1   **The major histocompatibility complex: a double-edged sword in fungal**

2   **disease susceptibility**

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The genotyped MHC IIβ1 sequences have been deposited in GenBank with the accession

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Conflicts of interest

The authors declare no conflicts of interest.

Abstract

Chytridiomycosis, caused by *Batrachochytrium dendrobatidis* (Bd), threatens amphibian

populations worldwide. MHC II has been implicated in Bd susceptibility, but the role of MHC in

Bd susceptibility remains poorly understood. In this study, we clustered MHC II ß1 alleles into

functional supertypes and investigated their diversity in amphibian species with differential

susceptibility. Despite sharing similar alpha diversity in MHC II supertypes, the hosts exhibited

distinct beta diversity. We demonstrated MHC supertypes, rather than individual MHC alleles,

predict Bd susceptibility, with some supertypes conferring protection and others increasing risk.

This suggests that MHC alleles function more as part of a complex network than as independent

entities. We also quantified MHC allelic-specific expression and observed individual-level

variability in expression across both species. Notably, positive and negative associations among

MHC alleles were observed. The similarity of these patterns between the two species suggests

the presence of conserved regulatory mechanisms across amphibians. Our results provide

valuable resources and insights to advance the understanding of adaptive immunological systems

and to develop targeted conservation strategies to preserve biodiversity.

Keywords: chytridiomycosis, *Batrachochytrium dendrobatidis* (Bd), major histocompatibility

complex (MHC), MHC functional modeling, disease susceptibility, allelic expression

Introduction

Emerging infectious diseases (EIDs) pose significant threats to global biodiversity, with amphibians being particularly vulnerable. The chytrid fungus, *Batrachochytrium dendrobatidis* (Bd), has caused severe declines and even extirpation of amphibian populations worldwide (Fisher *et al*, 2021; Lips *et al*, 2006; Scheele *et al*, 2019) and extinction of several species is predicted (Alroy, 2015). Bd originated in East Asia (O'Hanlon *et al*, 2018), where some amphibian species may have evolved resistance or tolerance to multiple Bd strains (Fu & Waldman, 2019, 2022). Understanding the genetic basis of resistance in these species is critical for developing effective conservation strategies.

The major histocompatibility complex (MHC) class II (MHC II) plays a pivotal role in the adaptive immune response by binding peptides derived from pathogens and presenting them to T cells (Janeway *et al*, 2001; Unanue *et al*, 2016). MHC II molecules are highly polymorphic, especially in ß1 domain that encode peptide binding sites (PBS), facilitating a wide range of pathogen recognition (Janeway *et al.*, 2001; Unanue *et al.*, 2016). While a few studies have linked specific MHC II genotypes to resistance to Bd in amphibians (Bataille *et al*, 2015; Cortazar-Chinarro *et al*, 2022; Fu *et al*, 2023a; Kosch *et al*, 2016; Lau *et al*, 2023; Savage & Zamudio, 2011, 2016), no study, to our knowledge, has investigated functional MHC IIß1-based supertypes and associations (*e.g.,* epistasis) between putative MHC loci.

This study aims to address these gaps by investigating the diversity of MHC II supertypes and allelic-expression patterns in an Asian Bd-resistant species (*Bufo gargarizans*) and an Australasian susceptible species (*Litoria caerulea*). The latter species exhibits a mortality rate of about 93.3% from Bd infection (Fu & Waldman, 2019). Using RNA-based genotyping, we previously obtained full-length MHC II β1 sequences from both species (Fu *et al*, 2023b). In this

study, we cluster them into functional MHC II supertypes and compare their alpha and beta

diversity as well as the allelic expression patterns in the two species with divergent Bd

susceptibility. Our results suggest a shift is needed in MHC research in conservation efforts away

from simple diversity estimates and towards more complex phenomena such as supertypes and

epistatic interactions. This research has important implications for advancing our understanding

of differential disease susceptibility and will inform amphibian conservation efforts.

Results

We modeled five functional supertypes (ST1−ST5) for *B. gargarizans* and *L. caerulea*

(Fig. S1c), with detailed allele distributions presented in the amino acid phylogenetic tree (Fig.

S2) and alignments (Fig. S3). Both species exhibited four MHC supertypes each with two unique

supertypes (ST1 for *L. caerulea*; ST4 for *B. gargarizans*) and three shared supertypes (ST2, ST3,

and ST5) (Fig. S1d). Most individuals in both species harbored 2 to 3 supertypes (90.9% in *B.*

gargarizans and 86.2% in *L. caerulea*) (Fig. 1a).

Bd resistance is not associated with MHC supertype alpha diversity

No significant differences were found between the two species in MHC supertype

richness (Wilcoxon rank sum test, $W = 510.5$, $p = 0.44$) (Fig. 1b) or Shannon diversity index (W

$= 389.5$, $p = 0.30$) (Fig. 1c). Generalized linear mixed effect models (GLMM) indicated that Bd

resistance was not associated with alpha diversity metrics (richness, Shannon diversity index,

Simpson index) ($p > 0.05$) (Table S1 & S2).

Bd resistance is associated with MHC supertype components

The compositions of MHC supertypes differed markedly between *B. gargarizans* and *L.*

caerulea, with ST5 dominating in the former and ST1 in the latter (Fig. 2a). The structures of the

MHC supertype were significantly different between the two species (Fig. 2b), as indicated by

PERMANOVA ($F_{1,59} = 193.84$, $p = 0.0001$) and ANOSIM tests ($R = 0.96$, $p = 0.0001$). The

GLMMs revealed that ST1 was significantly negatively associated with Bd resistance (Table S1),

while ST5 was positively associated (Table S2) ($p < 0.01$). Furthermore, the MHC II supertypes

were more dispersed in *L. caerulea* compared to *B. gargarizans* (Betadispersion, $F_{1,59} = 8.05$, $p =$

0.004) (Fig. 2c).

Physicochemical Properties of MHC Supertypes

The unique supertypes ST1 (*L. caerulea*) and ST4 for (*B. gargarizans*) differed

significantly in several physicochemical properties, including Z1 (hydrophobicity) ($\chi^2 = 14.08$, p

$= 0.0002$) (Fig. S4a), Z3 (Polarity) ($\chi^2 = 14.08$, $p = 0.0002$) (Fig. S4c, Table S5) and Z4 (relating

to electronegativity, heat of formation, electrophilicity and hardness) ($\chi^2 = 12.62$, $p = 0.0004$)

(Fig. S4d). Specifically, ST4 exhibited higher hydrophobicity and higher values of Z3 and Z4

compared to ST1 (Fig. S4a). Among shared supertypes (ST2, ST3, and ST5), ST2 showed

significantly higher hydrophobicity in *B. gargarizans* compared to *L. caerulea* (Kruskal–Wallis

rank sum test, $\chi^2 = 8.24$, $p = 0.004$) (Fig. S4a). Furthermore, *L. caerulea* exhibited higher Z2

(Steric bulk/Polarizability) for ST2 ($\chi^2 = 6.15$, $p = 0.013$) and ST5 ($\chi^2 = 5.08$, $p = 0.02$) than that

in *B. gargarizans* (Fig. S4b).

MHC supertypes predict Bd susceptibility

The relative risk analysis of MHC supertypes in Bd susceptibility revealed significant

differences in how various MHC supertypes impact susceptibility to Bd-induced mortality ($\chi^2 =$

77.39, $df = 4$, $p < 0.01$) (Fig. 3).

ST1 and ST3 were identified as high-risk factors for chytridiomycosis-induced

mortality, with markedly elevated risk ratios (Fig. 3). Specifically, ST1 had an RR of 16.85 with

95% CI [4.38, 64.86], making it a highly risky supertype linked to Bd susceptibility. Similarly,

ST3 also posed a significant risk with an RR of 7.28 [3.20, 16.55] (Fig. 3).

In contrast, ST5, ST4, and ST2 were associated with a protective effect against Bd-

induced mortality (Fig. 3). ST5, in particular, demonstrated a strong protective effect with a low

RR of 0.06 [0.02, 0.23] (Fig. 3). ST4 and ST2 also exhibited protective roles, with RR of 0.05

[0.00, 0.76] and 0.35 [0.22, 0.56], respectively (Fig. 3).

MHC alleles fail to predict Bd susceptibility

An individual with Bd-resistant *L. caerulea* (LC15) highly expressed the LitcaeIIB29

allele (Fig. S5), which belongs to the ST2 supertype (Fig. S3b). LitcaeIIB29 contained specific

motifs and deletion associated with Bd-resistance (Fu *et al.*, 2023a), suggesting it might be a

protective allele against Bd infection. However, not all *L. caerulea* individuals expressing

LitcaeIIB29 survived Bd infection (that is, LC24, LC1) (Fig. S5), indicating the presence of

suppressive alleles for resistance to Bd. Susceptible individuals (e.g., LC6, LC2) expressed other

alleles of MHC IIβ1 alleles (e.g., LitcaeIIB14, LitcaeIIB9, LitcaeIIB4, LitcaeIIB26) at high

levels (Fig. S5), which belongs mainly to ST1 and ST3 (Fig. S3a &S3c).

A relative risk analysis was performed for these alleles (LitcaeIIB29, LitcaeIIB14,

LitcaeIIB9, LitcaeIIB4, LitcaeIIB26), along with frequent alleles (LitcaeIIB19, LitcaeII6) (Fu *et*

al., 2023b), and an additional allele in LC15 (LitcaeII24) of *L. caerulea*. The results showed that

none of these MHC alleles was significantly associated with Bd susceptibility, with an RR value

of approximately 1[0.71, 1.07] (Fig. 4). Furthermore, no significant differences were observed in

the risk of susceptibility to Bd between these alleles in *L. caerulea* ($\chi^2 = 7.95$, *df* = 7, *p* = 0.34)

(Fig. 4).

Allelic-expression patterns of MHC IIß1 alleles

As MHC allelic expression varied between some individuals with *L. caerulea* (Fig. S5),

we investigated the allelic expression of MHC IIβ1 alleles in both *B. gargarizans* and *L.*

caerulea. The expression patterns of the MHC IIβ1 alleles in *B. gargarizans* and *L. caerulea*

showed consistent variability among individuals, each individual having one or two alleles with

high expression levels, while the remaining alleles were expressed at low levels (Fig. 5). Some

alleles were expressed in almost all individuals (e.g., BufgarIIB19, BufgarIIB9 in *B. gargarizans*;

LitcaeIIB14, LitcaeIIB19 in *L. caerulea*), while other alleles were only expressed in a subset of

individuals (e.g., Buga1, Buga3, LC6, LC26) (Figs. 5 & S6–S7).

Statistics analysis revealed that there were no significant differences between replicates

in beta diversity (PERMANOVA, *B. gargarizans*, $F_{1,64}$ = -0.01, p = 0.99; *L. caerulea*, $F_{1,56}$ =

0.03, p = 0.99) or in the Shannon diversity index (Wilcoxon rank sum test, *B. gargarizans*, W =

561, p = 0.84; *L. caerulea*, W = 429, p = 0.90) (Fig. S8).

Epistatic association among MHC II alleles

Interestingly, when some alleles (e.g., LitcaeIIB29, LitcaeIIB14) were highly expressed,

other alleles (e.g., LitcaeIIB14, LitcaeIIB29) were expressed at low levels (Fig. 6b), suggesting a

negative correlation between certain MHC II alleles. To explore the intrinsic relationship among

all MHC alleles, we performed a Pearson's correlation analysis and found significant positive

and negative associations among MHC II alleles in both species (*B. gargarizans*, Fig. 6a & S9; *L.*

caerulea, Fig. 6b &S10). For example, in *B. gargarizans*, BufgarIIB19 was negatively correlated

with BufgarIIB26 and BufgarIIB2 significantly (Fig. 6a); in *L. caerulea*, LitcaeIIB29 was

negatively correlated with LitcaeIIB14 and LitcaeIIB26 significantly (Fig. 6b). Some alleles

exhibited both positive and negative correlations with each other (Fig. 6a & S9: BufgarIIB1,

BufgarIIB15, BufgarIIB13, BufgarIIB11, BufgarIIB5, BufgarIIB2; Fig. 6b & S10: LitcaeIIB19,

LitcaeIIB26), but most were positively correlated with each other (Fig. 6). Furthermore, some

alleles were exclusively negatively correlated with others (Fig. 6a & S9: BufgarIIB19,

BufgarIIB26; Fig. 6b & S10: LitcaeIIB9, LitcaeIIB14, LitcaeIIB29).

Discussion

Our study applied amphibian-Bd model to understand how the diversity of MHC II

functional supertypes and allelic-expression contribute to differential Bd susceptibility. Our

findings suggest that MHC supertypes, but not MHC alleles, significantly influence risk and

protection, thus predicting Bd susceptibility. Transcriptional analysis at the allelic level reveals

substantial variability in expression between individuals, along with intrinsic positive and

negative correlations between MHC alleles, indicating a complex regulatory network that could

shape immune responses across species. These findings deepen our understanding of host

immunogenetics and offer valuable information for conservation strategies to mitigate the impact

of Bd on vulnerable amphibian populations.

Bd susceptibility is associated with MHC supertype components rather than alpha

diversity

Our modeling reveals both shared and unique supertypes across the two amphibian

species (Fig. S1 & Fig. 2). Shared supertypes (ST2, ST3, ST5) can represent conserved immune

functions derived from a common ancestor, while unique supertypes (ST1 in *L. caerulea* and

ST4 in *B. gargarizans*) can reflect species-specific adaptations to Bd or local environmental

pressure as found in fish (Lozano-Martín *et al*, 2023) and bats (Li *et al*, 2023). Our analysis

shows that resistance to Bd is not significantly related to the alpha diversity of MHC supertypes

or allelic richness (Fig. 1, Table S1), but a significant association exists with beta diversity (Fig.

2). This suggests that Bd susceptibility depends more on the specific supertypes of MHC present

than on the overall diversity.

The distinct structural differences in MHC supertypes between *B. gargarizans* and *L.*

caerulea also point to an evolutionary divergence in immune system adaptations. The unique

supertypes ST1 in *L. caerulea* and ST4 in *B. gargarizans* exhibited significant differences in

hydrophobicity, polarity, and other physicochemical properties (Fig. S4). These differences

likely underpin the functional divergence between these supertypes, with ST4's higher

hydrophobicity potentially enhancing Bd resistance through improved peptide binding affinity.

Such physicochemical properties could be key determinants of MHC-mediated immune

responses, as previous studies have also suggested that hydrophobicity selection plays a role in

Bd resistance (Fu, 2024).

MHC II as a double-edged sword in Bd susceptibility

The relative risk (RR) analysis underscores the distinct roles of specific MHC supertypes

in resistance to Bd, with ST1 and ST3 identified as risk factors, while ST5, ST4 and ST2 appear

to be protective against mortality induced by chytridiomycosis (Fig. 3). These findings reveal

that MHC II serve as a double-edged sword in Bd susceptibility, explaining the previous

inconsistent findings (Bataille *et al.*, 2015; Fu *et al.*, 2023a; Savage *et al*, 2020; Savage &

Zamudio, 2011, 2016). This dual role underscores the complex nature of MHC-mediated

immune responses, where the presence of specific supertypes can increase susceptibility or

enhance resistance to pathogens. Understanding this duality is crucial for understanding how

MHC diversity influences the outcomes of host-pathogen interactions and has significant

implications for the development of conservation strategies to combat chytridiomycosis.

Interestingly, although clear associations between MHC supertype and Bd susceptibility

emerged when comparing both Bd-resistant and susceptible species (Fig. 3), no specific MHC

alleles in susceptible species exhibited a significant risk of Bd susceptibility (Fig. 4). This

suggests that the MHC supertypes predict Bd susceptibility better than alleles. Additionally, it

appears that MHC alleles function more as part of a complex network than as independent

entities, highlighting the collaborative nature of MHC in modulating disease resistance.

The intrinsic association among MHC alleles

The multifaced role of MHC is most likely associated with the intrinsic associations

among MHC alleles of MHC IIβ1 alleles (Fig. 6), which represents a significant finding of this

study. The correlations among the MHC alleles of both species (Fig. 6) suggest potential

epistatic regulation, where the expression of one allele can influence others. Epistasis could play

a role in synergistically activating positively correlated alleles or antagonistically suppressing

others, explaining the inconsistencies in the role of MHC in predicting Bd susceptibility (Fig. 4)

and its varied roles.

Epistasis is vital to understanding the complexity of diseases, and is particularly

important in polymorphic genes (Mackay & Anholt, 2024; Mackay & Moore, 2014). Further

research into the mechanisms behind the specific patterns of MHC alleles and the evolutionary

context of potential epistatic interactions could offer valuable insight into how MHC diversity

has evolved to optimize resistance to pathogens. Allelic-specific expression of MHC should be

considered when studying how MHC contributes to differential disease susceptibility.

Understanding how the expression of MHC alleles is regulated is essential to advance

conservation efforts and disease mitigation strategies.

Eco-evolutionary significance

The evolutionary basis for these allelic-expression patterns and potential epistatic

interactions remains an open question. Human MHC (HLA) studies have also found allelic-

specific expressions (Ramsuran *et al*, 2015; Yamamoto *et al*, 2020), suggesting that this

phenomenon for MHC may be conserved across vertebrates, with amphibians providing an

evolutionary foundation. Given the key role of MHC in adaptive immunity, its expression

throughout the body likely plays a significant role in maintaining homeostasis and health

(Janeway *et al.*, 2001).

The presence of highly expressed alleles in certain individuals indicates that quantitative

differences in gene expression among specific alleles might be crucial to the development of an

effective immune response. This can occur synergistically with other expressed MHC alleles, but

may also induce autoimmunity or suppress other alleles that could be beneficial in defending

against pathogens. It is possible that selective pressures have favored certain allele combinations

that maximize immune effectiveness while suppressing non-essential or detrimental responses.

The prevalence of positive correlations among MHC alleles than negative correlations (Fig. 6)

suggests that while antagonistic effects might have been selected for critical immunoregulatory

roles, they may come at a cost.

Conservation implications

Selective breeding and targeted genetic intervention can offer effective protection for

endangered species susceptible to Bd, making it essential to understand the genetic basis of

disease susceptibility (Berger *et al*, 2024; Kosch *et al*, 2022). Our results by modelling specific

MHC supertypes and conducting risk analysis in Bd-resistant and susceptible species provide

evidence that MHC II serves as a double-edged sword for Bd susceptibility. This suggests that

targeting the functional MHC supertype may be more effective compared to focusing on a single

MHC allele in Bd-susceptible species. These insights lay a critical foundation for targeted

conservation efforts, potentially guiding breeding programs or other interventions aimed at

bolstering the resilience of vulnerable amphibian populations to Bd. Based on the challenges of

our recent research on MHC in Bd resistant and susceptible amphibian species, it is also

recommended to breed Bd resistant individuals with others to produce offsprings carrying these

alleles. This approach could further our understanding of the role of MHC in Bd resistance and

help to preserve rare MHC genotypes, which may also be crucial for the conservation effort.

Materials and Methods

MHC IIβ1 Sequences

MHC IIβ1 nucleotide alignments (No. of sites = 285) of Asian Bd resistant species (*Bufo*

gargarizans) (number of sequences = 33) and Australasian Bd resistant species (*Litoria caerulea*)

(number of sequences = 35) were obtained from a previous study (GenBank accession numbers

from OQ726420 to OQ726487) (Fu *et al.*, 2023b). Those *B. gargarizans* (N = 33) were collected

from Jeonju, Republic of Korea, and *L. caerulea* (N = 30) were wild-caught in New Guinea (Fu

et al., 2023b; Fu & Waldman, 2019). Among the 30 *L. caerulea*, there were two Bd-resistant

individuals (Fu *et al.*, 2023b; Fu & Waldman, 2019). For the genotyping of MHC class IIß1,

RNA was first isolated from the liver (N = 62) and the buccal swab (N = 1) of the two species,

amplified in duplicate or triplicate, and sequenced using the Illumina MiSeq 2×300 bp paired

end platform (PE) Illumina MiSeq platform (Fu *et al.*, 2023b). This study did not require ethical

approval.

Supertyping for MHC IIβ1 alleles

To cluster MHC IIβ1 into different functional supertypes, we first extracted 24 PBSs

from MHC IIβ1 amino acid alignments (N = 68) of *B. gargarizans* (N = 33) and *L. caerulea* (N =

35) (site 9, 11, 13, 28, 30, 32, 37, 38, 47, 56, 60, 61, 65, 68, 70, 71, 74, 78, 81, 82, 85, 86, 88, 89)

(Fu *et al.*, 2023b). These PBSs were annotated by comparing them with those of the MHC II of

Homo sapiens (Bergström *et al*, 1998). Each amino acid residue was then characterized based on

five physicochemical descriptor variables (Z1, lipophilicity/hydrophobicity; Z2 ,

polarization/steric bulk; Z3, polarity/charge; Z4 and Z5, relate to electronegativity, heat of

formation, electrophilicity and hardness) (Sandberg *et al*, 1998).

Next, a discriminant analysis of the principal components (DAPC) was performed to

group functionally similar MHC II alleles into different clusters using the adegenet 2.1.10

package in R v. 4.2.1 (Jombart, 2008; Jombart *et al*, 2010). For DAPC, clustering of K-means

with Bayesian information criterion (BIC) was used to evaluate the optimal number of clusters

(BIC was approximately 60) (Fig. S1a), and cross-validation was used to select the number of

principal components (PCs) to be objectively retained. The membership probability for each

MHC II allele was shown in Fig. S1b.

Construction of a Phylogenetic Tree

To visualize the distribution of MHC II supertypes in *L. caerulea* and *B. gargarizans* in

the amino acid phylogenetic tree, we constructed a consensus maximum likelihood tree of full-

length MHC IIβ1 alleles with 1000 bootstrap replicas using MEGA X with the JTT + G + I

substitution model (Kumar *et al*, 2018). All positions with < 95% site coverage were eliminated;

that is, fewer than 5% alignment gaps, missing data, and ambiguous bases were allowed at any

position (partial deletion option).

Alpha and Beta Diversity Analysis and Corresponding Statistics

To understand whether resistance to Bd is related to the alpha diversity of MHC II

supertypes, we calculate the number of MHC supertypes (richness), Shannon's diversity index,

Simpson's index for each individual in Bd-resistant species, *B. gargarizans* ($N = 33$) and Bd-

susceptible *L. caerulea* ($N = 28$), using the 'diversity' function 'diversity' from vegan package

(Oksanen, 2013). Two individuals resistant to Bd from *L. caerulea* were removed for this

comparison with *B. gargarizans* to avoid bias from individuals resistant to Bd from *L. caerulea.*

Kruskal–Wallis rank sum tests were conducted using 'kruskal.test' in R 3.3.1 (R Foundation for

Statistical Computing, Vienna, Austria). Wilcoxon rank sum tests were computed using

'wilcox.test' from package 'MASS' (Ripley *et al*, 2013).

To determine whether the structure of the MHC II supertype components differs between

Bd resistant and susceptible species, nonmetric multidimensional scaling (NMDS), as a

multivariate statistical ordination technique (Pierini *et al*, 2018), was used to display the structure

of the MHC II supertypes in the two species, based on the relative abundance of each supertype

at the individual level. Permutational Multivariate Analysis of Variance (PERMANOVA) and

Analysis of Similarities (ANOSIM) were then used to test the statistical differences and

similarities between the structure of MHC II supertype components in the Bd-susceptible and

resistant species, respectively. PERMANOVA and ANOSIM were based on Bray-Curtis

dissimilarity with 9999 permutations using the vegan package (Oksanen, 2013).

To test whether beta dispersion differs between Bd resistant and susceptible species, a

beta dispersion test was performed using the 'betadisper' function in the vegan package, followed

by the permutation test with 9999 permutations using 'permutest' in the vegan package to

determine statistical significance.

Assessing the effect of MHC II β1 diversity on Bd resistance

The diversity data of the MHC II supertypes (richness, Shannon's diversity index,

Simpson's index, beta dispersion, relative abundance of each supertype) generated above for

each individual from Bd-resistant *B. gargarizans* and susceptible *L. caerulea* were further used

to evaluate whether these factors of the MHC II supertypes were related to resistance to Bd using

generalized linear mixed effects models (GLMM) with the function 'glmer' in the package of

lmer4 (Bates *et al*, 2014) . In addition, number of MHC II alleles at the individual level from a

previous study (Fu *et al.*, 2023b) was also evaluated for Bd resistance using GLMM. The

GLMMs were fitted with binary Bd susceptibility data from both species ($N = 61$) as dependent

response, MHC IIβ1 diversity as fixed variable, individual ID and species ID as random

variables, and fitted with binomial error distribution. Each diversity indices was modeled

separately as they were proved to have autocorrelation.

An individual resistant to Bd (LC15) was added ($N = 62$). The beta dispersion was

recalculated using the same method as above. The GLMMs were fitted with binary Bd

susceptibility data from both species ($N = 62$) as dependent response, MHC IIβ1 diversity as

fixed variable, individual ID and species ID as random variables, and fitted with binomial error

distribution.

Physicochemical analysis for MHC IIβ1 supertypes

To understand whether different functional supertypes vary in the five Z variables with

respect to Bd resistance in the Bd-resistant species (*B. gargarizans*) and susceptible species (*L.*

caerulea), we performed comparisons of the composite values Z among different supertypes

using Kruskal-Wallis rank sum tests. A large negative value of Z1 refers to a

lipophilic/hydrophobic amino acid residue, a large positive value of Z1 refers to a polar

hydrophilic amino acid residue (Sandberg *et al.*, 1998). As the LitcaeIIB35 allele was a unique

allele of a survivor of *L. caerulea,* it was removed from this analysis.

For comparing the physicochemical properties of particular amino acid residues,

Kruskal–Wallis rank sum tests were conducted using the kruskal.test in R.

342   Relative risk analysis

Binary data (presence or absence of certain MHC supertypes) were collected from *B.*

gargarizans ($N = 33$) and *L. caerulea* ($N = 29$) to evaluate the effect of MHC II supertypes on

the mortality risk of chytridiomycosis. The mortality of a Korean Bd resistant species, *B.*

gargarizans, was recorded as zero as suggested by a previous study (Fu & Waldman, 2019). In

the Bd-susceptible species *L. caerulea*, two individuals survived from chytridiomycosis (Fu &

Waldman, 2019), but here we used only MHC genotypes from one of them, which was recorded

as one. The reason to not add the data of the other individual was because it was genotyped from

a buccal swab, instead of liver as all others (Fu *et al.*, 2023b). The number of events (mortality)

and the total number of certain MHC supertypes were collected for each individual for relative

risk estimation.

For relative risk analysis in *L. caerulea*, binary data (presence or absence of certain MHC

alleles) were collected from *L. caerulea* to assess the effect of MHC II alleles on the mortality

risk of chytridiomycosis. A *L. caerulea* individual survived from Bd infection (Fu & Waldman,

2019) and was recorded as zero. Other individuals of *L. caerulea* who succumbed to the Bd

infection (Fu & Waldman, 2019) were recorded as one. The number of mortality events and the

total number of individual MHC alleles were collected for each individual to estimate relative

risk. Particular MHC alleles were selected for this analysis, with further details provided in the

Results section.

Relative risk estimation was performed using the 'metabin' function 'metabin' from the

meta package (Schwarzer, 2007) (version 7.0-0) in R 4.2.1. Fixed and random-effect models

were used to estimate the pooled relative risk (RR) of MHC II supertypes and alleles on the

mortality risk of chytridiomycosis. When the value of the relative risk (RR) is equal to 1, it

indicates that there is no effect. An RR greater than 1 suggests a positive correlation with risk,

and we consider it a significant positive correlation when the RR exceeds 2. On the contrary, an

RR less than 1 indicates a negative correlation with risk, and we consider it significantly negative

when the RR is below 0.5.

MHC allelic-specific expression analysis

To further understand the complexity of MHC, we analyzed the allelic-specific

transcriptional expression of MHC II. As the sequences were derived from mRNA, it was

assumed that the read counts reflect the relative gene expression of the MHC II alleles. Read

count data for MHC were obtained from the supplementary material of two previous studies (Fu

et al., 2023a; Fu *et al.*, 2023b). The read counts for the MHC II alleles were normalized using a

log transformation on the base of 2 (log_2Reads). The lengths of all MHC II sequences were not

considered for this gene expression analysis in this study, as these MHC II sequences for each

species only have 3 bp differences in length (Fu *et al.*, 2023a; Fu *et al.*, 2023b). Next, heat maps

using hierarchical cluster analysis (Murtagh & Legendre, 2014) were used to visualize the

relative gene expressions of MHC II alleles for each individual with replicates (Individual_1,

Individual_2, and/or Individual_3) in Bd resistant (*B. gargarizans*) and susceptible species (*L.*

caerulea).

Replicate differences between Individual_1 (Replicate_1) and Individual_2 (Replicate_2)

were compared for both species. The beta diversity and Shannon diversity index were plotted to

compare whether there were differences between replicates. PERMANOVA based on Bray-

Curtis dissimilarity with 9999 permutations using the vegan package was used to compare beta

diversity (Oksanen, 2013). The Wilcoxon rank sum test with continuity correction was

performed to compare the differences in Shannon diversity index between replicates.

Correlation analysis

To detect whether there was a correlation in the relative gene expression of MHC II

alleles at the individual level, a pairwise Pearson correlation analysis was performed using the

relative gene expression of MHC II for each individual with the 'cor' function in R. For chord-

gram plotting, only significant correlations ($p < 0.05$) were used.

All statistical tests were conducted in R v. 4.2.1 (The R Development Core Team, 2022).

Conflicts of interest

The authors declare no conflicts of interest.

398
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493
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Figure 1 Distribution and alpha diversity of MHC II supertypes in *B. gargarizans* and *L.*
***caerulea*.** (a) Distribution of the number of MHC II supertypes per individual in *B. gargarizans*
and *L. caerulea*. The majority of individuals in both species possess 2 to 3 supertypes. (b)
Comparison of the number of MHC II supertypes between *B. gargarizans* and *L. caerulea*. No
significant differences were detected (Wilcoxon rank sum test, $W = 510.5$, $p = 0.44$). (c)
Comparison of the Shannon diversity index of MHC II supertypes between *B. gargarizans* and *L.*
caerulea. No significant differences were detected ($W = 389.5$, $p = 0.30$). BG, *B. gargarizans*.
LC, *L. caerulea*.
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Figure 2 Structure and beta dispersion of MHC II supertypes in *B. gargarizans* and *L.*
caerulea. (a) Heatmap plotting relative abundance of MHC II supertypes in both species, ranking
from high to low abundance in *B. gargarizan,* with corresponding relative abundance of MHC II
supertypes in *L. caerulea.* Unique supertypes for *B. gargarizans* and *L. caerulea* were ST4 and
ST1, respectively. (b) Non-metric multidimensional scaling (NMDS) plot showing the distinct
structure of MHC II supertypes between *B. gargarizans* and *L. caerulea* (PERMANOVA, $F_{1,59} =$
193.84, $p = 0.0001$). (c) Comparison of beta dispersion for the two species. *L. caerulea* shows
more dispersed MHC II supertypes (Betadispersion, $F_{1,59} = 8.05$, $p = 0.004$). Distance to centroid,
distance of individual MHC II supertypes to the group centroid. p values correspond to
PERMDISP (disp) tests. BG, *B. gargarizans*. LC, *L. caerulea*.

Supertype	RR	95% CI	Weight (random)	Risk Ratio MH, Fixed + Random, 95% CI
ST1	16.85	[4.38; 64.86]	20.3%	
ST2	0.35	[0.22; 0.56]	21.6%	
ST3	7.28	[3.20; 16.55]	21.2%	
ST4	0.05	[0.00; 0.76]	16.7%	
ST5	0.06	[0.02; 0.23]	20.3%	
Total (fixed effect, 95% CI)	**0.95**	**[0.72; 1.26]**	.	
Total (random effect, 95% CI)	**0.73**	**[0.07; 7.54]**	**100.0%**	

Heterogeneity: $Tau^2 = 6.5028$; $Chi^2 = 77.39$, df = 4 (P < 0.01); $I^2 = 95\%$

Relative Risk Estimate of Mortality from Chytridiomycosis

520
521 Figure 3 Relative risk estimation of mortality from chytridiomycosis for the MHC supertypes in
522 Bd-resistant and susceptible species.
523

Figure 4 Relative risk estimation of mortality from chytridiomycosis for MHC alleles in Bd-susceptible species, *L. caerulea*.

530
531 **Figure 5 Gene expression patterns of MHC IIβ1 alleles in *B. gargarizans* and *L. caerulea*.**
532 Expression levels of MHC IIβ1 alleles in *B. gargarizans* and *L. caerulea*. Each individual
533 typically has one or two highly expressed alleles, with remaining alleles expressed at lower
534 levels.
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Figure 6 Correlation analysis of MHC II alleles in *B. gargarizans* and *L. caerulea*. (a)
Pearson correlation matrix of MHC II alleles in *B. gargarizans*, showing significant positive and
negative associations among alleles. (b) Pearson correlation matrix of MHC II alleles in *L.
caerulea*, showing significant positive and negative associations among alleles. $p < 0.05$.

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