</sup> 113 114 The function of several IFN-induced proteins with potential antiviral action and the effects of polymorphisms in ISGs are still poorly characterized. Interferon-induced protein 44-like (IFI44L) 115 116 protein belongs to the group of proteins encoded by ISGs. IFI44L is transcriptionally induced by 117 type I IFN signaling and is up-regulated in the antiviral response.<sup>16</sup> IFI44L has been reported to have antiviral activity<sup>16,17</sup> but the exact functions of this protein in the innate immune response are 118 119 not known. Previously reported SNPs rs273259 and rs1333969 in the IFI44L gene have been

120	suggested to have a functional effect on IFI44L protein. <sup>18,19</sup> However, there is no data on the
121	association of these common gene variants with the susceptibility to RTIs in children.
122	We aimed to determine the association of variant forms of IFI44L gene
123	polymorphisms rs273259 and rs1333969 with rates of RTIs, acute otitis media episodes, and
124	antibiotic treatment courses during first two years of age. Our study populations were derived from
125	two prospectively followed, independent population-based birth cohorts from Finland, Steps to the
126	Healthy Development and Well-being of Children (STEPS) and the FinnBrain Birth Cohort
127	Study. <sup>20,21</sup> The effect of IFI44L gene polymorphisms on blood messenger RNA (mRNA)
128	transcriptional profiles were analyzed in a subset of children in the FinnBrain Birth Cohort Study.
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139	METHODS
140	Study populations
141	This study was conducted within two prospective, population-based birth cohort studies: the STEPS
142	Study and the FinnBrain Birth Cohort Study. <sup>20,21</sup> Children born to their Finnish- or Swedish-
143	speaking mothers were eligible, and no other selection criteria were applied in either study. The
144	STEPS Study and the FinnBrain Birth Cohort Study protocols were approved by the Ethics

- 145 Committee of the Hospital District of Southwest Finland. The parents of the participating children146 gave written informed consent on their child's behalf.
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148 STEPS Study. A cohort of 1827 children born in 2008-2010 in the Hospital District of Southwest Finland were followed for RTIs from birth to two years of age.<sup>3,4</sup> During follow-up, parents 149 150 documented in a daily diary the presence of respiratory symptoms, physician visits with diagnoses 151 of RTIs, and antibiotic treatments for RTIs. In a subset of children (n = 923; 51%), at the onset of 152 respiratory symptoms, nasal swabs were obtained using flocked nylon swabs (Copan, Brescia, Italy) either at the study clinic or by the parents at home and sent to the laboratory.<sup>3</sup> Children were 153 154 examined by a study physician during an acute RTI if the parents felt that an evaluation was 155 needed. Blood samples for genetic analyses were obtained at two months of age. Data on 156 emergency department visits and hospitalizations was collected from the Hospital District of 157 Southwest Finland electronic healthcare records.

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159 FinnBrain Birth Cohort Study. A total of 1443 children born between 2011 and 2015 in the 160 Hospital District of Southwest Finland were followed for RTIs from birth to one year of age. Cord blood was collected at birth and used for genetic studies. Data on physician visits for RTIs, 161 162 physician-diagnosed respiratory infections (RTI, rhinitis, cough, acute otitis media, bronchiolitis, or pneumonia), and antibiotic treatments for RTIs were collected using monthly questionnaires. The 163 final analysis included children with successful genotyping and information on respiratory 164 165 infections (n = 971 for rs273259 and n = 972 for rs133969). At 3 months of age children were examined by a study physician, and from a subset of 71 children, nasal swabs were collected using 166 167 flocked nylon swabs (Copan) and blood samples were collected in Tempus tubes (Applied Biosystems, Foster City, CA) for mRNA analysis. At the time of collection of nasal and blood 168 169 samples infants were afebrile and without signs or symptoms of an RTI.

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# 171 **Respiratory virus detection**

Nasal swabs were stored at -80°C until analyses. Swabs were suspended in phosphate buffered 172 173 saline, and nucleic acids were extracted by NucliSense easyMag (BioMerieux, Boxtel, the Netherlands) or MagnaPure 96 (Roche, Penzberg, Germany) automated extractor. Extracted RNA 174 175 was reverse transcribed and the cDNA of the STEPS Study samples were amplified using real-time. 176 quantitative reverse- transcription polymerase chain reaction (RT-PCR) for rhinovirus, 177 enteroviruses, and respiratory syncytial virus (RSV).<sup>22, 23</sup> In the FinnBrain Birth Cohort Study, the Anyplex RV16 (Seegene, Seoul, Korea) multiplex PCR assay was performed according to the 178 179 manufacturer's instructions. This multiplex assay included the detection of adenovirus, bocavirus, 180 coronaviruses, enteroviruses, influenza A and B viruses, metapneumovirus, parainfluenza virus 181 types 1-4, rhinovirus, and RSV A and B.

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#### 183 **Definitions of respiratory infection outcomes**

184 In the STEPS Study, an episode of RTI was defined as the presence of rhinitis or cough, with or 185 without fever or wheezing, documented in the diary by the parents, or as a physician-diagnosed RTI as previously described.<sup>3</sup> The number of days with RTI symptoms was analyzed using data filled 186 187 into daily diaries by the parents. Acute otitis media was diagnosed by a study physician or recorded into the diary or medical records by a physician at an outpatient office or hospital. If there were 188 189 repeated diagnoses of acute otitis media during continuous respiratory symptoms, parallel diagnoses 190 within 14 days were calculated as one diagnosis. As rhinovirus was the most frequent virus identified in the STEPS Study<sup>3</sup>, we report separately the rates of rhinovirus-positive RTIs. 191 192 In the FinnBrain Birth Cohort study, the definition of an RTI was based on the 193 monthly parental report of physician-diagnosed acute RTIs. Each separate episode in one-month

194 period, and any episode that continued during the turn of the month, was defined as a separate195 event.

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## 197 Genetic analysis

In the STEPS Study, DNA was extracted from whole blood according to standard procedures and IFI44L SNPs rs273259 and rs1333969 were analyzed using the Sequenom platform (San Diego, CA) at Genome Center of Eastern Finland, University of Eastern Finland, Kuopio, Finland. In quality control analysis both SNPs had genotype missingness per marker below the threshold of 5% (2.7% and 1.1%, respectively) and both had non-significant Hardy-Weinberg *P* values (*P* = .61 and *P* = .30, respectively). SNPs rs273259 and rs1333969 show mild linkage disequilibrium (r<sup>2</sup>=0.58) among the Finnish population.<sup>24</sup>

- 205In the FinnBrain Birth Cohort Study, DNA was extracted from whole blood according206to standard procedures and genotyped with Illumina Infinium PsychArray BeadChip comprising207603132 SNPs at Estonian Genome Centre, Tartu, Estonia. Quality control was performed with208PLINK 1.9 (http://www.cog-genomics.org/plink/1.9/).<sup>25</sup> Markers were removed for missingness209(>5%) and Hardy-Weinberg equilibrium (P value < 1 x 10<sup>-6</sup>). Individuals were checked for missing210genotypes (>5%), relatedness (identical by descent calculation, PI\_HAT>0.2) and population211stratification (multidimensional scaling).
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## 213 Transcriptome analysis

214 Details of the transcriptome analysis are presented in this article's Online Repository. Briefly,

215 whole blood mRNA transcriptional profiles were analyzed in 71 infants from the FinnBrain Birth

- 216 Cohort Study at 3 months of age (Table E1). RNA was extracted and hybridized to Illumina HT-12
- 217 V4 beadchips (Illumina, San Diego, CA). Data was pre-processed and filtered as previously
- 218 described.<sup>26</sup> As there was low number of infants with minor/minor genotypes (Table E1), mRNA

219 expression and transcriptional profiles were compared between 1) major/major genotypes, and 2) 220 other genotypes (including major/minor and minor/minor genotypes). First, we analyzed if the 221 presence of IFI44L polymorphisms influenced IFI44L mRNA expression. To further explore if 222 IFI44L polymorphisms were associated with altered expression of other genes, we performed differential gene expression analysis between the genotypes. Limma<sup>27</sup> package in R with false 223 224 discovery rate (FDR) adjusted P value of 0.05 and 1.25 fold change were used to detect 225 differentially expressed genes (DEGs). To assess function of the DEGs and affected pathways, we used Gene Ontology (GO)<sup>28, 29</sup> biological processes terms and Ingenuity Pathway Analysis (IPA) 226 software (QIAGEN, Redwood City, CA, USA). The data is deposited in the NCBI Gene Expression 227 228 Omnibus (GEO accession number: XXX).

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#### 230 Statistical analysis

231 In the STEPS Study, the association between the IFI44L genotypes and respiratory infection outcomes in children 0-2 years of age were analyzed using negative binomial regression analysis 232 233 with natural logarithm of the follow-up time as an offset. Unadjusted and adjusted incidence rate 234 ratios (aIRR, adjusted for sex and the presence of sibling(s) at birth) were reported. In the FinnBrain 235 Birth Cohort Study, the association between the IFI44L genotypes and RTIs and antibiotic 236 treatments for RTIs from birth to 1 year of age were first tested with linear regression analysis 237 implemented with PLINK (Purcell). The number of RTIs was then categorized in four groups: 0, 1-238 4, 5-10, and >10, and the number of antibiotic courses in three groups: 0, 1-4, and 5 or more. Final 239 analysis with adjustment for sex and the presence of sibling(s) at birth was done using ordinal 240 logistic regression to explore whether the odds of being in a higher category was associated with the 241 heterozygous or homozygous polymorphisms of IFI44L. The selection of sex and presence of sibling(s) as covariates in the final models was based on *a priori* knowledge. We have previously 242 published that, in the STEPS Study, male sex and the presence of older siblings were risk factors for 243

244 respiratory infection outcomes, while breastfeeding, parental smoking or daycare attendance were

245 not associated with an increased risk of respiratory infections<sup>13</sup>. Regression analyses were

246 performed using R 3.5.3. Two-tailed *P* values of less than .05 were considered significant.

247

#### 248 **RESULTS**

In the STEPS Study, the final analysis included 1135 children that had genotypes and RTI data, including 738 with data on rhinovirus etiology of RTIs. In the FinnBrain cohort, the final analysis included children with successful genotyping and data on RTIs (n = 970 for rs273259 and n = 971for rs133969). Background characteristics and allelic distribution of IFI44L polymorphisms in both cohorts are presented in Table 1 and RTI-related outcomes in Table 2.

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#### 255 IFI44L genotypes and respiratory infections in the STEPS Study cohort

Rates of all RTIs and rhinovirus-positive RTIs were similar in the first 2 years of life in children
with different IFI44L genotypes (Table 3). Slightly decreased rates of days with RTI symptoms
were observed among children with genetic variants. This difference was significant only for
children with the CT (major/minor) genotype of rs1333969 compared to those with the CC
(major/major) genotype (aIRR, 0.89 [95% CI, 0.81-0.98]).

261 The minor G allele of the rs273259 polymorphism was associated with decreased rates of acute otitis media both in unadjusted and adjusted analysis (Table 3 and Table E2). 262 Children with a homozygous GG (minor/minor) genotype had lower rates of acute otitis media 263 compared to children with the AA (major/major) genotype (aIRR, 0.77 [95% CI, 0.61-0.96]). 264 Similarly, the minor T allele of the rs1333969 polymorphism was associated with decreased rates of 265 266 acute otitis media. GG (minor/minor) genotype of the rs273259 and TT (minor/minor) genotype of the rs1333969 were associated with lower rates of antibiotic courses for RTIs compared with 267 children with the respective major/major genotypes (aIRR [95% CI] for rs273259, 0.76 [0.62-0.95], 268

and for rs1333969, 0.73 [0.56-0.97]).

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#### 271 IFI44L genotypes and respiratory infections in the FinnBrain Study cohort

272	In ordinal	logistic	regression	analyses	adjusted	for sex a	and presence	e of sibling(s)	, the G	allele of t	the

rs273259 polymorphism in the IFI44L gene was associated with lower number of RTIs during the

first year of life. Children with the minor/minor genotype GG had an odds ratio (OR) of 0.64 [95%

275 CI, 0.42-0.97], P = .04, and children with the major/minor AG genotype an OR of 0.65 [95% CI,

 $276 \quad 0.48-0.86$ ], P = .003, for RTI frequency compared to the major/major genotype (Table 4). The

rs1333969 minor allele T was similarly associated with a decreased frequency of RTIs.

278 The heterozygous genotypes rs273259 AG and rs1333969 CT were significantly

associated with decreased rates of antibiotic courses for RTIs from birth to 1 year of age compared

to the major/major genotypes (P = .02 and P = .04, respectively). Rates of antibiotic courses were

also lower in children with minor/minor compared with major/major genotypes of these

282 polymorphisms but differences were not statistically significant.

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## 284 Effects of IFI44L gene variants on peripheral blood transcription patterns

Blood mRNA transcriptional profiles were analyzed in 71 asymptomatic infants 3 months of age
from the FinnBrain Birth Cohort Study. The demographic characteristics, distribution of IFI44L
polymorphisms, and virus detections in these children are presented in Table E1. At least one
respiratory virus was detected in 25 (35%) of these children, rhinovirus being the most frequently
detected.

First, we compared IFI44L expression in all 71 children according to the rs273259
and rs1333969 genotypes and found no differences between the groups (Figure 1, panels A and B).
Next, we compared IFI44L expression in a subset of children (n = 25; Table E2) who were positive
at least for one respiratory virus. In these virus-positive children, rs1333969 genotype CC

294 (major/major) was associated with higher IFI44L expression (P = .0036). Similar findings were 295 observed with the rs273259 genotype (P = .048) (Figure 1, panels C and D.

To explore if different IFI44L genotypes were associated with differences in the 296 297 expression of other genes we performed differential gene expression analysis among all children. No DEGs were detected when comparing rs273259 and rs1333969 (major/major vs. other 298 299 genotypes). However, when we included only children with virus detections (n = 25) and compared 300 the rs1333969 CC (major/major) genotype to other genotypes, we identified 116 DEGs. (Table E3, 301 Figure E2). Of these 116 DEGs, 105 (91%) were overexpressed and 11 (9%) were underexpressed 302 in the CC (major/major) genotype. These DEGs were strongly associated with activation of the 303 interferon pathway and immune responses against viruses. Gene set analysis showed that the most significant GO biological process was "type I interferon signaling pathway" with 17/66 overlapping 304 transcripts ( $P = 3.3 \times 10^{-21}$ ; Table E4). Interferon signaling was also the most significant pathway 305 306 using IPA (12/36 genes;  $P = 1.4 \times 10^{-18}$ ; Figure 2).

In similar analysis comparing the rs273259 genotypes among infants with virus 307 308 detection, we identified 23 DEGs (Table E5, Figure E3). Of these 23 DEGs, 19 (82%) were 309 overexpressed and 4 (18%) were underexpressed in the AA (major/major) genotype. These DEGs 310 included immune response related genes such as interferon gamma (IFNG), granulysin (GNLY), 311 and granzyme A (GZMA). However, no statistically significant GO biological processes or IPA 312 pathways were identified (data not shown). When comparing the DEGs associated with rs1333969 (n = 116) and rs273259 (n = 23) genotypes, we found that 16 DEGs were identified in both 313 314 comparisons (Figure 3).

315 Comparing virus-positive and virus-negative asymptomatic children irrespective of 316 gene polymorphisms, we found no differences in IFI44L expression or in differential gene 317 expression analysis (data not shown).

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#### 319 **DISCUSSION**

In two independent, population-based, prospective birth cohort studies, we analyzed the influence of two common SNPs in IFI44L, a type I interferon gene, on children's susceptibility to RTIs. The variant forms of IFI44L were protective against early-childhood RTIs or acute otitis media in both cohorts. Further, we demonstrated that these gene polymorphisms were associated with altered expression of IFI44L and other transcripts belonging to type I interferon signaling pathways in children with an asymptomatic respiratory virus detection.

326 In the STEPS Study cohort, we found that the IFI44L gene variants had no effect on the rates of all RTIs or RTIs associated with rhinovirus. However, minor G allele of rs273259 and 327 328 minor T allele of rs1333969 were associated with a small decrease in the number of days with RTI symptoms per year and with a substantial decrease in the rate of acute otitis media from birth to 2 329 330 years of age. In the FinnBrain Birth Cohort Study, we found that the minor alleles of rs273259 and 331 rs1333969 were associated with a decreased RTI frequency during the first year of life. The inconsistencies in the results may be explained by differences in the follow-up period and outcomes 332 333 between the two birth cohorts. In the STEPS Study, RTI data was largely based on a daily symptom 334 diary kept by parents, documenting also very mild infections. Only 41% of RTIs required a physician visit.<sup>3</sup> The FinnBrain Cohort was followed less intensively, and only RTIs for which a 335 336 physician visit was needed were recorded. The effect of IFI44L polymorphisms in the STEPS Study on the rate of acute otitis media—which is the most common complication of a viral RTI in 337 children—is in line with an effect on RTIs in the FinnBrain Cohort where acute otitis media was not 338 339 separately recorded. Associations of minor alleles of IFI44L with a lower rate of antibiotic use for 340 RTIs in both cohorts suggests that these gene variants protect against more severe RTI, which can 341 possibly be complicated with a bacterial infection.

The role of ISGs in the immune defense is poorly described. IFI44L expression
 increases after infection of dendritic cells with measles virus<sup>30</sup> or airway epithelial cells with RSV

or influenza virus.<sup>31</sup> Upregulation of ISGs including IFI44L has been associated with the 344 persistence of hepatitis E virus.<sup>17</sup> IFI44L is shown to negatively modulate innate immune responses 345 in the context of a viral infection, and decreasing IFI44L expression impairs viral replication.<sup>32</sup> 346 Moreover, IFI44L had direct antiviral effects towards hepatitis C virus in a large-scale ISG screen.<sup>16</sup> 347 H28, a mouse homolog for human IFI44L gene, affects the susceptibility to viral myocarditis in a 348 mouse model.<sup>33</sup> Determination of the transcription activation of IFI44L has been recently suggested 349 as a diagnostic tool to discriminate between viral and bacterial infections.<sup>34,35</sup> These findings 350 351 illustrate the importance of a balanced regulation of IFI44L in the immune response against viral 352 infections. With this background it is rather surprising that IFI44L polymorphisms were associated 353 with acute otitis media and physician-diagnosed RTIs, but not with the rates of documented rhinovirus infections. Acute otitis media in children can be caused by viruses, bacteria, or both, and 354 it almost always develops during or after a viral infection.<sup>36</sup> Our results suggest that an appropriate 355 356 level of IFI44L activation is important for young children in order to contain viral RTIs and prevent development of acute otitis media. 357

358 Previous data on functional effects of polymorphisms in the IFI44L gene is limited. 359 An association between major alleles in IFI44L rs273259 and intronic rs1333973 and elevated 360 levels of measles-specific neutralizing antibodies in children has been reported.<sup>18</sup> The IFI44L rs273259 and rs1333973 polymorphisms are in complete linkage disequilibrium ( $r^2$  1.0) and thus 361 362 most likely represent the effect of the same gene loci.<sup>24</sup> A tendency for febrile seizures following measles, mumps, and rubella vaccination has been associated with the major A allele of rs273259.<sup>18</sup> 363 These reports suggest that the major allele of rs273259 associates with strong immune or 364 365 inflammatory responses after a stimulus such as a live vaccine.

We used transcriptional profiling at the age of 3 months to better understand whether these polymorphisms influenced gene expression. Differences were seen only in children positive for a respiratory virus, although they had no apparent symptoms of an infection at the time of 369 sample collection. Compared to children with major/major genotypes under this natural
370 immunologic stimulus, children with major/minor or minor/minor genotypes had weaker
371 transcription activity of IFI44L and, also, of expression of other type I interferon signaling pathway
372 genes. Although the numbers of subjects were limited, these results suggest that a relatively weak
373 interferon response could be beneficial in terms of development of symptomatic RTIs or acute otitis
374 media. Symptoms of respiratory virus infections are largely mediated by the host response, which
375 may explain these findings.

376 Strengths of this study include large study populations from two independent birth cohorts, detailed follow-up of RTIs particularly in the STEPS Study, and search for functional 377 378 effects of IFI44L polymorphisms by global transcriptome analysis in children with or without a 379 virus infection. Our study also has limitations. Clinical outcomes were partly different between the 380 two cohorts, and in the Finnbrain Cohort study follow-up was not as detailed as in the STEPS 381 Study. However, data such as antibiotic use for RTIs was similar in both cohorts and the findings 382 support each other. Both cohorts were from Finland and corresponding data from other populations 383 would be informative. Transcriptome data was available from a subset of children and larger studies 384 are needed to validate the findings.

In conclusion, we report an effect of IFI44L rs273259 and 1333969 polymorphisms on susceptibility to RTIs in early childhood. Minor alleles associated with lower rates of RTIs or acute otitis media and with weaker interferon response. The exact mechanisms how the polymorphisms affect the immune functions need further investigation.

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491 **Figure legends** 

#### 492 Figure 1. Expression values of IFI44L according to IFI44L polymorphisms and virus

493 **detection.** In 71 children with transcriptome data available there were no differences in IFI44L

494 expression according to rs1333969 (panel A) or rs273259 (panel B) genotype. However, in a

495 subgroup of children with respiratory virus detection at the time of mRNA sampling (n = 25),

496 IFI44L expression differed according to the genotype (panels C and D). In virus-positive children

497 rs1333969 major/major genotype was associated with higher IFI44L overexpression compared to

498 other genotypes (major/minor and minor/minor genotypes combined) (panel C; Mann-Whitney P =

499 .0036). Similar finding was observed with rs273259 (panel D; P = .048).

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503

#### 501 Figure 2. rs1333969 genotype of ILI44L affects expression of other transcripts in the

502 **interferon signaling pathway.** We performed global transcriptome analysis in respiratory virus-

positive (n = 25) children and detected 116 genes that were differentially expressed between the

504 rs1333969 major/major and other (major/minor and minor/minor) genotypes. Using gene set

analysis approach and Ingenuity Pathway Analysis (IPA) software, we detected that interferon

506 signaling pathway was the most affected pathway with 12/36 overlapping genes ( $P = 1.4 \times 10^{-18}$ ).

507 Differentially expressed transcripts in the interferon type II and type I signaling pathways are

508 highlighted with purple.

509

# 510 Figure 3. Venn diagram presenting the number of differentially expressed and overlapping

511 genes in children with different genotypes of rs1333969 and rs273259 polymorphisms.

512 Differential expression analysis was performed comparing major/major genotype to other

513 genotypes (major/minor and minor/minor). False discovery rate adjusted P value .05 and 1.25 fold

514 change were used as cut-offs for differentially expressed genes.

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516

517 Figure 1





518

519 Figure 2.



521 Figure 3.



522 523 Table I. Background characteristics and allelic distribution of IFI44L polymorphisms in children in

the STEPS Stu	dy and in the	e FinnBrain	Birth	Cohort Stu	ıdy
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	STEPS Study, No. (%)	FinnBrain Cohort, No. (%)
Female	612 (53.9)	464 (47.8)
Older siblings	612 (53.9)	463 (49.3) <sup>a</sup>
IFI44L rs273259		
GG	147 (13.0)	133 (14.0) <sup>b</sup>
AG	497 (43.8)	441 (45.0)
AA	491 (43.3)	396 (41.0)
IFI44L rs1333969		
TT	80 (7.0)	79 (8.0)
СТ	414 (36.5)	357 (37.0)
CC	641 (56.6)	535 (55.0)

<sup>a</sup> Data is missing for 31 children

<sup>b</sup> N=970

Clinical outcomes	
STEPS Study, $n = 1135$	
Length of follow-up, years, median (IQR)	2.0 (1.5-2.0)
RTIs during age 0-2 years, incidence rate per child-year (95% CI) <sup>a</sup>	
RTI episodes	5.9 (5.7-6.0)
Days with RTI symptoms	50.4 (48.2-52.7)
Rhinovirus-positive RTIs	2.0 (1.9-2.1)
Acute otitis media episodes	1.0 (0.9-1.0)
Antibiotic courses for RTIs	1.3 (1.2-1.4)
FinnBrain cohort, $n = 972$	
Number of RTIs during age 0-1 year, No. (%) <sup>b</sup>	
0	627 (64.5)
1–4	281 (29.0)
5–10	61 (6.2)
>10	3 (0.3)
Number of antibiotic treatments for RTIs during age 0-1 year, No.	
(%)	
0	710 (73.0)
1–4	235 (24.0)
>4	27 (3.0)
	c

Table II. Clinical outcomes in the STEPS Study and in the FinnBrain Birth Cohort Study

CI, confidence interval; IQR, interquartile range; RTI, respiratory tract infection.

<sup>a</sup> Includes all RTIs with or without a physician visit. Incidence rates were calculated using negative

binomial distribution and log-link with natural logarithm of the follow-up time as an offset.

<sup>b</sup> Includes only RTIs that necessitated a physician visit.

Table III. Association between IFI44L polymorphisms and rates of respiratory tract infections

(RTIs) and related outcomes during age 0-2 years in the STEPS Study children  $(n = 1135)^a$ 

	IFI44L gene polymorphism	Genotype (No.)	Incidence rate per child-year (95% CI) <sup>a</sup>	Incidence rate ratio (95% CI) <sup>a</sup>	Р
RTIs	rs273259	AA (491)	6.0 (5.7-6.3)	reference	
		AG (497)	5.8 (5.6-6.1)	0.98 (0.92-1.04)	.46
		GG (147)	5.7 (5.3-6.2)	0.97 (0.89-1.06)	.56
	rs1333969	CC (641)	6.0 (5.7-6.2)	reference	
		CT (414)	5.7 (5.4-6.0)	0.96 (0.90-1.01)	.14
		TT (80)	6.0 (5.4-6.7)	1.04 (0.93-1.16)	.46
<b>Rhinovirus-positive RTIs</b>	rs273259	AA (319)	2.1 (1.9-2.2)	reference	
		AG (321)	1.9 (1.7-2.0)	0.92 (0.83-1.03)	.16
		GG (96)	2.1 (1.8-2.5)	1.05 (0.89-1.24)	.54
	rs1333969	CC (409)	2.0 (1.9-2.2)	reference	
		CT (269)	1.9 (1.8-2.1)	0.95 (0.85-1.06)	.35
		TT (58)	2.2 (1.8-2.6)	1.12 (0.93-1.36)	.24
Days with RTI symptoms	rs273259	AA (445)	52.2 (48.7-55.9)	reference	
		AG (457)	50.0 (46.8-53.6)	0.96 (0.87-1.06)	.41
		GG (134)	45.6 (40.3-51.8)	0.90 (0.78-1.04)	.13
	rs1333969	CC (579)	52.7 (49.6-56.0)	reference	
		CT (384)	47.2 (43.9-50.9)	0.89 (0.81-0.98)	.02
		TT (73)	48.8 (41.3-58.1)	0.96 (0.81-1.15)	.67
Acute otitis media episodes	rs273259	AA (491)	1.1 (1.0-1.2)	reference	
		AG (497)	0.9 (0.8-1.0)	0.87 (0.75-1.01)	.07
		GG (147)	0.8 (0.6-1.0)	0.77 (0.61-0.96)	.02
	rs1333969	CC (641)	1.0 (1.0-1.2)	reference	
		CT (414)	0.9 (0.8-1.0)	0.87 (0.75-1.01)	.06
		TT (80)	0.7 (0.6-1.0)	0.74 (0.55-0.99)	.04
Antibiotic courses for RTIs	rs273259	AA (491)	1.4 (1.3-1.6)	reference	
		AG (497)	1.3 (1.1-1.4)	0.89 (0.78-1.03)	.13
		GG (147)	1.0 (0.9-1.3)	0.76 (0.62-0.95)	.02
	rs1333969	CC (641)	1.4 (1.3-1.5)	reference	
		CT (414)	1.3 (1.1-1.4)	0.91 (0.79-1.05)	.18
		TT (80)	1.0 (0.7-1.3)	0.73 (0.56-0.97)	.03

CI, confidence interval; RTI, respiratory tract infection.

<sup>a</sup> Incidence rates were analysed using negative binomial regression analysis with natural logarithm

of the follow-up time as an offset, adjusting for sex and the presence of sibling(s) at birth.

Table IV. Associations between IFI44L polymorphisms and the frequency of respiratory tract infections (RTIs) and antibiotic treatments for respiratory infections in the FinnBrain cohort (n = 971 for rs133969 and n = 970 for rs273259)

	IFI44L gene	Genotype (No.)	OR (95% CI) <sup>a</sup>	Р
	polymorphism			
RTIs <sup>b</sup>	rs273259	AA (396)	reference	
		AG (441)	0.65 (0.48-0.86)	.003
		GG (133)	0.64 (0.42-0.97)	.04
	rs1333969	CC (535)	reference	
		CT (357)	0.70 (0.53-0.94)	.02
		TT (79)	0.67 (0.40-1.09)	.11
Antibiotic courses	rs273259	AA (396)	reference	
for RTIs <sup>c</sup>				
		AG (441)	0.68 (0.50-0.93)	.02
		GG (133)	0.76 (0.48-1.18)	.23
	rs1333969	CC (535)	reference	
		CT (357)	0.72 (0.52-0.98)	.04
		TT (79)	0.92 (0.53-1.53)	.75

CI, confidence interval; OR, odds ratio; RTI, respiratory tract infection.

<sup>a</sup> Ordinal logistic regression adjusted for sex and presence of sibling(s) at birth.

<sup>b</sup> The frequency of acute respiratory infections from birth to 1 year of age was categorized in four

groups: 0, 1-4, 5-10, and >10 respiratory tract infections.

<sup>c</sup> The number of antibiotic courses from birth to 1 year of age was categorized in three groups: 0, 1-

4, and 5 or more antibiotic treatments.

#### **Online repository**

Associations between IFI44L gene variants and rates of respiratory tract infections during early childhood

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#### **Statistical analysis**

In the STEPS Study, the association between IFI44L polymorphisms rs273259 and rs1333969 and the incidence rate of respiratory tract infections (RTIs), rhinovirus-positive RTIs, days with RTI symptoms, acute otitis media episodes, and antibiotic treatments for RTIs during age 0-2 years were analyzed using negative binomial regression analysis with natural logarithm of the follow-up time as an offset, adjusting for sex and the presence of sibling(s) at birth (using R version 3.5.3). In the FinnBrain Birth Cohort Study, the associations between single nucleotide polymorphisms (SNPs) rs273259 and rs1333969 and RTIs as well as antibiotic courses for RTIs were tested with linear regression analysis implemented with PLINK.<sup>1</sup> Final analysis with adjustment for sex and the presence of sibling(s) at birth was done using ordinal logistic regression. The ordinal logistic regression analyses were performed in R  $3.5.3^2$  using the polr function in the MASS package.<sup>3</sup> Two-tailed *P* values were reported, with *P* <0.05 considered statistically significant.

#### **Transcriptome analysis**

#### mRNA samples

Data on mRNA transcriptional profiles was available from a subset of 81 children in the FinnBrain study cohort. Four samples were excluded due to low sample quality and 6 samples were excluded due to missing data on IFI44L polymorphisms. Subsequently, samples from 71 children were included in the downstream analyses. (Table S2).

#### mRNA sample collection and data pre-processing

Blood samples were collected during a pre-scheduled study visit at 3 months of age. 1 ml of blood was drawn in Tempus tubes (Applied Biosystems, Foster City, CA) and stored in -20 °C. RNA was extracted and hybridized to Illumina HT-12 V4 beadchips (Illumina, San Diego, CA). After hybridization beadchips were scanned on Illumina Beadstation 500 and Illumina GenomeStudio software (Illumina, San Diego, CA) was used to subtract background and for average signal intensity scaling (average normalization). All raw expression values <10 were set to 10 and the data was log2-transformed.

# Data analysis

As the number of children with minor/minor genotypes was low (Table S2), minor/minor homozygotes (rs1333969 TT and rs273259 GG) and major/minor heterozygotes (rs1333969 CT and rs273259 AG) were combined in a single class ("other genotype") for each of the studied polymorphism and gene expression analyses were performed by comparing major/major genotypes to "other genotypes" (including major/minor and minor/minor).

#### IFI44L expression

HT-12 V4 beadchips contain two probes targeting IFI44L (ILMN\_1723912 and ILMN\_1835092). The expression values of these two probes were highly correlated (Spearman r 0.906, P < 0.0001, Figure S1) and the mean of the two probes was used as expression value for IFI44L. Expression

values were analyzed according to genotype and virus detection and compared by the Mann-Whitney test. Analysis was performed using GraphPad Prism software version 8.0.0 (Graphpad, San Diego, CA).

#### Differential gene expression analysis

Data was first filtered by including only transcripts that were 'present' (signal precision <0.01) in  $\geq 10\%$  of the samples (PAL10%, 18,636 transcripts) in the downstream analyses. limma<sup>4</sup> package and R<sup>2</sup> version 3.5.1 were used to detect differentially expressed genes (DEGs) between the groups. False discovery rate (FDR) corrected *P* value 0.05 and 1.25 fold change were used as cut-offs for DEGs. Gene set analysis was performed for functional characterization of DEGs by analyzing Gene Ontology (GO)<sup>5,6</sup> biological processes terms associated with DEG lists. For this we used PANTHER overreprentation test (available at http://geneontology.org/) with Homo sapiens reference gene list and Fisher's exact test with Benjamini-Hochberg multiple test correction. Ingenuity Pathway Analysis software (QIAGEN, Redwood City, CA, USA) was used to further explore affected pathways.

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**Figure E1.** Correlation of the expression values of two probes targeting IFI44L in the Illumina HT-12 V4 beadchips (ILMN\_1723912 and ILMN\_1835092) in 71 children with transcriptome data available. As the two expression values had a strong correlation (Spearman r 0.906, P < 0.0001), a mean value of the two probes was used in downstream analyses. All values are log2 transformed.

**Figure E2.** Heatmap visualising the expression levels of 134 probes targeting 116 differentially expressed genes (DEGs) between rs1333969 CC (major/major) and other genotypes in children with viral detections (n=25). False discovery rate corrected *P* value 0.05 and 1.25 fold change were used as cut-offs to detect DEGs. DEGs are listed in Supplementary Table 3. Expression values are log2 transformed and normalized to median of the class "other genotype" (including CT [major/minor] and TT [minor/minor] genotypes). Samples are clustered using hierarchical clustering and Euclidean distance and colored according to rs1333969 genotype: CC (major/major)=green; CT (major/minor)=grey; TT (minor/minor)=magenta. DEG, differentially expressed gene

**Figure E3.** Heatmap visualising the expression levels of 24 probes targeting 23 differentially expressed genes (DEGs) between rs273259 AA (major/major) and other genotypes in children with viral detections (n=25). False discovery rate corrected *P* value 0.05 and 1.25 fold change were used as cut-offs to detect DEGs. DEGs are listed in Supplementary Table 5. Expression values are log2 transformed and normalized to median of the class "other genotype" (including AG [major/minor] and GG [minor/minor] genotypes). Samples are clustered using hierarchical clustering and Euclidean distance and colored according to rs273259 genotype: AA (major/major)=green; AG (major/minor)= grey; GG (minor/minor) magenta.

DEG, differentially expressed gene

Figure E1.



Figure E2.



25 samples

Figure E3.



25 samples

Table E1. Background characteristics, allelic distribution of IFI44L polymorphisms, and

respiratory viruses detected at 3 months of age in children included in transcriptome analysis in the

FinnBrain Birth Cohort Study.

	FinnBrain Cohort, No. (%)
Female	36 (51)
Older siblings	31 (44)
IFI44L rs273259	
GG	11 (15)
AG	33 (47)
AA	27 (38)
IFI44L rs1333969	
TT	6 (8)
СТ	30 (42)
CC	35 (50)
Detection of $\geq 1$ respiratory virus*	25 (36)
Rhinovirus	16 (23)
Adenovirus	3 (4)
Coronavirus	3 (4)
Respiratory syncytial virus	2 (3)
Bocavirus	1 (1)
Influenza A virus	1 (1)

\* Data on respiratory viruses was available from 70/71 children. 1 child had two viruses (rhinovirus

and adenovirus) detected concomitantly.

**Table E2**. Unadjusted analysis of association between IFI44L polymorphisms with rates ofrespiratory tract infections (RTIs) and related outcomes during age 0-2 years in the STEPS Studychildren (n=1135)<sup>a</sup>

	IFI44L	Genotype	Incidence rate	Unadjusted	Р
	polymorphism	(No.)	per child-year	incidence rate	
			(95% CI) <sup>a</sup>	ratio (95% CI) <sup>a</sup>	
RTIs	rs273259	GG (147)	5.7 (5.3-6.2)	0.95 (0.87-1.04)	.28
		AG (497)	5.8 (5.6-6.1)	0.97 (0.91-1.03)	.35
		AA (491)	6.0 (5.7-6.3)	reference	
	rs1333969	TT (80)	6.0 (5.4-6.7)	1.01 (0.90-1.13)	.91
		CT (414)	5.7 (5.4-6.0)	0.95 (0.90-1.01)	.12
		CC (641)	6.0 (5.7-6.2)	reference	
Rhinovirus-positive	rs273259	GG (96)	2.1 (1.8-2.5)	1.04 (0.88-1.23)	.62
RTIs		AG (321)	1.9 (1.7-2.0)	0.92 (0.83-1.03)	.17
		AA (319)	2.1 (1.9-2.2)	reference	
	rs1333969	TT (58)	2.2 (1.8-2.6)	1.10 (0.90-1.33)	.36
		CT (269)	1.9 (1.8-2.1)	0.96 (0.86-1.07)	.46
		CC (409)	2.0 (1.9-2.2)	reference	
Days with RTI	rs273259	GG (134)	45.6 (40.3-51.8)	0.87 (0.76-1.01)	.06
symptoms		AG (457)	50.0 (46.8-53.6)	0.96 (0.87-1.06)	.40
		AA (445)	52.2 (48.7-55.9)	reference	
	rs1333969	TT (73)	48.8 (41.3-58.1)	0.93 (0.78-1.11)	.41
		CT (384)	47.2 (43.9-50.9)	0.90 (0.81-0.99)	.03
		CC (579)	52.7 (49.6-56.0)	reference	
Acute otitis media	rs273259	GG (147)	0.8 (0.6-1.0)	0.74 (0.59-0.93)	.01
episodes		AG (497)	0.9 (0.8-1.0)	0.86 (0.74-1.00)	.05
<b>_</b>		AA (491)	1.1 (1.0-1.2)	reference	
	rs1333969	TT (80)	0.7 (0.6-1.0)	0.70 (0.52-0.94)	.02
		CT (414)	0.9 (0.8-1.0)	0.87 (0.75-1.01)	.07
		CC (641)	1.0 (1.0-1.2)	reference	
Antibiotic courses for	rs273259	GG (147)	1.0 (0.9-1.3)	0.73 (0.59-0.91)	.01
RTIs		AG (497)	1.3 (1.1-1.4)	0.88 (0.77-1.02)	.10
		AA (491)	1.4 (1.3-1.6)	reference	
	rs1333969	TT (80)	1.0 (0.7-1.3)	0.70 (0.53-0.92)	.01
		CT (414)	1.3 (1.1-1.4)	0.90 (0.78-1.05)	.18
		CC (641)	1.4 (1.3-1.5)	reference	

CI, confidence interval; RTI, respiratory tract infection.

<sup>a</sup> Incidence rates were analysed using negative binomial regression analysis with natural logarithm of the follow-up time as an offset.

Table E3. List of 116 differentially expressed genes (DEGs) between rs1333969 CC (major/major) and other genotypes in children with viral detections (n=25). False discovery rate corrected P value 0.05 and 1.25 fold change were used as cut-offs to detect DEGs. Along with the Gene symbol, also the Illumina probe identifier and expression level in rs1333969 CC (major/major) is presented. "+" denotes higher expression level and "-" lower expression level compared to other genotypes.

Gene Symbo	1	Illumina	probe	identifier	Expression	level	in
rs1333969	CC (major/	major) ge	notype				
AIM2	ILMN_16813	301	+				
ANKRD22	ILMN_21325	599	+				
APOBEC3G	ILMN_18021	L06	+				
APOL3	ILMN_17568	362	+				
ASCL2	ILMN_17234	112	+				
ATF3	ILMN 23748	365	+				
AURKA	ILMN 16809	955	+				
BATF	ILMN 16688	322	+				
BATF2	ILMN 16902	241	+				
BIRC5	ILMN 23494	159	+				
BLVRA	ILMN 16914	136	+				
BST2	ILMN 32591	L46	+				
C3orf14	ILMN 22244	186	+				
CCNA2	ILMN 17861	L25	+				
CCNB2	ILMN 18019	939	+				
CD48	ILMN 20610	)43	+				
CDC20	ILMN 16633	390	+				
CDC45	ILMN 16702	238	+				
CENPE	ILMN 17162	279	+				
CEP55	ILMN 17470	016	+				
CKS2	ILMN 17563	326	+				
CST7	ILMN 16798	326	+				
CXCL10	ILMN 17917	759	+				
DHX58	ILMN 16784	122	+				
DLGAP5	ILMN 32397	771	+				
DTX3L	ILMN 17843	380	+				
EPSTI1	ILMN 23885	547	+				
FABP5	TLMN_32666	506	+				
FASLG	ILMN 17818	324	+				
FBX06	TLMN 17014	155	+				
FGFBP2	TLMN 17619	945	+				
GBP1	TLMN 21487	785	+				
GBP2	TLMN 1774	77	+				
GBP4	TLMN 17713	385	+				
GBP5	TLMN 2114	568	+				
GCH1	TLMN 18127	759	+				
GINS2	TLMN 18095	590	+				
GNLY	TLMN 17906	592	+				
GZMA	TLMN 17793	824	+				
C7MB	TLMN 21094	189	+				
GZMH	TLMN 17312	222	+				
HCST	TLMN 23960	991	+				
HERCS	TLMN 17207	749	+				
HMMR	TLMN 24003	220	+				
HSPR11	TLMN 16813	340	+				
	TTUTIN TOOTC	U					

IDH2	ILMN 1751753	+
IFI35	ILMN 1745374	+
IFI44	ILMN 1760062	+
IFI44L	ILMN 1723912	+
IFI6	ILMN_2347798	+
тғтт1	TLMN 1707695	+
TFTT2	TLMN 1739428	+
TETE?	TIMN 1701789	+
TETEMS	TIMN 1905750	
IFIIMS	ILMN_1003730	
IFNG	1LMN_2207291	+
IRFI	1LMN_1/083/5	+
IRF'/	1LMN_2349061	+
ISG15	ILMN_2054019	+
KDELC2	ILMN_1651557	+
KIAA0101	ILMN_2285996	+
KIF2C	ILMN_1685916	+
LAG3	ILMN_1813338	+
LAP3	ILMN 3295494	+
LY6E	ILMN 1695404	+
MT1A	ILMN 1691156	+
MT1E	ILMN 2173611	+
MT1F	TLMN 1718766	+
MT1TP	TLMN 2136089	+
MT2Δ	TLMN 1686664	+
NCADC	$\frac{1100}{1000004}$	- -
NCAFG NKC7	TIMN 1692003	T
NRG/	1LMN_1002995	T
OASI	11MN_2410020	
UAS3	1LMN_1/4539/	+
OASL	1LMN_16/4811	+
PARP12	ILMN_1718558	+
PARP9	ILMN_1731224	+
PARPBP	ILMN_1727055	+
PI4K2B	ILMN_1815134	+
POLE2	ILMN_1774336	+
PRC1	ILMN_1728934	+
PSMA3	ILMN_2387553	+
PSMB8	ILMN_2390299	+
PSMB9	ILMN_2376108	+
PSME2	ILMN 1786612	+
PTTG1	ILMN 2042771	+
PTTG3P	ILMN 2049021	+
RARRES3	ILMN 1701613	+
RSAD2	ILMN 1657871	+
RТР4	TLMN 2173975	+
SCO2	TLMN 1701621	+
SERPING1	TLMN 1670305	+
SCOT 1	TIMN 1730825	+
SGOLI SD140	TIMN 2246992	- -
SP140	1 LMN _2240002	
SPATSZL	1LMN_1083678	+
STATL MAD1	1 = 1 = 1 = 1 = 1 = 1 = 1 = 1 = 1 = 1 =	+
TAPI		+
TIMM23	1LMN_1664231	+
TKl	ILMN_1806037	+
TRIM22	ILMN_1779252	+
TYMP	ILMN_3223126	+
TYMS	ILMN_1806040	+
UBE2C	ILMN_2301083	+
UBE2L6	ILMN_1769520	+
	-	

USP18	ILMN_3240420	+
VAMP5	ILMN 1809467	+
ADAM19	ILMN_1713751	-
ALOX15	ILMN 1783443	-
CAMK2G	ILMN_2359601	-
DPEP2	ILMN_1689160	-
EMR4P	ILMN_3243190	-
LZTR1	ILMN_1805161	-
MEGF6	ILMN_3241441	-
OVGP1	ILMN_1734542	-
PRSS33	ILMN_1736831	-
PVALB	ILMN_2069224	-
RELL1	ILMN_3233388	-

**Table E4.** Gene Ontology (GO) biological process terms associated with the 116 differentially expressed genes (DEG) between IFI44L rs1333969 genotypes. Association between the GO biological process terms and the DEG lists is presented as an overlap between the GO terms and the DEG list and with a *P* value determining the probability that the overlap would be explained by chance alone. *P* values are calculated using Fisher's exact test with Benjamini-Hochberg multiple test correction.

GO Biological Process Term	Overlap	Adjusted P value
Type I interferon signaling pathway (GO:0060337)	17/66	3.3E-21
Cellular response to type I interferon (GO:0071357)	17/66	3.3E-21
Cytokine-mediated signaling pathway (GO:0019221)	31/634	9.9E-18
Cellular response to interferon-gamma (GO:0071346)	12/117	8.0E-10
Positive regulation of defense response to virus by host	6/22	2.2E-07
(GO:0002230)		
Interferon-gamma-mediated signaling pathway	12/71	2.1E-12
(GO:0060333)		
Regulation of defense response to virus by host	7/31	4.7E-08
(GO:0050691)		
Negative regulation of viral genome replication	9/51	2.3E-09
(GO:0045071)		
Regulation of nuclease activity (GO:0032069)	3/7	2.6E-04
Negative regulation of viral life cycle (GO:1903901)	9/62	1.2E-08
Regulation of mitotic sister chromatid separation	4/16	1.2E-04
(GO:0010965)		
Regulation of viral genome replication (GO:0045069)	9/64	1.5E-08
Response to interferon-beta (GO:0035456)	4/20	2.4E-04

Anaphase-promoting complex-dependent catabolic	8/80	1.9E-06
process (GO:0031145)		
Regulation of mitotic cell cycle phase transition	9/185	1.0E-04
(GO:1901990)		
Granzyme-mediated apoptotic signaling pathway	2/7	9.6E-03
(GO:0008626)		
Cellular response to zinc ion (GO:0071294)	4/20	2.4E-04
Positive regulation of ubiquitin protein ligase activity	6/83	3.4E-04
(GO:1904668)		
Response to copper ion (GO:0046688)	4/26	5.1E-04

**Table E5.** List of 24 differentially expressed genes (DEGs) between rs273259 AA (major/major) and other genotypes in children with viral detections (n=25). False discovery rate corrected *P* value 0.05 and 1.25 fold change were used as cut-offs to detect DEGs. Along with the Gene symbol, also the Illumina probe identifier and expression level in rs273259 AA (major/major) is presented. "+" denotes higher expression level and "-" lower expression level compared to other genotypes.

Gene Symb	ool	Illumina	probe	identifier	Expression	level	in
rs273259	AA (major/ma	jor) gen	otype				
APOBEC3G	ILMN 180210	)6	+				
CST7	ILMN 167982	26	+				
DLGAP5	ILMN 174982	29	+				
EOMES	ILMN 176050	)9	+				
FCRL6	ILMN_207476	52	+				
GINS2	ILMN 180959	90	+				
GNLY	ILMN 17087	19	+				
GZMA	ILMN 177932	24	+				
GZMH	ILMN 173123	33	+				
IFNG	ILMN_220729	91	+				
KIAA0101	ILMN_228599	96	+				
LAG3	ILMN_181333	38	+				
MT1E	ILMN_217361	.1	+				
NKG7	ILMN_168299	93	+				
PLEKHF1	ILMN_170804	11	+				
PRC1	ILMN_172893	34	+				
PTTG1	ILMN_20427	1	+				
PTTG3P	ILMN_204902	21	+				
TYMS	ILMN_180604	ŧ0	+				
BASP1	ILMN_165182	26	-				
CRISPLD2	ILMN_179068	39	-				
PYGL	ILMN_169618	37	-				
ZNF446	ILMN 174376	57	-				