1	Dual RNA-seq provides insight into the biology of the neglected intracellular human pathogen Orientia
2	<u>tsutsugamushi</u>
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## 29 Summary

30 Emerging and neglected diseases pose challenges as their biology is frequently poorly understood, and 31 genetic tools often do not exist to manipulate the responsible pathogen. Organism agnostic sequencing 32 technologies offer a promising approach to understand the molecular processes underlying these diseases. 33 Here we apply dual RNA-seq to Orientia tsutsugamushi (Ot), an obligate intracellular bacterium and the 34 causative agent of the vector-borne human disease scrub typhus. Half the Ot genome is composed of 35 repetitive DNA, and there is minimal collinearity in gene order between strains. Integrating RNA-seq, comparative genomics, proteomics, and machine learning, we investigated the transcriptional architecture 36 37 of Ot, including operon structure and non-coding RNAs, and found evidence for wide-spread post-38 transcriptional antisense regulation. We compared the host response to two clinical isolates and identified 39 distinct immune response networks that are up-regulated in response to each strain, leading to predictions 40 of relative virulence which were confirmed in a mouse infection model. Thus, dual RNA-seq can provide 41 insight into the biology and host-pathogen interactions of a poorly characterized and genetically 42 intractable organism such as Ot.

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Keywords: neglected and emerging pathogens, intracellular bacteria, dual RNA-seq, transcriptomics,
host-pathogen cell biology, bacterial virulence, antisense transcription.

### 46 Main Text

## 47 Introduction

Improved surveillance and diagnostics have led to the recognition of previously neglected bacteria as serious pathogens, whilst human population growth, globalization and increased travel have contributed to the emergence of new pathogens and changing patterns of infectious disease. The biology of neglected and emerging pathogens is often poorly understood, but is essential to developing therapeutic and preventative strategies. Obligate intracellular pathogens present additional challenges, as many cause diseases that are difficult to diagnose and are difficult to manipulate experimentally.

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55 Obligate intracellular bacteria include the Rickettsiales, an order which includes the arthropod and 56 nematode symbiont Wolbachia as well as a number of human and veterinary pathogens. Orientia 57 tsutsugamushi (Ot, Class Alphaproteobacteria, Order Rickettsiales, Family Rickettsiaceae) causes the 58 mite-borne human disease scrub typhus, a leading cause of severe febrile illness in the Asia Pacific region<sup>1</sup>, 59 home to roughly two thirds of the world's population. Locally acquired cases in the Middle East and Latin 60 America suggest that this disease may be more widespread than previously appreciated<sup>2,3</sup>. Under-61 recognition and under-reporting are a major problem in scrub typhus because unambiguous diagnosis is 62 difficult, and awareness is low amongst many clinicians. Symptoms are non-specific and include 63 headache, fever, rash, and lymphadenopathy beginning 7-14 days after inoculation via a feeding larval 64 stage mite. If untreated, this can progress to cause multiple organ failure and death. In the mite vector Ot 65 colonizes the ovaries and salivary glands. During acute infection of its mammalian host, the bacteria infect endothelial cells, dendritic cells and monocytes/macrophages at the mite bite site<sup>4</sup>, and then disseminate 66 67 via blood and lymphatic vessels to multiple organs including lung, liver, kidney, spleen and brain<sup>5</sup>.

68 Ot strains are highly variable in terms of antigenicity and virulence. Hundreds of strains have been 69 described based on differences in the sequence of the surface protein TSA56<sup>9-11</sup>. These strains are classified into 7 geographically diverse serotype groups, dominated by the Karp, Kato and Gilliam 70 71 groups<sup>12</sup>. As with many other pathogenic bacteria, whole genome sequencing has revealed that serotype-72 based groupings do not necessarily reflect phylogenetic relationships<sup>8</sup>. Different strains of Ot exhibit 73 different levels of virulence<sup>19–21</sup>, dependent on both bacterial and host genotype. For example, strain Karp 74 (serotype group Karp) causes lethal infection in BALBc and C3H/He mice at low doses, strain Gilliam 75 (serotype group Gilliam) causes lethal infection in C3H/He but not BALBc mice at similar doses, whilst 76 strain TA716 (serotype group TA716) does not cause lethal infection in either mouse model at similar 77 doses<sup>20,22</sup>. The underlying causes of this variation in infection outcomes remain obscure.

78

79 Dual RNA-seq quantifies RNA transcripts of intracellular pathogens and host cells in a single 80 experiment<sup>24,25</sup>, and can provide insight into both the host and pathogen response to infection. For 81 example, dual RNA-seq has been used to study obligate intracellular Chlamydia trachomatis<sup>26</sup> revealing 82 the rewiring of Chlamydia metabolism during the onset of an infection of human epithelial cells, together 83 with the corresponding host responses. Here we apply dual RNA-seq to deepen our understanding of the 84 RNA biology of Ot and its consequences for virulence. We survey the transcriptome of Ot strain Karp, 85 identifying non-coding RNAs and transcribed operons in a genome broken by frequent recombination and 86 transposition of the rickettsial amplified genetic element (RAGE) integrative and conjugative element 87 (ICE)<sup>6,7</sup>. Integrating proteomic measurements, we further provide evidence that RAGE genes are regulated 88 through prevalent antisense transcription. Finally, we compare infection between strain Karp and strain 89 UT176 identifying a core host response to Ot dominated by type-I interferon signaling, as well as distinct

- 90 immune responses to each strain. We show that this in turn leads to different outcomes in a mouse model
- 91 of scrub typhus.

## 93 Results

## 94 Dual RNA-seq of Orientia tsutsugamushi infecting endothelial cells

95 We focused on two Ot clinical isolates: Karp, taken from a patient in New Guinea in 1943<sup>27</sup>, and UT176, 96 a separate strain in the same serotype group as Karp, taken from a patient in northern Thailand in 2004<sup>28</sup>. 97 These strains are closely related, with a sequence identity of 95% in their TSA56 gene (used to classify 98 strains)<sup>8</sup>. Consistent with a closed pan-genome for Ot, the gene content of Karp and UT176 are similar, 99 with differences primarily in gene copy number, pseudogenes, and gene order along the genome. Human 100 vein endothelial cells (HUVEC) were selected as host cells due to their similarity to cell types involved in 101 both early and advanced infection. HUVEC cells were infected with bacteria at an MOI of 100:1 and 102 grown for 5 days (Fig. 1A), by which point host cells were heavily loaded with bacteria (Fig. 1C, Supp. 103 Figs 1, 2). Uninfected HUVEC cells were grown in parallel. After 5 days total RNA was isolated, depleted 104 for rRNA, converted to cDNA and sequenced to  $\sim$ 35 million reads per library using Illumina technology. 105 Reads were mapped to the completed genomes of Karp, UT176<sup>8</sup> and, in parallel, the human genome. As 106 the Orientia genome is repeat-rich, we additionally applied model-based quantification with Salmon<sup>29</sup> 107 which uses uniquely mapping reads to assign multi-mapping reads to these transcriptomes to improve our 108 estimates of transcript abundance (see Methods).

109

We observed 17.1-17.5% bacterial reads in HUVECs infected with Karp and 2.8-4.9% bacterial reads in HUVECs infected with UT176 (Fig. 1D, Supp. Fig. 3). This difference likely reflects growth rate differences between Karp and UT176, which have doubling times of 19 and 27 hours in HUVEC, respectively (Fig. 1B). The distribution of reads to RNA classes (Fig. 1D) indicated efficient depletion of ribosomal transcripts in the host transcriptome (<0.001% human rRNA reads). In contrast, we found an average of 16% and 30% rRNA reads in Karp and UT176, respectively. Most of these remaining bacterial

ribosomal reads were derived from 5S rRNA (Supp. Table), likely reflecting the divergence of 5S rRNA
sequences between Ot and bacterial model organisms used for optimization of the Ribo-Zero approach
(https://emea.illumina.com/products/selection-tools/ribo-zero-kit-species-

compatibility.html?langsel=/de/). This notwithstanding, reads mapping to coding sequences (CDSs) were
not only abundant in the HUVEC data subset (53% of all host-mapped reads), but also in the Ot-specific
reads (38% of the Karp- and 49% of the UT176-mapped reads), allowing differential expression analysis.
Dual RNA-seq also readily detected the various non-coding RNA classes from both host and bacteria (Fig.
1E). Of 657 predicted core Ot genes<sup>8</sup> 491 were expressed and 212 were highly expressed (see Methods
for definitions).

125

#### 126 Ot ncRNAs and evidence for tmRNA processing

127 Bacterial genomes encode many non-coding (nc)RNAs. Among the most conserved are several 128 specialized, abundant housekeeping ncRNAs, including the RNA components of ribonuclease P (RNase 129 P), the signal recognition particle (SRP), and transfer-messenger RNA (tmRNA), all of which were 130 detected in the Karp transcriptome data (Fig. 1E, Supp. Table 1). To validate the RNA-seq data, we 131 performed Northern blot analysis for conserved housekeeping ncRNAs (Fig. 2A). These include the M1 132 RNA component of RNase P, a ribozyme responsible for tRNA processing, and 4.5S, the RNA component 133 of the SRP involved in translocation of membrane proteins. Both ran at their expected lengths of ~385 and 134  $\sim 100$  nt, respectively. However, a second stronger band for the M1 transcript ran slightly higher, indicative 135 of a length of ~450 nt, suggesting the existence of a precursor-M1.

136

We also found evidence of tmRNA processing in Ot. tmRNA has both mRNA-like and tRNA-like
 features, rescues stalled ribosomes<sup>30</sup>, and is known to contribute to virulence in pathogens as diverse as

Salmonella Typhimurium<sup>31</sup> and Francisella tularensis<sup>32</sup>. In our data, tmRNA appears to be expressed at 139 140 unusually high levels, contributing between 3 and 7% of total bacterial reads (Fig 1E), suggesting an 141 important role in Ot survival in mammalian cells. tmRNA generally consists of a tRNA-like (acceptor) 142 domain encoded upstream of a short open reading frame (coding domain). However, the transcript has 143 undergone a circular permutation in some clades of bacteria<sup>33</sup>, including the Alphaproteobacteria<sup>34</sup>, which 144 requires processing of a precursor transcript into separate, base-pairing acceptor and coding RNA chains<sup>35,36</sup> (Fig. 2B). We detected three Ot tmRNA forms using Northern blot: (i) a long precursor tmRNA 145 146 (372 nt); (ii) a 5' fragment of ~80 nt, the acceptor domain; (iii) and the 3' coding domain of ~240 nt (Fig. 147 2B). Read coverage over the tmRNA locus in the Karp genome supported a cleavage event within the 148 loop region that connects the tRNA- and mRNA-like domains in the full-length precursor (Fig. 2C).

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In addition to these universally conserved housekeeping ncRNAs, bacterial genomes encode family-, genus-, species-, or strain-specific small ncRNAs (sRNAs) to adapt their gene expression to specific intrinsic and environmental cues<sup>37,38</sup>. Our RNA-seq data identified 55 intergenic sRNA candidates, between 77-803 nt, in the Karp transcriptome (Supp. Table 1). When normalized to the genome size of Ot, this is consistent with the number of sRNAs reported in model bacterial pathogens<sup>39-44</sup>.

155

### 156 Conserved operons in a dynamic genome

The genome of Ot is highly dynamic<sup>8</sup>, and while the timescales and mechanisms of its rearrangements are unknown they are thought to be driven by an extreme proliferation of mobile elements<sup>6,7</sup>, in particular the RAGE. The consequences of this are evident when comparing the high degree of synteny in bacteria from two related 'normal' genera (*Escherichia* and *Salmonella*) to the complete shuffling we observe between the two Ot strains studied here (Fig. 2D). As bacterial genomes are normally organized into co-transcribed 162 operons of functionally related genes, we wondered how this macroscale loss of synteny would affect 163 conservation of these transcripts. Using Rockhopper<sup>45</sup> and manual curation, we identified adjacent genes expressed in a continuous transcript, classifying these as operons. We identified 131 operons fully 164 165 conserved between Karp and UT176 (all genes expressed in both strains) and seven partly conserved 166 (some genes expressed in both strains). Our previous analysis of 8 Ot genomes identified 51 universally 167 conserved genomic islands, including 35 potential collinear gene clusters containing two to thirteen 168 genes<sup>8</sup>, and we found evidence for operonic transcripts originating from 24 of these. We also identified 169 212 and 192 transcribed operons present only in Karp or UT176, respectively, and these were generally 170 associated with the RAGE mobile element (73% in Karp and 93% in UT176) in contrast to conserved 171 operons (14% of fully conserved operons, Fig 2E).

172

173 The majority (84%, Supp. Fig. 6) of conserved operons consisted of only two or three genes. Longer 174 operons tended to encode for core cellular processes, the longest being a 30 gene operon encoding almost 175 half of Ot ribosomal proteins proximal to the ribosomal RNA operon itself (Fig. 2F). Others included an 176 8 gene operon involved in iron-sulfur cluster assembly, and 6 and 5 gene operons in distinct loci each 177 encoding for portions of the NADH-ubiquinone oxidoreductase complex in an organization similar to that observed in *Rickettsia prowazekii* and eukaryotic mitochondria<sup>46</sup>. In summary, the identification of 178 179 cotranscribed gene clusters in a genome as highly dynamic as that of Ot indicates strong selection for 180 those genes to remain coupled, indicating involvement in the same pathways and likely shared regulation.

181

### 182 Evidence for Ot RAGE regulation by antisense RNA

183 The RAGE of Ot is present in at least 185 remnant copies<sup>7</sup>. It encodes an integrase (*int*) and transposase 184 gene (*tra*), multiple genes from the VirB type IV secretion system (*vir*) and a number of potential effector 185 genes including ankyrin-repeat containing proteins (ank), tetratricopeptide repeat containing proteins 186 (TPR), SpoT/RelA genes, DNA methyltransferases and replicative DNA helicases. Many of these genes 187 are truncated and most RAGE copies are highly degraded, containing only a subset of genes from the 188 complete element. It is not known if this ICE is still active for transposition, nor whether Ot can express 189 a functional type IV secretion apparatus. In our RNA-seq dataset  $\sim 50\%$  of the most highly expressed genes 190 were repetitive genes encoded by the RAGE (defined throughout our analysis as integrase, transposase, 191 conjugal transfer genes and hypothetical genes) in both strains. These same genes were also highly 192 expressed in the antisense direction (Fig. 3A, Supp. Fig. 6), leading us to hypothesize that the repetitive 193 RAGE genes may be regulated by antisense gene expression.

Antisense transcription is widespread in bacteria<sup>47</sup>, with between 5% and 75% of coding sequences exhibiting antisense transcription. While functions for a number of specific antisense transcripts have been described, including regulation through occlusion of the ribosome binding-site or induction of RNase III mediated decay<sup>48</sup> their relevance as a general functional class remains unclear. Antisense promoters tend to be weakly conserved<sup>49</sup>, arguing against specific functions, and mathematical modeling has suggested the majority of antisense transcripts are not expressed at sufficient levels to affect the regulation of their cognate coding sequence<sup>50</sup>.

To explore the relationship between sense and antisense expression of core Ot genes and repetitive RAGE genes, we combined our Karp RNA-seq dataset with a proteomics dataset generated under the same experimental growth conditions. We observed substantially fewer RAGE gene products detected by proteomics, compared with RNA-seq (Fig. 3A). Genes with detected protein products had higher transcript expression on average compared to those not detected by proteomics (Fig. 3B). However, many highly expressed transcripts appeared to produce no protein. Given our previous observations, we asked whether antisense transcription would correlate with protein expression. All genes with detected proteins

had an antisense-sense read count ratio of less than 1, in contrast to genes with no detected protein product,
which had an antisense-sense read count spanning several orders of magnitude (Fig. 3C) suggesting
antisense RNA expression may be a factor in inhibiting translation.

211 To test this hypothesis more rigorously, we constructed three logistic regression models to predict protein 212 detection from our transcriptomic data. The first used only transcripts per million (TPMs) derived from 213 the sense strand as a predictor; the second used only the antisense-sense read count ratio as a predictor; 214 the third used both features. Comparisons of the predictive power of these three models showed that 215 antisense transcription is predictive of protein expression (Fig. 3D). Model 1, relying only on sense 216 expression, did little better than chance at predicting protein detection. Models 2 and 3, which incorporate 217 the antisense-sense ratio, led to large improvements in predictive power, suggesting that antisense 218 transcription plays a wide-spread regulatory role in Ot. This was confirmed by cross-validation (Methods, 219 Supp. Fig. 7). We found significant enrichment for RAGE genes among those with high antisense-sense 220 ratios (Fig. 3E), suggesting antisense transcription may work to control the expression of selfish genetic 221 elements at the protein level. Thirty core genes also exhibited an antisense-sense ratio of >1 (Supp. Table 222 core genes) and these include the chromosomal replication initiator protein DnaA, DNA polymerase 223 subunit III, an outer membrane autotransporter protein ScaD, glutamine synthetase, three transporters, the 224 protein export protein SecB and 12 hypothetical proteins. None of these models achieved greater than 225 67% balanced accuracy, which may be due to both the existence of other modes of post-transcriptional 226 regulation and the lack of sensitivity in our proteomics. For instance, we have also performed a preliminary 227 investigation of codon bias and found some evidence for differential codon usage in genes expressed at 228 the RNA, but not protein, level (Supp. Text, Supp. Fig. 8-9).

229

## 230 Differential expression of genes in Karp and UT176

231 Due to a lack of genetic tools, identification of virulence mechanisms in Ot has been difficult, with only 232 a small number of antigenic surface proteins and effectors known. As pangenome diversity appears to 233 primarily be the result of gene duplication and decay, differences in virulence between strains are likely 234 due to differences in expression. To investigate this hypothesis, we performed differential expression 235 analysis between Karp and UT176 at 5 d after infection of HUVEC cells. Pathway and gene ontology 236 (GO) analyses of differentially expressed genes (Fig. 4A, Supp. Table 1) indicated that most pathways 237 were up-regulated in Karp compared with UT176, including those involved in DNA replication and metabolism, consistent with Karp's higher growth rate (Fig. 1B). At the gene level (Supp. Table 1, Fig. 238 239 4B) we found a number of surface and effector proteins (Anks) were differentially regulated between the 240 two strains. Ot encodes five autotransporter domain-containing proteins (ScaA-ScaE) and three 241 immunogenic-type surface antigens (TSA22, TSA47, TSA56). All these surface proteins are immunogenic, based on their reactivity to patient sera<sup>60</sup>, with TSA56 being the most abundant Ot surface 242 243 protein. TSA56 has four variable domains and these lead to strain-specific antibody responses in patients. 244 TSA47, TSA56, and ScaA have been evaluated as possible vaccine candidates<sup>61,62</sup>. Of the core Ot genes, 245 those most differentially expressed between Karp and UT176 were scaE, tsa56, and tsa22 (1.39, 3.06 and 246 3.94 logFC in Karp over UT176, respectively). In contrast, *scaD* levels were increased in UT176 but to a 247 lesser degree (0.80 logFC in UT176 over Karp). Given their high immunogenicity it is likely that their 248 differential expression results in differential host responses.

249

Genes for Ank and tetratricopeptide repeat-containing proteins (TPR) are present in 33 (Ank)/29 (TPR) and 21 (Ank)/22 (TPR) copies in Karp and UT176, respectively <sup>8</sup>. Some *ank* genes function as effectors in eukaryotic cells whilst others are uncharacterized. We compared the expression of Ank and TPR genes in Karp and UT176. *ank2*, *ank3*, *ank12*, *tpr6*, and *tpr8* were up-regulated with a logFC >1.5 in UT176,

254 while ank16, ank17, ak20, and tpr1 were up-regulated with a logFC >1.5 in Karp. Most of these proteins 255 were not detected in the Karp proteomics dataset suggesting that either the mRNAs were not translated, 256 or that the proteins were secreted and lost during purification. The protein products of all of these ank genes localise to the endoplasmic reticulum or host cell cytoplasm when ectopically expressed<sup>63</sup>. Ank6 257 258 interferes with NFkB translocation to the nucleus and inhibits its transcriptional activation<sup>64</sup>. The activity 259 of the other differentially expressed Anks is not known. Given that these effector proteins interact directly 260 with host cell proteins we expect that this differential expression will lead to downstream differences in 261 host response.

262

## 263 Karp and UT176 induce a type-I interferon proinflammatory response

The transcriptional profile of HUVEC cells infected with Karp or UT176 showed a clear core response to Ot (Fig. 5A, red), with smaller gene sets responding specifically to a single strain (Fig. 5A purple and orange). The core response was dominated by a type-I interferon proinflammatory response (Supp. Table 1), seen previously in cultured endothelial cells and monocytes, as well as patient-derived macrophages<sup>13–</sup> <sup>17</sup>. This is further illustrated by activation of the canonical interferon signaling pathway in response to Karp (Fig. 5B), with a similar response observed for UT176 (Fig. 5C).

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Host genes commonly up-regulated upon infection with either Ot strain include *IFNB1* (interferon beta) and genes involved in regulating the type-I interferon response: *IRF9* (interferon-regulated factor 9) and *STAT1/2*. Interferon-stimulated genes were also up-regulated upon Ot infection, including various interferon induced proteins with tetratricopeptide repeats (*IFIT*) genes and 2'-5'-oligoadenylate synthase 1 (*OAS1*). In addition to the type-I interferon pathway, the joint Ot response led to up-regulation of proinflammatory chemokine genes including *CXCL10*, *CXCL11*, and for cytokine receptors *IL13RA2*, *IL7R*, *IL15RA*, and *IL3RA* (Supp. Table 1).

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The upstream signals leading to activation of these signaling pathways are unknown but Ot has been shown to activate host cells by signaling through the NOD1-IL32<sup>65</sup> and TLR2<sup>66</sup> pathways. Our data showed that *TLR3* is up-regulated in cultured HUVEC cells in response to both Karp and UT176 (Supp. Table 1). TLR3 recognizes viral double-stranded (ds)RNA in the cytoplasm<sup>67</sup> and it is possible that it responds to Ot dsRNA. The up-regulation of the mRNA for transcription factor IRF7, which is known to respond to stimulation from membrane-bound TLRs, further supports a role for TLR2 and TLR3 in the detection of Ot.

286

## 287 Differential host responses to Karp and UT176

288 Although Karp and UT176 both induced a type-I interferon proinflammatory response compared to 289 uninfected HUVEC cells (Fig. 5B,C), each strain also induced its own unique response. Some of these 290 expression changes were validated by qRT-PCR (Supp. Fig. 12). The mRNA levels of multiple cytokines, 291 chemokines, and cytokine receptors were higher in HUVEC cells infected with UT176 compared with 292 Karp (Fig. 6A, Supp Fig 14, 15, 17). A network map of proinflammatory chemokines and cytokines, and 293 their differential induction in response to UT176 and Karp is shown in Fig 6A and Supp. Fig. 14A. Most 294 of the genes for cytokines, chemokines, and cytokine receptors were differentially up-regulated by 295 infection with UT176 compared with Karp, including CXCL8, CXCL1, CXCL2, CXCL10, IL6, IL1RL1, 296 IL18R1. The mRNA levels of surface adhesion molecules associated with activation of the endothelium, 297 VCAM1 and ICAM1, were also up-regulated in UT176 infected cells compared with Karp (Supp. Table 298 1). Whilst *TLR3* was up-regulated in both strains, TLR3 activation in UT176 infected cells was 1.5 logFC

higher than in response to Karp. Comparison of NFkB pathway genes and genes associated with NOS2 production revealed that genes in both pathways were up-regulated in UT176 but they were not upregulated or were significantly less up-regulated in response to Karp infection (Supp. Fig. 15). Expression of host genes associated with leukocyte proliferation and mononuclear leukocyte differentiation was strongly induced in HUVECs infected with UT176 but significantly less so when infected with Karp (Supp. Fig. 16). Thus, UT176 seems to induce a stronger proinflammatory response and this may lead to more effective pathogen clearance (see Fig. 1B).

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307 In contrast to the multiple chemokines and cytokines up-regulated in UT176-infected HUVEC cells, only 308 *IL33* was specifically up-regulated in Karp-infected HUVEC cells (5 logFC difference; Supp. Table 1). 309 IL33 is a proinflammatory cytokine that is involved in pathogenicity in a mouse model of scrub typhus<sup>68</sup>. 310 To investigate Karp-mediated activation of *IL33* we analyzed gene induction in the IL33-FAS network 311 (Fig. 6B/Supp. Fig. 14B). Most genes in the network were differentially induced in Karp-infected HUVEC 312 cells compared to in UT176-infected HUVECs. Up-regulation of IL33-NOS-mediated signaling 313 contributes to tissue inflammation. We analyzed networks of genes involved in (i) organismal growth 314 failure (ii) organismal morbidity and mortality and (iii) organismal death. In all cases Karp induced these 315 networks whilst UT176 dampened them (Supp. Fig. 17).

316

#### **Two Ot strains differ in virulence in a mouse model**

To assay the effects of the differential inflammatory responses induced by Karp and UT176 we tested the relative virulence of the two strains in an intravenous mouse infection model. 1.25x10<sup>6</sup> bacteria were inoculated into outbred ICR mice and monitored for disease symptoms for 12 days prior to euthanasia. Blood and tissue from lung, liver, spleen, and kidneys were isolated and the bacterial load measured by

qPCR. We found that Karp was significantly more virulent than UT176 as determined by disease outcome,
weight loss, bacterial load, and histopathological analysis (Fig. 7, Supp. Fig. 19-21). This difference is
likely to result from a combination of differential bacterial growth rate (Fig. 1B), differential expression
of bacterial virulence related genes (Fig. 4), and differential induction of host immune networks (Fig. 6).

## 328 Discussion

329 Both its obligate intracellular lifestyle and the complexity of rearrangements in the Ot genome make it 330 difficult to study. Ot has a genome of 1.9-2.5 Mbp, almost half of which is composed of repetitive regions 331 of >1,000 bp in length<sup>8</sup>. This is in contrast to the most closely related rickettsial species, whose genomes 332 are typically around 1.1-1.3 Mbp<sup>69</sup>. The Ot genome is remarkably unstable, which makes inference of its 333 transcriptional architecture particularly difficult. Using RNA-seq, we were able to identify core ncRNAs, 334 putative sRNAs, and operonic transcripts. In sharp contrast to most bacteria, only a handful of operons 335 containing more than 2 or 3 genes were conserved between Karp and UT176, and these primarily encode for proteins involved in core cellular processes like respiration and translation. Given that Karp encodes 336 337 only 12 predicted transcription factors and 3 sigma factors, in contrast to 300 and 7, respectively, in E. 338 *coli*, this raises the question of how transcription in Ot is coordinated.

339

340 One possible explanation is that much Ot transcription is not stringently controlled, and alternative 341 mechanisms have arisen in Ot to control protein expression. This is supported in part by our observation 342 that protein expression is partially predicted by antisense transcription. This mode of regulation seems to 343 be particularly prevalent for genes encoded by the RAGE, a transposable element of the integrative and 344 conjugative element group. Transposable element regulation by antisense transcripts was one of the 345 earliest discovered examples of riboregulation<sup>71</sup>, though it has not previously been observed at the scale 346 implied by our RNA-seq analysis. Such antisense regulation could arise spontaneously through capture of 347 transcriptional noise, providing a parsimonious alternative to transcriptional control<sup>72</sup>. It is unclear whether these untranslated transcripts have some function in Ot, or whether they are purely selfish DNA 348 349 elements that Ot has been unable to dispose of due to its small population size. One intriguing possibility

is that this regulatory mechanism would provide a large pool of double stranded RNA upon intracellular
bacterial lysis, which may explain Ot induction of TLR3 and an antiviral immune response.

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In the absence of genetic tools it is difficult to identify specific genes that drive virulence differences between UT176 and Karp. However, comparative genomics has revealed that whilst the pan genome of Ot is open, it is largely composed of gene duplications rather than newly acquired genes. This lack of gene novelty likely reflects the environmental isolation associated with an obligate intracellular lifestyle. Consequently, strain-specific differences in virulence are likely to be driven largely by differences in relative gene expression rather than the presence or absence of virulence genes. Consistent with this, we observed an up-regulation of virulence-associated surface proteins in Karp compared with UT176.

360

The inflammatory response triggered by Ot infection is a key driver of virulence in scrub typhus. We compared the response of endothelial cells to the two strains of Ot and found that differential activation of the immune response correlated with differential outcomes in a scrub typhus mouse model. Whilst both Karp and UT176 induced an antiviral proinflammatory response, as shown previously<sup>13–17</sup>, UT176 strongly induced an IL6-mediated pro-inflammatory response whilst Karp induced an IL33-NOS3-FAS response, differences likely to influence the relative virulence of these strains.

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*IL33* was one of the most strongly differentially regulated genes between UT176 and Karp infections (5.1 logFC higher in Karp-infected HUVECs). IL33 has previously been shown to play a role in pathogenesis in a scrub typhus murine model, using the Karp strain, where it was shown that IL33 levels were increased during Ot infection, that *IL33-/-* mice showed less severe disease symptoms, and that addition of rIL33

372	increased severity and mortality <sup>68</sup> . Our observations of reduced induction of <i>IL33</i> by the less virulent
373	UT176 strain further support a role for this cytokine in the pathogenesis of scrub typhus.

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In summary, we have used dual RNA-seq to gain insights into the transcriptome structure and mechanisms of gene regulation in the neglected intracellular pathogen Ot during infection. We provide evidence for widespread antisense regulation, in particular for the RAGE genes. We identified a relationship between the relative induction of IL33- and IL6-based gene networks in the host and disease severity. These findings will lay the groundwork for subsequent studies on the regulation of gene expression in Ot and mechanisms of pathogenesis. More generally, the present study may serve as a blueprint for the characterization of further obligate intracellular, genetically intractable bacterial pathogens.

### 383 Figure legends

384 Figure 1. Overview. A. Schematic experimental overview. HUVEC = human umbilical vein endothelial cell. B. Growth curve showing replication of Ot in cultured HUVEC cells. Bacteria were grown in 24 well 385 386 plates and the total bacteria per well is shown. Mean and SD from three independent replicates are shown. 387 C. Confocal microscopy images of Ot in HUVEC cells 5 days post infection. Additional images and time 388 points are shown in Supp. Fig. 1 and 2. Blue = DAPI (DNA), Red = Evans blue (host cells), green = Ot 389 labelled with Alexa488-click-methionine. **D.** RNA mapping statistics showing the fraction of host and Ot 390 RNA for each condition. The first replicate of the experiment is shown. Individual results for each replicate 391 are shown in Supp. Fig. 3. E. Percentage of RNA-seq reads assigned to different classes of RNA in Karp, 392 UT176 and HUVEC.

393

394 Figure 2. RNA biology in Ot. A. Northern blot analysis of core non-coding RNAs in Ot. B. Structure of 395 the two-piece tmRNA observed in the Ot transcriptome C. RNA-seq read coverage over the tmRNA gene 396 mirrors cleavage observed by Northern blot. D. A comparison of genomic syntemy of two species within 397 the enterobacteriaceae (Escherichia coli MG1655 and Salmonella enterica serovar Typhimurium SL1344, 398 top), with synteny between the two Orientia strains from this study (bottom). E. Pie charts illustrating the 399 relative abundance of RAGE genes in conserved (top) and strain-specific (bottom) operons. F. 400 Visualization of the largest conserved operon in Ot, encoding multiple ribosomal genes, showing RNA-401 seq coverage in both strains.

402

Figure 3. Antisense transcription is enriched on mobile genetic elements and is predictive of an
 absence of protein expression. A. B. Plot showing the relationship between protein expression, defined
 by LFQs, and transcript expression, defined by TPMs. Genes cluster into two groups based on their protein

406 expression. The red line indicates the threshold for expressed genes (TPM value equal to 10). C. Sense 407 transcription and the ratio of reads assigned to the antisense and sense strands, showing classification 408 based on proteomics detection. The red line indicates the sense-antisense ratio (1.059182) above which 409 translation was not detected by mass spectrometry. D. ROC curves evaluating the performance of logistic 410 regression models to predict protein expression from RNA-seq read counts. Model 1 strictly uses sense 411 expression, Model 2 the antisense-sense ratio, and Model 3 uses both. Incorporating antisense expression 412 clearly improves model performance. E. Fraction of core genes and RAGE genes in the set of genes with 413 high antisense-sense ratios, compared to all expressed genes.

414

415 Figure 4. Differential bacterial gene expression. A. Heatmap illustrating pathways enriched in 416 differentially expressed genes. All illustrated categories are more highly expressed in Karp. B. Volcano 417 plot showing the differential expression of bacterial genes in Karp and UT176. Bacterial surface genes 418 (red) and ankyrin repeat-containing effector proteins (blue) with log fold change  $\geq 1$  are highlighted.

419

420 Figure 5. Ot induces an antiviral interferon response in HUVECs. A. Summary of the host response 421 showing joint and strain specific responses. The joint response is defined as genes with a  $\log FC > 2$  and 422 FDR-corrected p-value < 0.01 for infection with both Karp and UT176. Strain-specific responses are genes 423 with a logFC > 2 and FDR-corrected p-value < 0.01 for infection with either Karp or UT176, excluding 424 genes already included in the joint response. **B.** Activation of multiple genes in the canonical interferon 425 signaling pathway in Karp infected HUVECs compared with uninfected HUVEC cells. C. Heat map showing up-regulation of genes in the interferon signaling pathway in HUVEC cells infected with Karp 426 427 and UT176 compared with uninfected cells.

428

Figure 6. Karp and UT176 lead to the up-regulation of distinct networks in HUVECs. A. Upregulation of multiple proinflammatory chemokines and cytokines in HUVECs infected with UT176. B.
Induction of the IL33-FAS-mediated anoikis network in Karp infected HUVECs.

432

433 Figure 7. Karp is more virulent than UT176 in a mouse infection model. A. Weight change over 12 434 days of infection. **B.** Clinical observation score of mice 12 days post-infection. This number is a composite 435 score based on appetite, activity, and hair coat with higher numbers representing low appetite, low activity, 436 and ruffled fur. Details provided in Supp. Fig. 20. C. Bacterial copy number in 100 µl blood taken from 437 euthanized mice 12 days post-infection, measured by qPCR. D. The ratio of bacterial DNA copy number 438 to mouse DNA copy number in lung, liver, spleen, and kidney of euthanized mice 12 days post-infection, 439 measured by qPCR. E. Lesion scores of Hematoxylin and Eosin stained lung, liver, spleen, and kidneys 440 of euthanized mice 12 days post infection. Scores range from 0 to 5 with 0 representing normal tissue and 441 5 representing severe lesion damage. All graphs show mean and standard deviation. Statistical significance 442 is calculated using unpaired Student t-test in GraphPad Prism software. \*\*p≤0.01 \*\*\*p≤0.001 443 \*\*\*\*p≤0.0001 F. Images of Hematoxylin and Eosin stained lung tissue of mice infected with buffer, 444 UT176 or Karp. Scale bars =  $50 \mu m$ . \* indicates airway and \*\* indicates blood vessel. Uninfected control: 445 airway, blood vessel and alveoli all appear normal. UT176-infected lungs: There are diffuse thickening 446 and infiltration of alveolar septa with a mixed population of macrophages and lymphocytes (arrows). 447 There is also mild perivascular lymphohistiocytic inflammation (open arrow). Karp-infected lungs: There 448 is diffuse moderate thickening and infiltration of alveolar septa with a mixed population of macrophages 449 and lymphocytes. The airway (\*) is unaffected and normal. Additional figures are shown in Supp. Fig. 450 20.

## 453 Materials and Methods

## 454 Growth of Ot and isolation of RNA

455 The clinical isolate strains (Karp and UT176) of Orientia tsutsugamushi were propagated in a confluent 456 monolayer of host cells (HUVEC, Human Umbilical Vein Endothelial Cells; ATCC PCS-100-010) for 5 457 days at MOI 100:1. Cells were cultured using Media200 (Thermo Fisher, Catalog no. M200-500) 458 supplemented with LVES media (Thermo Fisher, Catalog no. A14608-01) at 35 °C and 5% CO<sub>2</sub>. The 459 infectivity was determined by qPCR of the single copy Ot gene 47kDa at day 5-7. Both uninfected cells 460 and infected cells were harvested by incubating the cells on ice and quickly resuspending in RNAprotect 461 Bacteria Reagent (Qiagen, catalog no. 76506), then storing at -80 °C until use. RNA extraction was 462 performed using the Qiagen RNeasy Plus kit (Qiagen, catalog number 74136) according to manufacturer's 463 instructions and as described previously (Atwal, 2017).

464

## 465 **RNA processing and sequencing**

The integrity of the DNase-treated RNA samples was assessed in a Bioanalyzer (Agilent). All samples
had RIN (RNA integrity number) values ≥8.0. Ribosomal transcripts were removed using the Ribo-Zero
Gold (epidemiology) kit (Illumina). Following the manufacturer's instructions, 500 ng of total, DNasetreated RNA was used as an input to the ribo-depletion procedure. rRNA-depleted RNA was precipitated
in ethanol for 3 h at -20°C.

471 cDNA libraries for Illumina sequencing were generated by Vertis Biotechnologie AG, Freising-472 Weihenstephan, Germany. rRNA-free RNA samples were first sheared via ultrasound sonication (four 30-473 s pulses at 4°C) to generate on average 200- to 400-nt fragments. Fragments of 20 nt were removed using 474 the Agencourt RNAClean XP kit (Beckman Coulter Genomics) and the Illumina TruSeq adapter was 475 ligated to the 3' ends of the remaining fragments. First-strand cDNA synthesis was performed using M-

MLV reverse transcriptase (NEB) wherein the 3' adapter served as a primer. The first-strand cDNA was
purified, and the 5' Illumina TruSeq sequencing adapter was ligated to the 3' end of the antisense cDNA.

478 The resulting cDNA was PCR-amplified to about 10 to 20 ng/µl using a high fidelity DNA polymerase.

479 The TruSeq barcode sequences were part of the 5' and 3' TruSeq sequencing adapters. The cDNA library

- 480 was purified using the Agencourt AMPure XP kit (Beckman Coulter Genomics) and analyzed by capillary
- 481 electrophoresis (Shimadzu MultiNA microchip).

482 For sequencing, cDNA libraries were pooled in approximately equimolar amounts. The cDNA pool was

483 size fractionated in the size range of 200 to 600 bp using a differential cleanup with the Agencourt AMPure

484 kit (Beckman Coulter Genomics). Aliquots of the cDNA pools were analyzed by capillary electrophoresis

485 (Shimadzu MultiNA microchip). Sequencing was performed on a NextSeq 500 platform (Illumina) at

486 Vertis Biotechnologie AG, Freising-Weihenstephan, Germany (single-end mode; 75 cycles).

487

## 488 Northern blots

Each 15 μg of total RNA (i.e. a mixture of human and Ot RNA) prepared as above were loaded per lane
and separated in 6% (vol/vol) polyacrylamide–7 M urea gels. Blotting was performed as previously
described<sup>24</sup>. After the transfer onto Hybond XL membranes (Amersham), RNA was cross-linked with UV

492 light and hybridized at 42°C with gene-specific 32P-end-labeled DNA oligonucleotides (Supp. Fig. 13)

in Hybri-Quick buffer (Carl Roth AG). After exposure, the screens were read out on a Typhoon FLA 7000
phosphorimager (GE Healthcare).

495

#### 496 **qRT-PCR**

qRT-PCR was performed with the Power SYBR Green RNA-to-CT1-Step kit (Applied Biosystems)
according to the manufacturer's instructions and a CFX96 Touch real-time PCR detection system (Bio-

499 Rad). Human U6 snRNA served as reference transcripts. Fold changes in expression were determined 500 using the  $2^{(-\Delta\Delta Ct)}$  method <sup>76</sup>. Primer sequences are given in Supp. Fig. 13, and their specificity had been 501 confirmed using Primer-BLAST (NCBI).

502

## 503 **RNA seq read processing and quantification**

The raw reads were initially processed according to our established dual RNA-seq pipeline<sup>24</sup>. Briefly, raw reads were trimmed for adaptor sequences and a minimum read quality of 20 using cutadapt<sup>77</sup>. Reads were then mapped against the human (GRCh38) and Ot (UT176 accession: LS398547.1; Karp accession: LS398548.1) reference sequences using the READemption pipeline (v0.4.3, <sup>78</sup>) and segemehl with the lack remapper (v0.2.0 <sup>79</sup>), removing reads that mapped equally well to the bacterial and host genomes. For downstream analysis of human gene expression, only uniquely mapping reads were retained for guantification.

511 To improve quantification of repetitive sequences, reads mapped to the Ot genomes were used for 512 quantification of bacterial transcript expression using Salmon (v0.9.1) <sup>29</sup>. Salmon is a quasi-mapping 513 based gene expression quantification tool that consists of two steps, indexing and quantification.

Transcript fasta files were created from the Genbank annotations using the gene coordinates. The indexing step was performed in quasi-mapping mode (--type quasi). Expression of the transcripts was quantified using both stranded forward library type (-ISF) and removing incompatible mappings (--incompatPrior

517 0.0). Salmon identified identical gene repeats that are collected in 218 groups (see supplementary table,

518 Karp groups of duplicates). For quantification purposes we retained a single gene from each group.

519 For the purposes of summarizing gene expression, we calculated mean TPM values from three replicates

520 for each strain. Genes with a mean TPM greater than 10 were classified as expressed, and those with a

521 mean TPM value greater than 50 highly expressed.

522

## 523 Gene annotation

- 524 For each gene we retrieved the gene name, gene product, and amino acid sequence from the Genbank
- 525 annotation. In addition, using eggNOG-mapper<sup>10</sup> we predicted gene names and both KEGG pathways <sup>11</sup>
- 526 and GO terms. We manually identified surface antigen encoding proteins using BLAST. The KEGGREST
- 527 (Tenenbaum, D (2019) KEGGREST: Client-side REST access to KEGG. R package version 1.18.1.) and
- 528 GO.db (Carlson M (2019). GO.db: A set of annotation maps describing the entire Gene Ontology. R
- 529 package version 3.5.0.) R packages were used to retrieve KEGG and GO terms, respectively.

530

### 531 Non-coding RNA prediction

Noncoding RNAs were annotated using Rockhopper<sup>76</sup>, ANNOgesic <sup>77</sup> (v0.7.17) and Infernal<sup>78</sup> (v1.1.2) searching sequences against the Rfam database<sup>79</sup>. These provided inconsistent predictions of intergenic sRNAs. Intergenic sRNAs were manually curated by visual comparison of the predicted sRNA coordinates with the read coverage in the Integrative Genomics Viewer <sup>80</sup> (v2.5.2). Infernal predicted the core housekeeping ncRNAs tmRNA, RNaseP, SRP and 5S rRNA. The quantification of the bacterial transcriptomes complemented with predicted sRNAs was performed using Salmon.

538

#### 539 Genomic alignment

Genomic comparisons in Figure panels D and F were performed using Easyfig<sup>81</sup>. Escherichia coli K-12
 MG1655 (Accession number U00096) and Salmonella enterica serovar Typhimurium SL1344 (Accession
 number FQ312003) were used as comparators for synteny analysis.

#### 543

## 544 Orthology and conserved operon prediction

We predicted orthologous genes between the two Orientia strains using Poff<sup>82</sup> with default parameters in synteny mode. To identify conserved operons we used operon structures predicted in each strain by Rockhopper <sup>41</sup>. Based on visual analysis of read coverage in the Integrative Genomics Viewer, some of the operons were manually extended by addition of genes or merging two operons into one. We also identified partially conserved operons missing some genes in one strain.

550

## 551 Differential gene expression

552 For the bacteria, differential gene expression analysis was performed between orthologous genes 553 identified by Poff. Genes that were predicted as an orthologous group (more than two genes) were 554 removed from the analysis. Additionally, we removed duplicates (transcripts with perfectly identical 555 sequence) that were identified by Salmon in either strain. For both human and bacterial RNA-seq data, we performed differential gene expression analysis with the edgeR package <sup>83</sup> (v3.20.9) using robust quasi-556 likelihood estimation <sup>84</sup>, including genes with CPM (Counts Per Million) > 10 (for Ot) or CPM > 1 (for 557 558 HUVEC) in at least 3 libraries. To identify biological processes that differ between two Orientia strains, 559 we have performed gene set analysis using KEGG and GO terms that contain at least 4 expressed genes 560 using the fry test in the edgeR package.

561

## 562 **Proteomic sample preparation**

563 Bacteria were propagated in HUVEC cell line at MOI 100:1 and harvested at 5 dpi. Ot was isolated, 564 washed with 0.3 M sucrose, and lysed with 1% triton-X prior to acetone precipitation of protein. Total

protein was then alkylated, reduced, and subsequently treated with Lys-C/Trypsin. Digested peptides were
desalted using Oasis® HLB reversed-phase cartridges, vacuum dried, and stored for MS runs.

567

## 568 Mass spectrometry

569 The dried samples were resuspended of 2% (v/v) acetonitrile solution containing 0.06% (v/v) 570 trifluoroacetic acid and 0.5% (v/v) acetic acid and loaded onto an autosampler plate. Online 571 chromatography was performed using EASY-nLC 1000 (Thermo Scientific) in single-column setup using 572 0.1% formic acid in water and 0.1% formic acid in acetonitrile as mobile phases. using reversed-phase 573 C18 column (EASY-Spray LC Column, 75 µm inner diameter x 50 cm, 2 µm particle size) (Thermo 574 Scientific). The samples were injected and separated on the analytical column maintained at 50 °C using 575 a 2-23% (v/v) acetonitrile gradient over 60 min, then ramped to 50% over the next 20 min, and finally to 576 90% within 5 min. The final mixture was maintained for 5 min to elute all remaining peptides. Total run 577 duration for each sample was 90 min at a constant flow rate of 300 nl/min.

578 Data was acquired using an Orbitrap Fusion mass spectrometer (Thermo Scientific) in data-dependent 579 mode. Samples were ionized 2.5 kV and 300 °C at the nanospray source and positively-charged precursor 580 MS1 signals were detected using an Orbitrap analyzer set to 60,000 resolution, automatic gain control 581 (AGC) target of 400,000 ions, and maximum injection time (IT) of 50 ms. Precursors with charges 2-7 582 and having the highest ion counts in each MS1 scan were further fragmented using collision-induced 583 dissociation (CID) at 35% normalized collision energy and their MS2 signals were analyzed by ion trap 584 at an AGC of 10,000 and maximum IT of 35 ms. Precursors used for MS2 scans were excluded for 90 s 585 in order to avoid re-sampling of high abundance peptides. The MS1-MS2 cycles were repeated every 3 s 586 until completion of the run.

587	Identification of proteins within each sample was performed using MaxQuant (v1.5.5.1). Raw mass
588	spectra were searched against Orientia tsutsugamushi primary protein sequences derived from complete
589	genome data. Human whole proteome sequences were obtained from Uniprot and included as background.
590	Carbamidomethylation on Cys was set as the fixed modification and acetylation on protein N-terminus
591	and oxidation of Met were set as dynamic modifications for the search. Trypsin was set as the digestion
592	enzyme and was allowed up to 3 missed cleavage sites. Precursors and fragments were accepted if they
593	had a mass error within 20 ppm. Peptides were matched to spectra at a false discovery rate (FDR) of 1%
594	against the decoy database.

595

## 596 **Proteomic data analysis**

597 Protein expression was measured by label free quantification values (LFQs). A protein was classified as 598 detected if at least two peptides were detected in at least 2 biological replicates, and the mean LFQ across 599 the three replicates was used for further analysis. Otherwise the protein was classified as undetected, and 600 the LFQ value was set to zero. The proteomic data includes 19 protein groups that couldn't be resolved, 601 consisting of 93 proteins. In our analysis we discarded these proteins to simplify the analysis.

602

#### 603 Transcript classification

Sense transcript expression was defined by mean TPM value across replicates. The antisense/sense ratio was calculated as the ratio of mean read counts assigned to the antisense and sense strand of coding annotations. The duplicated sequences identified by Salmon (Supp. Table 1. Karp groups of duplicates) and non-coding RNAs were removed from the analysis.

609	We divided the data set into two classes, detected and undetected in proteomics. Within our analyzed data
610	set, 322 genes were detected, whereas 1608 genes were not detected by mass spectrometry. We found a
611	weak positive correlation between TPMs and LFQs for genes with detected proteins (Spearman's
612	correlation coefficient equal to 0.32), but it was not a linear association (Pearson's correlation coefficient
613	equal to 0.04). For the further analysis we selected transcripts with sense expression greater than 10 TPMs,
614	previously defined as our expression threshold.
615	
616	Logistic Regression model
617	To test whether antisense-sense ratios are predictive of protein expression, we have applied logistic
618	regression, which models the probability of a binary response, that is, whether a protein is expressed or
619	not. We have built 3 competing models. Model 1 makes predictions of the protein expression based solely
620	on sense transcription:
621	
622	$\beta_0 + \beta_1 * (TPM sense)$
623	
624	Model 2 makes predictions solely on the antisense-sense ratio:
625	
626	$\beta_0 + \beta_1 *$ ((number of antisense reads) / (number of sense reads))
627	
628	Model 3 uses both sense transcription and the antisense-sense ratio to make predictions:
629	
630	$\beta_0 + \beta_1^*$ (TPM sense) + $\beta_2^*$ ((number of antisense reads) / (number of sense reads))
631	
0.51	

632 Since the data is highly imbalanced, 295 transcripts with detected proteins, and 814 without, we used a 633 downsampling procedure (downSample function) implemented in the caret R package<sup>85</sup> to create a 634 balanced data set for model training purposes. Next, the function glm() with a logit link function from the 635 caret package was used to fit models to the reduced data set. For a first indication as to whether any of 636 these models are predictive, we trained all three models on a downsampled data set consisting of 590 637 genes, then tested them on the complete data set. To more rigorously assess this result, we have applied 638 500-fold cross validation. For each fold the data was split randomly into 2 data sets, training and testing 639 which included 1055 and 54 genes, respectively. Each time the new training data set was reduced to 562 640 genes, which were used to estimate the model parameters, and then the model was evaluated on the testing 641 data set. The model performance was evaluated using a variety of measures, i.e. sensitivity, specificity, 642 accuracy (caret R package) as well as with ROC curves <sup>86</sup> (pROC 1.14.0) and the area under the ROC 643 curve (AUC).

644

## 645 Immunofluorescence microscopy

646 The protocol for L-Homopropargylglycine (HPG) incorporation, click chemistry and fluorescence 647 detection were based on recommendations from Click-iT® HPG Alexa Fluor® Protein Synthesis Assay 648 Kits (Molecular probe by Life Technologies). HUVECs were grown on chambered coverslip slides (Ibidi, 649 USA), for 2 days before infection with bacteria at MOI 100:1. To incorporate HPG at times indicated, 650 medium was removed and replaced with L-methionine-free medium (Dulbecco's Modified Eagle 651 Medium, DMEM, Cat. no. 21013) containing 25 µM HPG for 30 min at 37 °C. Labeled bacteria were 652 washed twice in 1X PBS+ 1mg/ml BSA, pH 7.4 before fixing with 4% formaldehyde and subsequently 653 being permeabilized with 0.5% TritonX for 20 min on ice. After washing with PBS + 1 mg/ml BSA, the 654 Click-iT® reaction cocktail (Click-iT® HPG Alexa Fluor® Protein Synthesis Assay Kits cat. C10428)

655	was incubated with cells for 30 min at room temperature in the dark. The Azide dye (Alexa Fluor®488)
656	was used at a final concentration of 5 $\mu$ M. After the click reaction, cells were labeled with the actin probe
657	Alexa Fluor® 594 phalloidin at a dilution of 1:40 and the nuclear stain Hoechst diluted to 1:1000 for 30
658	min at 37 °C. Cells were washed 3X with PBS which was replaced with mounting media after the final
659	wash. Imaging was performed using a Zeiss LSM 7000 equipped with a $63 \times 1.4$ NA objective lens (Carl
660	Zeiss, USA) and also a Leica SP8 laser scanning confocal microscope.

661

## 662 Analysis of codon bias

We calculated the RSCU (relative synonymous codon usage) for each codon to quantify genome-wide or gene-specific codon usage bias following<sup>52</sup>. To determine the genomic codon counts for each species and gene set, we parsed nucleotide sequence data and annotation in the GenBank file format, downloaded from the NCBI database. We also obtained tRNA gene copy numbers from the GtRNAdb database<sup>87,88</sup>, and integrated protein abundance for E. coli K-12 MG1655 data from PaxDB 89.

668

#### 669 Host Network/Pathway analysis

To identify pathways that are affected in Karp and/or UT176 infected host cells, genes differentially expressed with an adjusted p-value of < 0.05 were analyzed using Ingenuity Pathway Analysis (IPA) software (Ingenuity® Systems, Inc. Redwood City, CA)<sup>81</sup> as described previously<sup>82</sup>. Selected pathways were chosen based on enrichment p-values and activation Z-scores, and served as the basis for Figs 5, 6, and Supp. Fig. 11, 14, 15, 16, and 17.

675

## 676 Mice and Ethics statement

677 All animal research was performed strictly under approved Institutional Animal Care and Use Committee 678 (IACUC) protocol by the IACUC and Biosafety Review Committee at the Armed Forces Research 679 Institute of Medical Sciences (AFRIMS) Bangkok, Thailand, an AAALAC International-accredited 680 facility. The protocol number was PN16-05. The animal research was conducted in compliance with Thai 681 laws, the Animal Welfare Act, and all applicable U.S. Department of Agriculture, Office of Laboratory 682 Animal Welfare and U.S. Department of Defense guidelines. All animal research adhered to the Guide for 683 the Care and Use of Laboratory Animals, NRC Publication (8<sup>th</sup> Edition). 684 C57BL/6NJcl mice were purchased from Nomura Siam International, Bangkok, Thailand. Mice were 685 housed in an animal biosafety level 2 facility and moved to an animal biosafety level 3 containment 2 days 686 before the inoculation. Mice at 6-8 weeks of age were used in these experiments. Two group of mice (n =8 per group) were intravenously injected in the tail vein with  $1.25 \times 10^6$  genome copies of O. 687 688 tsutsugamushi of either Karp strain or UT176 strain. The O. tsutsugamushi inoculum was derived from 689 O. tsutsugamushi-infected L929 cells. Clinical signs and body weight were evaluated daily. After 12 days 690 post inoculation, all mice were euthanized. Blood and tissue samples including lungs, liver, spleen, and 691 kidneys were collected for bacteria quantification and histopathology.

692

693

694

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707	Draft, L.B., J.S.; Writing - Review and Editing, A.J.W., L.B., J.S.; Supervision, L.B., J.S.; Funding
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710	Competing interests
711	The authors declare no competing interests.
712	

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- 714

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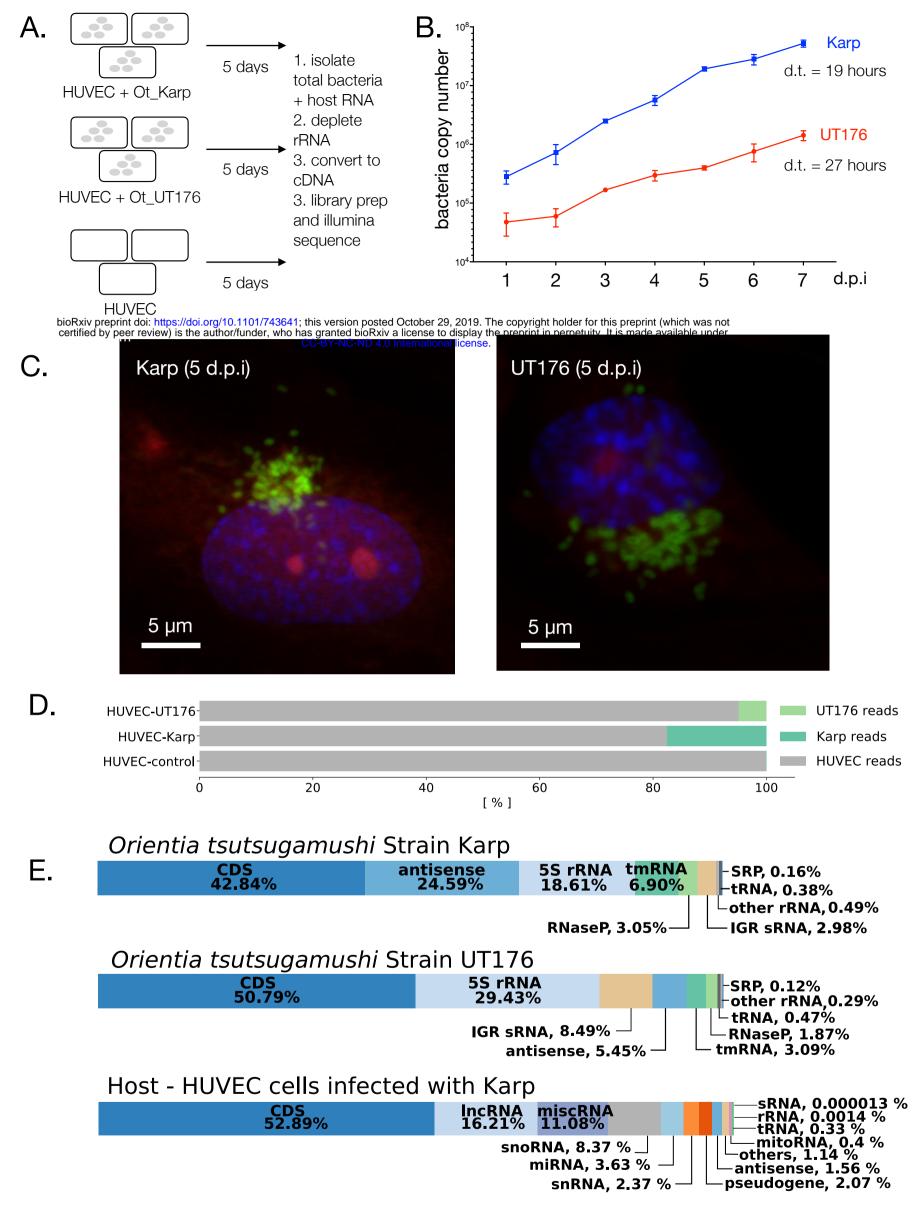
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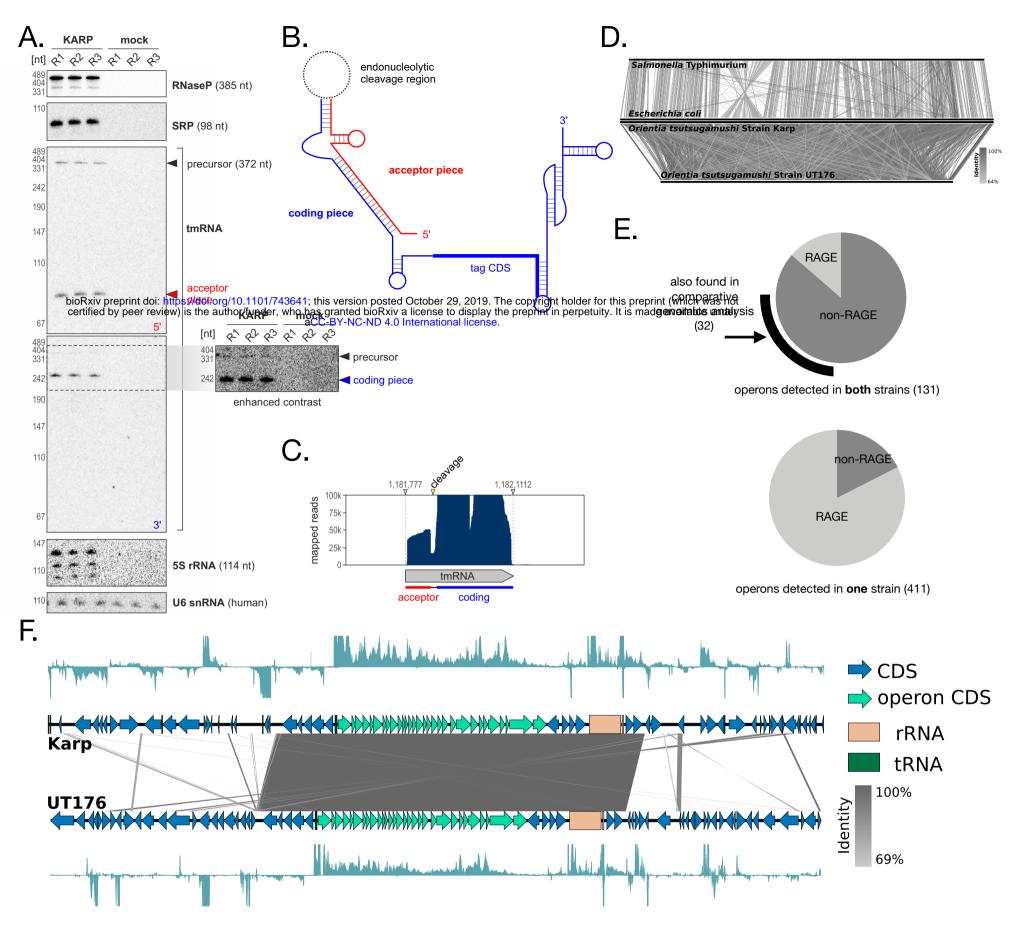
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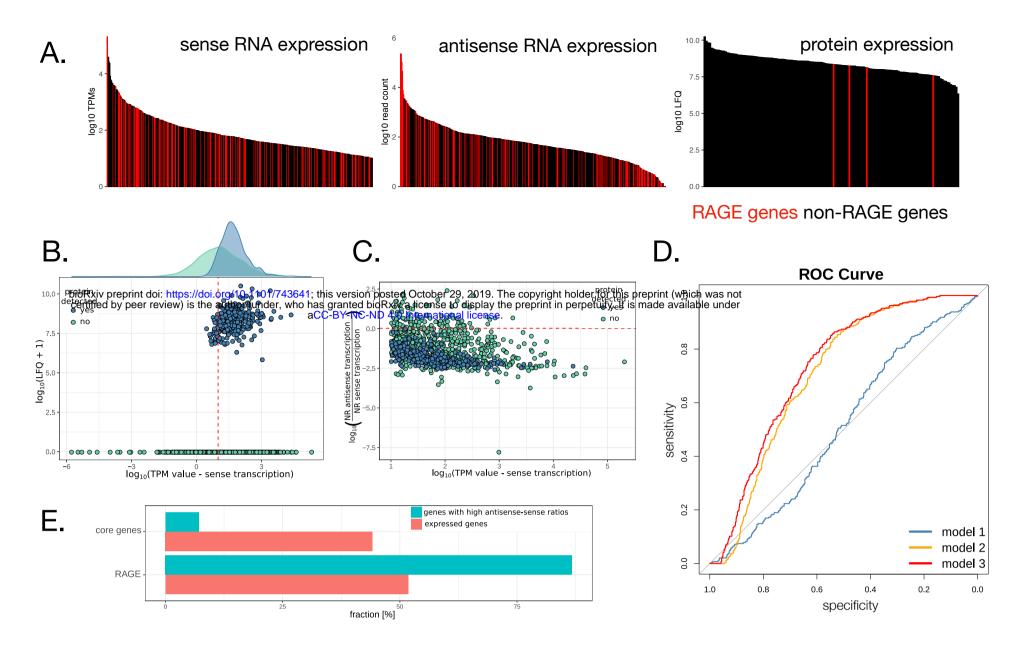
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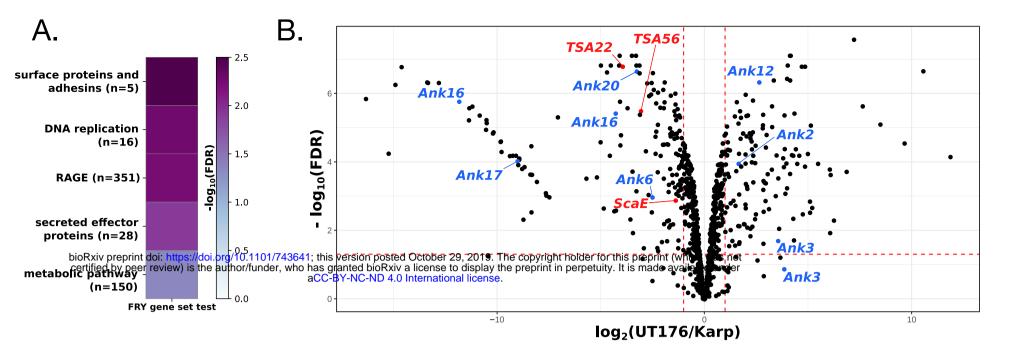
**Figure 1. Overview. A.** Schematic experimental overview. HUVEC = human umbilical vein endothelial cell. **B.** Growth curve showing replication of Ot in cultured HUVEC cells. Bacteria were grown in 24 well plates and the total bacteria per well is shown. Mean and SD from three independent replicates are shown. **C.** Confocal microscopy images of Ot in HUVEC cells 5 days post infection. Additional images and time points are shown in Supp. Fig. 1 and 2. Blue = DAPI (DNA), Red = Evans blue (host cells), green = Ot labelled with Alexa488-click-methionine. **D.** RNA mapping statistics showing the fraction of host and Ot RNA for each condition. The mean of three independent experiments is shown. Individual results for each replicate are shown in Supp. Fig. 3. **E.** Percentage of RNA-seq reads assigned to different classes of RNA in Karp, UT176 and HUVEC.



**Figure 2. RNA biology in Ot. A.** Northern blot analysis of core non-coding RNAs in Ot. **B.** Structure of the two-piece tmRNA observed in the Ot transcriptome **C.** RNA-seq read covereage over the tmRNA gene mirrors cleavage observed by Northern blot. **D.** A comparison of genomic synteny of two species within the enterobacteriaceae (*Escherichia coli* MG1655 and *Salmonella enterica* serovar Typhimurium SL1344, top), with synteny between the two Orientia strains from this study (bottom). **E.** Pie charts illustrating the relative abundance of RAGE genes in conserved (right) and strain-specific (left) operons. **F.** Visualization of the largest conserved operon in Ot, encoding multiple ribosomal genes, showing RNA-seq coverage in both strains.



**Figure 3.** Antisense transcription is enriched on mobile genetic elements and is predictive of an absence of protein expression. **A. B.** Plot showing the relationship between protein expression, defined by LFQs, and transcript expression, defined by TPMs. Genes cluster into two groups based on their protein expression. The red line indicates the threshold for expressed genes (TPM value equal to 10). **C.** Sense transcription and the ratio of reads assigned to the antisense and sense strands, showing classification based on proteomics detection. The red line indicates the sense-antisense ratio (1.059182) above which translation was not detected by mass spectrometry. **D.** ROC curves evaluating the performance of logistic regression models to predict protein expression from RNA-seq read counts. Model 1 strictly uses sense expression, Model 2 the antisense-sense ratio, and Model 3 uses both. Incorporating antisense expression clearly improves model performance. **E.** Fraction of core genes and RAGE genes in the set of genes with high antisense-sense ratios, compared to all expressed genes.



**Figure 4. Differential bacterial gene expression. A.** Heatmap illustrating pathways enriched in differentially expressed genes. All illustrated categories are more highly expressed in Karp. **B**. Volcano plot showing differential expression of bacterial genes in Karp and UT176. Bacterial surface genes (red) and ankyrin repeat containing effector proteins (blue) with log fold change  $\geq$ 1 are highlighted.

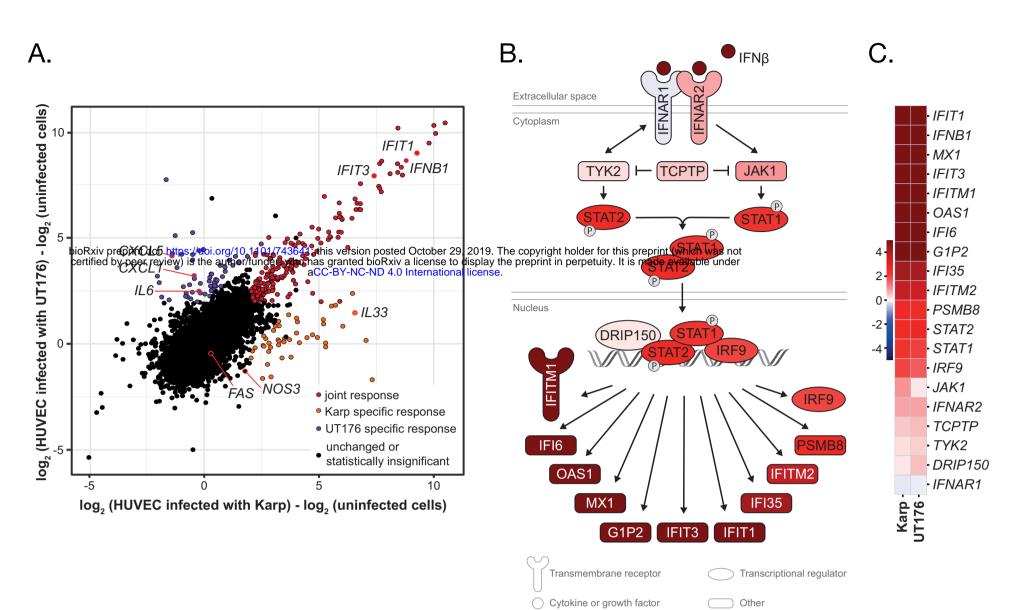


Figure 5. Ot induces an antiviral interferon response in HUVECs. A. Summary of the host response showing joint and strain specific responses. B. Activation of multiple genes in the canonical interferon signaling pathway in Karp infected HUVECs compared with uninfected HUVEC cells. C. Heat map showing up-regulation of genes in the interferon signaling pathway in HUVECs infected with Karp and UT176 compared with uninfected cells.

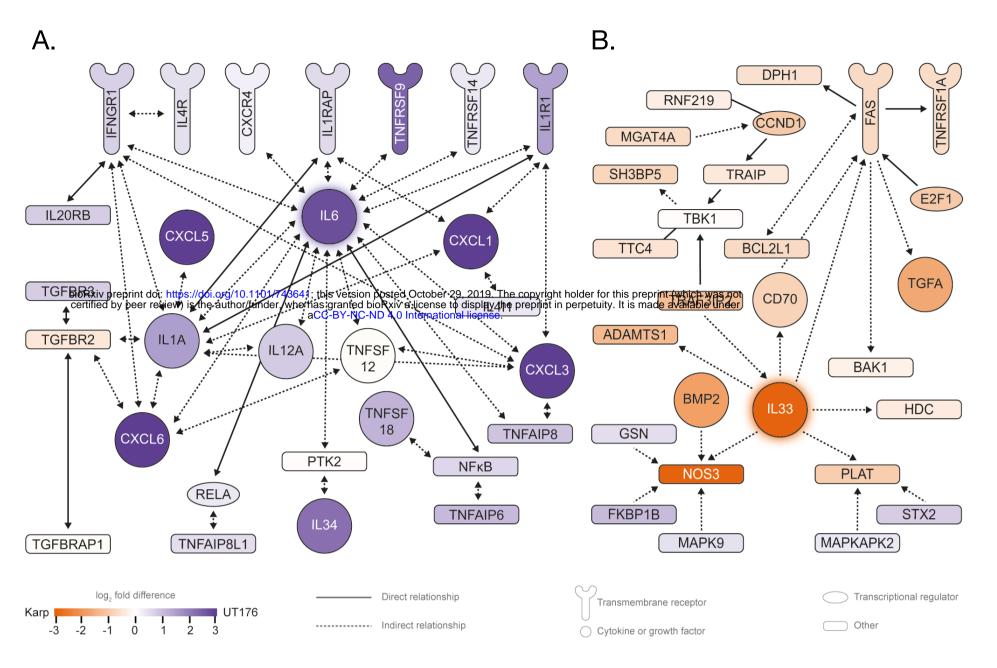
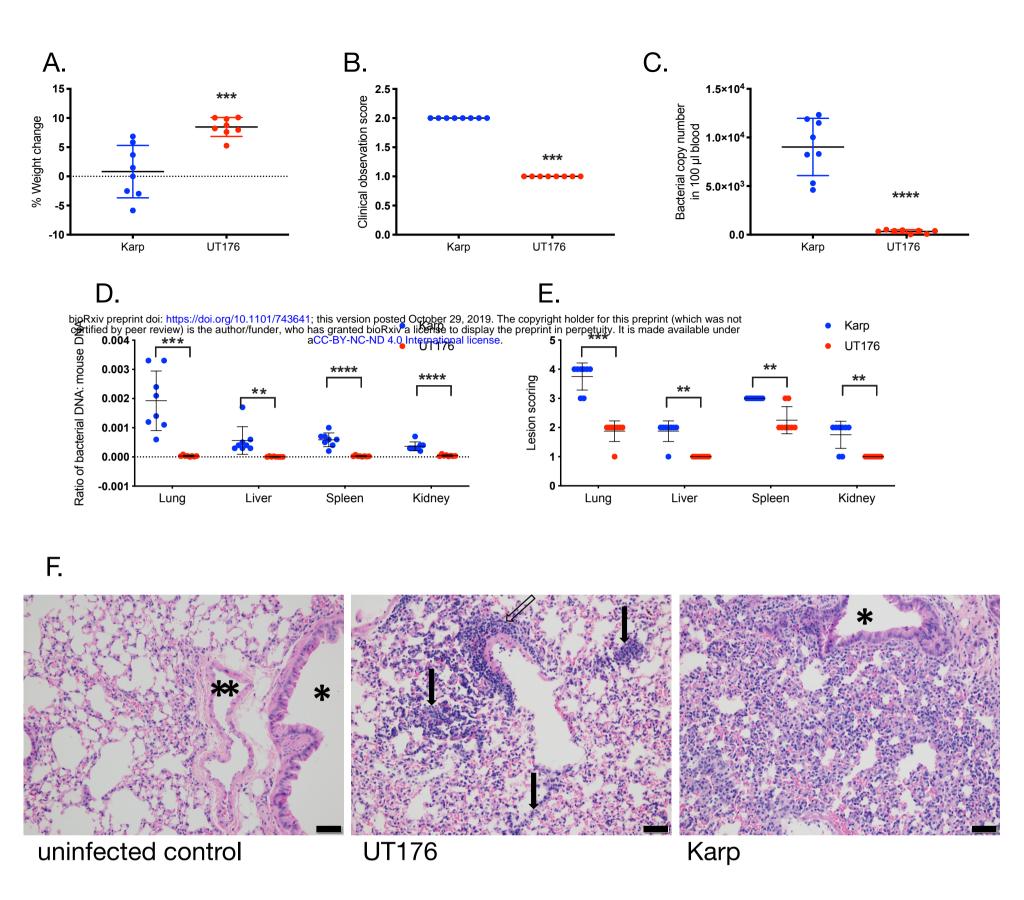


Figure 6. Karp and UT176 lead to up-regulation of distinct networks in HUVECs. A. Up-regulation of multiple proinflammatory chemokines and cytokines in HUVECs infected with UT176. B. Induction of the IL33-FAS-mediated anoikis network in Karp infected HUVEC cells.



**Figure 7. Karp is more virulent than UT176 in a mouse infection model. A.** Weight change over 12 days infection. **B.** Clinical observation score of mice 12 days post infection. This number is a composite score based on appetite, activity, and hair coat with higher numbers representing low appetite, low activity, and ruffled fur. Details provided in Supp. Fig. 20. **C.** Bacterial copy number in 100  $\mu$ l blood taken from euthanized mice 12 days post infection, measured by qPCR. **D.** Ratio of bacterial DNA copy number to mouse DNA copy number in lung, liver, spleen, and kidney of euthanized mice 12 days post infection, measured by qPCR. **E.** Lesion scores of Hematoxylin and Eosin stained lung, liver, spleen, and kidneys of euthanized mice 12 days post infection. Scores range from 0 to 5 with 0 representing normal tissue and 5 representing severe lesion damage. All graphs show mean and standard deviation. Statistical significance is calculated using unpaired t test using GraphPad Prism software. \*\*p<0.01 \*\*\*p<0.0001 \*\*\*\*p<0.0001 **F.** Images of Hematoxylin and Eosin stained lung tissue of mice infected with buffer, UT176 or Karp. Scale bars = 50  $\mu$ m. \* indicates airway and \*\* indicates blood vessel. Uninfected control: airway, blood vessel and alveoli all appear normal. UT176-infected lungs: There is diffuse thickening and infiltration of alveolar septa with a mixed population of macrophages and lymphocytes (arrows). There is also mild perivascular lymphohistiocytic inflammation (open arrow). Karp-infected lungs: There is diffuse moderate thickening and infiltration of alveolar septa with a mixed population of macrophages and lymphocytes (arrows). There is also mild perivascular lymphohistiocytic inflammation of macrophages and lymphocytes. The airway (\*) is unaffected and normal. Additional figures are shown in Supp. Fig. 20.