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# Cytokine response during non-cerebral and cerebral malaria: evidence of a failure to control inflammation as a cause of death in African adults

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**Background.** With 214 million cases and 438,000 deaths in 2015, malaria remains one of the deadliest infectious diseases in tropical countries. Several species of the protozoan Plasmodium cause malaria. However, almost all the fatalities are due to Plasmodium falciparum, a species responsible for the severest cases including cerebral malaria. Immune response to Plasmodium falciparum infection is mediated by the production of pro-inflammatory cytokines, chemokines and growth factors whose actions are crucial for the control of the parasites. Following this response, the induction of anti-inflammatory immune mediators downregulates the inflammation thus preventing its adverse effects such as damages to various organs and death. **Methods.** We performed a retrospective, nonprobability sampling study using clinical data and sera samples from patients, mainly adults, suffering of non-cerebral or cerebral malaria in Dakar, Sénégal. Healthy individuals residing in the same area were included as controls. We measured the serum levels of 29 biomarkers including growth factors, chemokines, inflammatory and anti-inflammatory cytokines. **Results.** We found an induction of both pro- and anti-inflammatory immune mediators during malaria. The levels of pro-inflammatory biomarkers were higher in the cerebral malaria than in the non-cerebral malaria patients. In contrast, the concentrations of anti-inflammatory cytokines were comparable in these two groups or lower in CM patients. Additionally, four pro-inflammatory biomarkers were significantly increased in the deceased of cerebral malaria compared to the survivors. Regarding organ damage, kidney failure was significantly associated with death in adults suffering of cerebral malaria. **Conclusions.** Our results suggest that a poorly controlled inflammatory response determines a bad outcome in African adults suffering of cerebral malaria.



- 1 Cytokine Response during Non-cerebral and Cerebral Malaria: evidence of a failure to
- 2 control inflammation as a cause of death in African adults
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- 21 Abstract
- 22 **Background.** With 214 million cases and 438,000 deaths in 2015, malaria remains one of the
- 23 deadliest infectious diseases in tropical countries. Several species of the protozoan *Plasmodium*
- 24 cause malaria. However, almost all the fatalities are due to *Plasmodium falciparum*, a species
- 25 responsible for the severest cases including cerebral malaria. Immune response to *Plasmodium*
- 26 falciparum infection is mediated by the production of pro-inflammatory cytokines, chemokines
- and growth factors whose actions are crucial for the control of the parasites. Following this
- 28 response, the induction of anti-inflammatory immune mediators downregulates the inflammation
- 29 thus preventing its adverse effects such as damages to various organs and death.
- 30 **Methods.** We performed a retrospective, nonprobability sampling study using clinical data and
- 31 sera samples from patients, mainly adults, suffering of non-cerebral or cerebral malaria in Dakar,
- 32 Sénégal. Healthy individuals residing in the same area were included as controls. We measured
- 33 the serum levels of 29 biomarkers including growth factors, chemokines, inflammatory and anti-
- 34 inflammatory cytokines.
- 35 **Results.** We found an induction of both pro- and anti-inflammatory immune mediators during
- 36 malaria. The levels of pro-inflammatory biomarkers were higher in the cerebral malaria than in
- 37 the non-cerebral malaria patients. In contrast, the concentrations of anti-inflammatory cytokines
- were comparable in these two groups or lower in CM patients. Additionally, four pro-
- 39 inflammatory biomarkers were significantly increased in the deceased of cerebral malaria
- 40 compared to the survivors. Regarding organ damage, kidney failure was significantly associated
- 41 with death in adults suffering of cerebral malaria.
- 42 **Conclusions.** Our results suggest that a poorly controlled inflammatory response determines a
- bad outcome in African adults suffering of cerebral malaria.



#### 44 Introduction

45	Despite a decade of sustained efforts that have substantially reduced mortality and morbidity
46	due to malaria, this disease continues to represent an important health concern in tropical
47	countries (White et al. 2014). According to the World Health Organization (WHO), there were
48	214 million cases of malaria worldwide in 2015, which resulted in 438,000 deaths (WHO 2015).
49	Ninety percent of the victims were from Africa, 74% being children under 5 years of age.
50	Malaria is endemic in many sub-Saharan African countries. However, there are disparities
51	between (WHO 2015) and even within countries (Espie et al. 2015) regarding the transmission of
52	the disease. In many rural areas where the local environment favors the development of the
53	mosquito vector and its interactions with humans, transmission of malaria is high and perennial
54	(Trape et al. 2014). In contrast, in other areas including urban zones, the transmission of malaria
55	is low to moderate and seasonal (White et al. 2014). Individuals living in regions of high and
56	stable transmission progressively acquire immunity after experiencing and surviving to several
57	infections (Olliaro 2008). This immunity protects against severe, life-threatening cases of
58	malaria but does not confer a sterile protection (Doolan et al. 2009). In these areas, clinical
59	malaria occurs in young children while healthy carriage of the parasite is common in adults.
60	Adults who die of malaria typically are pregnant women or non-immune individuals from low
61	transmission zones.
62	There was a decline of 18% and 48% of global malaria cases and deaths respectively between
63	2000 and 2015. This success was primarily due to a drastic reduction of malaria transmission by
64	widespread use of insecticide-treated bednets and the availability of artemisinin-based treatments
65	(Bhatt et al. 2015; White et al. 2014). The decline of malaria is expected to continue with the
66	support of the WHO Global Technical Strategy for malaria 2016-2030 that aims to reduce its



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global incidence and mortality by at least 90% by 2030 (WHO 2015). However, a continuous decrease of malaria prevalence and especially a sustained reduction of transmission in currently holoendemic zones may result, in the future, in an increase of the number of adults susceptible to severe cases. Such an unwanted but possible scenario potentially represents a future public health concern in sub-Saharan African countries. Several species of the protozoan *Plasmodium* cause malaria. However, almost all the deaths are due to P. falciparum, a species that causes the severest cases including cerebral malaria (Storm & Craig 2014). In response to P. falciparum infection, a robust immune inflammatory response takes place. An important component of this response is the production of inflammatory immune mediators whose actions are crucial for the control of the parasites (Deloron et al. 1994; Lyke et al. 2004; Sarthou et al. 1997). This inflammatory response is rapidly followed by the production of anti-inflammatory cytokines that downregulate the inflammation preventing detrimental immune reactions (Kurtzhals et al. 1998; Peyron et al. 1994; Walther et al. 2005). Therefore, the immune response to P. falciparum infection includes a subtle balance of pro- and anti-inflammatory immune mediators (Crompton et al. 2014; Frosch & John 2012). A rupture of this balance is at the basis of the events that lead to organ damage and death (Crompton et al. 2014). The pathogenesis of severe malaria and its associated mortality have been widely studied in children. In contrast, there are less investigations that addressed these aspects of the disease in adults, in particular from Africa (Olliaro 2008). In this study, we performed a retrospective analysis of the available clinical data and of the immune response of malaria patients, mainly adults, admitted at the Hôpital Principal de Dakar, Sénégal. Malaria is endemic in several areas in Sénégal. However, the capital city Dakar and its surroundings constitute a zone of low prevalence of malaria with a seasonal transmission. We report the analysis of the serum levels of cytokines, chemokines and growth



- 90 factors in control individuals and in patients suffering of non-cerebral (NCM) or cerebral malaria
- 91 (CM). All the CM patients were adults and included deceased and survivors enabling to gain
- 92 insights into the effect of the analysed biomarkers in the outcome of the disease.
- 93 Materials and methods
- 94 Study population, ethics, consent and permissions
- This study was performed on serum samples from patients diagnosed with malaria at the Hôpital
- 96 Principal de Dakar, Sénégal between October 2012 and December 2014 (Torrentino-Madamet et
- al. 2014). The samples were taken after written consents from the patients or their accompanying
- 98 family members. The controls corresponded to samples obtained from healthy volunteers
- 99 residing in Dakar. This study was approved by the Université Cheikh Anta Diop de Dakar's
- institutional research ethics committee (Protocol N° 001/2015/CER/UCAD). Venous blood
- samples were collected in Vacutainer® ACD tubes (Becton Dickinson, Rutherford, NJ, USA)
- prior to patient treatment. *Plasmodium* presence and density in blood samples were determined
- by microscopic examination of thin blood smears stained with a 10% May-Grünwald Giemsa
- solution (SigmaR, St-Louis, MO, USA). P. falciparum was the only species found. Blood
- parameters were determined at the hospital's clinical laboratory. The following criteria were
- used for enrollment into the two groups of malaria patients. Life-threatening CM was defined
- following the WHO criteria as the presence of *P. falciparum* in blood smears accompanied by a
- coma with no other cause of cerebral symptoms. NCM cases were defined by fever and presence
- of *P. falciparum* in blood smear, without other infections or symptoms of severe malaria as
- defined by the WHO (WHO 2000). CM patients were treated according to a protocol based on
- the Senegalese national recommendations that consisted of intramuscular administrations of 20
- mg/kg quinine every eight hours. NCM patients were treated with oral administration of 20



mg/kg of artesunate derivates or quinine. Secondary samples analyzed in this study corresponded 113 to blood taken from survivors of CM (14 individuals) before patient release from the hospital (1-114 15 days after admission). 115 Biomarker measurement 116 Serum biomarkers were measured using a Milliplex MAP kit for human cytokine/chemokine 117 118 magnetic bead panel (catalogue # HCYTMAG-60K-PX29, EMD Millipore Corporation, Billerica, MA, USA) according to the recommendations of the manufacturer. The levels of 29 119 biomarkers were measured in each sample including interleukin (IL)-1α, IL-1β, IL-1RA, IL-2, 120 121 IL-3, IL-4, IL-5, IL-6, IL-7, IL-8, IL-10, IL-12 (p40), IL-12 (p70), IL-13, IL-15, IL-17, 122 interferon (IFN)α2, IFNγ, IFN-inducible protein 10 (IP-10, CXCL-10), epidermal growth factor (EGF), eotaxin, granulocyte colony-stimulating factor (G-CSF), granulocyte-macrophage 123 colony-stimulating factor (GM-CSF), tumor necrosis factor (TNF)α, TNFβ, monocyte 124 chemotactic protein (MCP)-1, macrophage inflammatory protein (MIP)-1 $\alpha$ , MIP-1 $\beta$ , and 125 vascular endothelial growth factor (VEGF). The measurements were performed in 25 ul of 126 127 undiluted serum samples on one 96 well plate. Each well contained fluorescent-coded magnetic microbeads coated with analyte-specific capture antibodies to simultaneously measure the 128 biomarkers in a specimen. Seven standards and two quality-control (QC) samples were included 129 and measured in duplicate. The QC samples corresponded to mixtures with two values (high and 130 low) for each biomarker. After the capture of the biomarkers, the beads were washed, incubated 131 with biotinylated antibodies and then with streptavidin-PE. Excitation and fluorescence 132 acquisition from the beads were performed using a Luminex 200<sup>TM</sup> equipped with an 133 xPONENT<sup>TM</sup> software version 3.1 (Luminex, Austin, TX, USA) that calculated the 134 135 concentrations of the biomarkers by extrapolating the mean fluorescence intensity (MFI) to a 5-



parameter weighted logistic regression curve from the standards. Any measurement below the detection limit was given a value of 0 for the corresponding analyte. For most of the biomarkers, the majority of the samples had detectable values. For IL-2, IL-3, IL-4, IL12p40, IL-13 and TNFβ, the small number of samples with detectable MFI did not permit meaningful statistical analyses. These biomarkers were excluded from the statistical analyses. The MFI for one G-CSF and two IL-1RA samples were above the value of the highest standard whose concentration was 10,000 pg/ml. These samples were arbitrarily assigned concentrations above the highest standard. The G-CSF sample was assigned a concentration of 11,000 pg/ml. The two IL-1RA samples were attributed concentrations of 11,000 pg/ml and 12,000 pg/ml respectively according to the values of their MFI. Treating the samples above the highest standard in this way, rather than excluding them, allowed to take them into account when determining the median values for G-CSF and IL-1RA.

#### Statistical analyses

The statistical analyses were carried out using the IBM SPSS 22.0 software. Non-parametric tests were used to compare the levels of biomarker and their correlation with other variables across different groups. Mann-Whitney U test and Kruskal-Wallis one-way ANOVA were used to compare data across two and three groups respectively. Wilcoxon matched pairs signed rank test was used to compare biomarker levels in sera from CM patients at admission and at their release from the hospital. Correlation tests were performed using Spearman's Rho rank test. Pearson Chi-Square was used to test association of organ failure with outcome in CM patients. Benjamini-Hochberg correction was used for multiple testing adjustment. For all the statistical analyses, a p value < 0.05 was considered as significant except when multiple testing adjustment was used, in which cases significant p values depended on the critical values from the



Benjamini-Hochberg correction. The biomarker profiles were determined as previously described (da Costa et al. 2014). In brief, the median value in the global population (CT + NCM +CM) was calculated for each biomarker and used as a cut-off to determine the percentage of individuals that had "high" (above the median value) and "low" (below the median value) levels of biomarker in the CT, NCM and CM groups. An ascendant biomarker profile was then constructed in the CT group by assembling the biomarkers from the one having the smallest percentage of high producers to the one having the largest. The resulting ascendant curve was used as a reference to visualize the variation of the percentage of high producers of biomarkers in the other groups (Fig. 1). In addition to showing the differences in the percentage of high producers (descriptive statistics), the biomarker profiles also indicate the analytes (hatched bars) for which there was a significant difference in adjusted Mann-Whitney U pairwise comparison (inferential statistics).

#### Results

#### Study population and clinical data

We performed a retrospective, nonprobability sampling study using sera samples from healthy individuals and from patients admitted at the Hôpital Principal de Dakar, Sénégal. The cohort included 17 and 27 subjects diagnosed with NCM and CM respectively, and 18 healthy controls (CT) (Table 1). The three groups of individuals were comparable in age and gender, and were mainly composed of adults (Table 1). Subjects below 15 years of age included six children aged 5-13 diagnosed with NCM. Several clinical and blood parameters existed but were not recorded for all the individuals preventing reliable statistical analyses. Available data showed, as expected, hemoglobin levels comparable in the CT and NCM individuals while significantly lower in the CM patients (Table 1). Additionally, parasitemia was comparable between the NCM



and CM groups (Table 1). Regarding organ defect in the CM group, kidney failure was the most 182 frequent (13/27) followed by liver, hematologic and respiratory malfunction, while 183 hemodynamic failure was rare (Table 1). All the NCM patients were successfully treated, while 184 9/27 CM subjects died. 185 Levels of inflammatory but not of anti-inflammatory biomarkers were higher in CM than 186 187 in NCM patients To analyze the production of immune mediators during malaria, we measured the serum levels of 188 189 29 biomarkers including growth factors, chemokines, inflammatory and anti-inflammatory cytokines. We determined the ascendant biomarker profile of the CT group as previously 190 described (da Costa et al. 2014) and plotted the resulting curve on the profiles of the NCM and 191 192 CM patients (Fig. 1). The biomarker profiles display comparison of the proportion of individuals with levels of analytes above the global median between the controls and the malaria patients 193 (Figs. 1B and 1C). Additionally, analytes that significantly differ in Mann-Whitney U pairwise 194 comparison after Benjamini-Hochberg multiple testing adjustment are shown in the biomarker 195 profiles (Figs. 1B and 1C, hatched bars). Several analytes were significantly higher in malaria 196 patients (NCM and/or CM) than in CT individuals (Figs. 1 and 2). These biomarkers included 197 most of the pro-inflammatory cytokines and chemokines tested (IL-1α, IL-6, IL-8, IL-12p70, IL-198 15, IL-17A, IP-10, TNF $\alpha$ , IFN $\alpha$ 2, IFN $\gamma$ , MIP-1 $\alpha$ , MIP-1 $\beta$  and MCP-1) and the anti-199 inflammatory cytokines IL-10 and IL-1RA. The induction of both inflammatory and anti-200 inflammatory immune mediators that aims to respond to the infection while controlling the level 201 of inflammation in order to prevent damages to host organs has been well documented in malaria 202 patients (Frosch & John 2012). Also, we observed an induction of Th1 (IL-12, IFN $\gamma$  and TNF $\alpha$ ) 203 and Th2 (IL-10) biomarkers in both NCM and CM patients. Since only the control group 204



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included children, we performed pairwise comparisons after removing subjects below 15 years of age. We did not find differences in the analytes that significantly differed whether children were included or not except for IFNα2 that lost significance in the CT/NCM comparison (not shown). Besides individual biomarkers, several analytes were significantly positively correlated consistent with the immune response during malaria that mobilizes several cytokines, chemokines and growth factors (Supplementary File 1). Next, we analyzed the difference of cytokine levels between the NCM and CM patients. Most of the biomarkers induced during malaria were higher in CM than in the NCM individuals (Fig. 3). However, after Benjamini-Hochberg adjustment for multiple tests (Table 2), only the levels of the pro-inflammatory IL-6 and IL-8, and of IL-1RA, an antagonist of IL-1 reached statistical significance (Fig. 3 and Table 2). These results indicate an inflammatory response of higher magnitude in CM compared to NCM patients as previously mentioned in several reports (Crompton et al. 2014). In contrast, the level of IL-10 was not significantly different between NCM and CM patients (Fig. 3). Additionally, the level of IL-5, a Th2 anti-inflammatory cytokine, was significantly lower in CM than in NCM patients (Fig. 3 and Table 2) as was the ratios of IL-5 to the pro-inflammatory biomarkers TNFα, IP-10 and IL-8 (not shown). These results suggest that the level of antiinflammatory response did not match the strength of the inflammatory cytokine response in the CM patients. Levels of inflammatory biomarkers were lower in survivors than in deceased of CM Failure to control inflammation is proposed as one of the mechanisms leading to CM, which is consistent with the difference we observed between NCM and CM patients. To further analyze the effect of the inflammatory biomarkers, we compared the levels of analyte between the survivors (n = 18) and the deceased (n = 9) of CM. Interestingly, after multiple testing



adjustment (Table 3), there were four biomarkers whose levels significantly differed between the 228 two groups. All were pro-inflammatory analytes (Eotaxin, IL-15, MCP-1 and TNF $\alpha$ ) that were 229 significantly lower in the survivors than in the deceased of CM (Fig. 4). These results suggest 230 231 that the cause of death involved an inflammatory response of high magnitude that was not 232 properly controlled. To analyze possible effects of the inflammatory response in tissue damage, 233 we compared the failure of different organs between survivors and deceased CM patients. Kidney failure was significantly associated with patient's death ( $\chi^2$  [1, N = 27] = 8.98, p = 0.003; 234 Effect Size = 0.58) while the occurrence of neurological, respiratory, liver, hematologic and 235 236 hemodynamic failures were comparable between the two groups. We further attempted to correlate the biomarker levels with organ failure. Kidney failure showed significant moderate to 237 strong positive correlations with several chemokines and pro-inflammatory cytokines (Table 4), 238 239 while respiratory, hematological and liver failure displayed weak positive correlations with 5, 5 and 1 biomarkers respectively (not shown). 240 Variation of biomarker levels before and after cerebral malaria treatment 241 Analysis of biomarker profiles in malaria patients before and after treatment provides valuable 242 information on immune mediators that are induced during malaria. We compared the levels of 243 biomarker between the time of emergency admission and of hospital release in 14 CM patients 244 (Table 5). Wilcoxon rank test showed 7 biomarkers (G-CSF, IL-10, IL-1α, IL-8, IP-10, MCP-1, 245 TNFα) that were significantly different between the two time points after Benjamini-Hochberg 246 adjustment. All these biomarkers were lower in the second samples confirming the induction of 247 different types of immune mediators including growth factor (G-CSF), inflammatory (TNFα, IL-248 1α, IP-10), anti-inflammatory (IL-10) and chemokines (IL-8, MCP-1) during immune response 249 250 to malaria (Table 5).



#### Discussion

Inflammation and outcome of cerebral malaria

In this study, we performed a retrospective analysis of 18 controls, and of 17 and 27 NCM and CM patients respectively. The CM patients included 18 survivors and 9 (30%) deceased subjects, a proportion similar to the highest mortality rates reported for CM. Beside neurological defect, kidney failure was the most frequent organ malfunction in CM patients and was correlated with death. Analysis of the cytokine response showed a strong induction of pro- and anti-inflammatory biomarkers in malaria patients. However, the magnitude of this response was significantly higher in CM than in NCM patients for inflammatory biomarkers while it was comparable in the two groups for the anti-inflammatory cytokines. Additionally, comparison of the biomarkers in the survivors versus the deceased of CM showed four pro-inflammatory analytes that were significantly higher in the deceased patients. Altogether, our results suggest a scenario in which a strong inflammatory response that was not properly contained led to organ failure and death during CM.

The involvement of the inflammatory response in the pathogenesis of severe malaria, including CM, is well documented (Clark et al. 2008). The balance of pro- and anti-inflammatory cytokines, chemokines and growth factors is key to controlling parasite development without damages to host organs. Regarding the individual biomarkers, we found pro-inflammatory immune mediators increased in malaria patients with levels of IL-6 and IL-8 higher in CM compared to NCM individuals, and of eotaxin, IL-15, MCP-1 and TNF $\alpha$  elevated in deceased compared to survivors of CM. The association of these cytokines and chemokines with malaria severity and/or poor outcome have been described before (Clark et al. 2008). TNF $\alpha$  is one of the first recognized pro-inflammatory biomarkers that play important role during



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malaria. With other Th1 type cytokines IL-1, IL-12 and IFNγ it contributes to the control of the infection (Schofield & Grau 2005). However, elevated levels of TNFα were associated with disease severity in both children and adults (Prakash et al. 2006; Thuma et al. 2011) and can discriminate between SM and UM (Mahanta et al. 2015). Similarly, IL-8 (Berg et al. 2014; Lyke et al. 2004), IL-6 (Jakobsen et al. 1994; Lyke et al. 2004), IL-15 (Hu 2013; Ong'echa et al. 2011) and MCP-1 (MacMullin et al. 2012; Quelhas et al. 2012) were reported as increased during malaria.

In contrast to TNFα, IL-6, IL-8, IL-15 and MCP-1, eotaxin was not often mentioned in previous malaria studies. Interestingly, the level of eotaxin was higher in the CT individuals than in the malaria patients but the difference lost statistical significance after multiple testing adjustment. A significantly lower level of eotaxin was reported by Requena et al. in pregnant women exposed to malaria when compared to controls residing in malaria-free areas (Requena et al. 2014). Additionally, eotaxin was found as a negative predictor of hemoglobin level in children with SMA (Ong'echa et al. 2011). These observations suggest that eotaxin is dowregulated during malaria and that it could be involved in pathogenesis. Eotaxin is a Th2-type chemokine that mediates eosinophil development and recruitment in host tissues (Pope et al. 2001; Queto et al. 2010). Eotaxin is an important biomarker of allergic diseases (Pope et al. 2001) and polymorphism of its encoding gene influence total serum IgE level (Batra et al. 2007; Wang et al. 2007). The role played by IgE in response to malaria infection is controversial with some studies claiming a protective function (Bereczky et al. 2004; Farouk et al. 2005) while other associating IgE with disease severity (Perlmann et al. 1994; Perlmann et al. 1997; Seka-Seka et al. 2004). However, a recent study in a mouse model of experimental CM showed that animals genetically deficient for IgE or for the high affinity receptor for IgE were less

susceptible to CM (Porcherie et al. 2011) supporting a role of IgE in the development of CM. The same study showed that CM pathogenesis was mediated by neutrophils expressing the high affinity receptor for IgE that homed to the brain and locally induced high levels of proinflammatory cytokines (Porcherie et al. 2011). Whether this function could be translated to human is unknown. However, a recent study reported an elevated neutrophil count that correlated with expression levels of the pro-inflammatory mediators IL-1β and IL-8 in human severe malaria (Mahanta et al. 2015). Altogether, these observations support the hypothesis that elevated levels of eotaxin result in higher production of IgE and deleterious effects during human malaria. If this is the case, the downregulation of eotaxin observed previously (Requena et al. 2014) and in this study might be a mechanism that protects against the damages caused by IgE during malaria. This hypothesis is consistent with higher levels of eotaxin observed in deceased compared to survivors of CM. However it needs to be tested in other studies.

Besides eotaxin, IL-5, another Th2 type cytokine displayed a remarkable profile in this study with its level significantly decreased in CM compared to NCM patients (Fig. 3). IL-5 is a regulatory cytokine that cooperates with eotaxin in the development and recruitment of eosinophils (Nussbaum et al. 2013). A previous study reported elevated levels of IL-5 in mild compared to severe malaria patients (Prakash et al. 2006) suggesting a protective role of this cytokine. This hypothesis is consistent with a recent report of a mouse study demonstrating a protection of rodent against experimental CM by IL-33 treatment (Besnard et al. 2015). The protection against CM was mediated by IL-5 independently of eosinophils, implying a mechanism that does not involve eotaxin.

In conclusion, our study confirms previously reported inflammatory response during malaria. Our findings support the idea of a strong induction of pro-inflammatory immune



- mediators that was not matched by the production of regulatory, anti-inflammatory biomarkers
- as the cause of death during CM. Additionally, our results suggests the involvement of eotaxin
- and of IL-5 in CM development and outcome.

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#### References

- Batra J, Rajpoot R, Ahluwalia J, Devarapu SK, Sharma SK, Dinda AK, and Ghosh B. 2007. A hexanucleotide repeat upstream of eotaxin gene promoter is associated with asthma, serum total IgE and plasma eotaxin levels. *J Med Genet* 44:397-403. 10.1136/jmg.2006.046607
- Bereczky S, Montgomery SM, Troye-Blomberg M, Rooth I, Shaw MA, and Farnert A. 2004. Elevated antimalarial IgE in asymptomatic individuals is associated with reduced risk for subsequent clinical malaria. *Int J Parasitol* 34:935-942. 10.1016/j.ijpara.2004.04.007
- Berg A, Patel S, Gonca M, David C, Otterdal K, Ueland T, Dalen I, Kvaloy JT, Mollnes TE, Aukrust P, and Langeland N. 2014. Cytokine network in adults with falciparum Malaria and HIV-1: increased IL-8 and IP-10 levels are associated with disease severity. *PLoS One* 9:e114480. 10.1371/journal.pone.0114480
- Besnard AG, Guabiraba R, Niedbala W, Palomo J, Reverchon F, Shaw TN, Couper KN, Ryffel B, and Liew FY.

  2015. IL-33-mediated protection against experimental cerebral malaria is linked to induction of type 2 innate lymphoid cells, M2 macrophages and regulatory T cells. *PLoS Pathog* 11:e1004607.

  10.1371/journal.ppat.1004607
- 342 Bhatt S, Weiss DJ, Cameron E, Bisanzio D, Mappin B, Dalrymple U, Battle KE, Moyes CL, Henry A, Eckhoff PA, Wenger EA, Briet O, Penny MA, Smith TA, Bennett A, Yukich J, Eisele TP, Griffin JT, Fergus CA, Lynch M, Lindgren F, Cohen JM, Murray CL, Smith DL, Hay SI, Cibulskis RE, and Gething PW. 2015. The effect of malaria control on Plasmodium falciparum in Africa between 2000 and 2015. *Nature* 526:207-211. 10.1038/nature15535
  - Clark IA, Alleva LM, Budd AC, and Cowden WB. 2008. Understanding the role of inflammatory cytokines in malaria and related diseases. *Travel Med Infect Dis* 6:67-81. 10.1016/j.tmaid.2007.07.002
  - Crompton PD, Moebius J, Portugal S, Waisberg M, Hart G, Garver LS, Miller LH, Barillas-Mury C, and Pierce SK. 2014. Malaria immunity in man and mosquito: insights into unsolved mysteries of a deadly infectious disease. *Annu Rev Immunol* 32:157-187. 10.1146/annurev-immunol-032713-120220
- da Costa AG, Antonelli LR, Costa PA, Pimentel JP, Garcia NP, Tarrago AM, dos Santos Mdo P, Nogueira PA,
  Hekcmann MI, Sadahiro A, Teixeira-Carvalho A, Martins-Filho OA, and Malheiro A. 2014. The
  robust and modulated biomarker network elicited by the Plasmodium vivax infection is mainly
  mediated by the IL-6/IL-10 axis and is associated with the parasite load. *J Immunol Res*2014:318250. 10.1155/2014/318250



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- 357 Deloron P, Roux Lombard P, Ringwald P, Wallon M, Niyongabo T, Aubry P, Dayer JM, and Peyron F. 1994. 358 Plasma levels of TNF-alpha soluble receptors correlate with outcome in human falciparum 359 malaria. Eur Cytokine Netw 5:331-336.
- 360 Doolan DL, Dobano C, and Baird JK. 2009. Acquired immunity to malaria. Clin Microbiol Rev 22:13-36, 361 Table of Contents. 10.1128/CMR.00025-08
- 362 Espie E, Diene Sarr F, Diop F, Faye J, Richard V, Tall A, and Toure Balde A. 2015. Spatio-Temporal Variations in Malaria Incidence in Children Less than 10 Years Old, Health District of Sokone, Senegal, 2010-363 364 2013. PLoS One 10:e0137737. 10.1371/journal.pone.0137737
  - Farouk SE, Dolo A, Bereczky S, Kouriba B, Maiga B, Farnert A, Perlmann H, Hayano M, Montgomery SM, Doumbo OK, and Troye-Blomberg M. 2005. Different antibody- and cytokine-mediated responses to Plasmodium falciparum parasite in two sympatric ethnic tribes living in Mali. Microbes Infect 7:110-117. 10.1016/j.micinf.2004.09.012
- 369 Frosch AE, and John CC. 2012. Immunomodulation in Plasmodium falciparum malaria: experiments in 370 nature and their conflicting implications for potential therapeutic agents. Expert Rev Anti Infect 371 Ther 10:1343-1356. 10.1586/eri.12.118
- Hu WC. 2013. Human immune responses to Plasmodium falciparum infection: molecular evidence for a 372 373 suboptimal THalphabeta and TH17 bias over ideal and effective traditional TH1 immune response. 374 Malar J 12:392. 10.1186/1475-2875-12-392
- 375 Jakobsen PH, Morris-Jones S, Theander TG, Hviid L, Hansen MB, Bendtzen K, Ridley RG, and Greenwood 376 BM. 1994. Increased plasma levels of soluble IL-2R are associated with severe Plasmodium falciparum malaria. Clin Exp Immunol 96:98-103.
  - Kurtzhals JA, Adabayeri V, Goka BQ, Akanmori BD, Oliver-Commey JO, Nkrumah FK, Behr C, and Hviid L. 1998. Low plasma concentrations of interleukin 10 in severe malarial anaemia compared with cerebral and uncomplicated malaria. Lancet 351:1768-1772. 10.1016/S0140-6736(97)09439-7
  - Lyke KE, Burges R, Cissoko Y, Sangare L, Dao M, Diarra I, Kone A, Harley R, Plowe CV, Doumbo OK, and Sztein MB. 2004. Serum levels of the proinflammatory cytokines interleukin-1 beta (IL-1beta), IL-6, IL-8, IL-10, tumor necrosis factor alpha, and IL-12(p70) in Malian children with severe Plasmodium falciparum malaria and matched uncomplicated malaria or healthy controls. Infect Immun 72:5630-5637. 10.1128/IAI.72.10.5630-5637.2004
- 386 MacMullin G, Mackenzie R, Lau R, Khang J, Zhang H, Rajwans N, Liles WC, and Pillai DR. 2012. Host immune 387 response in returning travellers infected with malaria. Malar J 11:148. 10.1186/1475-2875-11-388 148
- Mahanta A, Kar SK, Kakati S, and Baruah S. 2015. Heightened inflammation in severe malaria is associated 389 390 with decreased IL-10 expression levels and neutrophils. Innate Immun 21:546-552. 391 10.1177/1753425914561277
- 392 Nussbaum JC, Van Dyken SJ, von Moltke J, Cheng LE, Mohapatra A, Molofsky AB, Thornton EE, Krummel 393 MF, Chawla A, Liang HE, and Locksley RM. 2013. Type 2 innate lymphoid cells control eosinophil 394 homeostasis. Nature 502:245-248. 10.1038/nature12526
  - Olliaro P. 2008. Editorial commentary: mortality associated with severe Plasmodium falciparum malaria increases with age. Clin Infect Dis 47:158-160. 10.1086/589288
- 397 Ong'echa JM, Davenport GC, Vulule JM, Hittner JB, and Perkins DJ. 2011. Identification of inflammatory 398 biomarkers for pediatric malarial anemia severity using novel statistical methods. Infect Immun 399 79:4674-4680. 10.1128/IAI.05161-11
- 400 Perlmann H, Helmby H, Hagstedt M, Carlson J, Larsson PH, Troye-Blomberg M, and Perlmann P. 1994. IgE 401 elevation and IgE anti-malarial antibodies in Plasmodium falciparum malaria: association of high 402 IgE levels with cerebral malaria. Clin Exp Immunol 97:284-292.



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- Perlmann P, Perlmann H, Flyg BW, Hagstedt M, Elghazali G, Worku S, Fernandez V, Rutta AS, and Troye-Blomberg M. 1997. Immunoglobulin E, a pathogenic factor in Plasmodium falciparum malaria. Infect Immun 65:116-121.
- Peyron F, Burdin N, Ringwald P, Vuillez JP, Rousset F, and Banchereau J. 1994. High levels of circulating IL-10 in human malaria. *Clin Exp Immunol* 95:300-303.
  - Pope SM, Brandt EB, Mishra A, Hogan SP, Zimmermann N, Matthaei KI, Foster PS, and Rothenberg ME. 2001. IL-13 induces eosinophil recruitment into the lung by an IL-5- and eotaxin-dependent mechanism. *J Allergy Clin Immunol* 108:594-601. 10.1067/mai.2001.118600
  - Porcherie A, Mathieu C, Peronet R, Schneider E, Claver J, Commere PH, Kiefer-Biasizzo H, Karasuyama H, Milon G, Dy M, Kinet JP, Louis J, Blank U, and Mecheri S. 2011. Critical role of the neutrophilassociated high-affinity receptor for IgE in the pathogenesis of experimental cerebral malaria. *J Exp Med* 208:2225-2236. 10.1084/jem.20110845
- 415 Prakash D, Fesel C, Jain R, Cazenave PA, Mishra GC, and Pied S. 2006. Clusters of cytokines determine
   416 malaria severity in Plasmodium falciparum-infected patients from endemic areas of Central India.
   417 J Infect Dis 194:198-207. 10.1086/504720
- Quelhas D, Puyol L, Quinto L, Nhampossa T, Serra-Casas E, Macete E, Aide P, Sanz S, Aponte JJ, Doolan DL,
  Alonso PL, Menendez C, and Dobano C. 2012. Intermittent preventive treatment with sulfadoxinepyrimethamine does not modify plasma cytokines and chemokines or intracellular cytokine
  responses to Plasmodium falciparum in Mozambican children. *BMC Immunol* 13:5. 10.1186/14712172-13-5
  - Queto T, Gaspar-Elsas MI, Masid-de-Brito D, Vasconcelos ZF, Ferraris FK, Penido C, Cunha FQ, Kanaoka Y, Lam BK, and Xavier-Elsas P. 2010. Cysteinyl-leukotriene type 1 receptors transduce a critical signal for the up-regulation of eosinophilopoiesis by interleukin-13 and eotaxin in murine bone marrow. J Leukoc Biol 87:885-893. 10.1189/jlb.1108709
  - Requena P, Campo JJ, Umbers AJ, Ome M, Wangnapi R, Barrios D, Robinson LJ, Samol P, Rosanas-Urgell A, Ubillos I, Mayor A, Lopez M, de Lazzari E, Arevalo-Herrera M, Fernandez-Becerra C, del Portillo H, Chitnis CE, Siba PM, Bardaji A, Mueller I, Rogerson S, Menendez C, and Dobano C. 2014. Pregnancy and malaria exposure are associated with changes in the B cell pool and in plasma eotaxin levels. *J Immunol* 193:2971-2983. 10.4049/jimmunol.1401037
  - Sarthou JL, Angel G, Aribot G, Rogier C, Dieye A, Toure Balde A, Diatta B, Seignot P, and Roussilhon C. 1997. Prognostic value of anti-Plasmodium falciparum-specific immunoglobulin G3, cytokines, and their soluble receptors in West African patients with severe malaria. *Infect Immun* 65:3271-3276.
- Schofield L, and Grau GE. 2005. Immunological processes in malaria pathogenesis. *Nat Rev Immunol* 5:722-735. 10.1038/nri1686
  - Seka-Seka J, Brouh Y, Yapo-Crezoit AC, and Atseye NH. 2004. The role of serum immunoglobulin E in the pathogenesis of Plasmodium falciparum malaria in Ivorian children. *Scand J Immunol* 59:228-230.
- Storm J, and Craig AG. 2014. Pathogenesis of cerebral malaria--inflammation and cytoadherence. *Front Cell Infect Microbiol* 4:100. 10.3389/fcimb.2014.00100
  - Thuma PE, van Dijk J, Bucala R, Debebe Z, Nekhai S, Kuddo T, Nouraie M, Weiss G, and Gordeuk VR. 2011.

    Distinct clinical and immunologic profiles in severe malarial anemia and cerebral malaria in Zambia. *J Infect Dis* 203:211-219. 10.1093/infdis/jiq041
- Torrentino-Madamet M, Fall B, Benoit N, Camara C, Amalvict R, Fall M, Dionne P, Ba Fall K, Nakoulima A,
  Diatta B, Dieme Y, Menard D, Wade B, and Pradines B. 2014. Limited polymorphisms in k13 gene
  in Plasmodium falciparum isolates from Dakar, Senegal in 2012-2013. *Malar J* 13:472.
  10.1186/1475-2875-13-472
- Trape JF, Tall A, Sokhna C, Ly AB, Diagne N, Ndiath O, Mazenot C, Richard V, Badiane A, Dieye-Ba F, Faye J, Ndiaye G, Diene Sarr F, Roucher C, Bouganali C, Bassene H, Toure-Balde A, Roussilhon C, Perraut



451	R, Spiegel A, Sarthou JL, da Silva LP, Mercereau-Puijalon O, Druilhe P, and Rogier C. 2014. The rise
<del>1</del> 52	and fall of malaria in a West African rural community, Dielmo, Senegal, from 1990 to 2012: a 22
453	year longitudinal study. Lancet Infect Dis 14:476-488. 10.1016/S1473-3099(14)70712-1
154	Walther M, Tongren JE, Andrews L, Korbel D, King E, Fletcher H, Andersen RF, Bejon P, Thompson F,
455	Dunachie SJ, Edele F, de Souza JB, Sinden RE, Gilbert SC, Riley EM, and Hill AV. 2005. Upregulation
456	of TGF-beta, FOXP3, and CD4+CD25+ regulatory T cells correlates with more rapid parasite growth
<del>1</del> 57	in human malaria infection. <i>Immunity</i> 23:287-296. 10.1016/j.immuni.2005.08.006
458	Wang TN, Chiang W, Tseng HI, Chu YT, Chen WY, Shih NH, and Ko YC. 2007. The polymorphisms of Eotaxin
459	1 and CCR3 genes influence on serum IgE, Eotaxin levels and mild asthmatic children in Taiwan.
160	Allergy 62:1125-1130. 10.1111/j.1398-9995.2007.01485.x
461	White NJ, Pukrittayakamee S, Hien TT, Faiz MA, Mokuolu OA, and Dondorp AM. 2014. Malaria. Lancet
162	383:723-735. 10.1016/S0140-6736(13)60024-0
163	WHO. 2000. Severe falciparum malaria. Trans R Soc Trop Med Hyg 94 (Suppl1):1-90.
164	WHO. 2015. World Malaria Report 2015. Geneva, Switzerland: World Health Organization.
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## Table 1(on next page)

Demographic, clinical, and disease outcome data.

		CT	NCM	CM	Total
Gender	Male	11	11	22	44
Gender	Female	7	6	5	17
Age	Range	23-57	5-74	15-80	5-80
1190	Median	28.5	18	26	26
	Normal	18	17	11	46
НВ	Low	0	0	16	16
	Median	0	520	1452	$1022^{a}$
Parasitemia	IQR	0	2552	9981	7654 <sup>a</sup>
Outcome	Survived	18	17	18	53
Outcome	Deceased	0	0	9	9
	Neurological	0	0	27	27
	Respiratory	0	0	6	6
Organ	Kidney	0	0	13	13
Failure	Liver	0	0	8	8
	Hematologic	0	0	7	7
	Hemodynamic	0	0	2	2

CT, control individuals; NCM, non-cerebral malaria patients; CM, cerebral malaria patients; HB, hemoglobin (Low, < 100 g/L; Normal, > 100 g/L); IQR, Inter Quartile Range. *a*, value for NCM + CM.



## Table 2(on next page)

Biomarkers significantly differing between non-cerebral and cerebral malaria patients after multiple testing adjustment. ->

Biomarkers	MW P values	BH critical values	Significance
TNFα <sup>a</sup>	0.049	0.017	No
IL-15a	0.042	0.013	No
MCP-1a	0.013	0.010	No
IL-6 <sup>a</sup>	0.008	0.008	Yes
IL-1RA	0.007	0.006	Yes
IL-5 <sup>b</sup>	0.002	0.004	Yes
IL-8a	0	0.002	Yes

MW, Mann-Whitney U comparison; BH, Benjamini-Hochberg correction; <sup>a</sup>, increased in CM; <sup>b</sup>, decreased in CM.



## Table 3(on next page)

Biomarkers significantly increased in deceased of cerebral malaria compared to survivors. agment4s2 o�3

Biomarkers	MW P values	BH critical values	Significance
IL-6	0.027	0.015	No
IL-8	0.017	0.010	No
Eotaxin	0.007	0.008	Yes
$TNF\alpha$	0.003	0.006	Yes
IL-15	0.002	0.004	Yes
MCP-1	0.001	0.002	Yes

MW, Mann-Whitney U comparison; BH, Benjamini-Hochberg correction.



## Table 4(on next page)

Biomarkers correlated with kidney failure in cerebral malaria patients.

	ρ (p value)		ρ (p value)		ρ (p value)
Eotaxin	0.514 (0.006)	IL-10	0.457 (0.017)	IL-1α	0.593 (0.001)
G-CSF	0.500 (0.008)	IL-12p70	0.445 (0.020)	IP-10	0.533 (0.004)
GM-CSF	0.714 (<0.001)	IL-15	0.621 (0.001)	MCP-1	0.581 (0.002)
IFNα2	0.525 (0.005)	IL-17A	0.401 (0.038)	TNFα	0.542 (0.003)
IFNγ	0.529 (0.005)	IL-1RA	0.390 (0.044)		

ρ, Spearman's Rho coefficient.



## Table 5(on next page)

Variation of biomarker levels between admission and release from hospital in cerebral malaria patients.

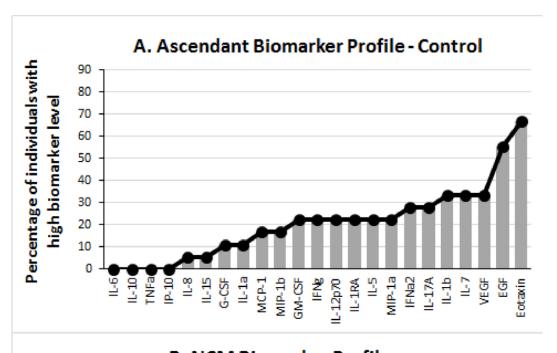
	Admission (pg/ml) MN ± SD / MD	Release (pg/ml) MN ± SD/ MD	P value
G-CSF	651 ± 1869 / 163	$116 \pm 111 / 99$	0.007
IL-10	1848 ± 1749 / 464	$99 \pm 165 / 40$	0.002
TNFα	$90 \pm 101 / 60$	$24\pm14/20$	0.002
IL-1α	$121 \pm 165 / 76$	$57 \pm 80 / 28$	0.013
IL-8	$213 \pm 417 / 66$	58 ± 152 / 14	0.001
IP-10	5668 ± 6297 / 2496	1757 ± 2191 / 892	0.002
MCP-1	$1303 \pm 1754 / 508$	$409 \pm 678 / 242$	0.005

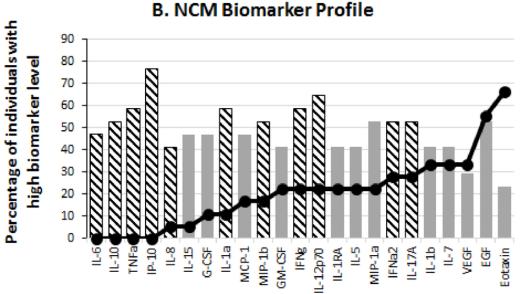
Admission, biomarker levels at the time of hospital admission of CM patients; Release, biomarker levels at the time of release of CM patients from hospital; *P* value, two-tailed *p* value of a Wilcoxon Rank test; MN, mean; SD, standard deviation; MD, median.

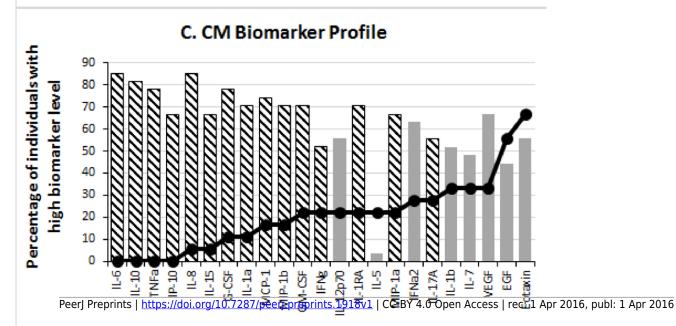


Serum levels of immune mediators during malaria. Root�,s2? g�3

The levels of 29 biomarkers were measured in control subjects (CT) and in non-cerebral (NCM) and cerebral (CM) malaria patients. The median value of each cytokine in the global population (CT + NCM + CM) was used as a cut-off value to determine the percentage of "high" (above median) biomarker producer individuals in each group. The ascendant biomarker profile of the CT (A) was determined and the resulting curve used as a reference to visualize the difference in the proportion of high biomarker producers with the NCM (B) and CM (C) groups. Hatched bars represent biomarkers for which there is a significant difference in Mann-Whitney U pairwise comparison with the CT reference group after Benjamini-Hochberg multiple test adjustment.







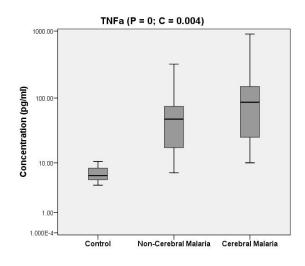


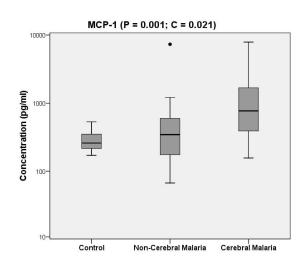
### Figure 2(on next page)

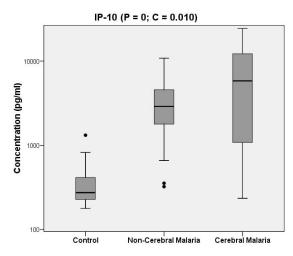
Serum biomarker levels in control individuals and in non-cerebral and cerebral malaria patients. io:s2? W��

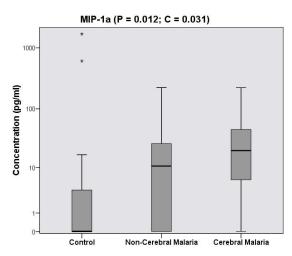
Biomarkers that significantly differed across the three groups in Kruskal-Wallis test after Benjamini-Hochberg adjustment are shown. Box plots represent medians with 25<sup>th</sup> and 75<sup>th</sup> percentiles, bars 10<sup>th</sup> and 90<sup>th</sup> percentiles, and dots outliers for biomarker concentrations. P, p[i] values in Kruskal-Wallis tests. C, critical values in Benjamini-Hochberg correction. io:s2? W��

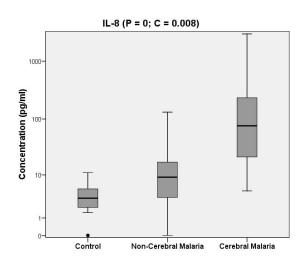


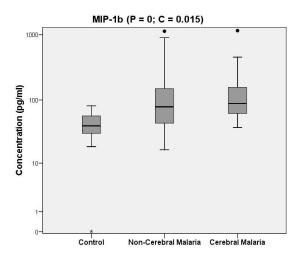


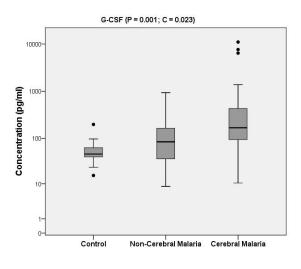


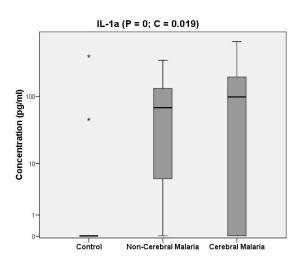


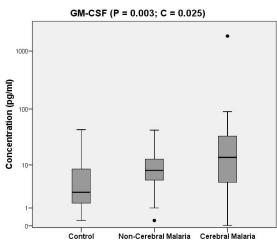


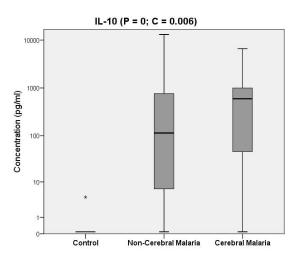


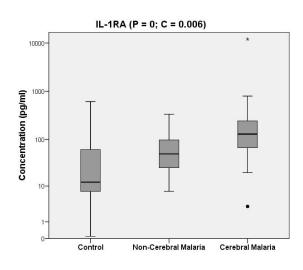


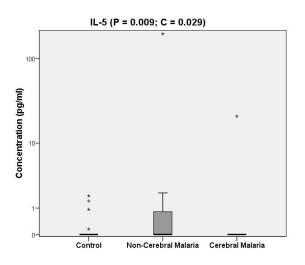


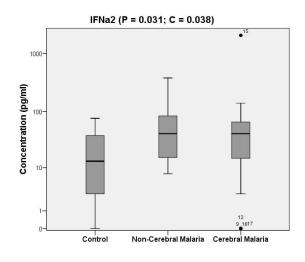


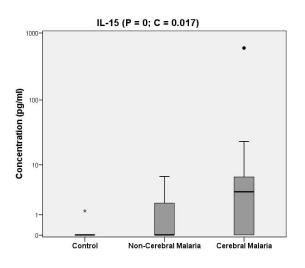


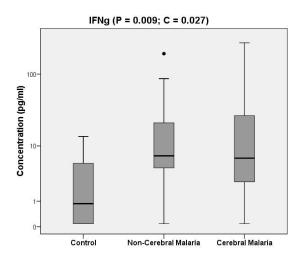


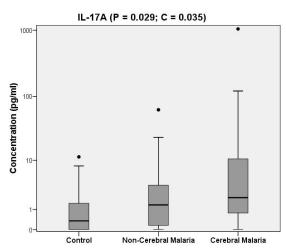


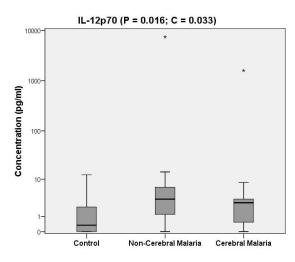


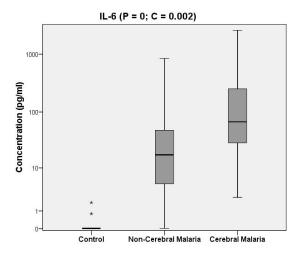








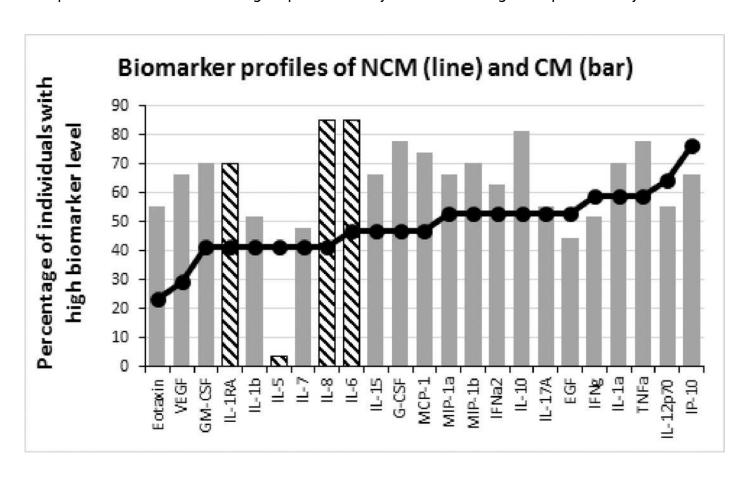






Levels of inflammatory immune mediators are higher in cerebral than in non-cerebral malaria patients.

The ascendant biomarker profile curve of the NCM (line) was plotted on the CM graph (bars) to visualize the difference in the proportion of high biomarker producers. Hatched bars represent biomarkers for which there is a significant difference in Mann-Whitney U pairwise comparison between the two groups after Benjamini-Hochberg multiple test adjustment.





Levels of inflammatory immune mediators are higher in deceased than in survivors of cerebral malaria.

The ascendant biomarker profile curve of the survivors (line) was plotted on the deceased graph (bars) to visualize the difference in the proportion of high biomarker producers.

Hatched bars represent biomarkers for which there is a significant difference in Mann-Whitney U pairwise comparison between the two groups after Benjamini-Hochberg multiple test adjustment.

