The immune regulation and epidemiological consequences of immune priming in *Drosophila*

Arun Prakash[1,4]*, Florence Fenner[1], Biswajit Shit[2], Tiina S. Salminen[3], Katy M. Monteith[1], Imroze Khan[2], Pedro F. Vale[1]*

[1]Institute of Ecology and Evolution, School of Biological Sciences
University of Edinburgh, UK

[2]Ashoka University, Plot No. 2, Rajiv Gandhi Education City,
P.O. Rai, Sonepat, Haryana-131029, India

[3]Faculty of Medicine and Health Technology
Tampere University, Tampere, Finland

[4]Current address: Vanderbilt University, 465 21st Ave S, MRB-III
Biological Sciences, Nashville, TN 37212, USA

*correspondence

arunpadmaprakash@gmail.com

pedro.vale@ed.ac.uk

Keywords: antimicrobial peptides, immune priming, immune regulation, pathogen clearance, sexual dimorphism, specificity & memory

Abstract

Invertebrates lack the specialized immune-memory cells responsible for vertebrate-like acquired immunity. However, there is increasing evidence that past infection by the same pathogen can 'prime' the insect immune response, resulting in improved survival upon reinfection. The mechanisms underlying these phenomenological accounts of priming are diverse, and often not completely clear. Here, we investigated the generality, specificity and mechanistic basis of immune priming in the fruit fly *Drosophila melanogaster* when infected with the gram-negative bacterial pathogen *Providencia rettgeri*. We further explore the epidemiological consequences of immune priming and find it has the potential to curtail pathogen transmission by reducing pathogen shedding. We find that priming in *Drosophila* is a long-lasting, pathogen-specific response, occurring in several fly genetic backgrounds and is particularly stronger in male flies. Mechanistically, we find that the enhanced survival of individuals primed with an initial non-lethal bacterial inoculum coincides with a transient decrease in bacterial loads, and that this is likely driven by the IMD-responsive antimicrobial-peptide *Diptericin-B* in the fat body. Further, we show that while *Diptericins* are required as the effector of bacterial clearance, it is not solely sufficient for immune priming, and requires regulation by the peptidoglycan recognition proteins *PGRP-LB, PGRP-LC* and *PGRP-LE*. We discuss potential explanations for the observed sex differences in priming, and discuss the epidemiological consequences of innate immune priming in invertebrates.

Introduction

Insects possess a robust immune response to pathogens which includes both cellular and humoral components [1–3], but lack vertebrate-like specialized immune memory cells responsible for acquired immunity. These differences in immune physiology resulted in the long-standing assumption that invertebrates should not be capable of immune memory, though this view was clearly at odds with empirical evidence from several invertebrate host-pathogen systems [4–6]. Work in recent decades has revealed that insects also possess a form of immune memory, known generally as "immune priming", where low doses of an infectious pathogen, or even an inactivated pathogen, can lead to increased survival upon reinfection [7–11].

There is now substantial evidence of diverse priming responses occurring within the same invertebrate life stage (larvae or adults), across life stages (from larvae to adults), or even between generations (parents to offspring) [12–14]. The survival benefit of priming has been observed in a range of arthropod taxa, including Dipterans: fruit flies [15], mosquitoes [16]; Coleopterans: flour beetles [13]; Lepidopterans: greater wax-moth [17]; Hymenopterans: bumblebee [9]; Crustaceans: water fleas [18] and Arachnids: spiders and scorpions [19]. Thus, substantial experimental evidence in both lab adapted and wild-caught arthropods suggests that immune priming is a widespread phenomenon, and is predicted to have a profound impact on the outcome of host–pathogen interactions, including infection severity and pathogen transmission [20–22].

The observation of immune priming in invertebrates underlines the importance of whole organism research in immunity in lieu of a purely mechanistic approach to immunology, highlighting that the same phenomenology can originate in very different mechanisms [6]. Determining the mechanisms of invertebrate immune priming has often proved challenging, but has generally revealed a great diversity of ways in which invertebrates may enhance their immune responses upon reinfection. In *Drosophila,* the priming response during infection with the gram-positive bacterial pathogen *Streptococcus pneumoniae* was shown to be dependent on haemocytes and phagocytosis, while the Toll-pathway - the main pathway involved in clearance of gram-positive bacteria - was shown to be insufficient for successful priming [15]. The increased phagocytic activity in primed individuals has also been shown to play a key role in priming in crustaceans [23]. In other *Drosophila* work, *PGRP-LB* (peptidoglycan recognition protein *LB*, a negative regulator of the Immune deficiency (IMD)-pathway in *Drosophila*) has been identified as a key mediator of transgenerational immune priming against infection with parasitoid wasps (*Leptopilina heterotoma* and *Leptopilina*

victoriae), where downregulation of *PGRP-LB* is necessary to increase haemocyte
proliferation, required for wasp encapsulation by haemocytes in the offspring [24]. By
contrast, in response to infection with *Drosophila C virus* (DCV)*, Drosophila* progeny can
produce a DCV-specific priming response by inheriting viral cDNA from the infected adult
flies which is a partial copy of the virus genome [25,26].

In other host-pathogen systems, the precise mechanisms underlying the immune priming
phenotype are less clear, but the upregulation of antimicrobial peptides (AMPs) appears to
be involved. Genome wide insect transcriptome studies have identified upregulation of
several AMPs in primed individuals, for example, *Attacins, Defensins and Coleoptericins* in
flour beetles [27,28], *Cecropin, Attacin, Gloverin, Moricin* and *Lysozyme* in silkworms [29],
Gallerimycin and Galiomicin in wax-moths [30] and finally, *Cecropin* in tobacco moths and
fruit flies [31,32] (reviewed in Milutinović and Kurtz, 2016; Prakash and Khan, 2022). In fruit
flies, the production of AMPs during antibacterial immunity is mediated by the Immune
deficiency (IMD) and Toll pathways. In both pathways, pathogens are recognised by
peptidoglycan receptors (PGRPs), initiating a signalling cascade that culminates in the
activation of the NF-κB-like transcription factors (*Dorsal* in Toll or *Relish* in IMD), resulting in
the upregulation of AMP genes. The Toll-pathway generally recognises LYS-type
peptidoglycan found in gram-positive bacteria and fungi. The IMD-pathway recognises DAP-
type peptidoglycan found in gram-negative bacteria and produces AMPs such as *Diptericins,*
Attacins and *Drosocin* among others [1,2,33–35]. AMPs work with a high degree of
specificity, so that only a small subset of the total AMP repertoire provides the most effective
protection against specific pathogens [36],although this specificity has been shown to be
greatly reduced during aging [37].

Beyond its underlying mechanisms, an important but understudied aspect of immune priming
are its potential consequences for epidemiological dynamics [21,22,38,39]. Epidemiological
modelling predicts that priming should affect the likelihood of pathogen persistence,
destabilise the dynamics of host–pathogen populations, and crucially, that these effects
depend on the degree of protection conferred by priming [21]. Further theoretical work
suggests that priming can either increase or decrease infection prevalence depending on the
extent to which it affects the pathogen's colonization success and the host's ability to clear or
tolerate the infection [38]. Immune priming is therefore expected to have a significant impact
on the outcome of pathogen transmission by directly modifying important epidemiological
parameters, but the strength and direction of these effects is not intuitive to predict. While
primed individuals may live longer, thus extending the infectious period, their pathogen
burden may be lower, which could lead to lower pathogen shedding and less severe

epidemics. Further, behavioural changes in primed individuals may also be likely, if immune
deployment during the initial exposure leads to sickness behaviours such as lethargy or
reduced social interactions [40,41].
127
Here, we focus on immune priming in *Drosophila* when infected with the gram-negative
bacterial pathogen *Providencia rettgeri*. Our interest in priming in this specific host-pathogen
pair was motivated by our observation that flies showed increased survival when they had
previously been pricked with a heat-killed inoculum of *P. rettgeri*. While previous work has
characterised immune priming during gram-positive bacterial infection [15], the mechanisms
underlying immune priming during gram-negative bacterial infection are poorly
characterised. We hypothesized that priming could be driven by the up-regulation of AMPs
following an initial pathogen exposure, resulting in faster clearance upon re-infection. The
IMD-responsive AMP *Diptericins* (*DptA and DptB*) is sufficient to confer complete protection
during infection with *P. rettgeri* [36], but it is unclear whether the same IMD-regulated AMP-
Dpt might also be involved in immune priming during re-infections. We therefore used
several of the most commonly used *D. melanogaster* genetic background strains (control
flies), as well as CRISPR/Cas9 single-gene knockouts, UAS-RNAi knockdown, and loss-of-
function mutants, each lacking distinct immune components, to investigate the occurrence,
generality, duration, and mechanistic basis of immune priming during systemic infection with
Providencia rettgeri.Furthermore, motivated by the theoretical predictions of the role of
immune priming on epidemiological dynamics, we also designed infection experiments to
enable us to test how immune priming could affect each of these behavioural and
immunological components of pathogen spread.
147

Materials and methods

Fly strains and maintenance

Several *D. melanogaster* strains were selected to represent variable genetic backgrounds: w^{1118} (Vienna *Drosophila* Resource Center)*, iso-w^{1118}* (Bloomington *Drosophila* Stock Center)*,* Canton-S*,* Oregon-R *Wolbachia^{+ve} and Oregon-R Wolbachia^{-ve}.* Transgenic flies included immune mutants *Rel^{E20}* (*relish* - IMD pathway regulator) and *spz (spätzle – Toll* pathway regulator) and the following CRISPR/Cas9 mutants [36]: (a) ΔAMPs - flies lacking 10 known fly AMPs, (b) Group-B - flies lacking major IMD regulated AMPs including *Attacins* (*AttC^{Mi}; AttD^{SK1}), Drosocin (Dro^{SK4}) and Diptericins (Dpt^{SK12}*), (c) *Dpt^{SK12}* – flies lacking *Diptericins (DptA and DptB),* and (d) *ΔAMPs^{+Dpt}* – flies lacking 10 known AMPs except *Diptericins.*

All the CRISPR/Cas9 mutants were generated previously from the *iso-w^{1118}* genetic background using CRISPR⁄Cas9 gene editing technology to induce null mutations in the selected genes [36], and were gifted generously by the Lemaitre lab (U. Lausanne). We also used the binary GAL4/UAS system for tissue specific silencing of target genes with the RNA interference (RNAi) method. *Diptericin-B (DptB)* (Bloomington stock# *28975*) was tissue specifically knocked down from fat body (*w$^{1118-iso}$,Fb-Gal4i+(P{fat}*) and from haemocytes [*w$^{1118-iso}$,Hmldelta- Gal4; He-Gal4* – a combination of two haemocyte GAL4 drivers, the Hml-GAL4.Δ [42] and He-GAL4.Z [43]]. All fly stocks and experimental flies were maintained at 25°C ±1°C on a 12:12 hour light: dark cycle in vials containing 7ml of standard cornmeal fly medium [44]. For the experiments, we controlled larval density by placing 10 females and 5 males in each vial and the females were allowed to lay eggs for 48-hours. Fourteen days later, the eclosing males and females were sorted and collected and separated into group of 25 flies in each vial. Three-day aged, mated individuals were used throughout the experiments.

Systemic immune priming and infection assays

P. rettgeri was grown at 37°C in 10ml Luria broth (Sigma Ltd) overnight to reach optical density OD_{600}=0.95 (measured at 600nm in a Cell Density Meter, Fisherbrand™). The culture was centrifuged at 5000 rpm for 5 min at 4°C, and the supernatant was removed, and the final OD was adjusted to 0.1 and 0.2 by using sterile 1xPBS (Phosphate buffer saline). To obtain heat-killed bacteria the dilution was incubated at 90°C for 20-30 mins [13]. To ensure all bacteria were dead in the heat-treated culture, it was plated and no growth was confirmed. To prime individuals, 3-day old adults were pricked with a 0.14-mm minutien pin (Fine Science Tools) dipped in either heat-killed bacteria for the primed treatment or in

1xPBS solution for the unprimed treatment (exposed to a sterile solution in the first
exposure) in the mesopleuron region (the area situated under the wing and to the left of the
pleural suture) [45]. Following this initial priming treatment, the individuals were pricked
using OD_{600}=0.1 live *P. rettgeri* bacteria (resulting in approximately 70 bacterial cells/fly). To
test whether male and female adult flies show priming (measured as enhanced survival) with
increasing time intervals between the initial heat-killed exposure and later challenge with live
P. rettgeri, we tested several time points between the two challenges 18-hours, 48-hours,
96-hours, 1-week and 2-weeks (See **Fig**. S1 for experimental design; n=9-13 vial
treatment/sex/ fly line). We used a split vial experimental design to obtain replicate matched
data for both survival and bacterial load see [46] for details. Briefly after infection each vial
containing about 25 flies (of each treatment, sex and fly line combination) were divided into 2
vials for measuring (i). survival following infection (see **Fig**. S1i; 13-17 flies/combination) and
(ii). internal bacterial load (see **Fig**. S1ii).
197

Bacterial load quantification

To test whether the host's ability to supress bacterial growth varies across primed and
unprimed individuals, we quantified bacterial load as colony forming units (CFUs) at 24-
hours after *P. rettgeri* infection for controls and transgenic flies in both sexes. Flies were
surface sterilized in groups of 3-5 flies per vial in 70% ethanol for 30s and washed twice with
distilled water before homogenising flies individually using micro pestles. We immediately
performed serial dilutions of the homogenate with 1xPBS and plated them on LB agar plates
and cultured at 29°C overnight. The following day, we counted the CFUs manually [47] (n=9-
13 vial/sex/treatment/fly mutants).
207

Gene expression quantification

The expression of *Diptericins* was quantified by qRT-PCR. In parallel with the survival
experiment, we randomly selected a subset of control w[1118] individuals (both males and
females) for RNA extraction, we included 15 flies [5-7 replicates of 3 flies pooled together for
each treatment (primed and unprimed) for both males and females]. We randomly removed
selected flies (3 flies per vial) at different time points post exposure to *P. rettgeri* (18-hours
and 72-hours post-priming, 12-hours and 24-hours post-challenge). We then homogenised
pools of three in 80µl of TRIzol reagent (Invitrogen, Life Technologies). Homogenates were
kept frozen at -70°C until RNA extraction. We performed mRNA extractions using the
standard phenol-chloroform method and included a DNase treatment (Ambion, Life
Technologies) [45].
219

We confirmed the purity of eluted RNA using a Nanodrop 1000 Spectrophotometer (version
3.8.1) before going ahead with reverse transcription (RT). The cDNA was synthesized from
2µl of the eluted RNA using M-MLV reverse transcriptase (Promega) and random hexamer
primers, and then diluted 1 : 1 in nuclease free water. We then performed quantitative RT-
PCR (qRT-PCR) on an Applied Biosystems StepOnePlus machine using Fast SYBR Green
Master Mix (Invitrogen) using a 10µl reaction containing 1.5L of 1:1 diluted cDNA, 5µl of Fast
SYBR Green Master Mix an 3.5µl of a primer stock containing both forward and reverse
primer at 1µM suspended in nuclease free water (final reaction concentration of each primer
0.35µM). For each cDNA sample, we performed two technical replicates for each set of
primers and the average threshold cycle (Ct) was used for analysis.

We obtained the *AMP* primers from Sigma-Aldrich Ltd; *Dpt*_Forward: 5'
GACGCCACGAGATTGGACTG 3', Dpt_Reverse: 5' CCCACTTTCCAGCTCGGTTC 3',
*AttC*_Forward: TGCCCGATTGGACCTAAGC,   *AttC*_Reverse:
GCGTATGGGTTTTGGTCAGTTC,   *Dro*_Forward: ACTGGCCATCGAGGATCACC,
*Dro*_Reverse: TCTCCGCGGTATGCACACAT. We used *RpL*49 as endogenous reference
gene, *RpL*49_Forward: 5' ATGCTAAGCTGTCGCACAAATG 3', *RpL*49_Reverse: 5'
GTTCGATCCGTAACCGATGT 3'. We optimised the annealing temperature (T□) and the
efficiency (Eff) of the *Dpt* primer pair was calculated by 10-fold serial dilution of a target
template (each dilution was assayed in duplicate); *Dpt*: T□= 59 °C, Eff= 102%; *AttC*: T□= 60
°C, Eff= 94%; *Dro*: T□= 61 °C, Eff= 104%.

Oral priming and infection

For oral priming and live infection, we adjusted the final concentration to OD_{600}=25. We
initially prepared vials for oral priming by pipetting 350-400 µl of standard agar [see [47]]
onto lid of a 7ml tubes (bijou vials) and allowed it to dry. Simultaneously, we starved the
experimental flies on 12ml agar vials for 4 hours. Once the agar on the lids dried, we placed
a small filter disc (Whattmann-10) in the lid and pipetted 80µl of heat-killed bacterial culture
(primed treatment) or 5% sucrose solution (unprimed treatment) directly onto the filter disc.
Once the agar dried, we orally exposed flies (heat-killed only, primed and unprimed
treatment) by adding approximately 10 flies per vial for 18-hours and then transferred the
flies onto fresh Lewis food vials. After 3-days, we again prepared the bijou vials and once the
agar dried, this time we added 80µl of live bacterial culture (OD_{600}=25) and exposed flies
(heat-killed only, primed, and unprimed individuals) to live *P. rettgeri* for 18-hours. We then
transferred flies onto fresh food vials and observed survival after oral exposure to *P. rettgeri*
every 12 hours for the next 8 days (see **Fig.** S2).

Measuring locomotor activity

We measured the locomotor activity of single flies (n=52 flies for each for each sex and treatment combination) during three continuous days using a *Drosophila* Activity Monitor – DAM (v2 and v5) System [48], in an insect incubator maintained at 25°C ± 1°C in a 12 D: 12 L cycle. We then processed the raw activity data using the DAM System File Scan Software [48]. We analysed fly activity data using three metrics [40,49–51]: total activity, the average activity during 5-min activity bouts, and proportion of 5-min bouts with zero activity (which has been defined as sleep in *Drosophila* [52]) (**Fig.** S2-III)

Measuring bacterial shedding

We measured the bacterial shedding of single flies at a single time point, 4-hours following the oral bacterial exposure. Following oral priming to either heat-killed bacterial culture (primed treatment) or 5% sucrose solution (unprimed treatment), flies were exposed to an oral infection with live infection with 80µl of live *P. rettgeri* culture (OD_{600}=25). Following 18 hours of oral exposure, flies were placed individually into 1.5ml Eppendorf tubes with approximately 50µl of Lewis medium in the bottom of the tube for 4-hours. After 4-hours, flies were removed from the tube and these were washed with 50µl of 1xPBS buffer by vortexing thoroughly for at least 5 secs. We then plated these samples on a LB agar plates, incubated them at 29°C and counted the colonies manually after 18-hours. n = 8-12 flies per treatment and sex combination (**Fig.** S2).

Measuring bacterial transmission

We measured transmission in groups of flies, by collecting age-matched donor and recipient w^{1118} flies, separately for each sex. To test the effect of priming on the ability of flies to transmit *P.rettgeri*, we orally exposed 3-day old w^{1118} flies (donor flies) with either 5% sucrose and heat-killed bacteria (primed) or 5% sucrose only (unprimed). After 96-hour the donor flies were exposed to OD_{600}=25 of *P. rettgeri* (*see section above*). The infected donors were marked by cutting the corner of a fly wing. We then placed one donor and five uninfected recipient flies in 7ml bijou vials with a small amount of Lewis food on the lid for each treatment (heat-killed bacteria only and 5% sucrose exposed without live infection) and sex-combination. After 4-hours exposure we surface-sterilised and homogenized the flies and plated the homogenate to measure the presence or absence of *P. rettgeri* infection inside the fly, as an indication of successful transmission of bacteria from the donors to the recipient [47].

Data analysis

All statistical analyses and graphics were carried out and produced in R (version 4.2.2) using the ggplot2, coxhz and lme4 packages [53–55], and all raw data and code is available at 10.5281/zenodo.7624084 [56]. We analysed the survival data following systemic *P. rettgeri* infection with a mixed effects Cox model using the R package 'coxme' [54] for different treatment groups (that is, primed and unprimed) across both the sexes and fly lines (controls and transgenic lines). We specified the model as: survival ~ treatment * sex * (1|vials/block), with 'treatment' and 'sex' and their interactions as fixed effects, and 'vials' nested within each 'block' as a random effect for control and transgenic lines. We used ANOVA to test the impact of each fixed effect in the 'coxme' model. We analysed the bacterial load, measured as $\log_{10}$ bacterial colony-forming units (CFUs) at 24-hours following *P. rettgeri* infection. As bacterial load data was non-normally distributed, we log-transformed the data and analysed using a non-parametric one-way ANOVA (Kruskal-Wallis test) to test whether the 'treatment' groups that is, primed and unprimed individuals significantly differed in internal bacterial load for males and females of each fly lines (control and transgenic lines).

We analysed the gene expression data by calculating the ΔΔCT value [57]. We used *RpL32* as a reference gene as it was expressing steadily in our treatment and control conditions. We calculated fold change in gene expression relative to the uninfected controls to calculate ΔΔCT and used ANOVA to test whether AMP expression differed significantly between primed and unprimed treatment for males and females. Data for bacterial shedding and transmission were non-normally distributed (tested using Shapiro-Wilks test for normality) hence we performed non-parametric Wilcoxon Kruskal-Wallis tests for bacterial shedding and transmission data.

We tested how immune priming affects the behavioural components of pathogen spread by calculating total locomotor activity, proportion of awake activity and sleep patterns for individual fly (16 for control, 52 flies for primed & unprimed treatment). We analysed variation in total locomotor activity, average awake activity and time asleep using a generalized linear model (GLM) by fitting a binomial distribution (best fitted model), which also fitted 'sex' and 'treatment' (i.e., heat-killed only, primed and unprimed) as categorial fixed effects separately for oral and systemic infection routes.

Results

I.   Immune priming in *Drosophila* is a long-lasting response, occurring in several genetic backgrounds, and is stronger in males

We first examined if the length of time between the initial non-lethal exposure with heat-killed *P. rettgeri* and the secondary pathogenic challenge with live *P. rettgeri* affects the extent of priming. To address this, we exposed w^{1118} male and female control flies to live *P. rettgeri* 18-hours, 48-hours, 96-hours, 1-week or 2-weeks following the initial exposure to heat-killed bacteria. Male w^{1118} flies showed increased survival after initial priming for time points 18-hours, 48-hours and 96-hours, and still showed a significant, albeit reduced, priming response 1-week and 2-weeks after the initial exposure (**Fig**. 1 A-E). Female flies did not show a priming response when infected 18-hours following the initial challenge, but the priming response increased with 48-hours and 96-hours priming intervals before completely disappearing around a week time-interval (including 2-weeks) (**Fig**. 1A-E, **Table**-S1).

Figure 1: Survival curves of w^{1118} females and males with primed (exposed to heat-killed *P. rettgeri* in the first exposure) and unprimed (exposed to a sterile solution in

the first exposure) treatments challenged with live *P. rettgeri* pathogen after **(A)** 18-hours **(B)** 48-hours and **(C)** 96-hours **(D)** 168-hours/1-week and **(E)** 336-hours/2-weeks post priming that is, initial non-lethal exposure to heat-killed *P. rettgeri* (n=7-9 vial with 10-15 flies in each vial/sex/treatment/timepoint).

Next, we asked if priming occurred in two other commonly used *Drosophila* lines, Canton-S and Oregon-R (Ore-R) as observed with w^{1118}. Given the widespread effects of the endosymbiont *Wolbachia* on *Drosophila* immunity [58–60] we also tested whether the presence of *Wolbachia* had any effect on immune priming by comparing the priming response of Oregon-R (OreR), the line originally infected with *Wolbachia* strain wMel, henceforth OreR^{Wol+} and a *Wolbachia*-free line OreR^{Wol-} that was derived from OreR^{Wol+} by antibiotic treatment [60]. Females and males of the four *Drosophila* lines were treated first with heat-killed *P. rettgeri*, followed by infection with live *P. rettgeri* 96-hours after the first treatment. Since the 96-hour time gap between priming and live *P. rettgeri* treatments showed maximum priming response (difference in survival) for both males and females of the w^{1118} line (Fig. 1C), we kept the 96-hours timepoint as the consistent time-gap between priming and live infection throughout the study (**Fig**. 2C). Canton-S flies showed increased survival following priming and we observed this survival benefit across both sexes, although stronger in females (**Fig**. 2B, **Table** S2B). Oregon-R males also exhibited increased survival following priming, but priming had no significant effect on the females (**Fig**. 2C, **Table**-S2). We found that the presence of *Wolbachia* significantly improved overall survival of both males and females (**Fig**. 2C and D, **Table**-S3). However, the immune priming observed in males in absence of *Wolbachia* (OreR^{Wol-}) was no longer present in flies carrying *Wolbachia* (OreR^{Wol+}) (**Fig.** 2D, **Table**-S3).

II. The strength of immune priming is bacterial species specific

A notable feature of immune priming is its specificity. Previous work suggests that insects show strain-specific priming against multiple B. thuringiensis strains under more frequent antigen exposure in flour beetles (Roth et al., 2009; Khan et al., 2017), suggesting an added level of functional complexity of insect immunity. We tested whether *D. melanogaster* also shows specific immune priming against *Providencia rettgeri (Pr)*. We used males of the w^{1118} line, as males were shown to have stronger priming response than females and two pathogens, one closely related species of *P. rettgeri* i.e., *Providencia burhodogranariea (Pb)* and another less closely related gram-negative bacteria i.e., *Pseudomonas entomophila (Pe)*. Male flies homologously primed and challenged with (*Pr – Pr*) species showed significantly improved survival rates compared with the heterologous treatment combinations (*Pr – other bacteria*) and corresponding control (1xPBS – challenge with live bacteria) (**Fig**. 3A-C, **Table** S4A-B). Our results thus show that flies immune system can discriminate between closely related bacterial species. This indicates a surprisingly high degree of specificity in priming.

Figure 3: Bacterial species-specific immune priming response in w^{1118} males. Two closely related species of Providencia bacteria *Providencia rettgeri* (Pr) and *Providencia burhodogranariea* (Pb) and another gram-negative bacteria *Pseudomonas entomophila* were used for testing the immune priming specificity

III.   Primed male w^{1118} flies exhibit a transient reduction in bacterial load

Previous studies have shown that the priming response to fungi and gram-positive bacteria

can be explained by increased clearance of bacterial pathogens in primed individuals

[15,61]. We therefore examined whether the increased survival following a prior challenge

we observed was a result of greater bacterial clearance in the primed individuals, or if the

primed flies were simply better able to tolerate the bacterial infection. To investigate this, we

repeated the priming experiment with w^{1118} as it showed the strongest priming phenotype in

both sexes (**Fig**. 1C and **Fig**. 4A), and measured the bacterial load at 24-hours and 72-hours

post-infection for both primed and unprimed female and male flies. Again, we observed a

clear priming effect in both sexes (**Fig**. 4A, **Table**-S5). In primed males the systemic

infection resulted in higher survival and also in decreased bacterial loads at 24-hours post-

infection when compared to unprimed individuals (**Fig.** 4, **Table**-S5 for survival, **Table**-S6 for

load). However, by 72-hours post-infection, bacterial loads had dropped in both primed and

unprimed male flies and there was no detectable effect of priming on the bacterial loads

(**Fig**. 4B, **Table**-S6).

Figure 4: Bacterial loads of primed and unprimed w^{1118} flies. **(A).** Survival curves of primed and unprimed control w^{1118} flies **(B).** Internal bacterial load (n=20-22 vial with 5-7 flies in each vial/sex/treatment) after **(i)** 24-hours and **(ii)** 72-hours following *P. rettgeri* infection. Different letters in panel-B denotes primed and unprimed individuals are significantly different, tested using Tukey's HSD pairwise comparisons, analysed separately for each timepoint and sex combination. The error bars in panel B represent standard error.

IV. Immune priming affects the duration of infection and pathogen clearance during systemic and oral bacterial infection

Apart from increasing survival during infections, immune priming may also have consequences to pathogen spread and transmission [22]. Despite having enhanced survival, the primed individuals may also extend the infectious period or their pathogen burden may be lower, which would lead to less severe epidemics [22]. To investigate how immune priming affects some of these epidemiological parameters we tested whether primed individuals have reduced bacterial spread in w^{1118} flies. However given he oral-faecal nature of bacterial transmission and that our previous results all related to systemic infections, we decided to also investigate immune priming under oral infection.

Following an initial 'priming' treatment consisting of an exposure to a heat-killed *P. rettgeri* culture, after a 72-hour period we exposed female and male w^{1118} flies to a lethal dose of live *P. rettgeri*. This time period was chosen because we had previously observed successful immune priming within 72-96 hours following the initial 'priming' treatment, and that in males this response was still strong even a week after the initial exposure. We found that primed w^{1118} males, but not females, showed increased survival after initial priming to both systemic and oral route of infection. (**Fig.** 5A, **Table**-S7).

To test whether the increased survival after priming was due to increased ability for pathogen clearance, we measured internal bacterial loads around 24-hours following infection for in both systemic and oral infections. Consistent with the observed pattern of survival, primed males showed decreased internal bacterial loads in both infection routes but priming in female flies did not result in any difference in bacterial loads (**Fig.** 5B, **Table**-S8). These results are generally consistent with our previous observations of immune priming during systemic infection, and also occur during oral infection. In the context of disease transmission, our results during oral infection suggest that immune priming can affect the duration of infection, and the ability to clear infection.

Figure 5: Priming occurs during both systemic and oral infections. **(A)** Survival curves of male and female wildtype (w^{1118}) flies with (i) systemic (ii) oral priming where flies initially exposed to heat-killed *P. rettgeri* or unprimed flies exposed to a sterile solution in the first exposure, this is followed by live *P. rettgeri* pathogen after 72-hour time gap [systemic infection dose = 0.75 OD (~45 cells/fly) and oral *P. rettgeri* infection dose = 25 OD_{600}]. (n= 7-9 vials/sex/treatment/infection route) **(B).** Mean bacterial load measured as colony forming units around 24 hours following (i) systemic and (ii) oral priming, followed by live *P. rettgeri* infection for male and female w^{1118}. Different letters in panel-B denotes primed and unprimed individuals are significantly different, tested using Tukey's HSD pairwise comparisons.

V.   Immune priming does not affect fly locomotor activity

While the duration of the infectious period is determined to some extent by the infected lifespan of a fly, pathogen transmission is also strongly influenced by host behaviours that impact the contact rates between infected and uninfected individuals [62]. One of the simplest behavioural readouts that is relevant for how frequently individuals may come into contact is locomotor activity[40,41,63]. Highly active individuals are more likely to contact conspecifics and therefore are more likely to spread and to acquire new infections. How much an individual moves throughout the day is determined not only by its level of activity while awake, but also by the fraction of the day it is not moving for example, while asleep[40,51]. A crucial point is that host behaviours are often modified by infection, or even by immune stimulation that mimics infection[62,64,65]. We therefore tested how immune priming might alter host behaviours such locomotor activity and sleep that may contribute to the rate of contact between individuals.

Overall, we found clear effects of the route of infection on the total locomotor activity,
average awake activity the proportion of time spent asleep. Orally infected flies did not show
any change in their behavioural phenotypes when exposed to a heat-killed bacterial
inoculum only, or even when exposed to a lethal inoculum. In systemically infected flies,
exposure to a lethal bacterial inoculum resulted a reduction in activity and increase in the
time spent sleeping, but these effects were not different between primed and unprimed
individuals (**Fig.** 6, **Table**-S9). In the context of the effect of priming on disease transmission,
immune priming during oral infection would appear to not be a substantial source of variation
in a fly's behavioural competence for pathogen transmission.

Figure 6: The effect of priming on fly locomotor activity. Mean ±SE total locomotor
activity for males and females (n= 52 individual flies per treatment), during first 72-
hours following systemic and oral priming and infection. **(A)** average total locomotor
activity **(B)** average awake activity and **(C)** proportion of flies spent sleeping.

VI.   Priming following oral infection reduces bacterial shedding and
transmission in males

Given that primed male w^{1118} flies showed a reduction in internal bacterial loads (Fig 5B)
we hypothesised that priming could therefore directly impact the amount of bacterial
shedding, and therefore have a direct impact on pathogen transmission. We measured
the shedding of single flies at a single time point, 4-hours after infection (that is, initial
heat-killed exposure followed by live *P. rettgeri* exposure). We found that primed male
flies shed less bacteria than unprimed flies. However, both primed and unprimed females
showed increased bacterial shedding following oral *P. rettgeri* infection (**Fig.** 7A, **Table**-
S10).

Figure 7: The effects of priming on bacterial shedding and transmission (A).
Bacterial shedding after 4-hours following oral priming (initial heat-killed exposure)
and infection with live *P. rettgeri* (OD$_{600}$=25) for males and females. (B) percentage
transmission of measurable bacterial loads for male and female w^{1118} flies (recipient-
flies) over the first 4-hours following exposure with infected donor flies. Different
letters in panel-B denotes primed and unprimed individuals are significantly different,
tested using Tukey's HSD pairwise comparisons.

Primed males also spread or transmit very little pathogen upon re-infection with oral *P.*
rettgeri (**Fig.** 7B, **Table**-S10). However, both primed and unprimed females showed
increased bacterial spread following oral *P. rettgeri* infection (**Fig.** 7B, **Table**-S10). Our

results therefore provide evidence that, at least in male flies, immune priming reduces
pathogen transmission by directly decreasing bacterial shedding from infectious flies.

512
VII. The *IMD*-pathway, but not the Toll pathway, is required for immune
priming during *P. rettgeri* infections

The inducible AMPs regulated by the IMD signalling pathway play a crucial role in resisting
gram-negative bacterial infection such as *P. rettgeri* [33]. Therefore, we wanted to
investigate whether the IMD signalling pathway and IMD-responsive AMPs contribute to
immune priming. To address this, we used several transgenic fly lines (CRISPR knockouts
and UAS-RNAi knockdowns) lacking or knockdown of different regulatory and effector
components of the IMD-signalling pathway. First, we used a *Relish* loss-of-function mutant
Rel^{E20}, which lacks the transcription factor *relish*, a key regulator of the IMD immune
response. As expected, we found that *Relish* mutants did not show any bacterial clearance,
died at faster rate, and therefore did not show any priming benefit (**Fig**. 8A-ii for survival and
Fig. 8B-ii for bacterial load, **Table**-S11 for survival and **Table**-S12 for bacterial load,).

525
In response to gram-positive bacterial *Streptococcus pneumoniae* infection, the Toll pathway
was previously shown to be required (though not sufficient) for priming [15]. In other work,
the Toll-pathway activity differed between males and females and explained sexual
dimorphism in immunity during *P. rettgeri* infection [66]. Given that we found sex differences
in the priming in response to *P. rettgeri* infection (**Fig**. 1 and 3), these previous results
motivated us to investigate whether Toll-signalling also contributes to immune priming
against *P. rettgeri*. To address this, we used *spz* deletion mutants which lack *spätzle*, a key
regulator in the *Toll* pathway, and these flies are not able to activate the Toll-signalling
pathway. *Spätzle* mutants showed enhanced survival following initial heat-killed exposure,
and their mortality rates were the same as in controls (w^{1118}) (**Fig**. 8A-iii, **Table**-S11)
indicating that Toll-pathway does not contribute to priming during *P. rettgeri* infection in
either males or females (**Fig**. 6A-iii, **Table**-S11).

Figure 8. Priming requires the IMD but not the Toll pathway (A): Survival curves for control flies and flies lacking different innate immune pathway components in females and males **(i)** control *iso-w^1118* **(ii)** *Rel^E20*- IMD-pathway transcription factor **(iii)** *Spz*- Toll pathway regulator in both males and females **(B) (i-iii)** bacterial load measured after 24-hours post-secondary pathogenic exposure (n=7-9 vial/sex/treatment/transgenic lines). Different letters in panel-B indicate that primed and unprimed individuals are significantly different, tested using Tukey's HSD pairwise comparisons, analysed separately for each timepoint and sex combination. The error bars in panel B represent standard error.

VIII. The IMD-regulated AMPs *Diptericins* (*DptA* and *DptB*) are required for priming against *P. rettgeri* in males

Given the important role of the IMD pathway for the priming response (Fig. 5A), next, we tested whether mutants with defective IMD signalling or unable to produce specific antimicrobial peptides were capable of immune priming. We first used a ΔAMP transgenic line, which lacks most of the known *Drosophila* AMPs (10 AMPs in total). It has been previously shown that ΔAMPs flies are extremely susceptible to the majority of microbial pathogens, including gram-negative bacteria [36]. We found that both primed and unprimed ΔAMP flies succumb to death at a similar rate, and both primed and unprimed ΔAMP flies

also exhibited elevated bacterial loads (measured 24-hours after the secondary pathogenic
exposure) (**Fig**. 9A-i for survival, **Fig**. 9B-i for bacterial load, **Table**-S11 and S12, relative to
control w^{1118} flies – compare with previous figure Fig. 8B-i), showing that AMPs are needed
for the priming response against *P. rettgeri*. To investigate which AMPs are required for
priming against *P. rettgeri* infection, we used a Group-B transgenic line, lacking major IMD
regulated AMPs (including *Diptericins* and *Attacins* and *Drosocin*) but have all upstream IMD
signalling intact. Primed Group-B flies showed mortality similar to unprimed Group-B flies
(**Fig**. 9A-ii, **Table** S11) and exhibited increased bacterial loads across both the sexes
irrespective of being primed or not (**Fig**. 9B-ii, **Table** S12). Thus, despite being able to
produce other AMPs, removal of IMD-regulated AMPs completely eliminated the priming
effect, indicating that AMPs regulated by the IMD-pathway are required for immune priming
against *P. rettgeri* infection.

Since *Diptericins* have been shown previously to play a key role in defense against *P.*
rettgeri, we then used a *Dpt* mutant (lacking *Diptericin-A* and *B*) and *AMPs^{+Dpt}* transgenic fly
lines (flies lacking all known AMPs except *Diptericin*) to test whether *Diptericins* are required
and sufficient for priming in both females and males. The survival benefit of priming
disappeared in flies lacking *Dpt* across both females and males and both primed and
unprimed *Dpt* mutants exhibited increased bacterial load (**Fig**. 9B-iii, **Table** S12). However,
the priming response was recovered completely in male flies that lacked all other AMPs but
possessed functional *Diptericins* (*AMPs^{+Dpt}*). However, the same effect was not seen in
females (**Fig**. 9A-iv for survival, **Fig**. 9B-iv for bacterial load; **Table** S11 for survival, **Table**
S12 for bacterial load).

Figure 9: Priming requires specific AMP expression (A). Survival curves for CRISPR/Cas9 AMP mutants **(i)** *ΔAMP* fly line: lacking all known 10 fly AMPs – **(ii)** *Group-B:* lacking major IMD pathway AMPs **(iii)** *Dpt* knockout and **(iv)** *ΔAMP+Dpt*: lacking all AMPs except *Dpt*. **(B)** internal bacterial load quantified after 24-hours post-secondary exposure (n=7-9 vials with 10-15 flies in each vial/sex/treatment/transgenic lines). Different letters in panel-B denotes primed and unprimed individuals are significantly different, tested using Tukey's HSD pairwise comparisons, analysed separately for for each fly line and sex combination. The error bars in panel B represent standard error.

IX.   *Diptericin B* expression in the fat body is required for priming

In response to gram-positive *Streptococcus pneumoniae* infection, previous work described the role of haemocytes in immune priming through increased phagocytosis [15]. Subsequent work has also shown that reactive oxygen species (ROS) burst from haemocytes is important for immune priming during *Enterococcus faecalis* infection [32]. Since our results pointed to a *Diptericins* being required for immune priming against *P. rettgeri*, we wanted to

determine if *Diptericin* expression in either the fat body or haemocytes was more important
for immune priming. Using-tissue specific *Diptericin-B* UAS-RNAi knockdown, we found that
male flies with knocked-down *DptB* in fat bodies no longer showed immune priming
compared to the background or control iso-w^{1118}, while knocking down *DptB* in haemocytes
resulted in a smaller but still significant increase in survival following an initial exposure (**Fig**.
10, **Table**-S13). This would therefore support that immune priming requires *DptB* expression
in the fat body, while haemocyte-derived *DptB* is not important for priming. It is worth noting
that it is possible that haemocytes contribute to immune priming through phagocytosis or
melanisation, or via cross-talk with the IMD pathway, and this remains a question for future
research.

Figure 10: Survival curves for **(i)** control iso-w^{1118} and *UAS-RNAi* mutants - **(ii)**
FB>DptB RNAi knock down of *DptB* in fat body and **(iii)** *FB>DptB* RNAi knock
down of *DptB* in haemocytes. (n=~50 flies/sex/treatment/fly lines).
614

615
X.   Priming is not an outcome of constant *Dpt* upregulation following the initial
challenge, but instead due to a slower resolution of the immune response
upon secondary infection

As our results indicated that AMPs, especially *Diptericins* play a key role in *Drosophila*
priming against *P. rettgeri*, we wanted to test if the priming effect we had observed was a
result of constant upregulation of AMPs after initial heat-killed exposure allowing rapid
bacterial clearance during the secondary exposure, or if AMP expression returned to a
baseline level within the 96-hours between priming and the live infection. To do this, we
measured *Dpt* gene expression at 18-hours and 72-hours following initial heat-killed
exposure, and then 12-hours, 24-hours and 72-hours following secondary live *P. rettgeri*
infection. *DptB* expression increased 18-hours after initial heat-killed exposure but returned
to baseline levels by 72-hours (**Fig.** 11A and 11B, **Table**-S14) indicating that flies did mount
an immune response to the heat killed bacteria, but that this was resolved by the time they
were infected with the live bacteria at 96-hours.

Further, 72-hours following a lethal secondary live *P. rettgeri* infection, we found that primed
w^{1118} females and males showed increased *DptB* levels compared to unprimed individuals
(**Fig.** 12A and 12B). The increased *DptB* expression also resulted in increased bacterial
clearance in males (see **Fig**. 4Bi and 8Bi). In case of females, despite higher *Dpt* levels at
72-hours following secondary live infection in primed flies, we did not detect any difference in
bacterial clearance between primed and unprimed flies (see **Fig**. 4Bi and 8Bi). We also
tested the expression pattern of other IMD-responsive AMPs such as *Attacin-C* and
Drosocin in females. Overall, we found that the expression of *Attacin-C* and *Drosocin* was
not different between primed and unprimed females (**Fig.** 11C for *AttC and Dro*, **Table**-S14).

Figure 11: **Antimicrobial gene expression following priming** (A) Mean±SE (standard error) of *Diptericin*-AMPs expression at different time points (hours) for females and males wild-type w[1118] flies with treated with - naïve or unhandled flies; flies exposed to initial heat-killed *P. rettgeri*; primed flies that are initially exposed to heat-killed P. rettgeri followed by challenge with *P. rettgeri*; unprimed flies that receive 1xPBS during primary exposure followed by live *P. rettgeri* during secondary exposure [n=15-21 flies (3 flies pooled) /sex/treatment/timepoint]. **(B).** *Diptericin (A+B), Attacin-C* and *Drosocin* AMPs expression 12-hours and 24-hours after exposure to live *P. rettgeri* in w[1118] female flies. Asterisks '*' indicates that primed and unprimed individuals are significantly different (p<0.05). The error bars represent standard error.

XI. **Regulation of IMD by PGRPs is required for immune priming**

Although we found that *Diptericin* is required for immune priming and that the priming response itself relies on an increased expression of *DptB* upon reinfection. Hence, we reasoned that this change in expression must be regulated upstream of the IMD signalling cascade. Following gram-negative bacterial infection, DAP-type peptidoglycans from gram-negative bacteria are recognised by the peptidoglycan receptors *PGRP- LC* (a transmembrane receptor) and *PGRP-LE* (a secreted isoform and an intracellular isoform), which then activate the IMD intracellular signalling cascade [33,34,67]. Negative immune regulation is achieved by direct inhibition of IMD in the cytoplasm by *pirk*, or further downstream by *caudal* at the level of *Relish*. Several PGRPs also downregulate the IMD response, including *PGRP-LB*, a secreted peptidoglycan with amidase activity, that break down peptidoglycans into smaller, less immunogenetic fragments[33,34,67]. *PGRP-LB* has also been shown to be important for transgenerational immune priming in *Drosophila* against parasitoid wasp infection [24].

We therefore decided to investigate the role of *PGRPs* in the immune priming we observed during *P. rettgeri* infection. To address this, we used fly lines with loss-of-function in *PGRP-LB*, *LC* and *LE*. Regardless of which *PGRP* was disrupted, we observed that flies were no longer able to increase their survival following an initial exposure (**Fig**. 12A, **Table**-S15). However, unlike similar outcomes with *Relish* or *ΔAMP*, here the lack of priming was not driven by an inability to clear bacterial loads, as microbe loads in *PGRP* mutants were ~100-fold lower than in *Relish* or AMP mutants (**Fig**. 12B, **Table**-S16; also compare **Figs**. 8B-ii and 9B-i. Further Dpt expression compared to the w^{1118} control was either similar (PGRP-LC, PGRP-LE) or higher (PGRP-LB), as expected, in both primed and unprimed flies (**Fig. 13**, **Table**-S17). This suggests that *Diptericin* expression is required, but not sufficient, for successful priming, which requires adequate regulation by *PGRPs*. Which specific molecular signal modifies *PGRP-mediated* regulation of *Diptericin* expression following an initial priming challenge is unclear, but must lie upstream of the IMD pathway and the fat body.

Figure 12: (A). Survival curves for males and females of Loss-of-function in *PGRPs* (peptidoglycan recognition proteins) of IMD **(i)** *PGRP-LB* **(ii)** *PGRP-LC* and **(iii)** *PGRP-LE* **(B).** internal bacterial load quantified after 24-hours post-secondary exposure in female and male flies (n=7-9 vials with 10-15 flies in each vial/sex/treatment/ fly lines). Different letters in panel-B denotes primed and unprimed individuals are significantly different, tested using Tukey's HSD pairwise comparisons for each fly line and sex combination. The error bars represent standard error.

Figure 13: *Diptericin*-AMPs expression 24-hours after exposure to live *P. rettgeri* in male and female control *w^1118* flies and flies with loss-of-function in different *PGRPs*, *PGRP-LB, PGRP-LC & -LE*.

Discussion

In the present work, we investigated the occurrence, generality and mechanistic basis of immune priming in fruit flies when infected with the gram-negative pathogen *Providencia rettgeri*. We present evidence that priming with an initial non-lethal bacterial inoculum results an increase in survival after a secondary lethal challenge with the same live bacterial pathogen. This protective response may last at least two weeks after the initial exposure, is particularly strong in male flies, and occurs in several genetic backgrouns. We show that the increased survival of primed individuals coincides with a transient decrease in bacterial loads, and that this is likely driven by the expression of the IMD-responsive AMP *Diptericin-B* in the fat body. Further, we show that while *Diptericin* is required as the effector of bacterial clearance, it is not sufficient for immune priming, which requires the regulation by at least three PGRPs (*PGRP-LB, PGRP-LC*, and *PGRP-LE*). Other work has shown that elimination of *PGRP-LB* results in increased expression of *Dpt* AMPs [68,69]. Therefore, despite having an intact IMD signalling cascade, and being able to express all AMPs including *Diptericin*, flies lacking any one of *PGRP-LB, LC* or *LE* were not capable of increasing survival following an initial sublethal challenge. Together, our data indicates that PGRPs are necessary for regulating immune priming against *P. rettgeri* (see **Fig**. 14).

In response to infection, the expression of several AMP genes in *Drosophila* increases and then drops once the infection threat is resolved or controlled. Previous studies have shown that this occurs within a period of few hours during bacterial infections [70]. One key aspect of our results is that immune priming was not the result of continued upregulation of *Diptericin* following the initial exposure to heat-killed bacteria. Instead, we observed that the initial immune response to heat-killed bacteria had already been resolved at 72-hours, before the secondary exposure to a lethal infection at 96-hours (see **Fig**. 9A and B). This second up-regulation of AMP expression was at least 10-times higher than the response to heat-killed bacteria, and was initially similar between both primed and unprimed flies (exposed to a sterile solution in the first exposure). It was only at 72-hours following the second lethal exposure that we observed significantly higher expression of *Diptericin* in primed flies. This difference appears to arise because unprimed flies show a faster resolution of the immune response compared to primed flies; that is, the expression of *Diptericin* shows a faster decrease between 24-hours and 72-hours post-exposure in unprimed compared to primed flies (see **Fig**. 9A and B). These patterns of gene expression provide a partial explanation for the increased survival following priming, but they do not explain why primed individuals had lower bacterial loads at 24-hours after exposure to the second lethal infection, as at this timepoint we did not detect any differences in *Diptericin* expression between primed and unprimed flies. It is also unclear why primed females

showed increased expression of *Diptericin* after 24-hours, but do not show any reduction in bacterial loads at this timepoint following priming, in the way male flies do.

The sex differences we observed in priming reflect a larger pattern of sexual dimorphism in immunity present in most species and particularly in *Drosophila* [71–73]. For instance, the Toll-signalling pathway activity mediated sex-differences in survival following a *P. rettgeri* systemic infection [66]. Here we found that males showed better bacterial clearance after initial exposure to heat-killed *P. rettgeri* which enabled them to experience enhanced survival compared to females, who exhibited higher bacterial loads and greater mortality. One possibility for the observed sex-differences could relate to different nutritional demands and metabolic activities in female *Drosophila*. For instance, female fruit flies are often able to reallocate resources in accordance with their reproductive demands, as observed in terminal investment during infection [74–76]. Studies from other insects suggest that inducing priming responses can directly reduce the reproductive fitness in mosquitoes [77], wax moth [78], and mealworm beetles [79]. There are therefore potential trade-offs between investment in reproductive effort and investment in stronger immune responses following priming. Given that all females used in this study were mated, it is possible that such trade-offs forced a reallocation of resources towards reproduction, thereby reducing the observed magnitude of the priming response in females. Future studies may consider comparing priming responses in females with different reproductive states in order to test whether immune priming is costlier for female *Drosophila*.

A subsidiary finding of this work was the effect of the endosymbiont *Wolbachia* on immune priming. There is strong evidence that *Drosophila* carrying endosymbiont *Wolbachia* are better able to survive infections, especially viral infections [80,59,81,60]. In this case we observed that the priming response that was present in male flies cleared of *Wolbachia* disappeared in males carrying the endosymbiont. It is unclear how *Wolbachia* might induce this effect. This effect is unlikely due to a direct effect of *Wolbachia* on the ability to clear *P. rettgeri* in primed flies, as previous work has found that *Wolbachia* had no effect on the ability to suppress *P. rettgeri* during systemic infection [82]. Indeed, if priming is the result of upregulation of AMP expression, this may suggest that *Wolbachia* may actively be supressing the expression of AMPs, thereby reducing the beneficial effects of priming. However, this would appear to contradict work showing that some *Wolbachia* strains upregulate the host's immune response and result in a reduction of pathogen growth [83–85]. Further rigorous experimental work is therefore required to fully dissect this effect of *Wolbachia* on immune priming.

Finally, it is important to consider the implications of immune priming for disease ecology
and epidemiology, and particularly how it may affect pathogen transmission. Epidemiological
models that have incorporated priming into disease transmission frameworks predict that
primed individuals with enhanced survival following an initial sub-lethal pathogenic exposure
are less likely to become infectious upon re-infections [22]. It remains unclear whether
immune priming reduces pathogen transmissibility, varies the infectious period, or alters
infection-induced behavioural changes in the host [22]. However, if priming acts by
improving bacterial clearance via increased AMP expression, as observed in the present
work, we predict that priming is likely to reduce pathogen shedding at the individual level,
resulting in reduced disease transmission at the population level. A better understanding of
how immune priming contributes to host heterogeneity in disease outcomes would aid our
understanding of the causes and consequences of variation in infectious disease dynamics.

Acknowledgements:

We thank Bruno Lemaitre's lab for generating and generously sharing the CRISPR/Cas9
AMP transgenic lines. We thank Emily Robertshaw, Srijan Seal, Saubhik Sarkar and Pavan
Thunga for laboratory assistance. We thank Sveta Chakrabarti, Jennifer C. Regan, Darren J.
Obbard, Amy B. Pedersen, Daniel H. Nussey and Ashworth fly group members for helpful
discussion. Finally, we thank Angela Reid, Lucinda Rowe, James King and Alison Fulton for
help with media preparation. Figures *SI-1* & *SI-2*, were prepared using Biorender platform.

Data accessibility: All raw data and R code used to produce the analyses and figures is
available at 10.5281/zenodo.7624084 and is citable as: Prakash A, Vale P. Data and code
for "The immune regulation and epidemiological consequences of specific immune priming in
Drosophila." Zenodo; 2023. doi:10.5281/zenodo.7624085 [56].

Author contribution:

AP and PFV conceived and designed the experiments. AP, FF, BS, KMM, TSS performed
the experiments. AP analysed the data with help from FF and PFV. AP and PFV wrote the
paper with additional inputs from IK, TSS, FF, BS & KMM.

Funding:

We acknowledge funding and support from the Branco Weiss fellowship and a Chancellor's
Fellowship to PFV; a Darwin Trust PhD studentship to AP from the School of Biological
Sciences, The University of Edinburgh, United Kingdom and the Ashoka University, India.
For the purpose of open access, the author has applied a Creative Commons Attribution (CC
BY) licence to any Author Accepted Manuscript version arising from this submission.

Conflicts of interests

The authors declare no conflict of interests.

References

1.   Hoffmann JA. The immune response of Drosophila. Nature. 2003;426: 33–38.
doi:10.1038/nature02021

2.   Hultmark D. Drosophila immunity: paths and patterns. Curr Opin Immunol. 2003;15:
12–19. doi:10.1016/S0952-7915(02)00005-5

3.   Buchon N, Silverman N, Cherry S. Immunity in Drosophila melanogaster — from
microbial recognition to whole-organism physiology. Nat Rev Immunol. 2014;14: 796–
810. doi:10.1038/nri3763

4.   Hauton C, Smith VJ. Adaptive immunity in invertebrates: A straw house without a
mechanistic foundation. BioEssays. 2007;29: 1138–1146. doi:10.1002/bies.20650

5.   Little TJ, Colegrave N, Sadd BM, Schmid-Hempel P. Studying immunity at the whole
organism level. BioEssays News Rev Mol Cell Dev Biol. 2008;30: 404–405; author
reply 406. doi:10.1002/bies.20738

6.   Little TJ, Hultmark D, Read AF. Invertebrate immunity and the limits of mechanistic
immunology. Nat Immunol. 2005;6: 651–654. doi:10.1038/ni1219

7.   Christophides GK, Zdobnov E, Barillas-Mury C, Birney E, Blandin S, Blass C, et al.
Immunity-Related Genes and Gene Families in Anopheles gambiae. Science. 2002;298:
159–165. doi:10.1126/science.1077136

8.   Kurtz J, Franz K. Evidence for memory in invertebrate immunity. Nature. 2003;425:
37–38. doi:10.1038/425037a

9.   Sadd BM, Schmid-Hempel P. Insect Immunity Shows Specificity in Protection upon
Secondary Pathogen Exposure. Curr Biol. 2006;16: 1206–1210.
doi:10.1016/j.cub.2006.04.047

10.   Milutinović B, Kurtz J. Immune memory in invertebrates. Semin Immunol. 2016;28:
328–342. doi:10.1016/j.smim.2016.05.004

11.   Prakash A, Khan I. Why do insects evolve immune priming? A search for crossroads.
Dev Comp Immunol. 2022;126: 104246. doi:10.1016/j.dci.2021.104246

12.   Contreras-Garduño J, Lanz-Mendoza H, Franco B, Nava A, Pedraza-Reyes M, Canales-
Lazcano J. Insect immune priming: ecology and experimental evidences. Ecol Entomol.
2016;41: 351–366. doi:10.1111/een.12300

13.   Khan I, Prakash A, Agashe D. Divergent immune priming responses across flour beetle
life stages and populations. Ecol Evol. 2016;6: 7847–7855. doi:10.1002/ece3.2532

14.   Sheehan G, Farrell G, Kavanagh K. Immune priming: the secret weapon of the insect
world. Virulence. 2020;11: 238–246. doi:10.1080/21505594.2020.1731137

15.   Pham LN, Dionne MS, Shirasu-Hiza M, Schneider DS. A Specific Primed Immune
Response in Drosophila Is Dependent on Phagocytes. Vernick K, editor. PLoS Pathog.
2007;3: e26. doi:10.1371/journal.ppat.0030026

16.   Ramirez JL, de Almeida Oliveira G, Calvo E, Dalli J, Colas RA, Serhan CN, et al. A
847   mosquito lipoxin/lipocalin complex mediates innate immune priming in Anopheles
848   gambiae. Nat Commun. 2015;6: 7403. doi:10.1038/ncomms8403

849   17.   Fallon JP, Troy N, Kavanagh K. Pre-exposure of Galleria mellonella larvae to different
850   doses of Aspergillus fumigatus conidia causes differential activation of cellular and
851   humoral immune responses. Virulence. 2011;2: 413–421. doi:10.4161/viru.2.5.17811

852   18.   Little TJ, O'Connor B, Colegrave N, Watt K, Read AF. Maternal Transfer of Strain-
853   Specific Immunity in an Invertebrate. Curr Biol. 2003;13: 489–492. doi:10.1016/S0960-
854   9822(03)00163-5

855   19.   Gálvez D, Añino Y, Vega C, Bonilla E. Immune priming against bacteria in spiders and
856   scorpions? PeerJ. 2020 [cited 2 Oct 2021]. doi:http://doi.org/10.7717/peerj.9285

857   20.   Tate AT, Rudolf VHW. Impact of life stage specific immune priming on invertebrate
858   disease dynamics. Oikos. 2012;121: 1083–1092. doi:10.1111/j.1600-0706.2011.19725.x

859   21.   Tidbury HJ, Best A, Boots M. The epidemiological consequences of immune priming.
860   Proc R Soc B Biol Sci. 2012;279: 4505–4512. doi:10.1098/rspb.2012.1841

861   22.   Tate AT. The Interaction of Immune Priming with Different Modes of Disease
862   Transmission. Front Microbiol. 2016;7: 1102. doi:10.3389/fmicb.2016.01102

863   23.   Roth O, Kurtz J. Phagocytosis mediates specificity in the immune defence of an
864   invertebrate, the woodlouse Porcellio scaber (Crustacea: Isopoda). Dev Comp Immunol.
865   2009;33: 1151–1155. doi:10.1016/j.dci.2009.04.005

866   24.   Bozler J, Kacsoh BZ, Bosco G. Maternal Priming of Offspring Immune System in
867   *Drosophila*. G3 GenesGenomesGenetics. 2020;10: 165–175.
868   doi:10.1534/g3.119.400852

869   25.   Mondotte JA, Gausson V, Frangeul L, Blanc H, Lambrechts L, Saleh M-C. Immune
870   priming and clearance of orally acquired RNA viruses in Drosophila. Nat Microbiol.
871   2018;3: 1394–1403. doi:10.1038/s41564-018-0265-9

872   26.   Mondotte JA, Gausson V, Frangeul L, Suzuki Y, Vazeille M, Mongelli V, et al.
873   Evidence For Long-Lasting Transgenerational Antiviral Immunity in Insects. Cell Rep.
874   2020;33: 108506. doi:10.1016/j.celrep.2020.108506

875   27.   Ferro K, Peuß R, Yang W, Rosenstiel P, Schulenburg H, Kurtz J. Experimental
876   evolution of immunological specificity. Proc Natl Acad Sci. 2019;116: 20598–20604.
877   doi:10.1073/pnas.1904828116

878   28.   Greenwood JM, Milutinović B, Peuß R, Behrens S, Esser D, Rosenstiel P, et al. Oral
879   immune priming with Bacillus thuringiensis induces a shift in the gene expression of
880   Tribolium castaneum larvae. BMC Genomics. 2017;18: 329. doi:10.1186/s12864-017-
881   3705-7

882   29.   Yi Y, Xu H, Li M, Wu G. RNA-seq profiles of putative genes involved in specific
883   immune priming in Bombyx mori haemocytes. Infect Genet Evol. 2019;74: 103921.
884   doi:10.1016/j.meegid.2019.103921

30.   Bergin D, Murphy L, Keenan J, Clynes M, Kavanagh K. Pre-exposure to yeast protects
larvae of Galleria mellonella from a subsequent lethal infection by Candida albicans and
is mediated by the increased expression of antimicrobial peptides. Microbes Infect.
2006;8: 2105–2112. doi:10.1016/j.micinf.2006.03.005

31.   Roesel CL, Rosengaus RB, Smith W, Vollmer SV. Transcriptomics reveals specific
molecular mechanisms underlying transgenerational immunity in Manduca sexta. Ecol
Evol. 2020;10: 11251–11261. doi:10.1002/ece3.6764

32.   Chakrabarti S, Visweswariah SS. Intramacrophage ROS Primes the Innate Immune
System via JAK/STAT and Toll Activation. Cell Rep. 2020;33: 108368.
doi:10.1016/j.celrep.2020.108368

33.   Lemaitre B, Hoffmann J. The Host Defense of Drosophila melanogaster. Annu Rev
Immunol. 2007;25: 697–743. doi:10.1146/annurev.immunol.25.022106.141615

34.   Valanne S, Wang J-H, Rämet M. The Drosophila Toll Signaling Pathway. J Immunol.
2011;186: 649–656. doi:10.4049/jimmunol.1002302

35.   Myllymäki H, Valanne S, Rämet M. The Drosophila Imd Signaling Pathway. J
Immunol. 2014;192: 3455–3462. doi:10.4049/jimmunol.1303309

36.   Hanson MA, Dostálová A, Ceroni C, Poidevin M, Kondo S, Lemaitre B. Synergy and
remarkable specificity of antimicrobial peptides in vivo using a systematic knockout
approach. eLife. 2019;8: e44341. doi:10.7554/eLife.44341

37.   Shit B, Prakash A, Sarkar S, Vale PF, Khan I. Ageing leads to reduced specificity of
antimicrobial peptide responses in Drosophila melanogaster. Proc R Soc B. 2022;
2022.06.25.497570. doi:10.1101/2022.06.25.497570

38.   Tate AT. A general model for the influence of immune priming on disease prevalence.
Oikos. 2017;126: 350–360. doi:10.1111/oik.03274

39.   Prakash A, Khan I. Why do insects evolve immune priming? A search for crossroads.
Dev Comp Immunol. 2022;126: 104246. doi:10.1016/j.dci.2021.104246

40.   Siva-Jothy JA, Vale PF. Viral infection causes sex-specific changes in fruit fly social
aggregation behaviour. Biol Lett. 2019;15: 20190344. doi:10.1098/rsbl.2019.0344

41.   Romano V, Lussiana A, Monteith KM, MacIntosh AJ, Vale PF. Host genetics and
pathogen species modulate infection-induced changes in social aggregation behaviour.
Biol Lett. 2022 [cited 20 May 2022]. doi:10.1098/rsbl.2022.0233

42.   Sinenko SA, Mathey-Prevot B. Increased expression of Drosophila tetraspanin, Tsp68C,
suppresses the abnormal proliferation of ytr-deficient and Ras/Raf-activated hemocytes.
Oncogene. 2004;23: 9120–9128. doi:10.1038/sj.onc.1208156

43.   Zettervall C-J, Anderl I, Williams MJ, Palmer R, Kurucz E, Ando I, et al. A directed
screen for genes involved in Drosophila blood cell activation. Proc Natl Acad Sci.
2004;101: 14192–14197. doi:10.1073/pnas.0403789101

44.   Lewis E. A new standard food medium. 1960 Drosophila Information Service. in. Cold
Spring Harb Protoc. 2014;2014: pdb.rec081414. doi:10.1101/pdb.rec081414

45. Prakash A, Monteith KM, Vale PF. Negative regulation of IMD contributes to disease
tolerance during systemic bacterial infection in Drosophila. Evolutionary Biology; 2021
Sep. doi:10.1101/2021.09.23.461574

46. Prakash A, Bonnet M, Monteith KM, Vale PF. The Jak/Stat pathway mediates disease
tolerance during systemic bacterial infection in Drosophila. Evolutionary Biology; 2021
Sep. doi:10.1101/2021.09.23.461578

47. Siva-Jothy JA, Prakash A, Vasanthakrishnan RB, Monteith KM, Vale PF. Oral Bacterial
Infection and Shedding in Drosophila melanogaster. J Vis Exp. 2018; 57676.
doi:10.3791/57676

48. Pfeiffenberger C, Lear BC, Keegan KP, Allada R. Processing Sleep Data Created with
the Drosophila Activity Monitoring (DAM) System. Cold Spring Harb Protoc.
2010;2010: pdb.prot5520. doi:10.1101/pdb.prot5520

49. Anderson L, Camus MF, Monteith KM, Salminen TS, Vale PF. Variation in
mitochondrial DNA affects locomotor activity and sleep in Drosophila melanogaster.
Heredity. 2022; in press. doi:10.1101/2021.10.30.464953

50. Gupta V, Stewart CO, Rund SSC, Monteith K, Vale PF. Costs and benefits of sublethal
Drosophila C virus infection. J Evol Biol. 2017;30: 1325–1335. doi:10.1111/jeb.13096

51. Vale PF, Jardine MD. Sex-specific behavioural symptoms of viral gut infection and
Wolbachia in Drosophila melanogaster. J Insect Physiol. 2015;82: 28–32.
doi:10.1016/j.jinsphys.2015.08.005

52. Shaw PJ, Cirelli C, Greenspan RJ, Tononi G. Correlates of sleep and waking in
Drosophila melanogaster. Science. 2000;287: 1834–7.
doi:10.1126/science.287.5459.1834

53. Wickham H. Ggplot2: elegant graphics for dataanalysis. New York, NY: Springer.;
2016. Available: https://mran.microsoft.com/snapshot/2015-02-
16/web/packages/ggplot2/ggplot2.pdf

54. Therneau T. Mixed Effects Cox Models. Mixed Effects Cox Models. CRAN repository;
2015. Available: https://repo.bppt.go.id/cran/web/packages/coxme/vignettes/coxme.pdf

55. Bates D, Mächler M, Bolker B, Walker S. Fitting Linear Mixed-Effects Models using
lme4. ArXiv14065823 Stat. 2014 [cited 25 Sep 2021]. Available:
http://arxiv.org/abs/1406.5823

56. Prakash A, Vale P. Data and code for "The immune regulation and epidemiological
consequences of specific immune priming in Drosophila." Zenodo; 2023.
doi:10.5281/zenodo.7624085

57. Livak KJ, Schmittgen TD. Analysis of Relative Gene Expression Data Using Real-Time
Quantitative PCR and the $2-\Delta\Delta CT$ Method. Methods. 2001;25: 402–408.
doi:10.1006/meth.2001.1262

58. Brownlie JC, Johnson KN. Symbiont-mediated protection in insect hosts. Trends
Microbiol. 2009;17: 348–354. doi:10.1016/j.tim.2009.05.005

59. Teixeira L, Ferreira Á, Ashburner M. The Bacterial Symbiont Wolbachia Induces
Resistance to RNA Viral Infections in Drosophila melanogaster. PLOS Biol. 2008;6:
e1000002. doi:10.1371/journal.pbio.1000002

60. Gupta V, Vasanthakrishnan RB, Siva-Jothy J, Monteith KM, Brown SP, Vale PF. The
route of infection determines Wolbachia antibacterial protection in Drosophila. Proc R
Soc B Biol Sci. 2017;284: 20170809. doi:10.1098/rspb.2017.0809

61. Khan I, Prakash A, Agashe D. Pathogen susceptibility and fitness costs explain variation
in immune priming across natural populations of flour beetles. Cotter S, editor. J Anim
Ecol. 2019;88: 1332–1342. doi:10.1111/1365-2656.13030

62. Stockmaier S, Stroeymeyt N, Shattuck EC, Hawley DM, Meyers LA, Bolnick DI.
Infectious diseases and social distancing in nature. Science. 2021;371: eabc8881.
doi:10.1126/science.abc8881

63. Craft ME. Infectious disease transmission and contact networks in wildlife and
livestock. Philos Trans R Soc B Biol Sci. 2015;370: 20140107.
doi:10.1098/rstb.2014.0107

64. Lopes PC, Block P, König B. Infection-induced behavioural changes reduce
connectivity and the potential for disease spread in wild mice contact networks. Sci Rep.
2016;6: 31790. doi:10.1038/srep31790

65. Lopes PC, French SS, Woodhams DC, Binning SA. Sickness behaviors across
vertebrate taxa: proximate and ultimate mechanisms. J Exp Biol. 2021;224: jeb225847.
doi:10.1242/jeb.225847

66. Duneau DF, Kondolf HC, Im JH, Ortiz GA, Chow C, Fox MA, et al. The Toll pathway
underlies host sexual dimorphism in resistance to both Gram-negative and Gram-
positive bacteria in mated Drosophila. BMC Biol. 2017;15: 124. doi:10.1186/s12915-
017-0466-3

67. Valanne S, Vesala L, Maasdorp MK, Salminen TS, Rämet M. The Drosophila Toll
Pathway in Innate Immunity: from the Core Pathway toward Effector Functions. J
Immunol. 2022;209: 1817–1825. doi:10.4049/jimmunol.2200476

68. Zaidman-Rémy A, Hervé M, Poidevin M, Pili-Floury S, Kim M-S, Blanot D, et al. The
Drosophila amidase PGRP-LB modulates the immune response to bacterial infection.
Immunity. 2006;24: 463–473. doi:10.1016/j.immuni.2006.02.012

69. Myllymäki H, Valanne S, Rämet M. The Drosophila Imd Signaling Pathway. J
Immunol. 2014;192: 3455–3462. doi:10.4049/jimmunol.1303309

70. Lemaitre B, Reichhart J-M, Hoffmann JA. Drosophila host defense: Differential
induction of antimicrobial peptide genes after infection by various classes of
microorganisms. Proc Natl Acad Sci. 1997;94: 14614–14619.
doi:10.1073/pnas.94.26.14614

71. Belmonte RL, Corbally M-K, Duneau DF, Regan JC. Sexual Dimorphisms in Innate
Immunity and Responses to Infection in Drosophila melanogaster. Front Immunol.
2020;10: 3075. doi:10.3389/fimmu.2019.03075

72.   Klein SL, Flanagan KL. Sex differences in immune responses. Nat Rev Immunol.
1004   2016;16: 626–638. doi:10.1038/nri.2016.90

1005   73.   Simon V. Wanted: women in clinical trials. Science. 2005;308: 1517–1518. Available:
1006   https://go.gale.com/ps/i.do?p=AONE&sw=w&issn=00368075&v=2.1&it=r&id=GALE
1007   %7CA133569531&sid=googleScholar&linkaccess=abs

1008   74.   Camus MF, Piper MD, Reuter M. Sex-specific transcriptomic responses to changes in
1009   the nutritional environment. Keller L, Eisen MB, Zajitschek F, editors. eLife. 2019;8:
1010   e47262. doi:10.7554/eLife.47262

1011   75.   Martínez BA, Hoyle RG, Yeudall S, Granade ME, Harris TE, Castle JD, et al. Innate
1012   immune signaling in Drosophila shifts anabolic lipid metabolism from triglyceride
1013   storage to phospholipid synthesis to support immune function. Hietakangas V, editor.
1014   PLOS Genet. 2020;16: e1009192. doi:10.1371/journal.pgen.1009192

1015   76.   Hudson AL, Moatt JP, Vale PF. Terminal investment strategies following infection are
1016   dependent on diet. J Evol Biol. 2020;33: 309–317. doi:10.1111/jeb.13566

1017   77.   Contreras-Garduño J, Rodríguez MC, Rodríguez MH, Alvarado-Delgado A, Lanz-
1018   Mendoza H. Cost of immune priming within generations: trade-off between infection
1019   and reproduction. Microbes Infect. 2014;16: 261–267. doi:10.1016/j.micinf.2013.11.010

1020   78.   Trauer U, Hilker M. Parental Legacy in Insects: Variation of Transgenerational Immune
1021   Priming during Offspring Development. PLOS ONE. 2013;8: e63392.
1022   doi:10.1371/journal.pone.0063392

1023   79.   Zanchi C, Troussard J-P, Martinaud G, Moreau J, Moret Y. Differential expression and
1024   costs between maternally and paternally derived immune priming for offspring in an
1025   insect. J Anim Ecol. 2011;80: 1174–1183. doi:10.1111/j.1365-2656.2011.01872.x

1026   80.   Hedges LM, Brownlie JC, O'Neill SL, Johnson KN. Wolbachia and Virus Protection in
1027   Insects. Science. 2008;322: 702–702. doi:10.1126/science.1162418

1028   81.   Martinez J, Longdon B, Bauer S, Chan Y-S, Miller WJ, Bourtzis K, et al. Symbionts
1029   Commonly Provide Broad Spectrum Resistance to Viruses in Insects: A Comparative
1030   Analysis of Wolbachia Strains. PLOS Pathog. 2014;10: e1004369.
1031   doi:10.1371/journal.ppat.1004369

1032   82.   Rottschaefer SM, Lazzaro BP. No Effect of Wolbachia on Resistance to Intracellular
1033   Infection by Pathogenic Bacteria in Drosophila melanogaster. PLOS ONE. 2012;7:
1034   e40500. doi:10.1371/journal.pone.0040500

1035   83.   Rancès E, Ye YH, Woolfit M, McGraw EA, O'Neill SL. The Relative Importance of
1036   Innate Immune Priming in Wolbachia-Mediated Dengue Interference. PLOS Pathog.
1037   2012;8: e1002548. doi:10.1371/journal.ppat.1002548

1038   84.   Chrostek E, Marialva MSP, Esteves SS, Weinert LA, Martinez J, Jiggins FM, et al.
1039   Wolbachia Variants Induce Differential Protection to Viruses in Drosophila
1040   melanogaster: A Phenotypic and Phylogenomic Analysis. PLOS Genet. 2013;9:
1041   e1003896. doi:10.1371/journal.pgen.1003896

1042   85. Prigot-Maurice C, Beltran-Bech S, Braquart-Varnier C. Why and how do protective
1043   symbionts impact immune priming with pathogens in invertebrates? Dev Comp
1044   Immunol. 2022;126: 104245. doi:10.1016/j.dci.2021.104245

1045