# 1 Identification of Interleukin1β as an Amplifier of Interferon alpha-induced Antiviral

# 2 Responses

3 Short Title: IL1β enhances IFNα-induced responses

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# 36 Abstract

The induction of an interferon-mediated response is the first line of defense against 37 pathogens such as viruses. Yet, the dynamics and extent of interferon alpha (IFN $\alpha$ )-38 induced antiviral genes vary remarkably and comprise three expression clusters: early, 39 intermediate and late. By mathematical modeling based on time-resolved quantitative 40 data, we identified mRNA stability as well as a negative regulatory loop as key 41 mechanisms endogenously controlling the expression dynamics of IFNa-induced antiviral 42 genes in hepatocytes. Guided by the mathematical model, we uncovered that this 43 regulatory loop is mediated by the transcription factor IRF2 and showed that knock-down 44 of IRF2 results in enhanced expression of early, intermediate and late IFNα-induced 45 antiviral genes. Co-stimulation experiments with different pro-inflammatory cytokines 46 revealed that this amplified expression dynamics of the early, intermediate and late IFNa-47 induced antiviral genes can be mimicked by co-application of IFNa and interleukin1 beta 48 (IL1 $\beta$ ). Consistently, we found that IL1 $\beta$  enhances IFN $\alpha$ -mediated repression of viral 49 replication. Conversely, we observed that in IL1<sup>β</sup> receptor knock-out mice replication of 50 viruses sensitive to IFN is increased. Thus, IL1 $\beta$  is capable to potentiate IFN $\alpha$ -induced 51 antiviral responses and could be exploited to improve antiviral therapies. 52

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# 54 Author Summary

Innate immune responses contribute to the control of viral infections and the induction of 55 interferon alpha (IFN $\alpha$ )-mediated antiviral responses is an important component. 56 However, IFNa induces a multitude of antiviral response genes and the expression 57 dynamics of these genes can be classified as early, intermediate and late. Here we show, 58 based on a mathematical modeling approach, that mRNA stability as well as the negative 59 regulator IRF2 control the expression dynamics of IFNa-induced antiviral genes. Knock-60 down of IRF2 resulted in the amplified IFNα-mediated induction of the antiviral genes and 61 this amplified expression of antiviral genes could be mimicked by co-stimulation with IFNa 62 and IL1 $\beta$ . We observed that co-stimulation with IFN $\alpha$  and IL1 $\beta$  enhanced the repression 63 of virus replication and that knock-out of the IL1 receptor in mice resulted in increased 64

replication of a virus sensitive to IFNα. In sum, our studies identified IL1β as an important
 amplifier of IFNα-induced antiviral responses.

67

# 68 Introduction

Cytokines such as interferons (IFNs) are important regulators of the innate immune 69 system, the first line of defense against microbial infection. IFNs induce in a highly 70 71 dynamic process the expression of several classes of IFN-stimulated genes. The encoded proteins of these genes fulfill a variety of tasks including the clearance of viruses. To 72 ensure effectiveness of the response and to prevent damage, the process has to be tightly 73 controlled, which is achieved through several positive and negative feedback loops [1]. 74 75 Due to the non-linearity of the underlying reactions the impact of alterations on a potential outcome is difficult to predict. IFNs such as interferon alpha (IFN $\alpha$ ) are widely applied 76 77 therapeutic agents and therefore strategies to strengthen IFN-induced responses are of major interest. However, this requires a more quantitative understanding of the 78 interrelations between the IFN signaling pathway components and the expression of IFN-79 stimulated genes (ISGs) as well as insights into mechanisms shaping the response to 80 IFNs. 81

A well-studied IFN-induced response is the antiviral response elicited for example by 82 major hepatotropic RNA viruses such as the human pathogen hepatitis C virus (HCV) and 83 the murine pathogen lymphocytic choriomeningitis virus (LCMV). Upon infection, the viral 84 RNA is sensed by specific cellular pattern recognition receptors (PRR) that trigger the 85 expression of interferons (IFNs) and induce expression of antiviral genes as first line of 86 defense [2]. However, viruses can evade the antiviral response by antagonizing the 87 induction of the effector pathways of the IFN system and establish a persistent infection. 88 Therefore, it would be highly beneficial to identify mechanisms to enhance the IFN-89 induced antiviral response to reduce virus spread and improve viral clearance. 90

The major signal transduction pathway activated in response to type I IFNs such as IFNα is the JAK/STAT pathway [3]. Regulation of the dynamics of the JAK/STAT pathway activation and the expression of IFN-stimulated genes are important to mount an effective IFN response and to maintain cellular homeostasis. The IFNα-induced signaling pathway comprises complex negative feedback loops consisting of suppressor of cytokine signaling 1 (SOCS1) and ubiquitin-specific peptidase 18 (USP18) that jointly determine

signal attenuation. In contrast, interferon regulatory factor 9 (IRF9) acts as a positive 97 regulator of IFNa signaling. By dynamic pathway modeling it was shown that an 98 99 upregulation of IRF9 can enhance the expression of ISGs [4]. Further, it was shown that the extent and duration of the expression of antiviral genes positively correlates with a 100 reduced virus load [5] and the specific expression profiles of antiviral genes appear to be 101 critical for shifting the balance from viral persistence to viral clearance. Therefore, the 102 103 modulation of feedback loops might be harnessed to increase and prolong the duration of the IFN response and thereby contribute to improved viral clearance. 104

IFNα was not only shown to activate the classical JAK-STAT1 pathway, but recent publications have also reported an activation of STAT3 after IFNα treatment [6]. For example, Su et al. showed a phosphorylation of STAT3 after IFNα treatment in RAMOS cells [7] and IFNα treatment led to an increase of STAT3 phosphorylation in primary healthy dendritic cells [8] as well as B cells [9]. The activation of the different STAT molecules may promote the formation of different hetero- and homodimer pairs, resulting in different expression of the ISGs.

In addition to type I IFNs, pro-inflammatory cytokines such as interleukin 6 (IL6), 112 interleukin-1beta (IL1ß) and IFN gamma (IFNy) [10] can contribute to the activation of an 113 anti-microbial response. Binding of IL1 $\beta$  to the type I IL1 receptor (IL1R1) that is expressed 114 on different cell types including hepatocytes results in the activation of different 115 downstream signaling pathways. While the main pathways activated by IL1ß are p38 and 116 NFkB [11], there is evidence that IL1β can also activate STAT3 [12]. IL1β was reported to 117 induce the protein-protein interaction between STAT3 and NFkB in hepatocytes as well 118 as DNA binding of this complex [13], which might be involved in facilitating the recently 119 reported NFkB-assisted DNA loading of STAT3 during the acute phase response [14]. An 120 interplay between IFN $\alpha$  and IL1 $\beta$  has been observed previously. On the one hand, in liver 121 samples of chronic hepatitis C patients elevated levels of IFNB and IL1B were observed 122 [15]. On the other hand, it was reported that IFNa and IFNB suppress IL1B maturation in 123 bone marrow-derived macrophages [16] and that IL1ß limits excessive type I IFN 124 production through the induction of eicosanoids [17]. Co-treatment with IFN $\alpha$  and IL1  $\beta$ 125 resulted in higher and more sustained STAT1 phosphorylation in Huh7 cells [18]. Thus, 126 the physiological relevance and the underlying mechanism of a potential cross-talk 127 128 between type I IFN-induced signaling and IL1β remains unknown.

Here we employ a systems biology approach that combines time-resolved quantitative experimental data and mathematical modeling. We show that mRNA stability as well as IRF2 as a negative feedback loop critically shape the distinct expression dynamics of the early, intermediate and late IFN $\alpha$ -induced genes. Importantly, we uncover that IL1 $\beta$  is capable to mimic the impact of knockdown of IRF2 and boosts the IFN $\alpha$ -induced antiviral gene response.

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# 136 **Results**

# 137 Distinct dynamics of IFNα-induced gene expression

To characterize the temporal response induced by IFNα stimulation and to classify the 138 induced genes based on their expression dynamics, we took advantage of our previously 139 reported microarray analysis monitoring IFNα-induced gene expression over 24 hours in 140 the human hepatoma cell line Huh7.5 stimulated with IFNa [4]. We used Huh7.5 cells as 141 a model system, because this cell line has been widely used to investigate the replication 142 of hepatotropic viruses. Utilizing these data, we focused our analysis on genes that 143 exhibited significant upregulation (p<0.05 and average fold-change>2) in response to 144 IFNα treatment (Fig 1A). Sorting the 53 significantly upregulated genes by the time point 145 of maximal induction revealed three expression clusters: early, intermediate and late (Fig. 146 1B). 21 genes classified as early were rapidly induced with a peak of maximal activation 147 (vertical red line) one to four hours after stimulation and rapidly declined thereafter. 27 148 genes grouped in the intermediate cluster reached their maximal expression at six to eight 149 hours, followed by a moderate decline. Five genes were induced late and exhibited 150 persistent upregulation with maximal expression at 12 hours or later. 151

As representatives for further analysis we selected two IFNa-induced genes with known 152 antiviral activity from each group [19, 20]: IFN regulatory factor 1 (IRF1) and tripartite 153 motif containing 21 (TRIM21) from the early group, MX dynamin-like GTPase 1 (MX1) and 154 eukaryotic translation initiation factor 2-alpha kinase 2 (EIF2AK2/PKR) from the 155 intermediate group, and IFN $\alpha$ -inducible protein 6 (*IFI6*) and IFN-induced transmembrane 156 protein 3 (IFITM3) as examples from the late group. The characteristic dynamics of the 157 IFNα-induced expression levels of each of the selected antiviral genes were verified by 158 gRT-PCR analysis and confirmed the grouping into the early, intermediate and late cluster 159 (Fig 1C). 160

To interrogate whether this dynamic behavior of IFNα-induced antiviral genes is 161 characteristic for Huh7.5 cells and hence potentially determined by the cancer cell context 162 163 or whether it is conserved in primary hepatocytes, we examined the IFN $\alpha$ -induced expression of the selected IFNα-induced antiviral genes in primary human hepatocytes 164 isolated from multiple donors. Overall the observed fold change of the expression of the 165 IFNα-induced antiviral genes was lower in primary human hepatocytes compared to 166 Huh7.5 cells. But in line with our previous results, the anticipated dynamic behavior was 167 observed for each of the genes tested: The early genes IRF1 and TRIM21 showed 168 maximal expression between 1 and 4 hours after IFNa treatment and rapidly declined 169 thereafter, the intermediate genes MX1 and EIF2AK2 showed maximal expression 170 between six to eight hours and rather sustained expression and the late genes IFI6 and 171 *IFITM3* exhibited a persistent increase for the entire observation time of up to 24 hours 172 (Fig 1D). The conserved dynamic behavior of IFNα-induced antiviral genes in Huh7.5 cells 173 and primary human hepatocytes suggested that the expression dynamics of IFN $\alpha$ -induced 174 antiviral genes is regulated by robust mechanisms maintained in hepatocytes. 175

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## 177 Distinct mRNA stability affects expression profiles of IFNα-induced genes

To elucidate key mechanisms that contribute to the three distinct expression profiles of 178 the IFN $\alpha$ -induced antiviral genes, we first tested whether the IFN $\alpha$  dose-dependency 179 differed between these groups. Comparing the half-maximal effective IFN $\alpha$  dose (EC<sub>50</sub>) 180 of the selected IFN $\alpha$ -induced antiviral genes however showed that the EC<sub>50</sub> of these 181 genes ranged from 100  $\pm$  9 to 171  $\pm$  23 U/ml INF $\alpha$  and did not reveal substantial 182 differences between the three groups (Fig 2A). Therefore, we next assessed whether the 183 distinct expression dynamics resulted from differences in the stability of the mRNAs. To 184 determine the mRNA half-lives of the selected IFNa-induced genes, we inhibited *de novo* 185 transcription using actinomycin D. As shown in Fig 2B, the mRNA concentration of each 186 of the examined antiviral genes decreased over time. To calculate the half-lives of the 187 different mRNAs, a three-parameter exponential-decay regression was performed with 188 the mRNA expression data. Interestingly, the mRNA expression profiles of the selected 189 genes representing the three groups were well reflected by their mRNA half-lives (Fig 2B): 190 mRNAs that exhibited an early-type expression profile displayed a short half-life of 30 191 minutes to 2 hours; intermediate-type mRNA expression showed a half-life of 192

approximately 5 to 7 hours; and genes with sustained-type expression profiles exhibited
 stable mRNAs over the entire observation period.

Thus, the three expression groups of IFN $\alpha$ -induced antiviral genes did not differ in their IFN $\alpha$  dose dependency, but were characterized by differences in mRNA stability. However, the distinct mRNA stabilities of the three groups did not explain e.g. the observed differences in the time to maximal expression of the antiviral genes. Therefore, we concluded that additional mechanisms such as feedback loops shape the expression profiles of IFN $\alpha$ -induced antiviral genes.

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202 Analysis of the pathway structure using a dynamic model of IFNα-induced signaling

203 To elucidate the potential impact of feedback loops regulating the dynamic properties of the expression of IFN $\alpha$ -induced antiviral genes, an ordinary differential equation (ODE) 204 model (core model) was developed (S1A Fig). The core model was based on our 205 previously published mathematical model [4] that was expanded by introducing mRNA 206 expression of the negative regulators SOCS1 and USP18 and the selected IFNα-induced 207 antiviral genes. The mathematical model was calibrated based on previously published 208 [4] and new experimental data on the activation of the JAK/STAT pathway and IFN $\alpha$ -209 induced expression of antiviral genes that were acquired for up to 24 hours post IFNa 210 stimulation. The initial concentrations of the main pathway components were 211 experimentally determined (S1 Table). In addition, the experimentally determined mRNA 212 half-life values were incorporated by introducing an mRNA-specific degradation 213 parameter for each individual mRNA. 214

The simulations of the core model for the IFNα-induced signaling components 215 (exemplarily shown for phosphorylation of JAK1 and STAT1), for the induction of the 216 positive regulator IRF9 and for the negative regulator USP18 were consistent with the 217 experimental data (S1B Fig). However, the trajectories of the core model were not able to 218 reproduce the induction kinetics of the early (IRF1 and TRIM21, S1C Fig) and late genes 219 (IFI6, S1C Fig) as well as of the negative regulatory signaling protein SOCS1 (S1B Fig). 220 Further, the core model failed to sufficiently reproduce the downregulation of the 221 222 intermediate genes MX1 and EIF2AK2 indicating a missing interaction (S1C Fig). Thus, we aimed to identify missing components in our mathematical model. 223

## **IRF2 constitutes an intracellular feedback loop that negatively regulates expression**

## 226 of early IFNα-induced genes

227 To improve the capacity of the model to represent the experimental data, we incorporated into the core model an additional negative feedback loop that acts exclusively at the 228 transcriptional level (Fig 3A). As shown in Fig 3B, this model extension indeed improved 229 the agreement between the mathematical model trajectories and the SOCS1 protein data 230 231 (compare Fig 3B to S1B Fig) as well as the mRNA data for the selected IFNα-induced antiviral genes (compare Fig 3C to S1C Fig). Statistical analysis based on the likelihood 232 ratio test (S2A Fig) and the Akaike information criterion (S2B Fig) confirmed that the core 233 model with the additional intracellular feedback was significantly superior to the core 234 235 model (S2C Fig).

To identify the nature of this negative intracellular factor, we performed a transcription 236 factor binding site (TFBS) analysis using the HOMER motive discovery approach [21]. 237 The analysis revealed six significantly enriched transcription factor binding motifs in the 238 genes analyzed in addition to ISRE (Fig 4A), i.e. the motifs corresponding to IRF1, IRF2, 239 IRF4, PU.1 and STAT5. Because IRF1 is a positive regulator of antiviral genes [22], this 240 factor was excluded. IRF2 exhibits structural similarity to IRF1 [23] but possesses a 241 repression domain and functions as a transcriptional repressor that antagonizes IRF1-242 induced transcriptional activation [24]. Although IRF2 and IRF4 are structurally similar, the 243 repressive function of IRF4 was reported to be different from that of IRF2. IRF4 possesses 244 an autoinhibition domain of DNA binding at the carboxy-terminal region that can mask the 245 DNA-binding domain of IRF4. PU.1, as part of the Ets-transcription factor family, forms 246 dimers with IRF4 [25]. The presence of different proteins with similar molecular functions 247 suggests a complex network of negative regulation of IFN-induced antiviral genes and the 248 absence of one of these factors might be compensated by the others. To quantify the 249 impact of the identified transcription factors, we performed siRNA knock-down 250 experiments. Expression of IRF2, IRF4 and IRF8 was downregulated by siRNA in all 251 possible combinations and the expression levels of the selected antiviral genes were 252 analyzed after 24 hours (S2D Fig). Interestingly, almost all combinations that included the 253 downregulation of IRF2 positively affected gene expression. To further analyze the 254 characteristics of the putative negative regulator of transcription, model predictions of the 255 256 expression dynamics of this intracellular factor (Fig 4B) were compared with the

experimentally measured mRNA expression of the selected IRFs. Only the profile of the 257 expression kinetics of IRF2 were similar to the dynamics predicted by the model for the 258 259 expression of the negative regulator (Fig 4C). Therefore, we treated Huh7.5 cells with IFNa in combination with non-targeting siRNA or siRNA directed against IRF2 and 260 261 measured the expression profiles of the selected antiviral genes in a time-resolved manner. As shown in Fig 4D, knock-down of IRF2 (S2E Fig) significantly enhanced the 262 263 expression of all antiviral genes monitored. These results confirmed IRF2 as an important transcriptional repressor negatively regulating IFNa-induced antiviral expression. 264

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## 266 IL1β amplifies the IFNα-induced gene response

The observation that knock-down of a negative regulator resulted in enhanced expression 267 of early, intermediate and late IFNa-induced antiviral genes suggested that strategies 268 could be designed to strengthen the induction of an antiviral response. Since knock-down 269 or inhibition of an intracellular factor is difficult to achieve in vivo, we tested whether a 270 similar amplified expression of IFN $\alpha$ -induced antiviral genes could also be mimicked by 271 the addition of an extracellular factor. As it has been previously reported that cross-talk 272 between IFN $\alpha$  and inflammatory cytokines may occur [26], we focused our analysis on 273 inflammatory cytokines that are known to act in the liver: interleukin 6 (IL6), IL8 and IL16. 274 To experimentally test these cytokines, we performed co-stimulation experiments with 275 each cytokine and IFNa and quantified the expression of the selected IFNa-induced 276 antiviral genes in Huh7.5 cells. Co-stimulation with IL8 had no effect on the dynamics of 277 IFNα-induced gene expression (S3A Fig), whereas treatment with IFNα and IL6 resulted 278 in a small increase in the expression of the early gene IRF1 (Fig 5A). Strikingly, co-279 stimulation with IFN $\alpha$  and IL1  $\beta$  resulted in markedly enhanced expression of all antiviral 280 genes examined (Fig 5B). Stimulation of Huh7.5 cells with IL1ß alone resulted only in a 281 minor increase in the expression of *IRF1* and did not elicit the expression of the other 282 selected antiviral genes. The enhanced expression dynamics in response to co-treatment 283 with IFN $\alpha$  and IL1 $\beta$  mimicked the effect on the expression dynamics of early, intermediate 284 and late IFNa-induced antiviral genes observed upon knockdown of IRF2 and was even 285 further elevated for the early antiviral gene IRF1 and the late antiviral gene IFITM3. These 286 results suggested that IL1ß indeed can act as a strong amplifier of IFNa-induced 287 expression of antiviral genes. 288

#### 289

## 290 IL1β-mediated STAT3 activation enhances the expression of IFNα-induced genes

It was previously reported that IL1β stimulation activates the NFκB-IκBα and the p38 291 signaling pathways [11]. To analyze which pathway mediated the enhancing effect of IL1B 292 onto IFN $\alpha$ -induced expression of antiviral genes, Huh7.5 cells were treated with IFN $\alpha$ , 293 IL1ß or with a combination thereof. The dynamics of key signaling proteins in response to 294 295 IFNα stimulation for up to 24 hours was analyzed by quantitative immunoblotting and for each component the area under the activation curve was calculated (Fig 6A, S3B Fig). 296 These results showed that the phosphorylation of STAT1 was strongly induced by IFN $\alpha$ , 297 but not by IL1<sup>β</sup>. However, co-treatment with IFN<sup>α</sup> and IL1<sup>β</sup> resulted in a stronger and 298 prolonged STAT1 phosphorylation. Single IL1<sup>β</sup> treatment or co-stimulation with IFN<sup>α</sup> 299 induced the activation of the p38 pathway and p65 of the NF $\kappa$ B pathway to a similar extent. 300 Strikingly, phosphorylation of STAT3 was detected after stimulation with IL1<sup>β</sup> alone as 301 well as after IL1 $\beta$  and IFN $\alpha$  co-treatment, whereas IFN $\alpha$  alone only resulted in a weak 302 activation of STAT3. The comparison of the area under the curve of STAT3 303 phosphorylation showed that STAT3 phosphorylation was significantly increased in the 304 IL1 $\beta$  and IFN $\alpha$  co-treated samples. To assess whether the increased phosphorylation of 305 STAT3 correlated with nuclear accumulation of STAT3 in particular at late time points, we 306 performed live cell imaging experiments with primary hepatocytes from an *mKate-Stat3* 307 knock-in mouse strain expressing a fluorescently tagged STAT3 [27] (Fig 6B). Compared 308 to the treatment with IL6 that resulted in an instantaneous nuclear translocation of STAT3 309 (S3C Fig), nuclear STAT3 was detectable at lower levels and at later time points in 310 response to IL1ß stimulation. However, it was markedly elevated upon co-treatment with 311 IFN $\alpha$  and IL1 $\beta$  at later time points, in particular 24 hours post treatment (Fig 6B). 312 Therefore, the sustained STAT3 phosphorylation profiles and the nuclear accumulation of 313 STAT3 observed upon co-treatment with IFNa and IL1ß matched the co-stimulatory effect 314 of IL1 $\beta$  and IFN $\alpha$  on the expression of the selected IFN $\alpha$ -induced antiviral genes. 315

To ascertain that STAT3 activation contributes to the enhanced expression of the selected IFN $\alpha$ -induced antiviral genes, single or co-stimulated Huh 7.5 cells were either left untreated or were co-treated with a STAT3 inhibitory compound (Stattic) [28]. Treatment of Huh7.5 cells with 10  $\mu$ M Stattic for up to 24 hours had no significant impact on their viability (S3D Fig). With this dose of Stattic, the induction of STAT3 phosphorylation by

co-stimulation with IFN $\alpha$  and IL1 $\beta$  was reduced for the entire observation time (S3E Fig). 321 Analyzing gene expression, we noticed that at the early time points the expression of all 322 323 selected genes induced by IFN $\alpha$  and IL1 $\beta$  co-stimulation was reduced by treatment with Stattic (Fig 6C). At 24 hours after IFNa and IL1B co-stimulation, expression of both early 324 325 and intermediate IFNq-induced antiviral genes was comparable for Stattic-treated and untreated samples. However, the late IFNα-induced genes, IFI6 and IFITM3, showed a 326 strong decrease in their expression upon Stattic treatment during the entire observation 327 time (Fig 6C). Overall, application of the STAT3 inhibitor Stattic had a significant effect on 328 the expression of all analyzed IFNα-induced antiviral genes. These results indicated that 329 co-stimulation of cells with IFNa and IL1B enhanced the activation of STAT3, thus 330 mediating the amplified expression kinetics of IFN $\alpha$ -induced antiviral genes. 331

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# IL1β enhances IFNα-induced gene expression in primary human hepatocytes and viral clearance

To assess whether the IL1β-induced amplification of IFNα-induced expression of antiviral 335 genes was conserved in primary human hepatocytes and relevant for eliciting an antiviral 336 response, we first examined the impact of IL1 $\beta$  on the dynamics of IFN $\alpha$ -induced antiviral 337 genes in these cells. As shown in Fig 7A, consistent with our observations in Huh7.5 cells. 338 co-stimulation of primary human hepatocytes with IFNa and IL1B increased the 339 expression especially of the early IFN $\alpha$ -induced gene IRF1 and the late gene IFI6. These 340 results underscored the importance of our findings also in the context of primary human 341 hepatocytes. 342

Next, we examined whether the increased expression of IFNα-induced antiviral genes in 343 response to co-treatment with IFN $\alpha$  and IL1 $\beta$  resulted in enhanced viral clearance. For 344 these studies we utilized a cell line containing a persistently replicating HCV reporter 345 replicon (Huh7/LucUbiNeo/JFH1) (Fig 7B). In this cell line, luciferase activity correlates 346 linearly with viral replication [29]. Treatment of the replicon cells with 500 U/ml IFN $\alpha$  – an 347 348 IFN $\alpha$  dose that was employed in the experiment examining activation of signaling pathways or expression of antiviral genes – resulted in a very rapid inhibition of HCV 349 replication. At this dose, a detectable but not major difference between treatment with 350 IFN $\alpha$  alone and the co-stimulation with IFN $\alpha$  and IL1 $\beta$  was observed (S4A Fig). To 351 352 increase the resolution of the assay and taking into account the high IFNα-sensitivity of

 $_{353}$  HCV, the applied IFN $\alpha$  and IL1 $\beta$  concentrations were reduced 10-fold. In this setting, co-

stimulation with IFNα and IL1β resulted in a stronger reduction in luciferase activity than

<sup>355</sup> IFNα alone, especially at later time points (>24 hours) (Fig 7C and S4B Fig). In conclusion,

 $IL1\beta$  enhanced the antiviral effect of IFN $\alpha$  treatment and reduced HCV replication.

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# IL1β-mediated enhanced expression of IFNα-induced genes requires the IL1β receptor

To confirm the specificity of the observed augmentation of the IFN $\alpha$  response by IL1 $\beta$ , 360 primary mouse hepatocytes were isolated from wildtype and from mice lacking the IL1 361 receptor (IL1R1<sup>-/-</sup> mice) [30]. Expression analysis of the selected IFNα-induced genes 362 upon treatment with 500 U/ml murine IFNa or 10 ng/ml murine IL1B confirmed that 363 treatment with IL1 $\beta$  alone did not induce expression of the selected IFN $\alpha$ -induced genes, 364 whereas IFNa stimulation significantly upregulated their expression (Fig 8A). Co-365 stimulation with IFNa and IL1B synergistically increased the expression of the selected 366 IFNα-induced antiviral genes. These experiments revealed that mRNA expression profiles 367 of the selected IFNa-induced antiviral genes in primary mouse hepatocytes are 368 comparable to those in Huh7.5 cells. Of note, while IFNa-induced expression of the 369 selected IFNa-induced antiviral genes in hepatocytes from IL1R1<sup>-/-</sup> mice lacking IL1B 370 signaling was comparable to wildtype cells, IL1R1<sup>-/-</sup> cells did not show a synergistic 371 enhancement of IFNa-induced gene expression upon co-stimulation with IL1B. These 372 results confirmed that the co-stimulatory effect of IL1ß on the IFNa-induced antiviral 373 response is mediated by the IL1R1 and that the underlying mechanism is conserved in 374 mouse and human. 375

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# 377 Viral infection is enhanced in IL1R1-<sup>/-</sup> mice

To demonstrate the *in vivo* relevance of our findings, wildtype and IL1R1<sup>-/-</sup> mice [30] were infected with  $2\times10^6$  pfu of LCMV stain WE. Prior to and four days post infection, the expression of the selected IFN $\alpha$ -induced genes in the liver of the animals was determined by qRT-PCR. In line with our hypothesis, the mRNA concentrations of the IFN $\alpha$ -induced genes *Mx1*, *Ifi27I2a*, *Trim21* and *Eif2ak2* were significantly reduced in infected IL1R1<sup>-/-</sup> mice compared to wildtype mice (Fig 8B). This was not due to differences in viral load, as comparable virus amounts were detected four days post infection (Fig 8C). However, in

line with the reduced antiviral response in the liver, we observed a significant increase in 385 LCMV titers in the liver of IL1R1<sup>-/-</sup> mice as compared to wildtype controls eight days post 386 infection (Fig 8C). Consistently, immunohistochemical evaluation of liver tissue revealed 387 that LCMV nucleoprotein (NP) was more abundant in hepatocytes of IL1R1 deficient mice 388 than in wild type counterparts (Fig 8D). Notably, antiviral T-cell immunity was also reduced 389 eight days post infection following LCMV infection in IL1R1<sup>-/-</sup> compared to control animals 390 (S5A-C Fig). In conclusion, the in vivo experiments confirmed the importance of the IL1ß 391 induced signal transduction mediated by the IL1 receptor for enhancing the IFN-induced 392 response. 393

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# 395 **Discussion**

We observed that the temporal expression profiles of IFN $\alpha$ -induced genes can be classified into three different groups based on the time point of maximal activation: early, intermediate and late. By mathematical modeling based on time-resolved experimental data, our studies revealed that mRNA stability and expression of IRF2 as a negative regulator of transcription critically determine the expression profiles of IFN $\alpha$ -induced genes. Strikingly, we observed that IL1 $\beta$  can mimic the impact of IRF2 knockdown and significantly boost IFN $\alpha$ -induced responses.

It has previously been reported that TNF stimulation of mouse fibroblasts for twelve hours resulted in early, intermediate and late gene expression clusters and that these clusters differ in mRNA stability [31]. Consistent with these observations, we demonstrated that the mRNA half-lives of the IFN $\alpha$ -induced antiviral genes indeed differ substantially among the three groups and correlate with their peak of expression.

Positive and negative feedback mechanisms establish a balanced regulatory network of 408 type I IFN-induced signaling [1] and the combination of transcriptional activators and 409 repressors is critical for the expression of specific genes and viral clearance. Consistent 410 with previous results [24], we observed that the transcription factor IRF2 is induced by 411 IFNα. In addition, we demonstrated that the downregulation of IRF2 by siRNA enhances 412 antiviral gene expression, which is in agreement with an elevated IFN-induced gene 413 expression in IRF2-deficient mice [32]. Furthermore, it has been demonstrated that IRF2 414 knock-down results in the upregulation of IFN-induced genes in the bone marrow [33]. 415 Virus-induced IFN<sub>β</sub> expression is substantially higher in IRF2-deficient mice than in wild-416

type mice [34], and HCV-infected patients exhibit increased expression of IRF2 [35]. In
line with these observations, we showed that IRF2 negatively regulates the expression of
IFNα-induced genes and represents an important feedback mechanism dampening the
type I IFN response.

Additionally, we provided evidence that co-stimulation with IL1 $\beta$  enhances the expression of IFN $\alpha$ -induced genes. In agreement with this observation, it was previously reported that IFN $\alpha$  and IL1 $\beta$  co-stimulation in Huh7.5 cells increased the phosphorylation of STAT1 and resulted in an increased expression of two antiviral proteins, PKR (encoded by *EIF2AK2*) and OAS, compared to treatment with IFN $\alpha$  alone [18]. In our study, co-stimulation with IFN $\alpha$  and IL1 $\beta$  rather shifted the peak of STAT1 phosphorylation to later time points.

We further showed that IL1 $\beta$  stimulation strikingly induced the phosphorylation of STAT3 427 at time points later than 6 hours. The IL1β-induced activation profile of STAT3 was 428 remarkably different from the IL6-induced STAT3 phosphorylation that peaks at one hour 429 after stimulation. At present, there are only very few reports on STAT3 activation by IL1β. 430 For example, IL1β-induced phosphorylation of STAT3 was reported in myocytes [36], in 431 mesangial cells [37] and in HepG2 cells with a weak increase of phosphorylation eight 432 hours after stimulation [12]. In our study, inhibition of STAT3 by the treatment with the 433 inhibitor Stattic reduced the phosphorylation of IL1B-induced STAT3 activation and the 434 expression of antiviral genes after IFNα and IL1β co-stimulation. Likewise, in RAW 264.7 435 cells, a reduction of LPS-induced STAT3 activation and target gene expression was 436 observed upon treatment with the inhibitor Stattic [38]. In conclusion, this is to our 437 knowledge the first report indicating that IL1ß stimulation triggers prolonged STAT3 438 phosphorylation and nuclear translocation. 439

Although IL1<sup>β</sup> on its own did not affect the expression of IFN<sub>α</sub>-induced genes in the 440 observed time frame of 24 h, co-treatment with IFNa elevated their expression and 441 enhanced for example the antiviral state as inferred from the increased inhibition of HCV 442 replication. Moreover, in LCMV infection in vivo, viral titers were increased in IL1R-knock-443 444 out mice, showing that IL1 $\beta$  signaling through this receptor contributes to viral clearance. Clinical data demonstrated that levels of pro-inflammatory cytokines including IL1B, IL4 445 and IL6 are elevated in the sera of patients with HCV infection [39]. However, the role of 446 IL1ß in hepatitis virus-infected individuals and the impact on viral clearance are 447 controversially discussed. On the one hand, it was reported that IL1<sup>β</sup> concentrations are 448

within the normal range during IFN $\alpha$  treatment of HCV patients [40] and decrease in chronically infected patients [41]. On the other hand, Daniels *et al.* demonstrated that the increased production of IL1 $\beta$  by peripheral blood mononuclear cells during IFN $\alpha$  treatment contributes to the inhibition of hepatitis B virus replication and promotes viral clearance [42]. Similarly, Zhu *et al.* reported that IL1 $\beta$  inhibits HCV replication in a hepatoma-derived replicon cell line [43].

In conclusion, we demonstrate that IL1 $\beta$  boosts the expression of IFN $\alpha$ -induced antiviral genes, and in vivo particularly those with an intermediate and a late expression profile. IL1 $\beta$  thereby could strengthen the efficacy of therapeutically applied IFN $\alpha$  in particular in the liver and this knowledge might help to improve IFN-based strategies for the treatment of viral infections.

460

# 461 Materials and Methods

# 462 Cell Culture

Huh7.5 cells were kindly provided by Charles M. Rice (The Rockefeller University, NY,
RRID:CVCL\_7927) and primary human hepatocytes (PHH) were kindly provided by
Georg Damm (Charité Berlin). Murine hepatocytes were isolated from wildtype or from
IL1R1<sup>-/-</sup> CL57BL/6 mice as previously described [44].

All cells were cultivated at 37°C and 5 % CO<sub>2</sub> incubation and 95 % relative humidity. Informed consent of the patients for the use of tissue for research purposes was obtained corresponding to the ethical guidelines of the Charité-Universitätsmedizin Berlin. The Huh7.5 cell line was authenticated using Multiplex Cell Authentication and the purity of cell line was validated using the Multiplex Cell Contamination Test by Multiplexion (Heidelberg, Germany) as described recently [45, 46].

473

# 474 Cells stimulation for protein and mRNA measurements

One day before time-course experiments,  $1.7 \cdot 10^6$  Huh7.5 cells or  $2 \cdot 10^6$  PHH were seeded into a 6 cm-diameter dishes or  $5.5 \cdot 10^5$  cells per well of 6-well plates in culture medium. Huh7.5 were cultured in Dulbeccos's Modified Eagle Medium (DMEM, Invitrogen) supplemented with 10% fetal calf serum (FCS) (Gibco) and 1% P/S (Invitrogen). PHHs were cultivated in Williams medium E (Biochrom) supplemented with 10% FCS (Gibco), 100 nM dexamethasone, 10 µg/ml insulin, 2 mM L-Glutamin (Gibco) and 1% Penicillin-

Streptomycin (P/S) (Invitrogen). Prior to stimulation, cells were washed three times with 481 PBS and cultivated in serum free medium for three hours. Stimulation of cells was 482 483 performed by adding the stimulation factor directly into serum free medium. To stop stimulation, dishes were placed on ice, medium was aspirated and cells were lysed either 484 with Nonidet P-40 lysis buffer (1% NP40, 150 mM NaCl, 20 mM Tris pH 7.4, 10 mM NaF, 485 1 mM EDTA pH 8.0, 1 mM ZnCl<sub>2</sub> pH 4, 1 mM MgCl<sub>2</sub>, 1 mM Na<sub>3</sub>VO<sub>4</sub>, 10% Glycerol and 486 freshly added 2 µg/ml aprotinin and 200 µg/ml AEBSF) or Nonidet P-40 cytoplasmic lysis 487 buffer (0,4% NP40, 10 mM HEPES pH 7.9, 10 mM KCl, 0.1 mM EDTA, 0.1 mM EGTA 488 and freshly added 2 µg/ml aprotinin, 200 µg/ml AEBSF, 1 mM DTT, 1 mM NaF and 0.1 489 mM Na<sub>3</sub>VO<sub>4</sub>) and nuclear lysis buffer (20 mM HEPES pH 7.9, 25% glycerin, 400 mM NaCl, 490 1 mM EDTA, 1 mM EGTA and freshly added 2 µg/ml aprotinin, 200 µg/ml AEBSF, 1 mM 491 DTT, 1 mM NaF and 0.1 mM Na<sub>3</sub>VO<sub>4</sub>) for cell fractionation. To measure the viability of 492 cells upon Stattic treatment, CellTiter-Blue Viability Assays (Promega) were performed 493 according to the manufacturer's instructions. Incubation with the dye for 60 min was 494 followed by measurement of the fluorescence with the infinite F200 pro Reader (Tecan). 495

496

# 497 **RNA analysis**

Cells were seeded, growth factor depleted and stimulated with IFNg (PBL, 11350-1). Total 498 RNA was isolated from three independent dishes per time point by passing the lysate 499 through a QIAshredder (Qiagen) for homogenization, followed by RNA extraction using 500 the RNeasy Plus Mini Kit (Qiagen) according to manufacturer's protocol. For cDNA 501 generation, 1 µg of total RNA was used and transcribed with the High-Capacity cDNA 502 Reverse Transcription Kit (Applied Biosystems) according to manufacturer's instructions. 503 Quantitative real-time PCR (qRT-PCR) was performed using the hydrolysis-based 504 Universal Probe Library (UPL) platform (Roche Diagnostics) in combination with the Light 505 Cycler 480 (Roche Diagnostics). Primers were generated using the automated Assay 506 Design Center based on species and accession number (www.lifescience.roche.com) 507 (see S2 Table). Crossing point (CP) values were calculated using the second derivative 508 maximum method of the Light Cycler 480 software (Roche Diagnostics). An internal 509 510 dilution series of template cDNA (stimulated for 1 hour with 500 U/ml IFNa) was measured with every gene analyzed for PCR efficiency correction and served as standard curve for 511 512 calculation of relative concentrations. Relative concentrations were normalized to HPRT.

#### 513

# 514 Quantitative immunoblotting

For Immunoprecipitation (IP), the target-specific antibody was added to the cellular lysates 515 together with 25 µl of Protein A or G sepharose (GE Healthcare) depending on the species 516 of target antibody and the mixture was incubated overnight rotating at 4°C. For anti-JAK1 517 (Upstate Millipore, 06-272, RRID:AB 310087), anti-Tyk2 (Upstate Millipore, 06-638, 518 RRID:AB 310197) and anti-STAT1 (Upstate Millipore, 06-501, RRID:AB 310145) IP, 519 Protein A sepharose was used. Protein G sepharose was used for anti-SOCS1 (Millipore, 520 04-002, RRID:AB 612104) IP. Protein concentration of cellular lysates was determined 521 using the BCA Assay kit (Pierce/Thermo Scientific) according to the manufacturer's 522 523 instructions. Proteins were separated by denaturing 10% or 15% SDS-PAGE. Sample loading was randomized to avoid systematic errors [47]. The proteins were transferred to 524 PVDF (STATs, IRF9, USP18) or nitrocellulose membranes (JAK1, TYK2). Membranes 525 were stained with 0.1% Ponceau Red (Sigma-Aldrich). To detect tyrosine phosphorylation 526 527 of immunoprecipitated JAK1 and TYK2, the anti-phosphotyrosine monoclonal antibody 4G10 (Upstate Biotechnology, 05-321, RRID:AB 309678) was used. Phosphorylation 528 specific and total antibodies: 529

Antibody	Vendor, CatLog	RRID
anti-phospho-STAT1	Cell Signaling Technologies, 9171	RRID:AB_331591
anti-phospho-STAT2	Cell Signaling Technologies, 4441	RRID:AB_2198445
anti-IRF9	BD Transduction Laboratories,	RRID:AB_397680
	610285	
anti-USP18	Cell Signaling Technologies, 4813	RRID:AB_10614342
anti-SOCS1	Invitrogen, 04-002	RRID:AB_612104
anti-phospho-p38	Cell Signaling Technologies, 4511	RRID:AB_2139682
anti-phospho-p65	Cell Signaling Technologies, 3031	RRID:AB_330559
anti-JAK1	Cell Signaling Technologies, 06-272	RRID:AB_310087
anti-TYK2	Upstate Millipore, 06-638	RRID:AB_310197
anti-STAT1	Upstate Millipore, 06-501	RRID:AB_310145
anti-STAT2	Upstate Millipore, 06-502	RRID:AB_310146

anti-p38	Cell Signaling Technologies, 9212	RRID:AB_330713
anti-p65	Santa Cruz, sc-109	RRID:AB_632039
anti-calnexin	Enzo life sciences	RRID:AB_10616095
anti-β-actin	Sigma Aldrich, A5441	RRID:AB_476744
anti-PARP	Roche	RRID:AB_1602926

#### 531

For detection of additional proteins on the same membrane, membranes were incubated 532 with  $\beta$ -mercaptoethanol and SDS. For normalization, antibodies against calnexin and  $\beta$ -533 actin were used for the cytoplasmic fraction and anti-PARP was used for the nuclear 534 fraction. Secondary horseradish peroxidase-coupled antibodies (anti-rabbit HRP, anti-535 goat HRP, Protein A HRP) were purchased from GE Healthcare. Immunoblots were 536 incubated with ECL or ECL advance substrate (GE Healthcare) and signals were detected 537 with a CCD camera (ImageQuant LAS 4000 biomolecular imager (GE Healthcare)). 538 Immunoblot data was quantified using ImageQuant TL version 7.0 software (GE 539 Healthcare). Quantitative immunoblot data were processed using GelInspector software 540 [47]. Data normalization was performed by using either the recombinant calibrator proteins 541 GST-JAK1DN or GST-Tyk2DC for JAK1 and TYK2, respectively, or housekeeping 542 proteins: β-actin for IRF1, IRF9, USP18, p38 and p65 or calnexin and PARP for STAT1 543 and STAT2 in the cytoplasm and nucleus, respectively. For smoothing splines to the data, 544 Matlab's csaps-splines with a smoothing parameter of 0.8 were used. 545

546

### 547 siRNA transfection

For siRNA transfection, 2.25×10<sup>5</sup> Huh7.5 cells were seeded in 6-well plates 24 hours prior 548 to transfection. The next day, cells were washed three times with PBS and cultivated in 549 P/S free DMEM supplemented with 10% FCS before the transfection with 50 nM siRNA 550 (Dharmacon) (IRF2: L-011705-02-0005; non-targeting siRNA: D-001810-10-20). 551 Transfection was performed by incubation of siRNA with Optimem Medium (Gibco, Life 552 Technologies) and Lipofectamin RNAiMAX (Invitrogen) for 20 minutes at RT and adding 553 the mixture dropwise to cells. For efficient uptake, cells were incubated with siRNA 554 transfection mixture for 24 hours. Subsequently, the medium was changed and time 555 course experiments were performed. 556

## 558 Live-cell imaging

Primary hepatocytes (15,000 cells per well, 96-well plate format) derived from mKate2-559 560 STAT3 heterozygous knock-in mice [27] were transduced with adeno-associated viruses encoding mCerulean-labeled histone-2B during adhesion. Cells were cultivated as 561 562 described above, stimulated with ligand, and imaged using a Nikon Eclipse Ti Fluorescence microscope in combination with NIS-Elements software. Temperature 563 (37°C), CO<sub>2</sub> (5%) and humidity were held constant through an incubation chamber 564 enclosing the microscope. Three channels were acquired for each position: bright-field 565 channel, STAT3 channel (mKate2), and nuclear channel (CFP). Image analysis was 566 performed using Fiji software, and data were processed using R software. 567

568

## 569 Luciferase assay

Luciferase activity was measured as read out for HCV replication. 30,000 cells of the 570 replicon cell line Huh7/LucUbiNeo/JFH1 [48] were seeded in a 24-well plate two days prior 571 to the stimulation. Cells were growth factor depleted for 3 hours followed by IFNa 572 treatment. At different time points cells were washed once with PBS and lysed with 100 573 µl luciferase lysis buffer (1% Triton X-100, 25 mM glycil-glycin (pH 7.8), 15 mM MgSO<sub>4</sub>, 4 574 mM EGTA, 10% Gylcerol) directly in the well. Plates were stored at -80°C until 575 measurement. Luciferase was measured applying 400 µl luciferase assay buffer (15 mM 576 K<sub>3</sub>PO<sub>4</sub> (pH7.8), 25 mM glycil-glycin (pH 7.8), 15 mM MgSO<sub>4</sub>, 4 mM EGTA) with freshly 577 added 1 mM DTT, 2 mM ATP and 1mM D-Luciferin. Luciferase activity was measured 578 using Mitras<sup>2</sup> multimode reader LB942 (Berthold). 579

580

## 581 Cultivation of primary mouse hepatocytes

582 Cells were seeded with a density of  $3.5 \times 10^5$  cells per cavity in a collagen-coated 6-well-583 plate. For the experiments cells were cultivated under FCS-free conditions in 584 DMEM/Ham's F-12 (Biochrom) supplemented with 2 mM glutamine and 100 U/ml 585 penicillin/0.1 mg/ml streptomycin (Cytogen). Cells were stimulated with 500 U/ml of 586 murine recombinant IFN $\alpha$  (PBL) with or without 10 ng/ml of murine recombinant IL1 $\beta$ 587 (JenaBioscience) for the time points indicated in the respective figure.

588

## 589 **RNA isolation and qRT-PCR of primary mouse hepatocytes**

Total cellular RNA was isolated by using the RNeasy Miniprep Kit (Qiagen) as described 590 in the manufacturer's instructions. 1 µg of total RNA was reverse transcribed with 591 Quantitect Reverse Transcription Kit (Qiagen) using oligo(dT), which included DNase I 592 digestion. cDNA was diluted 1/5, and 1.2 µl of the diluted cDNA was added as template 593 to a final volume of 25 µl including 1x GoTag gPCR Master Mix according to the 594 manufacturer's instructions (Promega, Mannheim, Germany). gRT-PCR was performed 595 596 using the ViiA7 real-time PCR system (Applied Biosystems). Primers were generated using the Primer-BLAST design tool from NCBI based on the accession number of the 597 gene of interest. All primers were purchased from Eurofins MWG Operon (Ebersberg). 598 Specificity of rtPCR was controlled by no template and no reverse-transcriptase controls. 599 600 Semiguantitative PCR results were obtained using the  $\Delta CT$  method. As control gene *HPRT* was used. Threshold values were normalized to *HPRT* respectively. 601

RNA purification of liver tissue from LCMV infected mice for qRT-PCR analyses were performed as previously described [49]. Gene expression of *IRF1*, *MX1*, *ISG12*, *TRIM21*, *EIF2AK2*, *IFITM3*, *HPRT* was performed using kits from Applied Biosystems. For analysis, the expression levels of all target genes were normalized to *HPRT* expression (ΔCt). Gene expression values were then calculated based on the ΔΔCt method, using the naïve liver samples as a control to which all other samples were compared. Relative quantities (RQ) were determined using the equation: RQ=2<sup>-ΔΔCt</sup>.

609

## 610 LCMV infection of wild-type or IL1R1 knock-out mice

All mice were on a C57BL/6 genetic background. IL1R1<sup>-/-</sup> mice [30] were obtained from 611 Jackson Laboratory (mouse strain 003245). All mice were maintained under specific 612 pathogen-free conditions and experiments have been approved by the LANUV in 613 accordance with German laws for animal protection (reference number G315). LCMV 614 strain WE was originally obtained from F. Lehmann-Grube (Heinrich Pette Institute, 615 Hamburg, Germany) and was propagated in L929 cells as described. Mice were infected 616 intravenously with 2×10<sup>6</sup> plaque forming units (pfu) LCMV-WE. Virus titers were measured 617 using a plaque forming assay as described previously [49]. Briefly, organs were harvested 618 into HBSS and homogenized using a Tissue Lyser (Qiagen). 0.8×10<sup>6</sup> MC57 cells were 619 added to previously in 10-fold dilutions titrated virus samples on 24-well plates. After 3h 620 1% methylcellulose containing medium was added. After 48 h plates were fixed (4%) 621

formalin), permeabilized (1% Triton X HBSS), and stained with anti-VL-4 antibody, 622 peroxidase anti-rat antibody and PPND solved in 50 mM Na<sub>2</sub>HPO<sub>4</sub> and 25 mM citric acid. 623 624 Histological analysis was performed on snap frozen tissue as described [49]. Anti-LCMV-NP (clone: VL4) was used in combination with an alkaline phosphatase system. Tetramer 625 production, surface and intracellular FCM staining was performed as described previously 626 [49]. Briefly, single cell suspensions from spleen and liver tissue as well as peripheral 627 blood lymphocytes were stained using gp33 or np396 MHC class I tetramers (gp33/H-628 2Db) for 15 min or gp61 MHC II tetramer for 30 min at 37°C, followed by staining with anti-629 CD8 (BD Biosciences) for 30 min at 4°C. For determination of their activation status, 630 lymphocytes were stained with antibodies against surface molecules as indicated for 30 631 632 min at 4°C. For intracellular cytokine stain single suspended splenocytes or liver cells were incubated with the LCMV-specific peptides gp33, np396, or gp61. After 1 h Brefeldin 633 A (eBiosciences) was added, followed by additional 5 h incubation at 37°C. After surface 634 stain with anti-CD8 or anti-CD4 (eBiosciences) cells were fixed with 2% formalin and 635 permeabilized with PBS containing 1% FCS and 0.1% Saponin and stained with anti-IFNy 636 (eBiosciences) for 30 min at 4°C. 637

638

## 639 Microarray analysis

IFNα-induced gene expression data [4] was analyzed by the Robust Multi-array Average 640 (RMA) [50] algorithm. It was applied for data processing of Affymetrix gene expression 641 data (Human Gene ST Arrays) using the implementation in the simpleaffy R package 642 version 2.40.0 (http://www.bioconductor.org/packages/release/bioc/html/simpleaffy.html). 643 All subsequent analyses were performed on the log<sub>2</sub>-scale and the expression of the 644 individual genes was considered relative to the measured expression of untreated cells at 645 0 hours. A paired t-test (treated vs. untreated) was used to assess the significance of 646 IFNα-induced regulation at 1, 2, 3, 4, 8, 12, 24 hours. Because only three genes 647 (ID8139776, TCEB3CL2, CFC1) were significantly downregulated, we focused on the 53 648 genes showing a significant upregulation (p<0.05 and average fold-change>2). The time-649 point of maximal regulation was considered to subdivide the upregulated genes into three 650 651 classes. Genes were visualized with respect to the time-point of maximal regulation and within the groups with the same time-point according to the fold change at 1 h. 652

## 654 Quantification of RNA stability

<sup>655</sup> Cells were seeded, growth factor depleted and stimulated with 500 U/ml IFN $\alpha$  for 8 hours <sup>656</sup> as described above followed by treatment with 5 µg/ml actinomycin D to inhibit <sup>657</sup> transcription. Total RNA was extracted at specific time points and analyzed using qRT-<sup>658</sup> PCR. RNA half-life was estimated by fitting the mRNA fold expression to an exponential <sup>659</sup> decay 3-parameter function. t<sub>1/2</sub>: mRNA half-life.

$$f(t) = d + a \cdot \exp\left(-\frac{\ln(2) \cdot t}{t_{1/2}}\right)$$

661

660

## 662 Quantification of dose-dependency of RNA on IFNα

Cells were seeded, growth factor depleted and stimulated as described above and
 stimulated with increasing doses of IFNα for 4 hours. Total RNA was extracted and
 analyzed using qRT-PCR. A sigmoidal 4-parameter Hill function was fitted to the RNA
 expression.

667

$$f(x) = d + \frac{a \cdot x^b}{c^b + x^b}$$

668 Where d = y-axis intercept, a = amplitude, b = slope and <math>c = x-value of the point of 669 inflection i.e. the EC<sub>50</sub> dose.

670

## 671 Transcription factor binding site analysis

Transcription factor binding site analysis was performed using HOMER software [21] (http://homer.salk.edu/homer/ngs/index.html). Promoter regions of analyzed genes were analyzed for known transcription factor binding site. For this, a list with identifiers of genes of interest was submitted to the software and the respective promoter regions were obtained from a software-specific database. Significant enrichment of found transcription factor binding sites were set relative to all promoter regions analyzed using hypergeometric test.

679

## 680 Mathematical modeling

The presented modeling approach is based upon a previously published IFNα model [4].
 For this study, the model has been extended by incorporating the genetic response of
 IFNα-stimulated JAK/STAT signaling. Further, the formation of the receptor complex was

simplified so that the complex is activated directly by IFN $\alpha$  binding. In addition, ISGF3 684 formation and dissociation were previously incorporated as two steps. Here, the complete 685 686 formation of ISGF3 was summarized in one step; STAT1, STAT2 and IRF9 bind synergistically. The final model consists of 30 species and 53 kinetic parameters. All 687 reactions are defined as ordinary differential equations (ODEs) based on mass action 688 kinetics in cytoplasm and nucleus. Measured concentrations (STAT1, STAT2, IRF9 and 689 IFN) were transformed from molecules per cell to nM by using STAT1 concentration as 690 reference. In the final version of the model, unphosphorylated STAT1 concentration was 691 identified to be negligible. The current model is implemented into the MATLAB-based 692 modeling framework D2D [51, 52]. 693

694

# 695 **Parameter estimation**

To find the optimal parameter sets that describe the experimental data for each model 696 structure best, we performed numerical parameter estimation. The D2D framework is 697 using a parallelized implementation of the CVODES ODE solver. The procedure of 698 parameter estimation is based on multiple local optimizations for different initial guesses 699 of the parameters. For the optimization, the LSQNONLIN algorithm (MATLAB, R2011a, 700 Mathworks) was used. Most kinetic parameters were limited to values between 10<sup>-6</sup> and 701 1. Exceptions include translocation parameters. Here, the upper boundary was raised to 702 10<sup>2</sup>. Parameter values close to upper or lower boundaries result from practical non-703 identifiability of the model structure. We assume that six orders of magnitude as a 704 parameter range is sufficient to not hinder the parameter estimation process. For the 705 random sampling of the multiple starting points, a Latin hypercube method was utilized. 706 In addition to kinetic parameters, the observation function relating the ODE model to the 707 experimentally accessible data contains scaling and noise parameters. These non-kinetic 708 parameters were fitted in parallel to the kinetic parameters as described [53]. Using a 709 previously established strategy [53], we ensured reliable convergence of our parameter 710 711 estimation procedure for the two mathematical models (S2C Fig).

712

## 713 **Prediction profiles**

To obtain confidence intervals of the model predictions for the additional internal feedback
 loops, we calculated predictions profiles for the respective species as described [54]. For

our analysis, prediction profiles have been calculated along the complete time course of 716 the core model with an additional intracellular feedback and species 717 718 "internal x factor mrna" (Fig 4B). Through the calculation of prediction profiles, a range for the specified trajectories of the species dynamic is given for each calculated time point. 719 in which the likelihood value of the model stays within a 95% confidence level. 720

721

# 722 Rankings (AIC/LRT)

Performances of different model structures are determined by the likelihood *L*. For comparison of the model structures, two different criteria are used (S2D,E Fig). First, we introduced a variation of the likelihood-ratio test:

 $icdf_{\Delta df}(0.95) - 2 \cdot \log(L)$ 

where  $\Delta df$  denotes the difference in degrees of freedom between the two selected models

and *icdf* denotes the inverse cumulative density function of the chi-squared distribution.

The results of the likelihood ratio tests with the full model are then used to obtain the ranking of the corresponding model structures.

For the second criterion, all models are compared utilizing the Akaike Information Criterion(AIC), defined as:

733

$$AIC = 2 \cdot k - 2 \cdot \log(L)$$

where *k* denotes the degrees of freedom in the respective model. While the AIC provides a ranking where each model is treated equally, the LRT provides information in terms of significance for a pairwise comparison of two selected models. In practice, the AIC slightly favors larger models due to the linear penalization of the degrees of freedom of a model.

738

# 739 Data availability

Mircoarray data is available at the Geo database
(https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE100928). All other relevant
data are within the manuscript and its Supporting Information files.

- 743
- 744

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### 748

Author contributions: KR generated the time-resolved quantitative gene expression 749 data and performed all the experiments. AS generated the time-resolved quantitative 750 signaling proteins data and the time-resolved quantitative gene expression data for the 751 microarray. TM, JT and MS developed the mathematical model. CK analyzed the 752 microarray data. JW, RB and MB provided the HCV system and contributed to the 753 754 corresponding analyses. CE, JH, PAL and JGB performed the mouse experiments. XH performed single cell experiments. DS and GD provided the primary human hepatocytes. 755 UK, JT, KR, AS, SC, FS, MT and MS conceived the project and wrote the manuscript. All 756 authors contributed to and approved the paper. 757

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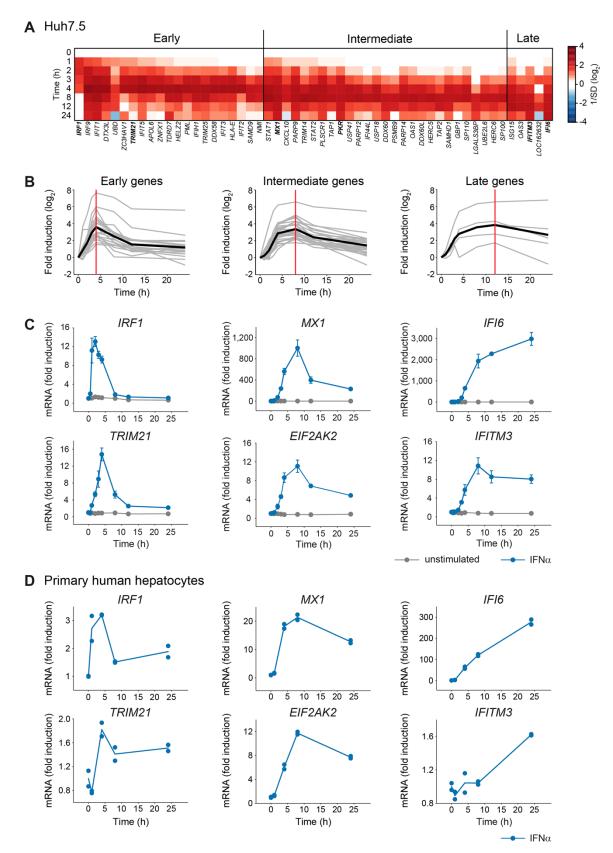
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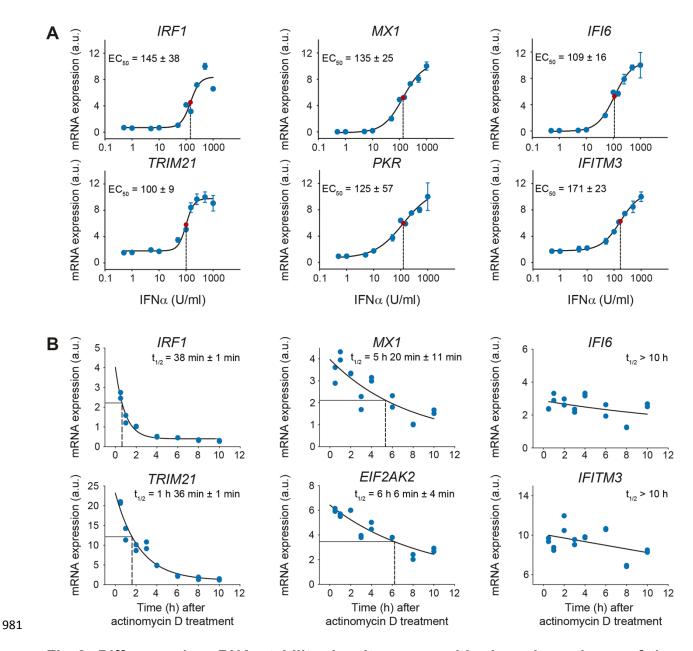
# 966 Figures



## <sup>968</sup> Fig 1: Early, intermediate and late expression profiles of IFNα-induced genes. (A)

Microarray expression data for Huh7.5 cells stimulated with 500 U/ml IFNa. The heatmap 969 shows the temporal expression patterns of 53 significantly upregulated genes, grouped 970 971 according to their peak expression time. (B) The induction of the genes depicted in A is displayed in a time-resolved manner according to the respective groups (grey curves). 972 The average expression of each group is indicated by a solid black line. The vertical red 973 974 lines indicate the time points of maximal induction. (C) Huh7.5 cells were stimulated with 500 U/ml IFN $\alpha$  or left untreated and two representative antiviral genes per group were 975 analyzed by gRT-PCR. The error bars represent SD of biological triplicates. 976 (**D**) IFNα-induced mRNA expression in primary human hepatocytes. Primary human 977

hepatocytes were growth factor depleted and stimulated with 500 U/ml IFNα. RNA was
 extracted at the indicated time points and analyzed using qRT-PCR. Points: experimental
 data; lines: average of biological duplicates.



**Fig 2: Difference in mRNA stability despite comparable dose-dependency of the expression profiles of given antiviral genes.** (**A**) IFNα dose-dependent mRNA expression of antiviral genes. Huh7.5 cells were treated with increasing doses of IFNα for 4 hours. The cells were lysed, total RNA was extracted and analyzed by qRT-PCR. The error bars represent standard deviations (SD) based on biological triplicates. Regression line: sigmoidal four-parameter Hill function; red point: inflection point; dashed line: calculated EC50; a.u.: arbitrary units.

(B) Quantification of the mRNA half-lives of the selected antiviral genes. Huh7.5 cells were
stimulated with 500 U/ml IFNα for 8 hours and then treated with 5 ng/ml actinomycin D for
the indicated times. Total RNA was extracted and analyzed by qRT-PCR. The data points
represent biological duplicates. Regression line: three-parameter exponential decay
function, dashed line: calculated RNA half-life.

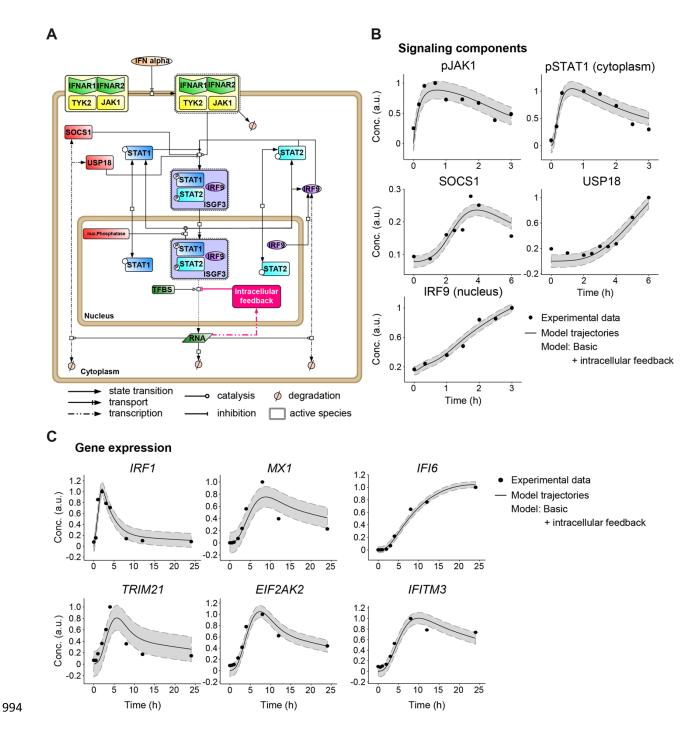


Fig 3: Core mathematical model with an additional intracellular feedback of IFNαinduced JAK/STAT signaling and gene expression (A) Schematic representation of the core model with an additional intracellular feedback according to Systems Biology Graphical Notation. TFBS: transcription factor-binding site. (B-C) Trajectories of the core model with an additional intracellular feedback are shown together with the dynamic

1000	behavior of the core components of the JAK/STAT signaling pathway measured by
1001	quantitative immunoblotting ( <b>B</b> ) and to the expression of IFN $\alpha$ -induced genes examined
1002	by qRT-PCR ( <b>C</b> ) after stimulation of Huh7.5 cells with 500 U/ml IFN $\alpha$ . Filled circles:
1003	experimental data; line: model trajectories, shades: estimated error; a.u. arbitrary units.

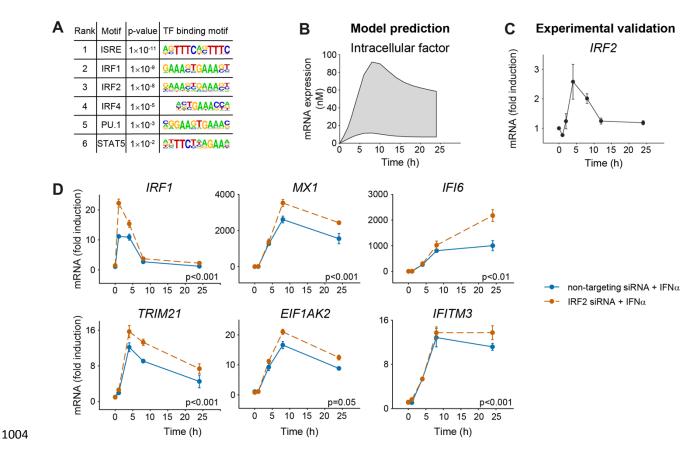
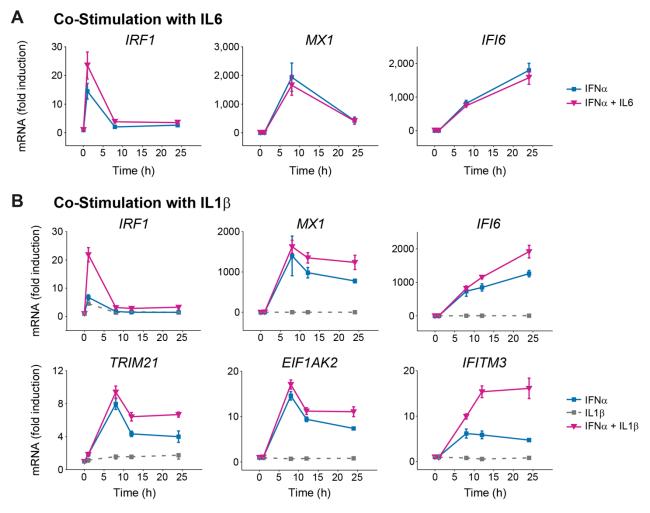


Fig 4 The expression profiles of the selected IFNα-stimulated genes are negatively 1005 influenced by the intracellular factor IRF2. (A) Transcription factor binding site analysis 1006 by the HOMER motifs software revealed six significantly regulated transcription factor 1007 binding motifs. The six most significantly enriched motifs according to the p-value and 1008 their sequence motifs are shown. (B) Model prediction of the mRNA expression profile of 1009 1010 the negative regulatory intracellular factor. Shading represents the uncertainty of the prediction. (C) Expression profile of *IRF2* mRNA after treatment with 500 U/ml IFNα was 1011 detected by qRT-PCR. (D) Upregulation of gene expression by decreased IRF2 1012 expression. Huh7.5 cells were incubated with 50 nM siRNA directed against IRF2 (orange) 1013 or non-targeting control (blue) for 24 hours, and then treated with 500 U/ml IFNα. The 1014 cells were lysed at the indicated time points and total RNA was extracted and analyzed 1015

- <sup>1016</sup> by qRT-PCR. The error bars represent SD of biological triplicates. Significance was tested
- 1017 by 2-way ANOVA.



1018

Fig 5 Enhanced IFNα-induced gene expression after co-stimulation with IFNα and 1019 1020 **IL1** $\beta$ . (A) Co-stimulation with IFN $\alpha$  and IL6. Huh7.5 cells were growth factor depleted followed by single treatment with 500 U/ml IFNα alone or in combination with 5 ng/ml 1021 1022 IL6. At indicated time points RNA was extracted and analyzed using gRT-PCR. Error bars represent SD of biological triplicates. (B) IFNα-induced gene expression after co-1023 treatment with IFNα and IL1β. Huh7.5 cells were treated with 500 U/ml IFNα, were 1024 1025 stimulated with 500 U/ml IFNa alone or were co-treated with 500 U/ml IFNa and 10 ng/ml IL1β. RNA was extracted at the indicated time points and analyzed by gRT-PCR. Error 1026 bars represent SD of biological triplicates. 1027

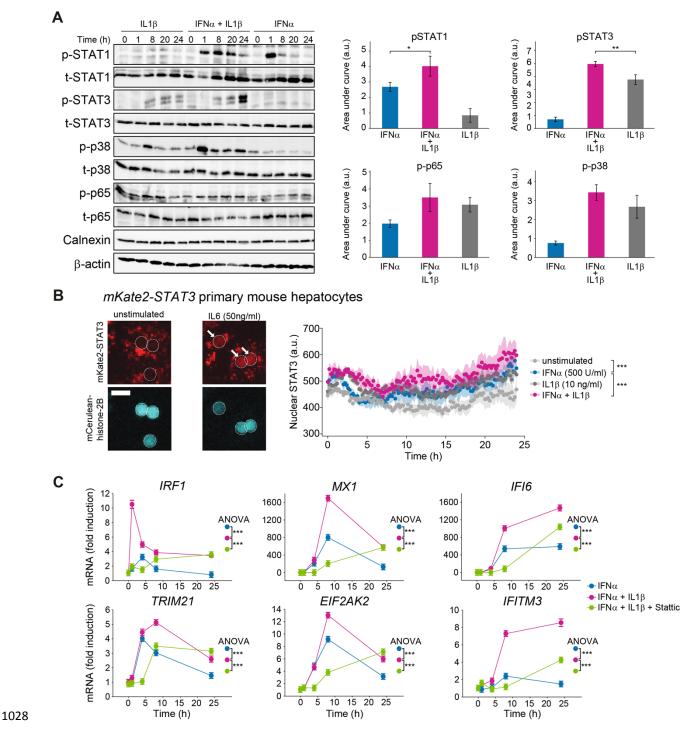


Fig 6 Co-stimulation of IFNα and IL1β results in phosphorylation of STAT3. (A)
 Huh7.5 cells were single or co-stimulated with 500 U/ml IFNα and 10 ng/ml IL1β. Cells
 were lysed at indicated time points and analyzed using quantitative immunoblotting. Error
 bars represent SEM of three biological replicates. (B) Primary mouse hepatocytes from

*mKate2-Stat3* knock-in mice were growth factor depleted overnight and stimulated with 1033 IL6 or left untreated. Representative images of cells expressing a mCerulean-histone-2B 1034 nuclear marker are depicted. The dotted line indicates the outline of the nuclei and white 1035 arrows indicate nuclear STAT3. The right panel indicates the guantification of the nuclear 1036 mKate2-STAT3 intensity of primary mouse hepatocytes stimulated with IL1β, IFNα, co-1037 stimulated or left unstimulated. The quantification is based on 20 cells per condition: 1038 1039 shading indicates SEM; scale bar=25 µm. Significance was tested by two-way ANOVA. \*\*\*, p<0.001. (C) Huh7.5 cells were pre-treated for 30 minutes with 10 µM STAT3 inhibitor 1040 Stattic followed by 500 U/ml IFNa in combination with 10 ng/ml IL1B. mRNA was extracted 1041 1042 at indicated time points and analyzed using gRT-PCR. Error bars represent SD of biological triplicates. 1043

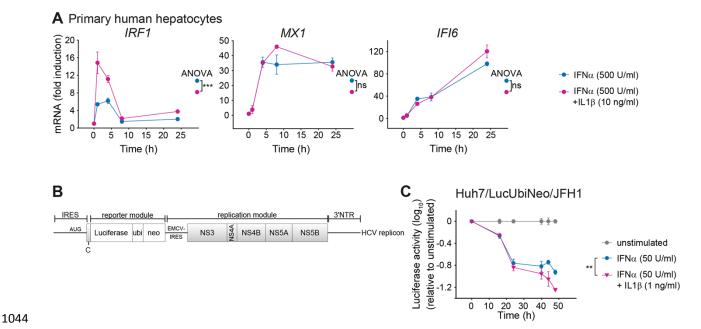


Fig 7 Co-stimulation with IFNα and IL1β enhances IFNα-induced gene expression 1045 in primary human hepatocytes and viral clearance of HCV in a replicon cell line. (A) 1046 Effect of co-stimulation with IFN $\alpha$  and IL1 $\beta$  on mRNA expression of IFN $\alpha$ -induced genes 1047 in primary human hepatocytes. Cells were stimulated with 500 U/ml IFNa alone or co-1048 treated with 500 U/ml IFNα and 10 ng/ml IL1β. RNA was extracted at the indicated time 1049 points and analyzed by gRT-PCR. Samples were analyzed from three different donors 1050 and error bars represent SD. (B) Scheme of the bicistronic subgenomic HCV reporter 1051 RNA (replicon). IRES, internal ribosomal entry site; NTR, non-translated region. (C) 1052 Enhanced suppression of HCV replication in cells co-stimulated with IFN $\alpha$  and IL1 $\beta$ . 1053 Huh7/HCV/Luc replicon cells were stimulated with 50 U/ml IFNa alone or were co-treated 1054 with 50 U/ml IFN $\alpha$  and 1 ng/ml IL1 $\beta$ . The values are relative to the unstimulated control. 1055 Error bars represent the SEM of six technical replicates. 1056

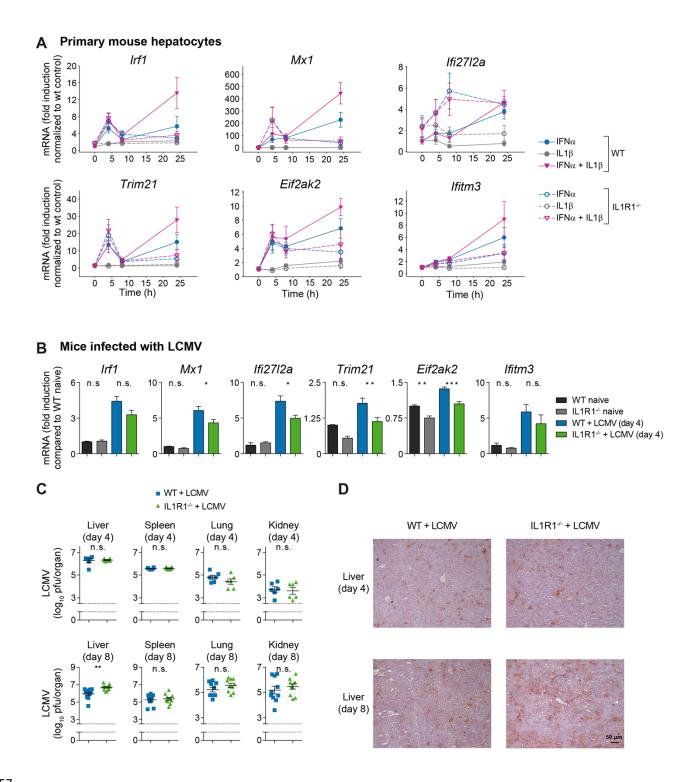


Fig 8 IFNα-induced antiviral response is reduced and virus replication is enhanced
 in IL1R1<sup>-/-</sup> mice. (A) Expression of the selected antiviral genes in primary mouse
 hepatocytes from wild-type (WT) or IL1R1 knock-out (IL1R1<sup>-/-</sup>) mice upon stimulation with

500 U/ml murine IFNα2, 10 ng/ml murine IL1β or co-treatment. RNA was extracted at the 1061 indicated time points and analyzed by gRT-PCR. Error bars represent SD of four biological 1062 replicates; a.u.: arbitrary units. (B) Wild-type (wt) or IL1R1 knock-out (IL1R1<sup>-/-</sup>) CL57BL/6 1063 mice were infected with 2×10<sup>6</sup> pfu of LCMV strain WE. Prior to and four days post infection, 1064 livers were isolated and the selected antiviral genes were measured by gRT-PCR. 1065 Differences between WT and IL1R1<sup>-/-</sup> livers were tested by one-way analysis of variance. 1066 \*\*\*, p<0.001; \*\*, p<0.01; \*, p<0.05; n.s., not significant; n=6. (C) Wild-type (wt) or IL1R1 1067 knock-out (IL1R1-/-) CL57BL/6 mice were infected with 2.106 pfu of LCMV WE. Four and 1068 eight days post infection, livers, spleens, lungs and kidneys were isolated and viral load 1069 was guantified. Titer differences between WT and IL1R1<sup>-/-</sup> organs were tested by two-1070 1071 sided t-tests. \*\*, p<0.01; n.s., not significant; n=6-10. (D) Wildtype (wt) or IL1R1 knock-out (IL1R1<sup>-/-</sup>) CL57BL/6 mice were infected with 2.10<sup>6</sup> pfu of LCMV WE. Four and eight days 1072 past infection, livers were isolated and viral proteins (LCMV-NP) were stained; n=6-7; 1073 1074 scale bar=50 µm.

## 1075 Supporting information captions

1076 S1 Fig. Core mathematical model of IFNα-induced JAK/STAT signaling and gene 1077 expression. (A) Schematic representation of the core model according to Systems 1078 Biology Graphical Notation. TFBS: transcription factor-binding site. (**B**,**C**) Trajectories of 1079 the core model are shown together with the dynamic behavior of the core components of the JAK/STAT signaling pathway measured by quantitative immunoblotting (**B**) and to the 1080 expression of IFN $\alpha$ -induced genes examined by qRT-PCR (**C**) after stimulation of Huh7.5 1081 1082 cells with 500 U/ml IFNa. Filled circles: experimental data; line: model trajectories, shades: estimated error; a.u. arbitrary units. 1083

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S2 Fig. The core model with an additional intracellular feedback is superior and IRF-1085 downregulation enhances gene expression. (A) Model rankings according to likelihood 1086 ratio test presented by the negative logarithmic likelihood penalized by parameter 1087 difference. Lower values indicate (B) Model rankings according to Akaike information 1088 criteria (AIC). The preferred model is the one with the smaller AIC value. (C) Assessment 1089 1090 of the optimization performance by a waterfall plot. The best parameters were reproducibly found, which validates the applied model calibration approach. (D) Huh7.5 cells were 1091 growth factor depleted and pre-incubated for 24 hours with siRNA directed against IRF2, 1092 IRF4 or IRF8 or a combination thereof followed by 500 U/ml IFNa treatment. At indicated 1093 time points RNA was extracted and analyzed using gRT-PCR. Error bars represent SD 1094 (n=3). (E) Huh7.5 cells were growth factor depleted and pre-incubated for 24 hours with 1095 siRNA directed against IRF2 followed by 500 U/ml IFNa treatment. At indicated time points 1096 RNA was extracted and analyzed using gRT-PCR. Error bars represent SD (n=3). 1097

1098

S3 Fig. IFN $\alpha$ -induced gene expression after co-stimulation with IL8 and the 1099 activation of STAT3 by IL1 $\beta$  is blocked by Stattic. (A) Co-stimulation with IFN $\alpha$  and 1100 IL8. Huh7.5 cells were growth factor depleted followed by single treatment with 500 U/ml 1101 1102 IFNα alone or in combination with 10 ng/ml IL8. At indicated time points RNA was extracted and analyzed using qRT-PCR. Error bars represent SD of biological triplicates. 1103 (B) Huh7.5 cells were single or co-stimulated with 500 U/ml IFN $\alpha$  and 10 ng/ml IL1 $\beta$ . Cells 1104 were lysed at indicated time points and analyzed using quantitative immunoblotting. Error 1105 bars represent SEM of three biological replicates. (C) mKate2-Stat3 primary mouse 1106 hepatocytes were stimulated with 5 ng/ml IL-6 or 10 ng/ml IL-1β. Line plots represent the 1107 dynamics of nuclear STAT3 for the indicated conditions. Two biological replicates and two 1108 technical replicates were included. Data represent mean ± SEM. (D) Huh7.5 cells were 1109 treated with 10 µM Stattic for up to 24 h or left untreated and cell viability was measured. 1110 (E) Huh7.5 cells were pre-treated with 10  $\mu$ M Stattic followed by 10 ng/ml IL1 $\beta$  and 500 1111 U/ml IFNa treatment. Cells were lysed at indicated time points and analyzed using 1112 1113 quantitative immunoblotting. Error bars represent SD of biological triplicates. a.u.: arbitrary units. 1114

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S4 Fig. Enhanced viral clearance in a HCV replicon cell line upon co-stimulation with IFNα and IL1β. (A) Luciferase activity measurement in single and co-stimulated cells. Time-resolved measurements of luciferase activity in cells treated with 500 U/ml IFNα alone or in combination with 10 ng/ml IL1β compared to the unstimulated control. Error bars represent SEM of three biological replicates. (B) Luciferase activity measurement in single and co-stimulated cells. Time-resolved measurements of luciferase activity in cells treated with 50 U/ml IFNα alone or pre-treatment with 50 U/ml

IFNα followed by 1 ng/ml IL1β treatment compared to the unstimulated control. Error bars
 represent SEM of four biological replicates.

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S5 Fig. Reduction of anti-viral T cell immunity following LCMV infection in IL1R1<sup>-/-</sup> 1126 mice. (A) Wild-type (WT) or IL1R1 knock-out (IL1R1<sup>-/-</sup>) CL57BL/6 mice were infected with 1127 2×10<sup>6</sup> pfu of LCMV WE. Four and eight days post infection, single cell suspensions from 1128 spleen and liver tissue as well as peripheral blood lymphocytes were stained using qp33 1129 or np396 MHC class I tetramers or gp61 MHC II tetramer followed by staining with anti-1130 CD8. Differences between WT and IL1R1<sup>-/-</sup> cells were tested by two-way ANOVA. \*\*\*, 1131 p<0.001; \*\*, p<0.01; \*, p<0.05; n.s., not significant, n=6. (B) Four and eight days post 1132 infection, suspended liver cells or splenocytes were stained with the LCMV-specific 1133 peptides gp33, np396, or gp61. Additionally, surface staining with anti-CD8 or anti-CD4 1134 antibodies and intracellular staining with anti-IFNy antibodies was performed. Differences 1135 between WT and IL1R1<sup>-/-</sup> cells were tested by two-way ANOVA. \*, p<0.05; n.s., not 1136 significant, n=6. (C) Four and eight days post infection, lymphocytes were stained with 1137 antibodies against surface molecules. 1138

1139

S1 Table. Initial concentrations of model species. Measured concentrations (JAK1,
 TYK2, STAT1, STAT2, IRF9) were transformed from molecules per cell to nM by using
 STAT1 concentration as reference. Concentrations for receptors were assumed to be
 non-limiting and therefore set to a high amount [4].

1144

1145 S2 Table. qRT-PCR primers and corresponding UPL probes.