scientific reports

OPEN

Check for updates

Transcriptomic analysis of the black tiger shrimp (*Penaeus monodon*) reveals insights into immune development in their early life stages

Pacharaporn Angthong, Tanaporn Uengwetwanit, Sopacha Arayamethakorn & Wanilada Rungrassamee^ \boxtimes

With the rapid growth in the global demand, the shrimp industry needs integrated approaches for sustainable production. A high-quality shrimp larva is one of the crucial key requirements to maximize shrimp production. Survival and growth rates during larval development are often criteria to evaluate larval quality, however many aspects of gene regulation during shrimp larval development have not yet been identified. To further our understanding of biological processes in their early life, transcriptomic analysis of larval developmental stages (nauplius, zoea, mysis, and postlarva) were determined in the black tiger shrimp, *Penaeus monodon* using next-generation RNA sequencing. Gene clustering and gene enrichment analyses revealed that most of the transcripts were mainly related to metabolic processes, cell and growth development, and immune system. Interestingly, Spätzle and Toll receptors were found in nauplius stage, providing evidence that Toll pathway was a baseline immune system established in early larval stages. Genes encoding pathogen pattern-recognition proteins (*LGBP*, *PL5-2* and *c-type lectin*), prophenoloxidase system (*PPAE2*, *PPAF2* and *serpin*), antimicrobial peptides (*crustin* and *antiviral protein*), blood clotting system (*hemolymph clottable protein*) and heat shock protein (*HSP70*) were expressed as they developed further, suggesting that these immune defense mechanisms were established in later larval stages.

The black tiger shrimp (Penaeus monodon) is one of the economically important shrimp species with high global market demand¹. However, sustainable production of the black tiger shrimp is still difficult due to various factors such as lack of selective breeding programs and effective disease control approaches^{2,3}. The major shrimp diseases are mostly caused by bacterial, viral and fungal pathogens^{4,5} such as white spot syndrome virus (WSSV)^{4,6}, the microsporidian Enterocytozoon hepatopenaei (EHP)7, and Vibrio parahaemolyticus (acute hepatopancreatic necrosis (AHPND) pathogen)^{8,9}, resulting in mass mortalities in shrimp. Importantly, early developmental stages of animals have been reported for a higher infection risk by pathogenic microorganisms than adult stage^{10,11}. In shrimp, AHPND causes severe mortality in early stages of shrimp including P. monodon¹²⁻¹⁴. Additionally, the infectious hypodermal and hematopoietic necrosis virus (IHHNV) causing runt deformity syndrome (RDS) and EHP can infect shrimp at the early life stage which can further transmit to later shrimp developmental stages, resulting in poor survival rates or growth performance in shrimp aquaculture^{15,16}. Consequently, a selection of high-quality shrimp larva based on their survival, stress resistance and growth performance has become one of the important aspects to lower risks of disease outbreak in grow-out pond systems. An understanding of biological processes including growth, immune and stress-related pathways underlining early larval stages in shrimp will provide an essential foundation for identifying developmentally important genes useful for future larval quality screening.

Being a crustacean, shrimp possesses an exoskeleton surface and undergoes metamorphosis through the following stages: egg, nauplius, zoea, mysis, postlarva, juvenile and adult^{17,18}. Their morphology, physiology and ecology are drastically transformed during the early life stages. To understand biological and physiological

National Center for Genetic Engineering and Biotechnology, National Science and Development Agency, 113 Thailand Science Park, Phahonyothin Road, Khlong Luang, Pathum Thani 12120, Thailand. [⊠]email: wanilada.run@ biotec.or.th

	affer	North Contraction	and the second	AN AMAINT
Stage	Nauplius (N)	Zoea (Z)	Mysis (M)	Postlarva (PL)
Substage	Nauplius V	Zoea III	Mysis III	15-day-old postlarva (PL15)
Sample collection	n _{pooled} ≈850, 3 rep	n _{pooled} ≈500, 3 rep	n _{pooled} ≈120, 3 rep	n _{pooled} ≈50, 3 rep

Figure 1. Schematic diagram of larval stages during early development of *P. monodon* collection. Shrimp samples were collected at stages of nauplius (N), zoea (Z), mysis (M) and 15-day-old postlarva (PL15) for transcriptome analysis.

processes at larval stages, differential gene expression analysis was carried out in various crustaceans such as Pacific white shrimp (P. vannamei)^{19,20}, water flea (Daphnia magna)²¹, barnacle (Amphibalanus amphitrite)²² and crab (Portunus pelagicus)23. Molting- and exoskeleton developmentally-related genes are mostly found associated in early developmental stages of Pacific white shrimp²⁴ and crab²³ during their metamorphosis. However, the functional genes involved in physiological changes during the early life stages of P. monodon have not yet been characterized. In addition to growth- and metabolic-related processes, the immune system in the early life of shrimp undergoes rapid changes and becomes more established as they develop further²⁵. Shrimp rely on their innate immune system for defense and protection against pathogens^{26,27}. The innate immune system consisting of cellular and humoral immune responses that interact to recognize and eliminate invading microorganisms²⁸. The cellular immune responses mostly occur in hemocytes, which recognize the component on a cell of microorganism via pattern recognition proteins (PRPs) and trigger a series of immune responses such as phagocytosis, nodulation and encapsulation^{27,29,30}. In contrast, the humoral immune responses are found in hemolymph such as prophenoloxidase (proPO) system, blood clotting system and antimicrobial peptides (AMPs)^{27,31,32}. Several studies have been conducted on shrimp immune responses in different experimental conditions. For instance, investigation on the transcriptional profile of immune-related genes under AHPND, V. harveyi or WSSV infection^{33–36}. However, most of these studies were identified in juvenile and adult shrimp stages, and there is still limited understanding on the development of innate immune system in early life stages.

Here, we aimed to understand gene expression profiles, particularly those related to immune and stress responses in the early developmental stages of *P. monodon*. The four larval stages in shrimp (nauplius, zoea, mysis and 15-day-old postlarva) were collected for transcriptomic analysis. Our findings on the biological processes and immune responses will contribute to understanding molecular mechanisms in shrimp at their early life stages, and further studies in areas of functional gene analysis and developmental biology. Ultimately, this work can be implemented with a strategic approach to design efficient shrimp feeds and practices to reduce the risk of diseases and increase farm productivity.

Results

De novo assembly and functional annotation. To determine gene expression profiles in P. monodon at early life stages, cDNA libraries were constructed for transcriptomic analysis in the four developmental stages (nauplius (N), zoea (Z), mysis (M) and 15-day-old postlarva (PL15)) (Fig. 1). After quality assessment and data filtering, an average of 403,006,878±4,628,572 clean paired-end reads were used for further analysis. A total of 34,016 transcripts were assembled with a total length of 82,226,667 bp, an average length of $2,417\pm1,452$ bases, a 50% total assembly length (N50) of 2,881 bp, and a GC content of 44.23% (Fig. 2a). Transcriptome assembly validation was done using Benchmarking Universal Single-Copy Ortholog (BUSCO)³⁷, which showed 90.98% of complete BUSCO indicating the high quality of assembly. All transcripts obtained were annotated by comparison with the reference protein database (RefSeq) and GO database, in which 22,019 (65%) transcripts were annotated (Fig. 2b), no hits and unknown functions were 19% and 16%, respectively. GO annotations were assigned to three principal GO databases classification. The main ontologies represented were (1) 43.34% biological processes, (2) 37.11% molecular functions and (3) 39.45% cellular functions (Fig. 2c). The top GO term under biological processes was from organic substance metabolic processes (27.52%), cellular metabolic processes (26.63%) and primary metabolic processes (26.13%). The top GO term under molecular function was protein binding (15.40%), ion binding (10.33%) and hydrolase activity (9.08%). The most prevalent GO term in cellular component was organelle (26.83%), intracellular organelle (26.43%) and cytoplasm (23.86%). The GO term distribution indicating that our RNA sequencing analysis yielded a good coverage of gene expression in shrimp at early life stages.

Clustering of gene expression profiles across shrimp growth stages and enrichment analysis. To determine the gene expression dynamics in the early life of *P. monodon*, gene expression clustering was performed to categorize expression patterns associated with the developmental stages (Fig. S1). Our gene enrichment analysis revealed transcripts with their function in various biological processes (i.e., signal transduction, cell cycle, RNA polymerase II transcription, post-translational protein modification), metabolic pathways (i.e., metabolisms, metabolism of proteins and metabolism of carbohydrates) and developmental biological pathways



Figure 2. Summary of assembly and annotation of *P. monodon* at early developmental stages, including nauplius, zoea, mysis and 15-day-old postlarva. (**a**) Summary of read depth of RNAseq data. (**b**) The pie chart shows percentage of transcripts matched sequences in NCBI RefSeq database. (**c**) Histogram gene ontology classification of the transcripts into three main categories including biological process, molecular function and cellular component.

and immune system in all stages. Gene expression patterns were grouped into 9 clusters. Cluster 1 to 4 showed highly expressed genes in each life stage, namely nauplius (1062 transcripts), zoea (71 transcripts), mysis (139 transcripts) and PL15 (1,146 transcripts). Cluster 5 (2554 transcripts) and 6 (423 transcripts) showed decreasing gene expression patterns with developmental stages, while cluster 7 (3780 transcripts) and 8 (1237 transcripts) showed increasing expression patterns from the nauplius stage to the later growth stage. Cluster 9 (9870 transcripts) was a group of transcripts with unchanged expression levels throughout early developmental stages.

Expression profiles of genes related to metabolic pathways and growth development in early life stages of *P. monodon.* Here, expression levels of transcript-related to metabolic processes, and cell and growth development were identified in larval stages (Fig. 3 and Table S1). A group of transcripts was highly expressed and specific to each larval shrimp stage (Fig. 3a). For instance, the transcripts involved in cell and growth development such as *Krüppel-like factor, zinc finger protein, histone* and *homeobox protein* were enriched in the nauplius stage (Cluster 1), while *alpha (1,6)-fucosyltransferase* was highly expressed in the zoea stage (Cluster 2). Moreover, the PL15 stage (Cluster 4) showed increased expression levels of *actin, ferritin* and *tubulin* transcripts. On the other hand, transcripts-related with metabolic pathways such as *galactoside alpha-(1,2)-fuco-*

Scientific Reports | (2021) 11:13881 |

Relative abundance а Low High Nauplius N.2 Zoea Z.2 Mysis M.2 PL15 Description N.1 M 3 PL15.1 PL15.2 PL15.3 N 3 73 M.1 /D repeat domain-containing protein 83-like Krueppel-like factor 16 Rudppener actor 10 Endothelia Izinc finger protein induced by tumor necrosis factor alpha-like E3 ubiquitin-protein ligase RNF34-like isoform X1 Histone H3.3A Cluster ' Cell and growth development Histone H2A V Histone H2A.V Actin-elated protein 6-like Homeobox protein H0-A3-like Chromosome-associated kinesin KIF4-like Peroxisomal sarcosine oxidase-like Galactoside alpha-(1,2-/tucosyltransferase 2-like Beta-1,3-galactosyltransferase 2-like Alpha-(1,6-/fucosyltransferase 2-like 405 chiosomal protein 15-6-like 605 ribosomal protein 15-6-like Cluster 2 Metabolic process Cell and growth development Cluster 3 cAMP-dependent protein kinase catalytic subunit 1 cAMP-dependent protein kinase catalytic subunit NADH dehydrogenase subunit 1 (mitochondrion) NADH dehydrogenase subunit 5 (mitochondrion) (6S ribosoma protein L3-like Carbohydrate sulfotransferase 11-like isoform X1 Metabolic process Aminoacytase siliotaristerase Trans Isolom X Aminoacytase-1-like isoform X2 Inter-alpha-trypsin inhibitor heavy chain H3-like Ubiquitin-conjugating enzyme E2 N 39S ribosomal protein L53, mitochondriaHike Metabolic process Cluster 4 Actin-like Actin-3, muscle-specific-like Tubulin beta chain Ferritin-like Cell and growth developmen

b

Relative abundance

	Nauplius				Zoea			Mysis		PL15	Description			
_	N.1	N.2	N.3	Z.1	Z.2	.2 Z.3 M.1 M.2 M.3		PL15.1 PL15.2 PL	5.3					
											60S ribosomal protein L12-like]		
											40S ribosomal protein S20-like isoform X1			
											40S ribosomal protein S2-like			
											40S ribosomal protein S11-like isoform X1			
											60S acidic ribosomal protein P2-like, partial			
											60S acidic ribosomal protein P1-like			
											60S ribosomal protein L15-like			
											39S ribosomal protein L35, mitochondriaHike	 Metabolic process 		
											28S ribosomal protein S29, mitochondria-like			
											28S ribosomal protein S25, mitochondrial			
											39S ribosomal protein L46, mitochondriaHike			
											39S ribosomal protein L37, mitochondriaHike			
											39S ribosomal protein L28, mitochondriaHike isoform X1			
											39S ribosomal protein L14, mitochondriaHike isoform X1			
ŝ											39S ribosomal protein L13, mitochondriaHike			
ster											Homeobox protein mab-5-like	7		
B											Cel cycle checkpoint protein RAD1-like			
ľ		_									Cell cycle checkpoint protein RAD17-like			
											Zinc finger protein 431-like			
											Zine finger protein 2-like			
											Curdin dependent kingso 1 liko			
											Cyclin-dependent kinase 2-like isoform X1			
											Cyclin-dependent kinase 7-like			
											Cyclin-dependent kinase 8-like isoform X1	 Cell and growth development 		
											Cyclin-dependent kinase 9-like			
											Cyclin-I-like			
											Ras-related protein Rab-10-like			
											Ankyrin repeat and SOCS box protein 13-like isoform X1			
											Ankyrin-1-like, partial			
											Mitotic spindle assembly checkpoint protein MAD2A-like			
											M-phase inducer phosphatase-like isoform X2			
											Mitotic checkpoint protein BUB3-like isoform X2]		
											G2/mitotic-specific cyclin-A-like	1		
											Cyclin-dependent kinase 7-like			
											Cel division cycle protein 20 homolog			
											G2/mitotic-specific cyclin-B-like			
Pa -											F-box/WD repeat-containing protein 7-like			
ust											RNA N6-adenosine-methyltransferase metti16-like	 Cell and growth development 		
o											E3 ubiquitin-protein ligase UHRF1-like			
											SUMO-activating enzyme subunit 2-like isoform X1			
1											GUNE-inducible zinc finger protein 1-like			
1											Actin-related protein 6-like			
											Kinesin-like protein Kin-23 isotorm X1	J		

Figure 3. Heatmap showing the enriched transcripts involved in metabolic processes and cell and growth development associated with early shrimp stages, which were divided to nauplius (N), zoea (Z), mysis (M) and 15-day-old postlarva (PL15). (a) Cluster 1–4 shows the pattern of highly gene expressed profiles in nauplius, zoea, mysis and 15-day-old postlarva. (b) Cluster 5–6 shows decreasing pattern of gene expression from nauplius to postlarval stage, (c) cluster 7–8 shows increasing pattern of gene expression from nauplius to postlarval stage, and (d) cluster 9 shows the pattern of unchanged in gene expression across all life stages.

	~													Re	ative al	bundance
	U															
														Low		High
		Naupliu	s		Zoea			Mysis			PL15		Description			
	N.1	N.2	N.3	Z.1	Z.2	Z.3	M.1	M.2	M.3	PL15.1	PL15.2	2 PL15.3				
Γ													Homeobox protein Hox-B2-like	1		
													Fibronectin type 3 and ankyrin repeat domains protein 1-like			
													Ankyrin repeat domain-containing protein 12-like			
													Ankyrin-3-like isoform X4			
Ľ	2												Ankyrin-3-like isoform X2			
	ISI												Ankyrin-3-like isoform X6	- Cella	nd growt	th development
0	5												Ankyrin-2-like			
													Ubiquitin-conjugating enzyme E2-17 kDa-like			
													F-box/WD repeat-containing protein 7-like			
													Ras-related protein Rab-7a			
													Keratin-associated protein 10-6-like			
													60S ribosomal protein L12-like	1		
													Carbohydrate sulfotransferase 11-like	- Metab	olic proc	cess
													MAP kinase-interacting serine/threonine-protein kinase 1-like			
													Serine/threonine-proteinphosphatase 6 regulatory ankyrin repeat subunit C-like	1		
1	2												Obscurin-like isoform X6			
	ste												Muscle M-line assembly protein unc-89-like			
ł	3												Myosin regulatory light chain 2-like	- Cell and growth develo		الممحم والمرام الم
													Troponin T, skeletal muscle-like			in development
													Tubulin beta chain-like isoform X4			
													Actin-like			
													Actin-2, muscle-specific-like			

	4													Relative abund	lance
(J														
														Low	High
		Nauplius	;		Zoea			Mysis			PL15		Description		
_	N.1	N.2	N.3	Z.1	Z.2	Z.3	M.1	M.2	M.3	PL15.1	PL15.2	PL15.3			
													28S ribosomal protein S26	7	
													39S ribosomal protein L4, mitochondrial-like		
													39S ribosomal protein L44, mitochondrial-like		
													39S ribosomal protein L51, mitochondrial-like		
													39S ribosomal protein L16, mitochondrial-like isoform X2		
													60S ribosomal protein L23 isoform X1		
													Ibus ribosomal protein L4-A-like		
						_							Beta 1,3-galactosyltransferase 5-like isolorm X1		
						_				-			Galactoso 1 phosphato uridulutransforaso liko		
													Galactosviralactosvirviosvirviosvirotain 3-bata-alucuronosvitransfarase P-like isoform X2		
													Aminopentidase NJike	- Metabolic process	
													Aminoacylase 1-like isoform X1	Metabolic process	
						_							2-amino-3-ketobutvrate coenzyme A ligase mitochondrial-like		
													Beta-1.3-glucosyltransferase-like		
													Selenocysteine-specific elongation factor-like		
													Elongation factor 1-beta		
													Dual specificity mitogen-activated protein kinase kinase 1-like		
													Protein kinase shaggy-like isoform X2		
													Mitogen-activated protein kinase kinase kinase 7-like		
σ													cAMP-dependent protein kinase type I regulatory subunit-like		
ter													cAMP-dependent protein kinase catalytic subunit 1		
Į.													cAMP-dependent protein kinase catalytic subunit 1 isoform X2]	
1	·							_					Ras-related protein Rab-11B-like isoform X2]	
													Ras-related protein Rab-5B-like		
						_						_	Ras-related protein Rab-23-like		
		_											Ras-related protein Rab-1A		
								_					Ras-related protein Rap 1-like		
													Cyclin K liko		
													Cyclin-dependent kingse 8-like isoform ¥1		
													Cyclin-D1-binding protein 1 homolog isoform X1		
													Zinc finger protein ZPR1-like		
													Zinc finger CCCH domain-containing protein 15 homolog isoform X2	- Cell and growth de	velopment
					_								Zinc finger protein OZF-like	oon and grown as	10100110
												_	F-box/LRR-repeat protein 4-like		
													F-box/LRR-repeat protein 15-like		
								_					F-box/WDrepeat-containing protein 2-like		
													F-box only protein 7-like		
													F-box only protein 21-like isoform X2		
													Ankyrin repeat and SAM domain-containing protein 6-like isoform X1		
													Ankyrin repeat protein		
													Ankyrin-1-like, partial		
													Hepatocyte growth factor-regulated tyrosine kinase substrate-like isoform X1	J	

Figure 3. (continued)

syltransferase in zoea, *cAMP-dependent protein kinase catalytic* and *NADH dehydrogenase* in mysis (Cluster 3), and *carbohydrate sulfotransferase* in PL15 stage. These results show that the dynamic changes of distinct classes of genes during the development reflecting different needs of gene functions for their metabolic processes and maintenance of their cellular functions.

To further explore changes in metabolisms and growth-related pathways under shrimp metamorphosis, the transcripts with continuously decreasing expression patterns (Cluster 5) were mostly members of a ribosomal protein family (Fig. 3b). The higher numbers of various components of ribosomal protein transcripts were found in nauplii, suggesting different physiological and metabolic activities in each shrimp's life stage. Moreover, transcripts encoding *cyclins* and *zinc finger proteins* which play important roles in cell cycle and growth development were decreasing as shrimp developed from nauplius to PL15 stage (Cluster 5). The transcript involved in cell and growth development such as *cell division cycle protein* and *kinesin-like protein* showed a decreasing trend once shrimp developed into the zoea stage (Cluster 6) (Fig. 3b). On the other hand, cell growth and

development-related transcripts such as *ankyrin, muscle M-line assembly protein, obscurin, tubulin, keratin* and *actin* were increasing (Cluster 7 and 8) (Fig. 3c), indicating that they were essential in shrimp as they further developed.

In addition, there were a group of unchanged transcripts levels across the four developmental stages (cluster 9) (Fig. 3d). These were those related to metabolic processes (*ribosomal protein* family, *elongation factors, mitogenactivated protein kinase*) and cell and growth development (*ras-related proteins, cyclins, zinc finger proteins, F-box proteins* and *ankyrin*) were constitutively expressed during the growth development, indicating that these genes were required for maintenance of basic cellular functions and developmental processes in shrimp.

Expression profiles of genes related to immune responsive genes in early life stages of P. monodon. To understand immune development in shrimp, the expression dynamics of immune-related transcripts during the developmental stages of shrimp were explored (Fig. 4). Here, we identified immunerelated genes including Toll pathway, immune deficiency (IMD) pathway prophenoloxidase system (proPO system), pattern recognition proteins (PRPs), blood clotting system, antimicrobial peptides (AMPs), heat shock proteins (HSPs), proteinases and proteinase inhibitors and oxidative stress in shrimp immune network in each stage. For instance, the immune-related genes involved in the Toll pathway (Spätzle and ubiquitin-conjugating enzyme) were significantly expressed in the nauplius stage (cluster 1), suggesting a baseline defense mechanism to protect themselves when they first hatched out from eggs. Moreover, the crustin-like antimicrobial peptide was found in higher abundance in mysis stage (cluster 3), while alpha 2 macroglobulin and beta-1,3-glucan binding protein (BGBP) showed higher expression levels in PL15 shrimp (cluster 4). Components of Toll pathway (protein pellino, Toll-like receptor 6 (TLR6) and ubiquitin-conjugating enzymes), proteinases and proteinase inhibitors (caspase4), blood clotting system (dihydropteridine reductase isoform X1) and heat shock protein showed higher transcript levels in the nauplius stage and decreasing in later stages (cluster 5). Conversely, AMPs (antiviral protein, fortilin binding protein, crustin Pm1, crustin Pm4 and anti-lipopolysaccharide factor (ALF)), PRPs (penlectin5-2 (PL5-2), tumor necrosis factor ligand, ficolins, macrophage mannose receptor and c-type lectins), IMD pathway (Relish), proPO system (prophenoloxidase-activating factor 1 (PPAF1), PPAF2 and serpin3), blood clotting system (hemolymph clottable protein), heat shock proteins (HSP70 and HSP90) and JAK-STAT pathway (NF-kappa-B inhibitor cactus) were expressed in an increasing manner from nauplius to postlarval stage (cluster 7 and 8). The immune-related transcripts with unchanged expression levels (cluster 9) throughout the four early life stages were those related to oxidative stress response (superoxide dismutase (Mn), mitochondrial-like isoform X1 (MnSOD)), PRPs (BGBP, lipopolysaccharide-induced tumor necrosis factor-alpha factor homolog (LITAF) and ficolin-2-like isoform X1) and Toll pathway (Toll-like receptor 1 (TLR1), Toll-like receptor 3 (TLR3 and tumor necrosis factor receptor-associated factor 6 (TRAF6)), suggesting for their important roles in maintaining homeostasis during their growth development. Moreover, there were additional 32 non-clustered transcripts with their roles related to AMPs, proteinases and proteinase inhibitors, PRPs, blood clotting system, proPO system, HSPs, Toll pathway, JAK-STAT pathway, oxidative stress and apoptotic tumor-related protein were found as well. Our results showed evidence of shrimp immune-related genes expressed in early life stages, in which more components of the shrimp immune system were expressed in the later stages under non-pathogenic rearing conditions.

To validate our transcriptomic profiles, 11 immune-related genes (*crustin Pm4*, *antiviral protein*, PL5-2, *c-type lectin4*, *serpin3*, *PPAF1*, *PPAF2*, *hemolymph clottable protein*, *HSP70*, *MnSOD* and *TLR1*) were selected for gene expression analysis using real-time PCR (Fig. 5). The expression patterns of our target immune-related genes were consistent to gene expression profiles obtained from the next-generation sequencing (Fig. 4), except *HSP70*. Although the expression level of *HSP70* was not statistically significantly different among shrimp growth stages, *HSP70* transcript was expressed in higher abundance in zoea, mysis and PL15 than the nauplius stage.

Evidence of immune development in their early life stages. After hatching out from eggs, shrimp go through series of changes such as nutrient requirement, energy consumption and feeding behavior, therefore shrimp become more exposed to rearing environments as they develop. Shrimp directly interact and exchange with a variety of microorganisms in their rearing environment, and they rely mainly on innate immune responses as their defense mechanisms during the development. Here, our transcriptomic analysis revealed components of innate immune-related pathways associated with each life stage (Fig. 6). The schematic model showed constitutive expression of immune-related genes identified in larval stages such as *Spätzle*, *TLR1*, *TLR6*, *TRAF6* and *MnSOD*. Toll-Spätzle complex acts as pathogen recognition and triggers Toll signaling pathway for series of immune responses to eliminate the pathogens³⁸. Our findings suggest that Toll pathway was a baseline immune system established in early larval stages. On the other hand, genes encoding PRPs (*PL5-2*, *c-type lectins* and *ficolins*), proPO system (*PPAF1*, *PPAF2* and *serpin3*), IMD pathway (*Relish*) AMPs (*crustin Pm1*, *crustin Pm4*, *ALF* and *antiviral protein*), blood clotting system (*hemolymph clottable protein*) and HSPs (*HSP70* and *HSP90*) were expressed in later growth stages.

Discussion

Transcriptomic analysis has been widely applied in aquaculture to understand underlying molecular mechanisms related to various biological processes^{24,39,40}. In penaeid shrimp, gene expression profiles related to growth, metabolic activities and immune responses have mostly been identified in juvenile and adult stages^{33,35,41}, while little is still known in shrimp at early life stages including nauplius, zoea, mysis and postlarva. Particularly, their morphological and physiological were dramatically changed from nauplii into postlarva in their early life, and they can be more susceptible to diseases due to their underdeveloped immune systems¹⁷. Here, we determined gene expression profiles of *P. monodon* in the early life stages to further our understanding of the biological processes and mechanisms related to their early development, providing insights into shrimp immune development and growth-related pathways.

In this study, the enriched pathways indicating life-stage specific expression patterns in the early developmental stages of P. monodon were mainly related to metabolic processes, immune system, and cell and growth development. In particular, several transcript-related to ontogenetic developmental processes were significantly expressed in each life stage such as homeobox proteins, cyclin-dependent kinase, zinc finger proteins, and histonerelated proteins. Among those, homeobox proteins are essential for regulating the development of body plan of various species including humans⁴², flies^{43,44} and worms⁴⁵. Thus, the higher transcript levels of homeobox proteins in early life stages suggest their relevant roles in morphological transformation of body structures such as appendage, organ and segment of shrimp. Additionally, cyclins, which play an important role in cell cycling by interacting with cyclin-dependent kinases showed a decreasing trend as shrimp developed from nauplii to PL15. On the other hand, we found a group of transcripts related to the molting process and exoskeleton formation was increasing with developmental stages including ferritin, tubulin and keratin^{23,46,47}. This was congruent with the previous report in Pacific white shrimp (P. vannamei)⁴⁶. Being a crustacean with their body surface covered by exoskeleton shell^{48,49}, shrimp periodically undergo a molting process to grow and this process requires a newly synthesized exoskeleton layer^{50,51}, hence, the transcript-related to this process were crucial and associated to shrimp developmental process. Moreover, ankyrin, obscurin and actin, which play essential roles in muscle development were highly expressed in PL15. In this process, ankyrin will bind to obscurin in the sarcoplasmic reticulum and lead to muscle growth development^{52,53}. Obscurin-knockout mice show a decreasing level of ankyrin expression, contributing to the loss of muscle mass⁵⁴. Actins play roles in microfilament formation in muscles and serve as the major component of muscle during the molting cycle in crustaceans^{24,55}. Our results showed that these genes were important for growth development in shrimp.

Ribosomal proteins are composed of two asymmetric subunits forming into a complex and play an important part in protein translation, which are essential for cell growth and development^{56,57}. Ribosomal proteins can be remarkably different between organisms, developmental stages and growth conditions⁵⁷. Here, we identified various forms of the ribosomal proteins associated with shrimp developmental stages, in which some forms were found in higher abundance in nauplii, suggesting for the specific function required for early life. Previous studies have reported on increased expression levels of various ribosomal proteins during the embryonic development of zebrafish (*Danio rerio*)^{58,59} and bighead carp (*Hypophthalmichthys nobilis*)⁶⁰, and this could be explained by higher rates of cell division and cell differentiation taking place during the growth development. On the other hand, *elongation factors* and *mitogen-activated protein kinase*, known housekeeping genes in shrimp showed constitutively expressed during early life stages. Housekeeping genes are required for the basic functions of the cell, and they are expressed in all cells of an organism⁶¹. Thus, shrimp larva needed a group of these genes for maintenance of their cellular function across developmental stages.

In addition to growth and developmental processes, there were some immune-related transcripts associated with the shrimp developmental stage. Several major shrimp immune responses such as pattern-recognition proteins (PRPs), prophenoloxidase system (proPO system), immune deficiency (IMD) pathway and antimicrobial peptides (AMPs) showed increasing expression patterns during developmental stages. In crustaceans, PRPs play important role in detecting pathogen-associated molecular patterns (PAMPs) presented on the surface of microorganisms and activate downstream immune responses such as AMPs^{27,62}, proPO system^{63,64}, melanization and blood coagulation in arthropods^{65,66}. The proPO system is one of the main shrimp innate immune response and is initiated by the binding of PRPs to microbial membrane components such as peptidoglycans (PGs) and lipopolysaccharide (LPS)⁶³. The complex leads to the activation of serine proteinase cascades to cleave proPO, generating active phenoloxidase (PO) to activate melanization process^{63,64,67}. Here, transcripts of *PPAF1*, *PPAF2* and serpin3, members of proPO system were increased with larval developmental stages. Consistently, the expression level of proPO has been reported to gradually increase during the development of bivalve molluscs (Crassostrea gigas, Argopecten ventricosus and Nodipecten subnodosus)68 and black tiger shrimp (P. monodon)25. In P. monodon, the transcript level of proPO was lower in nauplii and was gradually increased as shrimp developed further into zoea and postlarval stages²⁵. Similarly, the expression level of *Relish* was also increasing with the larval developmental stage. Relish is a key transcription factor in IMD pathway that regulates the expression of AMPs in Drosophila⁶⁹ and crustaceans such as shrimp^{31,70}. In penaeid shrimp, AMPs are part of important host immune systems, in which they play antimicrobial activity against Gram-positive and Gram-negative bacteria, fungi, yeasts and viruses^{31,71}. The transcript levels of crustin Pm1, crustin Pm4, anti-lipopolysaccharide factor (ALF) and antiviral protein, members of AMP families, were increased with shrimp developmental stage, and our observations were consistent with the previous studies in P. monodon and P. vannamei larval and juveniles^{25,71,72}. In P. monodon, crustin Pm1 has been shown to inhibit only the growth of Gram-positive bacteria (Staphylococcus aureus and Streptococcus iniae)⁷³, while crustin Pm4 exhibits antimicrobial activity against both Gram-positive bacteria (Bacillus megaterium) and Gram-negative bacteria (Escherichia coli and V. harveyi)⁷⁴. Additionally, the transcript level of crustin Pm4 in P. monodon is inducible after WSSV infection suggesting that crustin Pm4 might play a protective role against viral pathogen⁷⁴. Moreover, the previous study has reported that the antiviral protein of P. monodon showed strong antiviral activity against WSSV⁷⁵. Among AMP families, ALF has been reported to exhibit broad-spectrum activity against various microorganisms including bacteria, fungi and viruses⁷⁶. In ALF-knockout P. vannamei, the exposure to pathogenic bacteria (V. penaeicida) or fungi, (Fusarium oxysporum) resulted in high mortality, providing evidence that ALF can protect shrimp against different microbial infection⁷⁷. It is worth noting that diverse types of AMPs were expressed in association with early larval stages. Having different AMPs with broad-spectrum antimicrobial activities as key effectors might help to provide immune protection during larval development.

Toll pathway plays a crucial role in response to Gram-positive bacteria, fungi and viruses. Toll receptors recognize a presence of a pathogen, leading to activation of signaling proteins including Myeloid differentiation

Relative abundance

Hiah

Low

Cluste		Nauplius	5	71	Zoea	7.0	N 4	Mysis	Ц 2	DI 46 4	PL15	DI 45 2	Description	Immune pathway
1	N.I	N.2	N.3	2.1	2.2	2.3	M.1	141.2	M.3	PL15.1	PL13.2	PL15.3	Spätzle	Toll pathway
		_											Ubiquitin-conjugating enzyme E2 C-like Serpin B12-like	Proteinases and proteinase inhibitors
3													Interferon regulatory factor 2-binding protein-like isoform X1 Crustin-like antimicrobial peptide	Pattern recognition proteins Anti-microbial peptides
4													Alpha2 macroglobulin-like	Proteinases and proteinase inhibitors
											_	_	Alpha-2-macroglobulin receptor-associated protein-like	Proteinases and proteinase inhibitors
													Caspase 4	Plead platting success
													Heat shock 70 kDa protein 14-like	Heat shock protein
2													Protein Pellino-like	
													Ubiquitin-conjugating enzyme E2 G1-like Ubiquitin-conjugating enzyme E2 Q1-like isoform X3	Toll pathway
												_	Toll-like receptor 6	-
													† Antiviral protein Fortilin binding protein 1	Anti-microbial peptides
													Trypsin-1-like	Proteinases and proteinase inhibitors
													Trypsin-like isoform X1 † Penlectin 5-2	1
													Tumor necrosis factor superfamily (TNFSF)	Pattern recognition proteins
											_		Ficolin-1-like	r adem recognition proteins
7													† Hemolymph clottable protein-like	
													Hemocyte protein-glutamine gamma-glutamyltransferase-like	Blood clotting system
											_		† Prophenoloxidase activating factor 1-like † Prophenoloxidase-activating factor 2-like	Prophenoloxidase system
													† Serpin 3]
													† Heat shock 70 kDa protein cognate 4-like Heat shock protein HSP 90-alpha-like	Heat shock protein
													Relish) Imd pathway
													NF-kappa-B inhibitor cactus-like	JAK-STAT pathway
													Crustin Pm1 antimicrobial peptide	Anti-microbial peptides
											_		Anti-lipopolysaccharide factor-like	Proteinases and proteinase inhibitors
8													Macrophagemannose receptor 1-like]
													+ C-type lectin 4	Pattern recognition proteins
													Phenoloxidase-activating factor 1-like	Prophenoloxidase system
													Mitogen-activated protein kinase 14-like isoform X1 ± Superoxide dismutase (Mn) mitochondrial-like isoform X1	JAK-STAT pathway
													Lipopolysaccharide-induced tumor necrosis factor-alpha factor homolog	
9													Beta-1,3-glucan-binding protein	Pattern recognition proteins
													Ubiquitin-conjugating enzyme E2-17 kDa	
													† Toll-like receptor 1	Toll pathway
													Tumor necrosis factor receptor-associated factor 6-like	
													Lysozyme-like	Anti-microbial peptides
													Anti-lipopolysaccharide factor Effector caspase]
													Caspase-1-like isoform X1	
													Clip domain-containing serine protease 2-like Clip domain-containing serine protease 14D-like	Proteinases and proteinase inhibitors
													Leukocyte elastase inhibitor-like	
													Techylectin-5A-like isoform X1	
													C-type lectin 2	
		_	_			_							C-type lectin 3	Pattern recognition proteins
													Janus kinase	
g													Protein inhibitor of activated STAT	
stere													Annexin B9-like Proclotting enzyme	Blood clotting system
		_											Proclotting enzyme-like isoform X2	
P Z		-										_	Prophenoloxidase activating factor	Prophenoloxidase system
													Heat shock protein cognate 5	
													Heat shock protein 22-like isoform X1	
													Heat shock protein 40	Heat shock protein
													Heat shock protein 60A-like	
													Ubiquitin-conjugating enzyme E2 L3	1
													Ubiquitin-conjugating enzyme E2-17 kDa-like	Toll pathway
													ubiquitin-conjugating enzyme E2 G2 Mitogen-activated protein kinase kinase 4	J 1
													Cactin-like isoform X1	JAK-STAT pathway
													Selenium-dependent glutathione peroxidase Defender against apoptotic death	Oxidative stress Apoptotic tumor-related protein

Figure 4. Heatmap showing the enriched transcripts involved in immune responses in early life stages of black tiger shrimp, including nauplius (N), zoea (Z), mysis (M) and 15-day-old postlarva (PL15). The dagger (†) indicates genes that were further validated by quantitative real-time PCR.

.....

factor 88 (MyD88), Tube, Pelle and tumor necrosis factor receptor-associated factor 6 (TRAF6), relaying the signal to the Dorsal-Cactus complex. Cactus is phosphorylated, dislocated from Dorsal, and degraded, while NF- κ B transcription factor Dorsal translocated into the nucleus to activate the expression of AMPs^{28,78}. In *P* monodon, Toll-like receptors (TLRs) have been reported as part of shrimp defense mechanisms against pathogen invasion^{79,80}. Expression of *TLR* transcripts of *P. monodon* larva and adult are inducible upon exposure to *V. harveyt*^{80,81}, suggesting their involvement in activating shrimp immune responses against pathogenic bacteria.



Figure 5. Validation of RNAseq data by quantitative real-time PCR (qPCR) of immune-related transcripts including *crustin Pm4*, *antiviral protein*, *penlectin 5–2* (*PL5-2*), *c-type lectin 4*, *serpin 3*, *prophenoloxidase-activating factor 1* (*PPAF1*), *prophenoloxidase-activating factor 2* (*PPAF2*), *hemolymph clottable protein*, *heat shock protein 70* (*HSP70*), *superoxide dismutase* (*Mn*) (*MnSOD*) and *toll-like receptor* in nauplius (N), zoea (Z), mysis (M) and 15-day-old postlarva (PL15). The error bars indicate standard error of the mean from biological triplicates. Different letters show significant different by ANOVA (*p value* < 0.05).

Interestingly, TLRs have been reported to be constitutively expressed in shrimp tissues of *P. vannamei*⁸² and *Fenneropenaeus chinensis*⁸³ under the non-pathogenic condition as well, indicating that they also serve as part of primary innate immune responses in shrimp. Here, we identified three isoforms of TLRs, *TLR1*, *TLR3* and *TLR6* in *P. monodon* larva. Among the three identified toll isoforms, transcript levels of *TLR6* showed a decreasing trend, while *TLR1* and *TLR3* were constitutively expressed with shrimp larval development. Different toll-like receptor isoforms such as *TLR1* and *TLR3* have been identified *P. vannamei*^{82,84}, and they are inducible upon a pathogen exposure in *P. vannamei*^{82,84}. However, the function and importance of different TLR isoforms of *P. monodon* have not been addressed and need to be further characterized. In addition to *TLRs, TRAF6*, one of the core components of Toll pathway also showed constitutive expression in early developmental stages. Previous studies have reported an increased expression level of *TRAF6* in *P. monodon* post-larvae and adult after *V. harveyi* exposure^{80,81}. Our results show that several components of Toll signaling pathway were established since the nauplius stage, suggesting that Toll pathway was primary immune response for host defense mechanisms against invading pathogens in their early larval stages.

In conclusion, we provide the first report on gene expression dynamics in the early development of *P. monodon.* The pathway enrichment and gene clustering analyses showed expression patterns of the transcript related to various biological processes such as metabolism, cell and growth development and immune response systems, reflecting different activities taking place at each life stage. In particular, we provide evidence of innate immune presence in early larval development such as Toll signaling pathway, proPO system, AMPs, and PRPs. Understanding developmental dynamics at molecular levels including relevant biological processes and immune response system of *P. monodon* at early life will lead to the future development of efficient feeds and



Figure 6. Schematic model of shrimp immune system in early life stages of *P. monodon*, including nauplius, zoea, mysis and 15-day-old postlarva. Pattern recognition proteins (PRPs) (beta 1,3-glucan binding protein (BGBP), lipopolysaccharide and beta 1,3-glucan binding protein (LGBP) and lectin), prophenoloxidase system (proPO system) (prophenoloxidase-activating factor 1 (PPAF1), prophenoloxidase-activating factor 2 (PPAF2) and serpin), antimicrobial peptides (AMPs) (crustin, anti-lipopolysaccharide factor (ALF) and antiviral protein), blood clotting system, Toll pathway (toll receptor, Spätzle and tumor necrosis factor receptor-associated factor 6 (TRAF6)), IMD pathway (Relish) and stress responses (heat shock proteins (HSPs) and manganese superoxide dismutase (MnSOD) were involved in early life stages of shrimp. Blue box represents transcript expression found associated with the four larval stages, while orange box represents an immune gene with increasing expression pattern during the development. The compotents in shrimp immune pathways were adapted from previous studies³¹.

1 · · · · ·

immunostimulatory additives suitable for each developmental stage. The fundamental knowledge of biological processes can be further applied for larval quality screening.

Methods

Shrimp samples collection. The black tiger shrimp (*P. monodon*) were reared at Shrimp Genetic Improvement Center (SGIC), National Science and Technology Development Agency (NSTDA) in Surat Thani province, Thailand. Shrimp were unfed at nauplius stage. At zoea stage, larvae were fed with microalgae *Thalassiosira* sp. and *Chaetoceros* sp. The heat-treated *Artemia* and microalgae were fed to mysis shrimp. After they reached postlarval stage, live *Artemia* and commercial feed diets were given to shrimp. Shrimp larval stages were identified based on morphological classification of *P. monodon* larva⁸⁵ under stereo microscope. Each larval stage was collected at the same sampling period and in triplicates from three independent shrimp families at our breeding facility (Fig. 1). Briefly, nauplii ($n_{pooled} \approx 850$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_{pooled} \approx 50$) were collected when they reached their substage III. Postlarva PL15 ($n_$

RNA extraction and library preparation. Total RNA from each shrimp sample was extracted by using TRI Reagent (Molecular Research Center, USA) according to manufacturer's protocol. Each pooled shrimp sample was immediately grounded in a mortar containing liquid nitrogen. An equal amount of 50 mg from each ground tissue sample was homogenized in TRI Reagent and subjected to chloroform extraction. DNA contamination in RNA samples were removed by treating RNA with RQ1 RNase-free DNase (Promega, USA). RNA purity and concentration were analyzed by NanoDrop (ND-8000) spectrophotometer, and the quality of RNA was examined under 1% agarose gel electrophoresis. DNA-free RNA samples were subjected to Illumina sequencing service at Macrogen Inc. (Korea). RNA sequencing libraries were prepared using the TruSeq

Stranded mRNA LT Sample Prep kit (Illumina, USA) following manufacturer's protocol. Each library was subjected to 150 bp paired-end sequencing using NovaSeq 6000 (Illumina, USA).

Transcriptome data analysis. Ouality of the raw RNA-Seq data were processed through FASTQC⁸⁶ and TrimGalore (https://github.com/FelixKrueger/TrimGalore) to remove adaptor-sequences and read ends of low base quality (Phread score < 20). The reads with at least 100 bp in length were used in downstream data analysis. Sequencing reads were assembled by using Trinity with default parameters⁸⁷. The longest isoform for each gene was selected. The assembled contigs were merged with the published full-length transcript sequences⁸⁸ according to a similarity criterion of 98% and 80% minimal alignment coverage for the shorter sequence using CD-HIT⁸⁹. The non-redundant reference sequences were used in downstream differential gene expression analysis and functional annotation. The transcripts were evaluated by using BUSCO with default settings and BUSCO v3.0.2 core dataset for single-copy conserved eukaryotic genes³⁷. Functional annotations were carried out by using BLASTX against the NCBI protein reference database (Refseq)⁹⁰ which including the proteins from a reference P. monodon genome⁹¹, and GO (Gene Ontology)⁹² via Blast2GO program⁹³. The reads were mapped on the non-redundant reference using Bowtie294. Genes with count per million (CPM) values less than 1 in all groups were excluded from downstream analysis⁹⁵. Normalization and differential expression were carried out using DESeq296 in R environment97. A pairwise comparison was performed. Differentially expressed genes were those with their absolute value of log, fold change ≥ 1 , with p value < 0.05. Non-differentially expressed genes were clustered as one group whereas significant differentially expressed genes were clustered based on their altered expressed transcripts using unsupervised hierarchical clustering and quality threshold clustering (QTC) method. QTC was conducted to determine gene expression patterns using MeV with following criteria (1) diameter of 0.5 and (2) a minimum of 50 cluster members⁹⁸. To understand biological functions of each gene cluster, gene set enrichment analysis was performed using reactome pathway analysis⁹⁹.

Validation of gene expression by quantitative real-time PCR (qPCR) analysis. qPCR was performed to validate gene expression patterns obtained from RNA-seq. Complementary DNA was synthesized from each RNA sample using ImPromII Reverse Transcription System kit (Promega, USA) according to the manufacturer's protocol. Purity and concentration of cDNA samples were determined by using NanoDrop (ND-8000) spectrophotometer. Eleven immune-related genes were selected for qPCR validation. Specific primer of each gene was designed using Primer Premier Program (Table S2). Each qPCR reaction contained 100 ng of cDNA template, 0.2 μ M of each primer and 1X SYBR Green SsoAdvanced (BioRad). The cycle parameters were as follows; initial denaturation at 95 °C for 30 s, followed by 40 cycles of 95 °C for 15 s, 56 °C for 30 s, 72 °C for 30 s and extension at 72 °C for 1 min. The specificity of each PCR product was confirmed by melting curve analysis when temperature was reducing from 65 to 95 °C at 0.5 °C increment with a continuous fluorescent reading. The expression profile of each gene was calculated using $2^{-\Delta \Delta CT}$ method¹⁰⁰. Relative gene expression analysis was normalized to that the housekeeping gene (*Elongation factor 1α*, *EF1α*) as an internal control. All qPCRs were performed in three biological replicates (n=3). The relative expression level of each gene from different shrimp growth stages were statistically tested using one-way analysis of variance (ANOVA) followed by Duncan's new multiple range test in IBM SPSS statistics 23.0.

Data availability

The transcriptome dataset was deposited to BioProject at NCBI under accession Number PRJNA688806.

Received: 5 April 2021; Accepted: 23 June 2021 Published online: 06 July 2021

References

- 1. FAO. Food and Agriculture Organization of the United Nations Statistics. Fisheries and Aquaculture Software. FishStat Plus—Universal Software for Fishery Statistical Time Series (Fisheries and Aquaculture Department, 2016).
 - Marsden, G., Richardson, N., Mather, P. & Knibb, W. Reproductive behavioural differences between wild-caught and pond-reared *Penaeus monodon* prawn broodstock. *Aquaculture* **402–403**, 141–145. https://doi.org/10.1016/j.aquaculture.2013.03.019 (2013).
- 3. Stentiford, G. D. *et al.* Disease will limit future food supply from the global crustacean fishery and aquaculture sectors. *J. Invertebr. Pathol.* **110**, 141–157. https://doi.org/10.1016/j.jip.2012.03.013 (2012).
- Flegel, T. A future vision for disease control in shrimp aquaculture. J. World Aquac. Soc. https://doi.org/10.1111/jwas.12589 (2019).
- 5. Escobedo-Bonilla, C. Emerging infectious diseases affecting farmed shrimp in Mexico. Austin J. Biotechnol. Bioeng. 3, 1-3 (2016).
- Lightner, D. V. Virus diseases of farmed shrimp in the Western Hemisphere (the Americas): A review. J. Invertebr. Pathol. 106, 110–130. https://doi.org/10.1016/j.jip.2010.09.012 (2011).
- Chaijarasphong, T. et al. The shrimp microsporidian Enterocytozoon hepatopenaei (EHP): Biology, pathology, diagnostics and control. J. Invertebr. Pathol. https://doi.org/10.1016/j.jip.2020.107458 (2020).
- Tran, L. et al. Determination of the infectious nature of the agent of acute hepatopancreatic necrosis syndrome affecting penaeid shrimp. Dis. Aquat. Organ. 105, 45–55. https://doi.org/10.3354/dao02621 (2013).
- Lai, H.-C. et al. Pathogenesis of acute hepatopancreatic necrosis disease (AHPND) in shrimp. Fish. Shellfish. Immunol. 47, 1006-1014. https://doi.org/10.1016/j.fsi.2015.11.008 (2015).
- Lightner, D. V., Redman, R. M. & Bell, T. A. Observations on the geographic distribution, pathogenesis and morphology of the baculovirus from *Penaeus monodon* Fabricius. *Aquaculture* 32, 209–233. https://doi.org/10.1016/0044-8486(83)90220-X (1983).
- 11. Evans, H. & Shapiro, M. in Manual of Techniques in Insect Pathology (ed Lacey, L. A.) 17-53 (Academic Press, 1997).
- Feng, B. *et al.* Diversity analysis of acute hepatopancreatic necrosis disease-positive Vibrio parahaemolyticus strains. Aquac. Fish. 2, 278–285. https://doi.org/10.1016/j.aaf.2017.10.001 (2017).
- de la Peña, L. D. et al. Acute hepatopancreatic necrosis disease (AHPND) outbreaks in Penaeus vannamei and P. monodon cultured in the Philippines. Dis. Aquat. Organ. 116, 251–254. https://doi.org/10.3354/dao02919 (2015).

- Deris, Z. M. et al. Immune and bacterial toxin genes expression in different giant tiger prawn, Penaeus monodon post-larvae stages following AHPND-causing strain of vibrio parahaemolyticus challenge. Aquac. Rep. 16, 100248. https://doi.org/10.1016/j. aqrep.2019.100248 (2020).
- Escobedo-Bonilla, C. M. & Ibarra Rangel, J. L. Susceptibility to an inoculum of infectious hypodermal and haematopoietic necrosis virus (IHHNV) in three batches of whiteleg shrimp *Litopenaeus vannamei* (Boone, 1931). *ZooKeys* 457, 355–365 (2014).
- Vu-Khac, H., Thi Thanh, T. N., Thi Thu, G. N., Le, Č. H. & Nguyen, V. D. Vertical transmission and early diagnosis of the microsporidian *Enterocytozoon hepatonaei* in whiteleg shrimp *Penaeus vannamei. J. Pure Appl. Microbiol.* 12, 1125 (2018).
- Ronquillo, J. D., Saisho, T. & McKinley, R. S. Early developmental stages of the green tiger prawn, *Penaeus semisulcatus* de Haan (Crustacea, Decapoda, Penaeidae). *Hydrobiologia* 560, 175–196. https://doi.org/10.1007/s10750-005-1448-y (2006).
- Hassan, H.-U. The larval development of *Penaeus semisulcatus* de Haan, 1850 (Decapoda, Penaeidae) reared in the laboratory. *J. Plankton Res.* 4, 1–17. https://doi.org/10.1093/plankt/4.1.1 (1982).
- 19. Wei, J. *et al.* Comparative transcriptomic characterization of the early development in Pacific white shrimp *Litopenaeus vannamei*. *PLoS ONE* **9**, e106201. https://doi.org/10.1371/journal.pone.0106201 (2014).
- Wei, J., Zhang, X., Yu, Y., Li, F. & Xiang, J. RNA-Seq reveals the dynamic and diverse features of digestive enzymes during early development of Pacific white shrimp *Litopenaeus vannamei*. *Comp. Biochem. Physiol. Part D Genomics Proteomics* 11, 37–44. https://doi.org/10.1016/j.cbd.2014.07.001 (2014).
- Campos, B., Fletcher, D., Piña, B., Tauler, R. & Barata, C. Differential gene transcription across the life cycle in *Daphnia magna* using a new all genome custom-made microarray. *BMC Genomics* 19, 370. https://doi.org/10.1186/s12864-018-4725-7 (2018).
- Al-Aqeel, S., Ryu, T., Zhang, H., Chandramouli, K. H. & Ravasi, T. Transcriptome and proteome studies reveal candidate attachment genes during the development of the barnacle *Amphibalanus amphitrite. Front. Mar. Sci.* https://doi.org/10.3389/fmars. 2016.00171 (2016).
- Kuballa, A. V., Holton, T. A., Paterson, B. & Elizur, A. Moult cycle specific differential gene expression profiling of the crab Portunus pelagicus. BMC Genomics 12, 147. https://doi.org/10.1186/1471-2164-12-147 (2011).
- Gao, Y. et al. Whole transcriptome analysis provides insights into molecular mechanisms for molting in *Litopenaeus vannamei*. PLoS ONE 10, e0144350–e0144350. https://doi.org/10.1371/journal.pone.0144350 (2015).
- Jiravanichpaisal, P. et al. Expression of immune-related genes in larval stages of the giant tiger shrimp, Penaeus monodon. Fish. Shellfish. Immunol. 23, 815–824. https://doi.org/10.1016/j.fsi.2007.03.003 (2007).
- Little, T. J., Hultmark, D. & Read, A. F. Invertebrate immunity and the limits of mechanistic immunology. Nat. Immunol. 6, 651–654. https://doi.org/10.1038/ni1219 (2005).
- Li, F. & Xiang, J. Recent advances in researches on the innate immunity of shrimp in China. Dev. Comp. Immunol. 39, 11–26. https://doi.org/10.1016/j.dci.2012.03.016 (2013).
- Tassanakajon, A., Somboonwiwat, K., Supungul, P. & Tang, S. Discovery of immune molecules and their crucial functions in shrimp immunity. Fish. Shellfish. Immunol. 34, 954–967. https://doi.org/10.1016/j.fsi.2012.09.021 (2013).
- Flegel, T. W. & Sritunyalucksana, K. Shrimp molecular responses to viral pathogens. Mar. Biotechnol. 13, 587–607. https://doi. org/10.1007/s10126-010-9287-x (2011).
- Jiravanichpaisal, P., Lee, B. L. & Söderhäll, K. Cell-mediated immunity in arthropods: Hematopoiesis, coagulation, melanization and opsonization. *Immunobiology* 211, 213–236. https://doi.org/10.1016/j.imbio.2005.10.015 (2006).
- Tassanakajon, A. et al. Shrimp humoral responses against pathogens: Antimicrobial peptides and melanization. Dev. Comp. Immunol. 80, 81-93. https://doi.org/10.1016/j.dci.2017.05.009 (2018).
- Söderhäll, K. & Cerenius, L. Role of the prophenoloxidase-activating system in invertebrate immunity. *Curr. Opin. Immunol.* 10, 23–28. https://doi.org/10.1016/s0952-7915(98)80026-5 (1998).
- Soo, T. C. C., Devadas, S., Mohamed Din, M. S. & Bhassu, S. Differential transcriptome analysis of the disease tolerant Madagascar-Malaysia crossbred black tiger shrimp, *Penaeus monodon* hepatopancreas in response to acute hepatopancreatic necrosis disease (AHPND) infection: Inference on immune gene response and interaction. *Gut Pathog.* 11, 39. https://doi.org/10.1186/ s13099-019-0319-4 (2019).
- Robalino, J. et al. Insights into the immune transcriptome of the shrimp Litopenaeus vannamei: tissue-specific expression profiles and transcriptomic responses to immune challenge. Physiol. Genomics 29, 44–56. https://doi.org/10.1152/physiolgenomics. 00165.2006 (2007).
- Silveira, A. S. *et al.* An immune-related gene expression atlas of the shrimp digestive system in response to two major pathogens brings insights into the involvement of hemocytes in gut immunity. *Dev. Comp. Immunol.* 79, 44–50. https://doi.org/10.1016/j. dci.2017.10.005 (2018).
- Wang, F., Li, S., Xiang, J. & Li, F. Transcriptome analysis reveals the activation of neuroendocrine-immune system in shrimp hemocytes at the early stage of WSSV infection. BMC Genomics 20, 247. https://doi.org/10.1186/s12864-019-5614-4 (2019).
- Waterhouse, R. M. et al. BUSCO applications from quality assessments to gene prediction and phylogenomics. Mol. Biol. Evol. 35, 543–548. https://doi.org/10.1093/molbev/msx319 (2018).
- Parthier, C. et al. Structure of the Toll-Spätzle complex, a molecular hub in Drosophila development and innate immunity. Proc. Natl. Acad. Sci. 111, 6281. https://doi.org/10.1073/pnas.1320678111 (2014).
- Lou, F., Gao, T. & Han, Z. Transcriptome analyses reveal alterations in muscle metabolism, immune responses and reproductive behavior of Japanese mantis shrimp (*Oratosquilla oratoria*) at different cold temperature. *Comp. Biochem. Physiol. Part D Genomics Proteomics* 32, 100615. https://doi.org/10.1016/j.cbd.2019.100615 (2019).
- Chandhini, S. & Rejish Kumar, V. J. Transcriptomics in aquaculture: Current status and applications. *Rev. Aquac.* https://doi. org/10.1111/raq.12298 (2018).
- Sittikankaew, K. *et al.* Transcriptome analyses reveal the synergistic effects of feeding and eyestalk ablation on ovarian maturation in black tiger shrimp. *Sci. Rep.* 10, 3239. https://doi.org/10.1038/s41598-020-60192-2 (2020).
- 42. Innis, J. W. Role of HOX genes in human development. *Curr. Opin. Pediatr.* 9, 617–622. https://doi.org/10.1097/00008480-19971 2000-00011 (1997).
- Negre, B., Ranz, J. M., Casals, F., Cáceres, M. & Ruiz, A. A new split of the hox gene complex in *Drosophila*: relocation and evolution of the gene labial. *Mol. Biol. Evol.* 20, 2042–2054. https://doi.org/10.1093/molbev/msg238 (2003).
- 44. Pavlopoulos, A. & Akam, M. Hox gene Ultrabithorax regulates distinct sets of target genes at successive stages of Drosophila haltere morphogenesis. Proc. Natl. Acad. Sci. 108, 2855. https://doi.org/10.1073/pnas.1015077108 (2011).
- Gąsiorowski, L. & Hejnol, A. Hox gene expression during development of the phoronid *Phoronopsis harmeri. EvoDevo* 11, 2. https://doi.org/10.1186/s13227-020-0148-z (2020).
- 46. Gao, Y. *et al.* Transcriptome analysis on the exoskeleton formation in early developmetal stages and reconstruction scenario in growth-moulting in *Litopenaeus vannamei. Sci. Rep.* 7, 1098. https://doi.org/10.1038/s41598-017-01220-6 (2017).
- 47. Pratoomchat, B., Sawangwong, P., Guedes, R., Reis, M. I. & Machado, J. Cuticle ultrastructure changes in the crab *Scylla serrata* over the molt cycle. *J. Exp. Zool.* **293**, 414–426. https://doi.org/10.1002/jez.90002 (2002).
- Nagasawa, H. The crustacean cuticle: Structure, composition and mineralization. Front. Biosci. (Elite Ed.) 4, 711–720. https:// doi.org/10.2741/412 (2012).
- Chen, P.-Y., Lin, A.Y.-M., McKittrick, J. & Meyers, M. A. Structure and mechanical properties of crab exoskeletons. Acta Biomater. 4, 587–596. https://doi.org/10.1016/j.actbio.2007.12.010 (2008).

- Corteel, M. et al. Moult cycle of laboratory-raised Penaeus (Litopenaeus) vannamei and P. monodon. Aquac. Int. 20, 13–18. https://doi.org/10.1007/s10499-011-9437-9 (2012).
- Galindo, C., Gaxiola, G., Cuzon, G. & Chiappa-Carrara, X. Physiological and biochemical variations during the molt cycle in juvenile *Litopenaeus vannamei* under laboratory conditions. J. Crust. Biol. 29, 544–549. https://doi.org/10.1651/08-3094.1 (2009).
- Kontrogianni-Konstantopoulos, A., Jones, E. M., Van Rossum, D. B. & Bloch, R. J. Obscurin is a ligand for small ankyrin 1 in skeletal muscle. *Mol. Biol. Cell* 14, 1138–1148. https://doi.org/10.1091/mbc.e02-07-0411 (2003).
- Katzemich, A. et al. The function of the M-line protein obscurin in controlling the symmetry of the sarcomere in the flight muscle of Drosophila. J. Cell Sci. 125, 3367. https://doi.org/10.1242/jcs.097345 (2012).
- Lange, S., Perera, S., Teh, P. & Chen, J. Obscurin and KCTD6 regulate cullin-dependent small ankyrin-1 (sAnk1.5) protein turnover. Mol. Biol. Cell 23, 2490–2504. https://doi.org/10.1091/mbc.E12-01-0052 (2012).
- 55. Cesar, J. & Yang, J. Expression patterns of ubiquitin, heat shock protein 70, α-actin and β-actin over the molt cycle in the abdominal muscle of marine shrimp *Litopenaeus vannamei*. Mol. Reprod. Dev. 74, 554–559. https://doi.org/10.1002/mrd.20605 (2007).
- Korobeinikova, A. V., Garber, M. B. & Gongadze, G. M. Ribosomal proteins: Structure, function, and evolution. *Biochemistry* (*Moscow*) 77, 562–574. https://doi.org/10.1134/s0006297912060028 (2012).
- Filipovska, A. & Rackham, O. Specialization from synthesis: How ribosome diversity can customize protein function. *FEBS Lett.* 587, 1189–1197. https://doi.org/10.1016/j.febslet.2013.02.032 (2013).
- Wan, Y. et al. Transcriptome analysis reveals a ribosome constituents disorder involved in the RPL5 downregulated zebrafish model of Diamond–Blackfan anemia. BMC Med. Genomics 9, 13. https://doi.org/10.1186/s12920-016-0174-9 (2016).
- 59. Taylor, A. *et al.* Hematopoietic defects in rps29 mutant zebrafish depend upon p53 activation. *Exp. Hematol.* **40**, 228-237.e225. https://doi.org/10.1016/j.exphem.2011.11.007 (2011).
- Fu, J. et al. Dynamic transcriptome sequencing and analysis during early development in the bighead carp (Hypophthalmichthys nobilis). BMC Genomics 20, 781. https://doi.org/10.1186/s12864-019-6181-4 (2019).
- Eisenberg, E. & Levanon, E. Y. Human housekeeping genes, revisited. Trends Genet. 29, 569–574. https://doi.org/10.1016/j.tig. 2013.05.010 (2013).
- De Gregorio, E., Spellman, P. T., Tzou, P., Rubin, G. M. & Lemaitre, B. The Toll and Imd pathways are the major regulators of the immune response in *Drosophila*. *EMBO J.* 21, 2568–2579. https://doi.org/10.1093/emboj/21.11.2568 (2002).
- Amparyup, P., Charoensapsri, W. & Tassanakajon, A. Prophenoloxidase system and its role in shrimp immune responses against major pathogens. *Fish. Shellfish. Immunol.* 34, 990–1001. https://doi.org/10.1016/j.fsi.2012.08.019 (2013).
- Cerenius, L. & Söderhäll, K. The prophenoloxidase-activating system in invertebrates. *Immunol. Rev.* 198, 116–126. https://doi. org/10.1111/j.0105-2896.2004.00116.x (2004).
- Jiravanichpaisal, P., Lee, B. L. & Söderhäll, K. Cell-mediated immunity in arthropods: Hematopoiesis, coagulation, melanization and opsonization. *Immunobiology* 211, 213–236. https://doi.org/10.1016/j.imbio.2005.10.015 (2006).
- Tang, H. Regulation and function of the melanization reaction in *Drosophila*. Fly 3, 105–111. https://doi.org/10.4161/fly.3.1. 7747 (2009).
- Söderhäll, I., Bangyeekhun, E., Mayo, S. & Söderhäll, K. Hemocyte production and maturation in an invertebrate animal; proliferation and gene expression in hematopoietic stem cells of *Pacifastacus leniusculus*. Dev. Comp. Immunol. 27, 661–672. https://doi.org/10.1016/s0145-305x(03)00039-9 (2003).
- Luna-González, A., Maeda-Martínez, A. N., Vargas-Albores, F., Ascencio-Valle, F. & Robles-Mungaray, M. Phenoloxidase activity in larval and juvenile homogenates and adult plasma and haemocytes of bivalve molluscs. *Fish. Shellfish. Immunol.* 15, 275–282. https://doi.org/10.1016/s1050-4648(02)00165-1 (2003).
- Kleino, A. & Silverman, N. The Drosophila IMD pathway in the activation of the humoral immune response. Dev. Comp. Immunol. 42, 25–35. https://doi.org/10.1016/j.dci.2013.05.014 (2014).
- Li, F. & Xiang, J. Signaling pathways regulating innate immune responses in shrimp. Fish. Shellfish. Immunol. 34, 973-980. https://doi.org/10.1016/j.fsi.2012.08.023 (2013).
- Tassanakajon, A., Amparyup, P., Somboonwiwat, K. & Supungul, P. Cationic antimicrobial peptides in penaeid Shrimp. *Mar. Biotechnol.* 13, 639–657. https://doi.org/10.1007/s10126-011-9381-8 (2011).
- Barreto, C. et al. Specific molecular signatures for type II crustins in penaeid shrimp uncovered by the identification of crustinlike antimicrobial peptides in *Litopenaeus vannamei*. Mar. Drugs 16, 31. https://doi.org/10.3390/md16010031 (2018).
- Supungul, P. et al. Cloning, expression and antimicrobial activity of crustin Pm1, a major isoform of crustin, from the black tiger shrimp Penaeus monodon. Dev. Comp. Immunol. 32, 61–70. https://doi.org/10.1016/j.dci.2007.04.004 (2008).
- 74. Donpudsa, S. *et al.* Type I and type II crustins from *Penaeus monodon*, genetic variation and antimicrobial activity of the most abundant crustin*Pm4*. *Dev. Comp. Immunol.* **47**, 95–103. https://doi.org/10.1016/j.dci.2014.06.015 (2014).
- Luo, T., Zhang, X., Shao, Z. & Xu, X. PmAV, a novel gene involved in virus resistance of shrimp Penaeus monodon. FEBS Lett. 551, 53–57. https://doi.org/10.1016/s0014-5793(03)00891-3 (2003).
- Destoumieux-Garzón, D. et al. Antimicrobial peptides in marine invertebrate health and disease. Philos. Trans. R. Soc. Lond. B Biol. Sci. 371, 20150300. https://doi.org/10.1098/rstb.2015.0300 (2016).
- de la Vega, E. *et al.* Anti-lipopolysaccharide factor in *Litopenaeus vannamei* (*LvALF*): A broad spectrum antimicrobial peptide essential for shrimp immunity against bacterial and fungal infection. *Mol. Immunol.* 45, 1916–1925. https://doi.org/10.1016/j. molimm.2007.10.039 (2008).
- Kawasaki, T. & Kawai, T. Toll-like receptor signaling pathways. Front. Immunol. https://doi.org/10.3389/fimmu.2014.00461 (2014).
- 79. Mohd Ghani, F. & Bhassu, S. A new insight to biomarkers related to resistance in survived-white spot syndrome virus challenged giant tiger shrimp, *Penaeus monodon*. *PeerJ* 7, e8107. https://doi.org/10.7717/peerj.8107 (2019).
- Deepika, A., Krishnan, S. & Rajendran, K. Responses of some innate immune-genes involved in the toll-pathway in black tiger shrimp (*Penaeus monodon*) to Vibrio harveyi infection and on exposure to ligands in vitro. *J. World. Aquac. Soc.* https://doi. org/10.1111/jwas.12723 (2020).
- Sreedharan, K. et al. Ontogenetic and expression of different genes involved in the Toll pathway of black tiger shrimp (*Penaeus monodon*) following immersion challenge with *Vibrio harveyi* and white spot syndrome virus (WSSV). Agri Gene 8, 63–71. https://doi.org/10.1016/j.aggene.2018.05.002 (2018).
- Habib, Y. J. et al. Genome-wide identification of toll-like receptors in Pacific white shrimp (*Litopenaeus vannamei*) and expression analysis in response to *Vibrio parahaemolyticus* invasion. Aquaculture 532, 735996. https://doi.org/10.1016/j.aquaculture. 2020.735996 (2021).
- Yang, C. et al. A Toll receptor from Chinese shrimp Fenneropenaeus chinensis is responsive to Vibrio anguillarum infection. Fish. Shellfish. Immunol. 24, 564–574. https://doi.org/10.1016/j.fsi.2007.12.012 (2008).
- Wang, P.-H. et al. Molecular cloning, characterization and expression analysis of two novel Tolls (LvToll2 and LvToll3) and three putative Spätzle-like Toll ligands (LvSpz1–3) from *Litopenaeus vannamei. Dev. Comp. Immunol.* 36, 359–371. https://doi.org/ 10.1016/j.dci.2011.07.007 (2012).
- Silas, E. G., Muthu, M. S., Pillai, N. N. & George, K. V. Larval development-*Penaeus monodon* Fabricius. CMFRI Bull. 28, 2–11 (1979).
- 86. Andrews, S. FastQC: A Quality Control Tool for High Throughput Sequence Data (Babraham Bioinformatics, 2010).

- Grabherr, M. G. *et al.* Full-length transcriptome assembly from RNA-Seq data without a reference genome. *Nat. Biotechnol.* 29, 644–652. https://doi.org/10.1038/nbt.1883 (2011).
- Pootakham, W., Uengwetwanit, T., Sonthirod, C., Sittikankaew, K. & Karoonuthaisiri, N. A novel full-length transcriptome resource for black tiger shrimp (*Penaeus monodon*) developed using isoform sequencing (Iso-Seq). *Front. Mar. Sci.* https://doi. org/10.3389/fmars.2020.00172 (2020).
- Li, W. & Godzik, A. Cd-hit: A fast program for clustering and comparing large sets of protein or nucleotide sequences. *Bioinformatics (Oxford, England)* 22, 1658–1659. https://doi.org/10.1093/bioinformatics/btl158 (2006).
- 90. Camacho, C. et al. BLAST+: Architecture and applications. BMC Bioinform. 10, 421. https://doi.org/10.1186/1471-2105-10-421 (2009).
- 91. Uengwetwanit, T. et al. A chromosome-level assembly of the black tiger shrimp (*Penaeus monodon*) genome facilitates the identification of growth-associated genes. *Mol. Ecol. Resour.* https://doi.org/10.1111/1755-0998.13357 (2021).
- Ashburner, M. et al. Gene ontology: Tool for the unification of biology. Nat. Genet. 25, 25–29. https://doi.org/10.1038/75556 (2000).
- Götz, S. et al. High-throughput functional annotation and data mining with the Blast2GO suite. Nucleic Acids Res. 36, 3420–3435. https://doi.org/10.1093/nar/gkn176 (2008).
- Langmead, B. & Salzberg, S. L. Fast gapped-read alignment with Bowtie 2. Nat. Methods 9, 357–359. https://doi.org/10.1038/ nmeth.1923 (2012).
- Robinson, M. D., McCarthy, D. J. & Smyth, G. K. edgeR: A Bioconductor package for differential expression analysis of digital gene expression data. *Bioinformatics (Oxford, England)* 26, 139–140. https://doi.org/10.1093/bioinformatics/btp616 (2010).
- Love, M. I., Huber, W. & Anders, S. Moderated estimation of fold change and dispersion for RNA-seq data with DESeq2. *Genome Biol.* 15, 550. https://doi.org/10.1186/s13059-014-0550-8 (2014).
- 97. R Development Core Team. R: A language and environment for statistical computing (R Foundation for Statistical Computing, Vienna, 2019).
- Howe, E. A., Sinha, R., Schlauch, D. & Quackenbush, J. RNA-Seq analysis in MeV. *Bioinformatics (Oxford, England)* 27, 3209–3210. https://doi.org/10.1093/bioinformatics/btr490 (2011).
- Haw, R., Hermjakob, H., D'Eustachio, P. & Stein, L. Reactome pathway analysis to enrich biological discovery in proteomics data sets. Proteomics 11, 3598-3613. https://doi.org/10.1002/pmic.201100066 (2011).
- Livak, K. J. & Schmittgen, T. D. Analysis of relative gene expression data using real-time quantitative PCR and the 2^{-ΔΔCT} method. Methods 25, 402–408. https://doi.org/10.1006/meth.2001.1262 (2001).

Acknowledgements

This research was supported by the National Center for Genetic Engineering and Biotechnology (BIOTEC), Thailand (Grant Number: P-16-52214) and the International Foundation for Science (IFS), Sweden (Grant Number: A/5349-2). PA was supported by Postdoctoral Fellowship from BIOTEC. We thank Somjai Wongtripob and staff members at Shrimp Genetic Improvement Center (Thailand) for shrimp sample collection. We are grateful to Prof. Morakot Tanticharoen, Dr. Kanyawim Kirtikara, Dr. Wonnop Visessanguan and Dr. Nitsara Karoonuthaisiri for their mentorship on shrimp research.

Author contributions

W.R. designed the experiments. P.A. and S.A. performed the experiments. W.R., T.U. and P.A. analyzed the data. P.A. and W.R. wrote the manuscript. All authors read and approved the submitted version of the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary Information The online version contains supplementary material available at https://doi.org/10.1038/s41598-021-93364-9.

Correspondence and requests for materials should be addressed to W.R.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/.

© The Author(s) 2021