

RESEARCH

Open Access



Association between cytokine and increased risk of death in ART-naïve and ART-non-adherence patients hospitalized with advanced HIV disease

Yury Oliveira Chaves^{1,2,3,4†}, Wellington Mota Gama^{5†}, Monique Freire dos Reis^{6,7}, Bárbara José Antunes Baptista¹, Taynná Vernalha Rocha Almeida¹, Antônio Alcirley da Silva Balieiro³, Allyson Guimarães da Costa^{4,5,7}, Hiochelson Najibe dos Santos Ibiapina⁷, Andrea Teixeira de Carvalho⁸, Thaissy dos Santos Xavier^{2,3}, Marly Marques de Melo⁹, Rebeca de Souza Pinheiro^{2,7}, Jhennyffer Mendes de Souza⁸, Zeca Manuel Salimo⁷, Olindo Assis Martins Filho⁸, Marcus Vinícius Guimarães de Lacerda^{3,7,9}, Adele Schwartz Benzaken^{7,10}, Luiz Carlos de Lima Ferreira^{1,7,9} and Paulo Afonso Nogueira^{2,3,5*}

Abstract

Background Despite progress in healthcare for people living with HIV/AIDS (PLWHA), many still present with advanced HIV, thus increasing their risk of death. Late initiation of treatment and poor adherence to antiretroviral therapy (ART) are key contributing factors. This study aimed to evaluate cytokines as mortality predictors among hospitalized PLWHA. It assessed the risk of death between ART-naïve and ART-non-adherent PLWHA with advanced HIV and quantified immunological markers in post-mortem samples to determine the influence of irregular ART use.

Methods A longitudinal observational study was conducted at the Fundação de Medicina Tropical Doutor Heitor Vieira Dourado (FMT-HVD) in Manaus, Brazil, with 111 participants recruited between 2018 and 2019. Clinical and laboratory data were obtained from electronic medical records. Plasma samples were analyzed for 27 cytokines/chemokines using the Luminex® multiplex assay within 72 h of admission and 6 h after post-mortem.

Results ART-naïve PLWHA had a higher risk of death. Most of the 27 immunological markers analyzed in the post-mortem were elevated in those who died compared to those who were discharged. Increased levels of IFN γ , CCL2, and CCL3 were associated with death. Elevated immunological markers in ART-naïve PLWHA correlated with CD4 cell counts. Notably, IL-17 increased in ART-naïve PLWHA, while IL-2 increased in ART-non-adherent PLWHA, indicating a dichotomy. T helper-2 responses were marked by IL-9 in ART-naïve and IL-5 in ART-non-adherent PLWHA.

[†]Yury Oliveira Chaves and Wellington Mota Gama contributed equally to this work

*Correspondence:
Paulo Afonso Nogueira
paulonogueirafiocruz@gmail.com

Full list of author information is available at the end of the article



© The Author(s) 2024. **Open Access** This article is licensed under a Creative Commons Attribution-NonCommercial-NoDerivatives 4.0 International License, which permits any non-commercial use, sharing, 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 you modified the licensed material. You do not have permission under this licence to share adapted material derived from this article or parts of it. 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-nc-nd/4.0/>.

Conclusions ART-naïve PLWHA hospitalized with advanced HIV have a higher risk of death. Some immunological markers are possible predictors of death upon hospital admission due to HIV/AIDS, and their levels were found to be increased in post-mortem blood samples. Our findings suggest a polarized response among ART-naïve and ART-non-adherent PLWHA.

Keywords HIV/AIDS, Opportunistic infections, Late presentation, Therapeutic failure, Immunological markers, Mortality biomarkers

Background

With the availability of antiretroviral therapy (ART), acquired immunodeficiency syndrome (AIDS) cases are no longer expected to be prevalent. Effective and uninterrupted ART reduces viral load, improves immune function, and significantly decreases mortality while enhancing the quality of life for people living with HIV/AIDS (PLWHA) [1, 2]. Brazil is one of the countries that has responded positively in the fight against HIV/AIDS, offering state-of-the-art antiretroviral therapy through a unified public health system that is universal and free for the entire population [1–4]. Despite this, we are entering the fifth decade, and the HIV/AIDS epidemic in Brazil is far from being stabilized. Although 89% of PLWHA are diagnosed, only 82% are on ART, and while 95% of those on treatment have achieved viral load < 1,000 copies/mL, these numbers remain far from ideal [5]. Misinformation, non-adherence to ART, poverty and social stigmas seem to be barriers to ending the AIDS epidemic in Brazil and late diagnosis and late presentation to healthcare is a major of them [1, 6].

Late presentation occurs when PLWHA seek care at an advanced stage of the disease, typically with a CD4+ count below 350 cells/mm³ or an AIDS-defining condition [6–12]. Individuals at this stage face significantly higher risks of opportunistic infections and mortality, which have been the leading cause of hospitalization among PLWHA for over a decade, particularly in the region of the present study [13–16]. ART-naïve individuals are more likely to present late due to delayed diagnosis, leading to worse disease progression [6–8]. Insufficient adherence to ART is also associated with disease progression [17–21]. As the immune system deteriorates, the disease advances to a stage defined by a CD4+ count of less than 200 cells/mm³ or by the World Health Organization (WHO) criteria for stages 3 and 4, which are linked to specific opportunistic infections [7, 9, 22–24].

The burden of advanced disease continues to pose a significant risk of death among ART-naïve patients and ART-non-adherent patients who have interrupted their treatment in Brazil [6, 25]. Recently, we identified a specific chemokine as a potential predictor of mortality in hospitalized HIV patients with advanced disease [26, 27]. A key question remains whether irregular ART use affects circulating cytokine levels and influences

mortality differently between ART-naïve and ART-non-adherent PLWHA in late-stage disease.

Cytokines and other soluble immunological markers, such as chemokines and growth factors, have prognostic significance as potential predictors of mortality in untreated PLWHA [28]. Regardless of ART status—whether naïve or non-adherent—disease progression weakens immune regulation, leading to impaired viral control and worsened outcomes. Irregular ART adherence disrupts cytokine production, increasing inflammation and diminishing antiviral responses [29]. In ART-naïve individuals, HIV shifts the immune response toward a Th2-dominated profile, with heightened pro-inflammatory activity and reduced antiviral defenses [18, 30].

Although several studies provide insights into the broader effects of ART on immune function and cytokine profiles [18, 31–36], no studies have specifically compared cytokine levels among PLWHA who have died, either regardless of ART status. In this context, the study evaluated the risk of death using a 27-plex cytokine and chemokine panel and given the complexity of cytokine responses in disease progression, it also assessed post-mortem cytokine profiles in ART-naïve and ART-non-adherent PLWHA who died while hospitalized.

Methods

Study population and study design

This cross-sectional and longitudinal observational study evaluated immunological and clinical biomarkers associated with death or discharge of patients with HIV/AIDS, of either sex, who were admitted to the Fundação de Medicina Tropical Doutor Heitor Vieira Dourado (FMT-HVD) between 2018 and 2019. A total of 111 participants aged between 18 and 70 were enrolled in this study within 72 h of admission. After signing the informed consent form, blood was collected from each patient to measure serum cytokines and chemokines. Of the 111 patients included, 77 were discharged and 34 died. All patients were followed up until discharge or death.

Participant selection of ART-naïve and ART-non-adherent PLWHA

Participants in this study were classified into two groups: ART-naïve PLWHA and ART-non-adherent PLWHA. This classification was based on structured interviews

conducted with each participant. The information obtained from these interviews was further validated by cross-referencing the electronic medical database at the FMT-HVD, medication dispensing records, and data from the Laboratory Examination Control System (called SISCEL, *Sistema de Controle de Exames Laboratoriais*) and Brazilian Logistics System for the Distribution and Control of Medication for PLWHA (called SICLOM, *sistema de controle logístico de medicamento*). This comprehensive approach ensured accurate categorization of participants, allowing for reliable analysis of their treatment adherence and health status.

General characteristics of patient comorbidities

Information regarding coinfections and comorbidities was obtained from the electronic medical database at the FMT-HVD. The outcomes of interest were survival (hospital discharge) and death, verified via either a death certificate or a discharge authorization registered in the electronic medical record. Comorbidities or disorders were defined as signs and/or symptoms of respiratory, neurological, cardiovascular or digestive origin, of both infectious and non-infectious causes, with or without chronicity.

Respiratory syndromes encompass a variety of pathogenic conditions that affect the respiratory tract, including infectious and non-infectious signs and symptoms such as dyspnea (shortness of breath or difficulty breathing), abnormal lung auscultation, long-term and/or productive cough, and pleural effusion. For ART-experienced PLWHA, positive cultures for *Mycobacterium tuberculosis* or positive GeneXpert® MTB/RIF results were collected from their electronic medical records for previous hospitalizations. For tuberculosis diagnosis in ART-naïve PLWHA, those who had died or were discharged were diagnosed based on positive culture, GeneXpert® MTB/RIF results, or suspected TB in chest X-rays, which was characterized by lesions such as infiltrates in the upper lobe, cavitations, nodules, or hilar lymphadenopathy. Neurological syndromes include those of infectious and non-infectious etiology, with signs and symptoms such as alterations in consciousness, sensory loss and/or movement disorders (poor coordination, tremors, asthenia), paralysis and seizures. Gastrointestinal candidiasis was diagnosed by examining lesions in the mouth associated with odynophagia, dysphagia, esophagitis, gastritis, vomiting and diarrhea. Other diagnoses, such as herpes simplex types 1 and 2, Epstein-Barr virus, varicella zoster virus, cytomegalovirus, John Cunningham virus, BK virus, *Toxoplasma gondii*, *Pneumocystis jirovecii*, and HTLV-1/2, were identified according to the protocols described by [37]. *Cryptococcus* sp. was detected using the cryptococcal antigen (CrAg), Nankin ink staining,

and culture. *Histoplasmosis* sp. was detected using Nankin ink staining, and culture.

Clinical management of hospitalized patients with advanced AIDS

The clinical management involves a comprehensive approach [38]. Antiretroviral therapy (ART) initiation is typically delayed until the infection is stabilized to avoid immune reconstitution inflammatory syndrome (IRIS). Treatment for opportunistic infections includes management of fungal infections such as pneumocystosis (*Pneumocystis jirovecii*) with sulfamethoxazole/trimethoprim (SMX/TMP), which can be combined with corticosteroids in severe cases. Amphotericin B, followed by fluconazole, is used for cryptococcal or neurocryptococcal meningitis, or histoplasmosis, while rifampicin and isoniazid are administered for tuberculosis, with adjustments to account for drug interactions with ART. Sulfadiazine with pyrimethamine and folinic acid is the first-line treatment for cerebral toxoplasmosis, and ganciclovir or valganciclovir are recommended for cytomegalovirus (CMV) infections. In cases of severe pneumocystosis, corticosteroids are added to reduce pulmonary inflammation. Routine laboratory evaluations include monitoring CD4 counts and viral loads to assess immune status and ART effectiveness, alongside cultures and imaging to aid in diagnosing and managing opportunistic infections. Complications such as IRIS, if occurring after ART initiation, are managed with anti-inflammatory agents and corticosteroids in severe cases. Metabolic and nutritional disorders are addressed through electrolyte monitoring, nutritional support, and correction of malnutrition or anemia, which are critical components of care.

Causes of death reported on death certificates

All the individuals had advanced AIDS with opportunistic respiratory infections (Supplementary data). According to their death certificates, advanced AIDS was associated with several opportunistic infections leading to septic shock with or without acute respiratory failure. Based on medical histories obtained from the electronic medical records, these patients were admitted to the hospital with worsening conditions (as evidenced by the average length of hospital stay), which led to respiratory failure requiring ventilatory support. In summary, the disease had already been manifesting itself, then worsened, and there was little time to provide sufficient support to diagnose the etiological agent and prescribe antimicrobial therapy before initiating antiretroviral medication. In other words, the exacerbation indicated by the short hospitalization time suggests that they suffered from pulmonary dysfunction caused by an acute exacerbation of a chronic disease. Additionally, patients

were also suffering from drug-induced hepatitis caused by empirical polypharmacy.

Sociodemographic and laboratory data of cases and control participants

During the first contact with the patients, sociodemographic data such as name, age, gender and use of ART were collected. The following data were collected through the patient's electronic medical records: Clinical data: general health status, comorbidities, coinfections, treatment, clinical manifestations (weight loss, diarrhea, vomiting), discharge, and death; Laboratory data: blood count, immunological markers (viral load and CD4+ T cell count), and biochemical markers (glucose, calcium, total protein, albumin, globulin, urea, creatinine, bilirubin, gamma GT, alkaline phosphatase, AST and ALT, phosphorus, sodium, potassium and C-reactive protein).

Collection of blood samples

On patient enrollment, after the interview and signing of the consent form, 5 mL of blood was collected by venipuncture in vacuum tubes with EDTA anticoagulant. Collection occurred upon admission to the ward, and patients were monitored until discharge or death. In the event of patient death, their family members/caregivers were approached regarding the possibility of conducting a post-mortem examination for the purposes of epidemiological and patient care monitoring and education, and as a complement to *in vivo* data. In these cases, 4 mL of blood was collected via peripheral venipuncture using vacuum EDTA tubes. After collecting all the samples (taken on admission or during post-mortem), each sample was centrifuged at 500 g for 5 min at 25 °C to obtain the plasma. One milliliter was aliquoted immediately for marker measurement and then stored at -80 °C, as described by [26], for future analysis.

Dosage of immunological markers

The BioPlex Pro™ Human Cytokine 27plex assay kit (cat. no. M500KCAF0Y) is composed of a magnetic bead and microsphere panel that quantifies FGF, Eotaxin (CCL11), G-CSF, GM-CSF, IFN- γ , IL-1 β , IL-1ra, IL-2, IL-4, IL-5, IL-6, IL-7, IL-8 (CXCL8), IL-9, IL-10 (CXCL10), IL-12(p70), IL-13, IL-15, IL-17, IP-10, MCP-1 (CCL2), MIP-1 α (CCL3), MIP-1 β (CCL4), PDGF-BB, RANTES (CCL5), TNF- α and VEGF in volumes as low as 25 μ L. In summary, the Luminex XMAP technique has a similar principle to the enzyme-linked immunosorbent assay (ELISA) [39]. Magnetic microspheres covalently bind to capture antibodies that target specific cytokines/chemokines. Plasma samples are prepared in a 96-well plate and, after washing, detection antibodies are added to form a sandwich complex. The final detection uses streptavidin-phycoerythrin conjugate as a fluorescence

indicator. Cytokine/Growth factors/Chemokine levels are measured in pg/mL using the Luminex XMAP analytical instrument according to the manufacturer's protocol (Bio-Rad).

Statistical analysis

Data were tabulated in an Excel database created by the researchers and analyzed using the GraphPad Prism program, version 7, for univariate analysis, and the STATA program for multivariate analysis. The chi-square (χ^2) test was applied to categorical variables, including causes of hospitalization, relative risk of death among ART-naïve, ART-non-adherence and undetectable viral load patients, and for comparison of numerical data (hematological, biochemical, and immunological markers). When comparisons were made between two groups, the non-parametric Mann-Whitney U-test was used. The Spearman's correlation was employed to compare CD4 counts, viral load and immunological markers of PLWHA who died (grouped into ART-naïve and non-adherent to ART). Two paired samples of the same patients were assessed using the Wilcoxon signed-rank test to compare cytokine/Growth factors/Chemokine levels in samples taken on admission and during post-mortem. Multivariate analyses were conducted to identify parameters that predicted death by comparing admission data between groups of patients that were discharged and those that died. We evaluated relative risk to determine the association of immunological markers that changed throughout hospitalization, as determined in the post-mortem, between PLWHA grouped into ART-naïve and ART-non-adherent.

Results

Of the 111 hospitalized PLWHA, 34 died (26 males and 8 females). The median age and interquartile range were 34 years (25; 44). Seventy-seven PLWHA were discharged (54 males and 23 females). The median age and interquartile range were 35 years (29; 39.5). The most frequent cause of hospitalization was respiratory syndromes (76.47%), followed by the presence of more than two opportunistic infections: tuberculosis (35.29%), gastrointestinal candidiasis (35.29%), and neurological syndrome (32.35%) (Table 1). Univariate analyses showed that a respiratory syndrome increased the relative risk (RR) of death to 2.05 when compared to PLWHA who were discharged, while neurotoxoplasmosis did not (Table 1). The HIV-RNA >1,000 copies differed significantly between groups ($p=0.001$), with a higher concentration in patients who died. CD4 T cell counts were lower in those who died, 27.5×10^3 cells/mL and the interquartile range (IQR) of $17-140.5 \times 10^3$ cells versus 82.0×10^3 cells/mL and IQR of $36.50-204.05 \times 10^3$ cells ($p=0.0178$). Both

Table 1 Assessment of causes of hospitalization in HIV/AIDS inpatients

Cause of hospitalization	Death N= 33	Discharge N= 77	RR	95% CI	P
CD4 counts (x cells/mm ³) in admission	27.5 (17–140.5)	82.0 (36.50–204.0)			0.0178*
CD4 < 350	32	70	1.412	0.5347 to 5.085	0.5681
CD4 > 350	2	7			
HIV-RNA copies/mL	894.838 (401.167–1.388.510)	126.368 (73.664–179.071)			0.001*
Hemoglobin (13.0–18.0 g/dL)	9.266 (8.365–10.166)	10.741 (10.243–11.239)			0.003*
Anemia	32	61	3.097	1.001 to 11.35	0.0497*
No	2	16			
Respiratory syndrome	26	42	2.055	1.071 to 4.16	0.035*
No	8	35			
Neurological syndrome	11	39	0.5835	0.3134 to 1.051	0.098
No	23	38			
Other	10	17	1.296	0.693 to 2.26	0.473
No	24	60			
Tuberculosis	12	22	1.235	0.6818 to 2.139	0.508
No	22	55			
Histoplasmosis	2	7	0.7083	0.1967 to 1.87	0.719
No	32	70			
Cryptococcosis	1	2	1.091	0.1982 to 2.846	0.999
No	33	75			
Neurotoxoplasmosis	3	20	0.3703	0.125 to 0.9628	0.044*
No	31	57			
Bacterial Pneumonia	2	6	0.8047	0.2245 to 2.049	0.999
No	32	71			
Pneumocistosis	3	2	2.052	0.7613 to 3.522	0.166
No	31	75			
CMV	1	0	3.333	0.6772 to 17.74	0.306
No	33	77			
Herpes zoster	0	2	0	0 to 2.217	0.999
No	34	75			
Disseminated infection by mycobacteria	0	1	0	0 to 2.729	0.999
No	34	76			
Gastrointestinal Candidiasis	12	18	1.473	0.8182 to 2.519	0.246
No	22	59			
No coinfection	11	15	1.564	0.8592 to 2.666	0.152
No	23	62			
More than 2 opportunistic infections	24	66	0.56	0.3327 to 1.028	0.070
No	10	11			

N= simple number; RR=risk ratio; IC= confidence interval; * significant p-value

groups showed evidence of advanced disease, as nearly all PLWHA had CD4 counts below 200 cells/ 10^3 mm³.

We compared laboratory parameters between those who died and those who were discharged (Supplementary Table 1). Although anemia was observed in both groups, the patients who died had an RR of 3.0 and lower hemoglobin levels. Among the hematological and biochemical parameters, no significant alterations were observed (Supplementary Tables 1 and 2). The values of calcium, total protein and albumin were significantly different between the groups. In general, liver function was preserved without significant alterations in liver markers. Alkaline phosphatase and transaminase levels were

elevated in both groups. Renal function was able to maintain creatinine levels within normal limits. The other laboratory parameters did not show significant differences between admission and death (Supplementary Table 1).

To assess whether soluble immune response factors (cytokines, growth factors and chemokines) were associated with the outcome of death (Fig. 1), we measured 27 immunological markers. Of the total markers evaluated, 23 were observed to be increased in patients who died when compared to those who were discharged. Thus, several of these immunological markers are promising predictors of mortality.

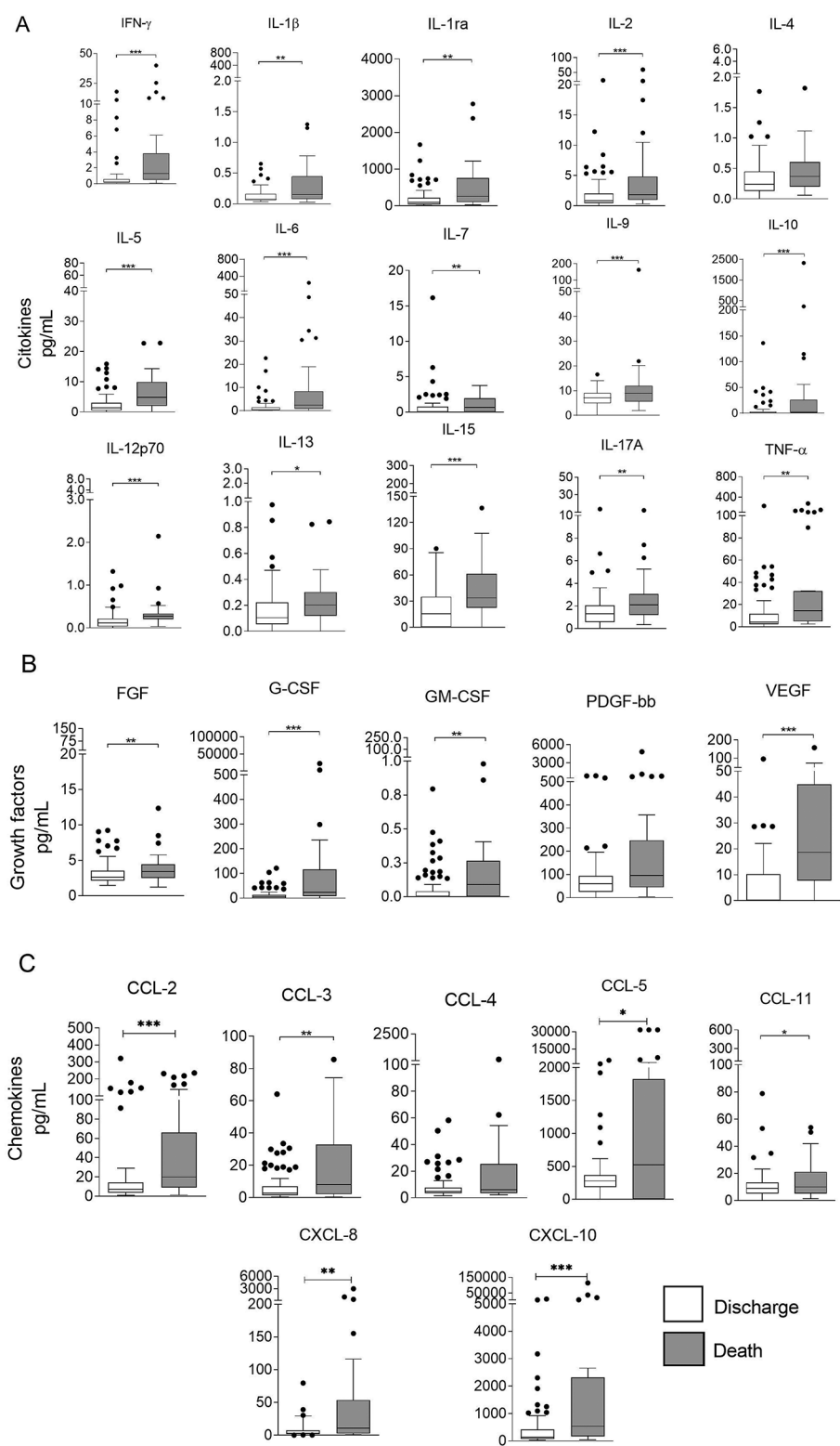
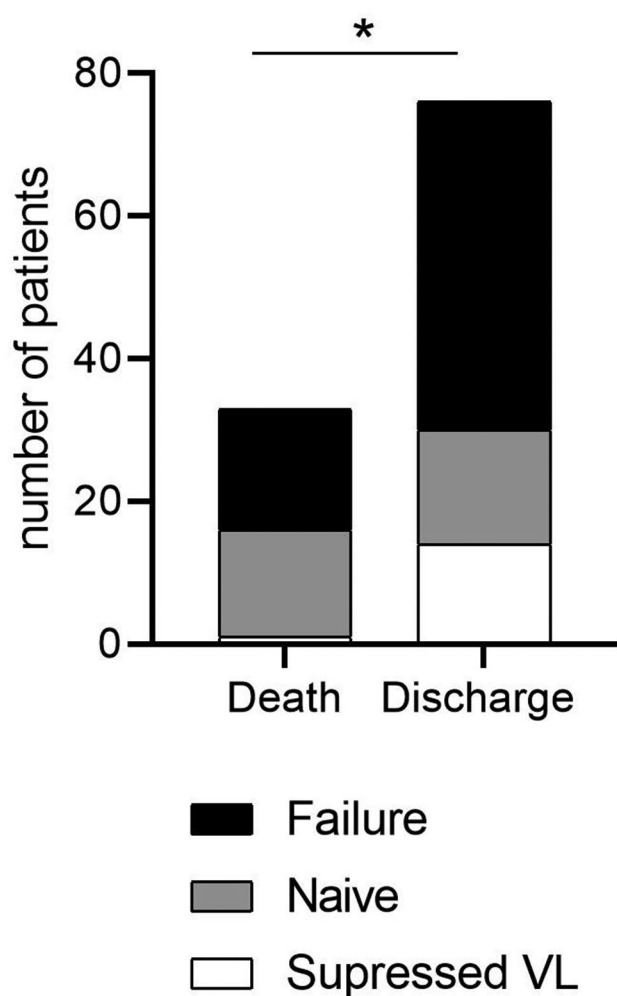


Fig. 1 Cytokines, chemokines, and growth factors as predictors of mortality. Measurement of immunological mediators (Bio-Plex Pro human cytokine 27-plex kit) among HIV/AIDS patients who were discharged or died. Concentrations were compared using the Mann-Whitney test. **A)** Cytokines are shown in alphabetical sequence. **B)** Growth factors are shown in alphabetical sequence. **C)** Chemokines are shown in alphabetical sequence

Table 2 Relative risk of laboratory parameters and mediator markers in the mortality of hospitalized PLWHA

Predictors	Outcome		
	Risk Relative	95%CI	P
(Intercept)	0.0001	0.0000–0.0001	0.004
Hematocrit	0.8879	0.8064–0.9777	0.016
CCHM g/dL	2.1777	1.3302–3.5651	0.002
Leukocytes/mm ³	1.0002	1.0000–1.0003	0.013
Sodium mmol/L	1.0393	0.9549–1.1311	0.373
IFN- γ	1.9110	1.0018–3.6455	0.049
CCL-2	0.9608	0.9246–0.9984	0.041
CCL-3	1.0656	1.0073–1.1273	0.027
CCL-5	1.0007	0.9999–1.0016	0.098

Multivariate analysis was conducted to evaluate relative risk

**Fig. 2** Relative risk of death in hospitalized HIV patients according to ART status. In the period of 2018 and 2019, our study enrolled by convenience 111 hospitalized PWLHA of which 77 were discharged and 34 died. Relative risk of death was calculated using χ^2 among 31 ART-naïve people, 63 ART-non-adherent people, and 17 PWLHA with suppressed viremia. Among those who died, 15 were ART-naïve, 17 ART-non-adherent and one had suppressed viremia

We evaluated the association of laboratory variables and immunological markers with the risk of death (Table 2). Using a relative risk model, hematological, biochemical factors, and immunological assessment markers were identified as independent predictive factors for death. The relative risk indicated a higher risk of death in patients with reduced levels of hematocrit, MCHC, leukocytes, and high levels of INF- γ , CCL-2 and CCL3.

Hospitalized PLWHA were stratified considering the use of antiretroviral therapy, virological failure, treatment-naïve status and suppressed viral load (Fig. 2). Based on this stratification, the death and discharge groups were compared using the χ^2 test. The RR indicated an increased risk of death in patients with virological failure and treatment-naïve status compared to those who were discharged (RR: 2.62; 95% CI: 1.23 to 5.58; $p=0.013$).

Regarding ART status among those who died, the hospitalization time for ART-naïve PLWHA was shorter than for ART-non-adherent PLWHA ($p=0.031$). The median number of hospitalization days for ART-naïve PLWHA who died was 9 days, with an IQR of 8.5 to 22.5 days. The minimum hospitalization time was 3 days, and the maximum was 48 days. The median number of hospitalization days for ART-non-adherent PLWHA who died was 8 days, with an IQR of 4 to 11 days. The minimum hospitalization time was 2 days, and the maximum was 65 days. Viral load and CD4 counts did not differ between ART-naïve and ART-non-adherent PLWHA. The median viral load for ART-naïve PLWHA was 181,092 copies of HIV RNA/mL, with an IQR of 46,442 to 494,805 copies/mL, while the median viral load for ART-non-adherent PLWHA was 287,753 copies of HIV RNA/mL, with an IQR of 40,807 to 760,571 copies/mL ($p=0.922$). The median CD4 T-cell count for ART-naïve PLWHA was 29.5×10^3 cells/mL (IQR 19.2 to 136.8×10^3 cells/mL), while for ART-non-adherent PLWHA it was 27.5×10^3 cells/mL (IQR 13.7 to 223×10^3 cells/mL) ($p=0.707$).

Since ART-naïve PLWHA have no prior experience with antiretroviral drugs, we specifically assessed the correlations of these immunological markers with CD4+ T cell counts in both ART-naïve and ART-non-adherent PLWHA, focusing on those who either died or were discharged (Fig. 3). In the ART-naïve PLWHA who died, CD4+ T cell counts were inversely correlated with several immunological markers, IL-1 β ($r=-0.69$, $p=0.0212$); IL-2 ($r=-0.74$, $p=0.012$); IL-4 ($r=-0.80$, $p=0.0049$); IL-5 ($r=-0.84$, $p=0.003$); IL-6 ($r=-0.62$, $p=0.027$); IL-9 ($r=-0.77$, $p=0.008$); IL-15 ($r=-0.81$, $p=0.003$); IL-17 ($r=-0.86$, $p=0.002$); FGF ($r=-0.79$, $p=0.007$); G-CSF ($r=-0.65$, $p=0.029$); CCL2 ($r=-0.84$, $p=0.002$); CCL3 ($r=-0.70$, $p=0.018$) e CXCL8 ($r=-0.84$, $p=0.003$), and positively correlated with CCL4 ($r=0.78$, $p=0.032$) and VEGF ($r=0.85$, $p=0.0009$). However, no significant correlations

Variables	ART-Naïve PWLHA				ART-Non adherent PWLHA			
	Discharged		Death		Discharged		Death	
	r	P-value	r	P-value	r	P-value	r	P-value
IFN γ	0,03721	0,8835	-0,6059	0,0732	-0,184	0,2435	-0,1533	0,5544
IL-1 β	-0,1724	0,4939	-0,6925	0,0212*	-0,1902	0,2275	-0,2747	0,2838
IL-1ra	-0,1074	0,6715	-0,4545	0,1474	-0,09387	0,5543	-0,05028	0,8482
IL-2	-0,4369	0,0699	-0,7455	0,0129*	-0,1895	0,2294	-0,1877	0,4674
IL-4	0,2377	0,3422	-0,8091	0,0049*	-0,4047	0,0078*	-0,1609	0,5337
IL-5	-0,1115	0,6596	-0,8455	0,0033*	-0,2335	0,1367	-0,1717	0,5071
IL-6	0,2589	0,2995	-0,6273	0,0278*	-0,04367	0,7836	0,008584	0,9756
IL-7	-0,09301	0,7136	-0,09081	0,7914	0,1072	0,4991	0,04386	0,8665
IL-9	-0,1725	0,4936	-0,7727	0,0087*	-0,08829	0,5782	-0,1386	0,5935
IL-10	-0,07625	0,7636	-0,5364	0,0839	-0,2073	0,1877	0,08216	0,753
IL-12p70	-0,2773	0,2653	-0,4977	0,1692	0,2006	0,2027	-0,3595	0,1559
IL-13	0,04021	0,8741	0,03636	0,9739	-0,1361	0,3901	-0,4346	0,0822
IL-15	-0,246	0,3252	-0,8182	0,0038*	-0,0249	0,8756	-0,1313	0,6128
IL-17	0,1436	0,5697	-0,8636	0,0025*	-0,2719	0,0816	-0,07485	0,7741
TNF α	-0,4471	0,0629	0,4909	0,1616	-0,2929	0,0597	-0,13	0,6167
FGF	0,1911	0,4475	-0,7909	0,007*	-0,1216	0,4431	0,04047	0,8779
G-CSF	-0,3279	0,184	-0,6545	0,0299*	0,04244	0,7896	-0,09571	0,7129
GM-CSF	-0,1648	0,5135	-0,8374	0,0021*	-0,2483	0,1128	0,1534	0,5523
PDGFbb	0,04956	0,8452	-0,1545	0,4851	0,3426	0,0264*	-0,06009	0,8186
VEGF	-0,01057	0,9668	0,8532	0,0009*	0,06699	0,6734	-0,3294	0,1951
CCL2	0,2447	0,3277	-0,8455	0,0025*	-0,1977	0,2095	-0,3225	0,2057
CCL3	-0,2552	0,3068	-0,7091	0,0185*	-0,1344	0,3961	-0,1239	0,6338
CCL4	-0,1931	0,4427	0,7818	0,0323*	0,05431	0,7326	-0,1655	0,5228
CCL5	-0,2426	0,332	0,1959	0,7111	-0,0586	0,7124	-0,3613	0,1537
CCL11	0,3511	0,1532	-0,5727	0,0667	-0,3052	0,0494*	-0,1471	0,5704
CXCL8	-0,1373	0,5869	-0,8455	0,0033*	-0,203	0,1973	-0,01839	0,9454
CXCL10	0,03511	0,89	-0,4727	0,1275	-0,1722	0,2754	-0,05763	0,8259

Fig. 3 Correlations between immunological markers and CD4 T cell counts according to ART status. Each immunological marker was correlated with the CD4 T cell count on admission among PLWHA who died or were discharged, classified into ART-naïve, ART-non-adherent or PLWHA with suppressed viremia. The correlation between CD4 T cell counts for each marker was calculated using Spearman's correlation coefficient (r = Rho value). Positive correlations are in blue gradient scale and negative correlations are in red gradient scale. Only the p-values with statistically significant differences are depicted with an asterisk: * $p < 0.05$; ** $p < 0.005$

were observed in those who were discharged. Conversely, in ART-non-adherent PLWHA, IL-4 and CCL11 levels were inversely correlated with CD4+ T cell counts, and PDGFbb levels were positively correlated in those who were discharged, with no significant correlations in those who died. The extensive correlations observed in ART-naïve PLWHA who died indicate that the exacerbation of these markers is associated with lower CD4+ T cell counts.

Overall, levels of most of the 27 immunological markers were increased in the post-mortem samples compared to the admission samples (Fig. 4A-C). Exceptions were the growth factors PDGFbb, and VEGF (Fig. 4B), and the chemokines CCL3, CCL5 and CXCL10 (Fig. 4C), which did not increase compared to levels on admission. When comparing ART-naïve PLWHA and ART-non-adherent PLWHA, Table 3 shows an increase in both

groups post-mortem for IFN- γ , IL-1 β , IL-1RA, IL-4, IL-6, IL-10, IL-12p70, IL-13, IL-15, FGF, G-CSF, CCL2, CCL11 and CXCL8. Of these immunological markers, only CCL3 ($p = 0.0114$) and CXCL8 ($p = 0.040$) measured post-mortem differed between ART-naïve PLWHA and ART-non-adherent PLWHA. Nonetheless, the levels of IL-17 ($p = 0.012$), IL-7 ($p = 0.008$) and IL-9 ($p = 0.008$) were increased in the post-mortem samples of ART-naïve PLWHA but not in those who reported non-adherence to ART. Figure 5A-F illustrate these differences post-mortem compared to admission. Conversely, IL-2 ($p = 0.003$) and IL-5 ($p = 0.0001$) were increased in the post-mortem samples of those who reported non-adherence to ART but not in ART-naïve PLWHA (Table 3; Fig. 5G-J). Figure 5L-M show that the increase in IFN- γ in the post-mortem samples occurred in both groups; however, the increase observed in ART-non-adherent PLWHA was very abrupt.

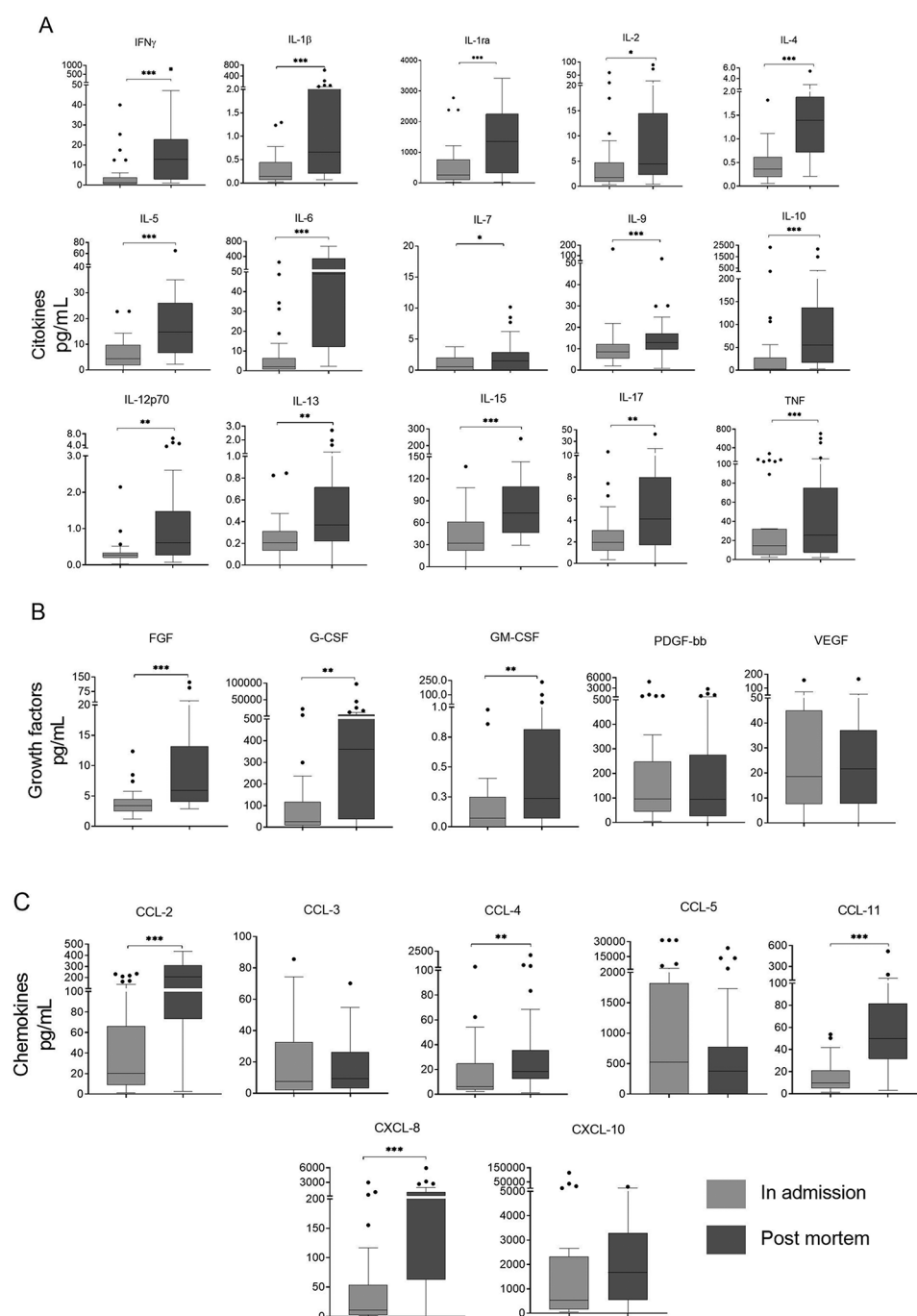


Fig. 4 Temporal comparison of the cytokines, chemokines, and growth factors between samples taken on admission and during post-mortem. Measurement of immunological mediators (Bio-Plex Pro human cytokine 27-plex kit) among HIV/AIDS patients who were discharged or died. Concentrations were compared using the Wilcoxon test. **A**) Cytokines are shown in alphabetical sequence. **B**) Growth factors are shown in alphabetical sequence. **C**) Chemokines are shown in alphabetical sequence

Discussion

As of 2023, the state of Amazonas reported 31% of PLWHA start ART with CD4 counts below 200 cells/mm³ [5], a stage that has been the leading cause of hospitalization among this population for over a decade, as these individuals face significantly higher risks of opportunistic

infections and mortality [13–16]. This study is the first to report a higher risk of death in hospitalized ART-naïve PLWHA, and it should be highlighted that sociodemographic determinants, such as disinformation, poverty and social stigmas, contribute to non-adherence to ART [6]. Additionally, our study indicates that the burden of

Table 3 Correlation of inflammatory mediators with CD4 cell count in HIV/AIDS patients hospitalized treatment naive with virological failure (failure) on admission and at postmortem

	ART-naïve PLWHA N = 15			ART non-adherence PLWHA N = 17			Comparison between groups	
	In admission	Postmortem	p	In admission	Postmortem	p	Data in admission	Data in postmortem
IFN γ	3.015 (0.88: 12.51)	13.89 (4.34: 20.64)	0.012	0.355 (0.865: 1.488)	11.55 (2.67: 22.8)	0.001	0.059	0.576
IL-1 β	0.125 (0.07: 0.66)	1.335 (0.36: 9.575)	0.010	0.0725 (0.145: 0.2425)	0.3 (0.13: 2.695)	0.009	0.918	0.249
IL-1ra	224.5 (104.2: 1188)	1544 (852.3: 2625)	0.003	75.21 (254.8: 490.8)	1014 (278.2: 1657)	0.003	0.312	0.140
IL-2	1.615 (0.99: 9.05)	4.695 (2.495: 15.76)	0.107	0.8525 (1.92: 4.028)	3.675 (2.243: 13)	0.003	0.647	0.433
IL-4	0.305 (0.2: 0.825)	1.665 (0.615: 1.885)	0.005	0.165 (0.375: 0.535)	1.21 (0.7125: 1.998)	0.0001	0.992	0.984
IL-5	6.065 (2.75: 14.01)	14.76 (6.775: 29.37)	0.054	1.348 (3.245: 7.28)	14.09 (6.145: 25.95)	0.0001	0.053	0.975
IL-6	1.23 (0.845: 7.215)	126 (10.99: 351.2)	0.008	0.375 (3.23: 8.558)	46.15 (11.38: 305.3)	0.001	0.978	0.765
IL-7	0 (0: 1.565)	2.655 (0.83: 3.6)	0.008	0.285 (1.07: 2.115)	1.435 (0: 2.158)	0.999	0.057	0.128
IL-9	8.42 (5.1: 11.81)	14.46 (8.85: 18.31)	0.008	7.513 (8.455: 12.56)	12.92 (10.51: 15.65)	0.174	0.411	0.550
IL-10	4.76 (1.335: 41.03)	21.03 (15.42: 91.4)	0.049	0.575 (1.595: 25.15)	62.04 (14.15: 186.2)	0.010	0.176	0.526
IL-12p70	0.27 (0.185: 0.43)	1.185 (0.305: 2.125)	0.012	0.2 (0.265: 0.3175)	0.535 (0.255: 1.208)	0.011	0.634	0.472
IL-13	0.2 (0.105: 0.4)	0.59 (0.22: 0.93)	0.039	0.1375 (0.215: 0.2775)	0.37 (0.2: 0.6)	0.009	0.674	0.727
IL-15	38.68 (22.23: 63.1)	73.34 (45.03: 110.9)	0.015	18.09 (29.59: 49.19)	63.41 (47.59: 106.8)	0.0002	0.294	0.881
IL-17	1.775 (1.21: 5.255)	4.77 (2: 11.84)	0.021	1.16 (2.355: 2.893)	3.395 (1.49: 5.715)	0.330	0.888	0.261
TNF α	10.8 (3.425: 28.14)	25.03 (5.325: 82.24)	0.330	7.078 (14.42: 60.5)	26.97 (8.27: 62.48)	0.611	0.411	0.433
FGF	3.405 (2.57: 5.76)	8.72 (4.095: 14.7)	0.005	2.365 (3.41: 4.443)	5.55 (4.095: 11.35)	0.001	0.801	0.621
G-CSF	44.07 (10.82: 165.2)	469.6 (63.88: 11519)	0.043	6.565 (18.43: 63.12)	64.27 (8.33: 1485)	0.015	0.261	0.113
GM-CSF	0.07 (0.0: 0.34)	0.235 (0.075: 0.755)	0.148	0.06 (0.0: 0.25)	0.22 (0.035: 1.02)	0.052	0.693	0.977
PDGFbb	54.49 (17.37: 221.8)	130.5 (17.22: 312.5)	0.595	69.62 (115.8: 302.5)	65.6 (27.14: 146.6)	0.224	0.105	0.550
VEGF	14.28 (6.66: 44.98)	21.61 (9.27: 35.64)	0.719	5.17 (18.64: 38.45)	15.01 (3.33: 38.38)	0.979	0.940	0.829
CCL2	45.75 (12.28: 170.4)	193.6 (87.52: 271.3)	0.025	3.975 (14.22: 23.31)	234 (80.13: 317.1)	0.0001	0.048	0.832
CCL3	8.645 (3.86: 59.27)	26.12 (7.755: 31.75)	0.719	1.183 (3.36: 13.5)	7.12 (1.508: 16.04)	0.611	0.142	0.011
CCL4	10.13 (3.535: 23.19)	11.69 (7.455: 24.65)	0.990	5.118 (15.07: 27.38)	13.33 (5.52: 65.51)	0.377	0.526	0.628
CCL5	744.3 (3.59: 2144)	240.9 (0: 541.8)	0.426	437.9 (0: 3484)	449 (2.23: 885.4)	0.743	0.799	0.405
CCL11	7.895 (4.895: 22.8)	42.74 (12.97: 76.41)	0.002	5.575 (11.37: 19.77)	62.3 (35.99: 88.89)	0.0001	0.852	0.277
CXCL8	16.08 (3.295: 94.18)	654.7 (151.8: 1894)	0.012	2.155 (7.145: 19.24)	178.8 (46.57: 442.5)	0.0001	0.153	0.048
CXCL10	649.7 (383.3: 2546)	1412 (531.4: 2604)	0.719	115.8 (321.2: 1593)	2058 (451.7: 3305)	0.120	0.113	0.635

#: Median(IQ25:IQ75) *: p-value < 0.05; ** p < 0.005

hospitalization remains high among those with advanced HIV, regardless of whether the PLWHA had experience with ART, which is consistent with the findings of this systematic study [14, 15]. The higher mortality in ART-naïve PLWHA presented as late presenters underscores the need for particular attention from the government authorities that are responsible for addressing the social vulnerabilities of PLWHA in the state of Amazonas, as the persistence of advanced HIV is leading to increased AIDS-related mortality in this ART era, especially due to a new wave [40], despite some positive results [1–3, 41].

The massive depletion of CD4+ T cells and HIV viremia lead to extensive immune activation and progression to advanced HIV, which is associated with an increased risk of all-cause mortality [42]. Although the average CD4 count of those who died was lower, nearly all of these patients were in advanced AIDS with severe CD4 depletion. However, the average viremia in those who

died was significantly higher compared to those who were discharged. Therefore, the very high levels of several cytokines, chemokines, and growth factors observed in PLWHA who died after hospital admission, as seen in the univariate analysis, are more strongly associated with viral replication than with low CD4 counts. Krastinova and colleagues [43] found an association between viral load and disease progression, showing that higher HIV viral load was significantly correlated with elevated levels of markers, including CCL2, compared to those with lower viral loads. Thus, our findings align with the understanding that immune activation, characterized by excessive cytokine and chemokine production, is associated with rapid disease progression and increased mortality risk [26, 43–48].

During HIV-1 infection, various cytokines and chemokines are activated, influencing viral replication either positively or negatively [49]. While several serological

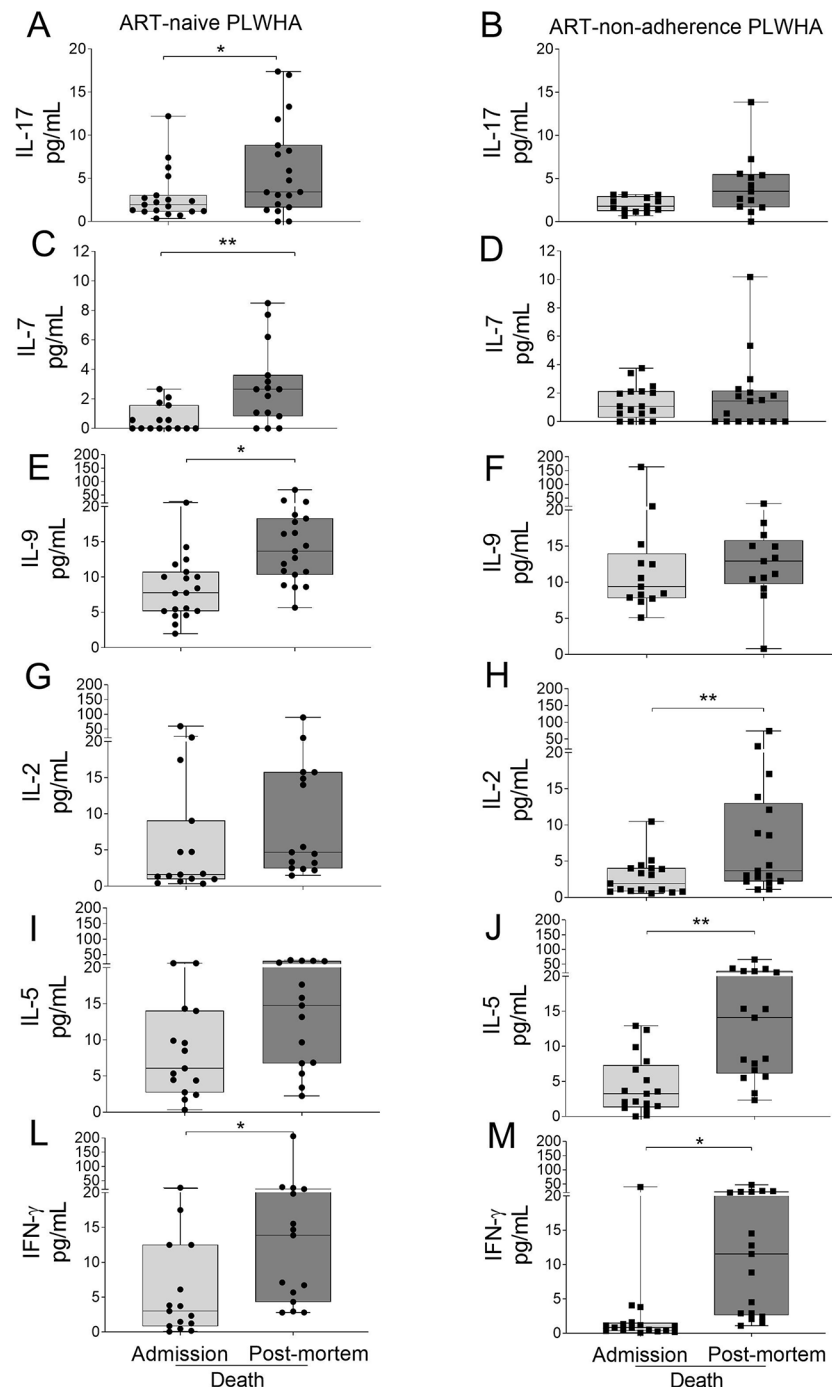


Fig. 5 Differences between levels of IL-17, IL-7, IL-9, IL-2, IL-5 and IFN γ in samples taken post-mortem in relation to the samples taken on admission to hospital among ART-naïve and ART-non-adherence PLWHA. Concentrations were compared using the Wilcoxon test

markers were elevated in those who succumbed to the disease, INF- γ , CCL2, and CCL3 were the only factors identified as significant predictors of mortality in our multivariate analysis, building upon earlier findings [26]. A study highlights the role of gamma interferon (IFN- γ) in PLWHA that experienced treatment failure with a significant increase in IFN- γ levels suggesting a link to

a pro-inflammatory immune state associated with high viral loads [32]. In relation to chemokines, we observed divergent associations between the relative risks of CCL2 and CCL3 with outcomes (Table 2). While CCL2 acted as a protective factor, CCL3 emerged as a risk factor. Meanwhile, CCL5 approached statistical significance. Additionally, we observed divergent associations

between CD4 counts and the chemokines CCL2, CCL3, and CCL4 in treatment-naïve PLHIV who died. CCL2 and CCL3 showed an inverse correlation with CD4, while CCL4 had a direct correlation. This result aligns with the known roles of chemokines and their receptors in HIV infection, where CCR2b and CCR3, ligands for CCL2 and CCL3, may have inhibitory effects on viral entry, though possibly less potent than other pathways [49, 50]. Chemokines such as CCL5, CCL3, and CCL4, ligands for CCR5, are known to block the entry of early-stage HIV strains, while SDF-1 α , the ligand for CXCR4, inhibits later-stage strains [50]. Campbell et al. demonstrated that CCL2 levels correlate with HIV viral load, indicating that CCL2 may enhance CD4+ T cell susceptibility to infection by upregulating CXCR4, facilitating X4-tropic HIV strain entry [51]. Other studies suggest that CCL2 may indirectly block viral entry by promoting receptor dimerization, impacting CCR5 and CXCR4 without downregulating these receptors [52, 53]. These multifaceted roles of chemokines provide insight into the divergent risk associations observed in our analysis, prompting further questions about how the host's chemokine system influences viral replication and tropism. This is particularly relevant given the high prevalence of subtype B in the region, as documented in previous studies [54, 55].

In addition to analyzing mortality outcomes, our study reveals important differences in cytokine profiles between ART-naïve PLWHA and those who have undergone anti-retroviral therapy. Some studies have reported that IL-4, TNF- α and IFN- γ are inversely associated with CD4 T cell counts [17, 18]. In our study, several markers were inversely associated with CD4 T cell counts in ART-naïve PLWHA. Benjamin Amoani et al. [17] discuss the modulation of cytokines by ART, noting that as the viral load decreases, these cytokine levels normalize while anti-inflammatory cytokines decrease. This aligns with our data, which shows that the inverse correlation between CD4 counts and certain cytokines in ART-naïve PLWHA may disappear with ART-experience, even with non-adherence. Despite this, more studies are necessary to underscore the impact of ART on cytokine modulation and immune response.

A unique aspect of this study is the comparison of 27 immunological markers in post-mortem samples. With the exception of PDGFbb, VEGF, CCL3, CCL5 and CXCL10, all other markers were exacerbated post-mortem compared to levels on admission (Fig. 3). According to Maes et al. [39], the 27-plex can be separated into an immune profile, such as the M1 macrophage (IL-1 β , sIL-1RA, IL-6, TNF- α , CXCL8, CCL3), T helper-1 (IL-2, IFN- γ , IL-12), T helper-2 (IL-4, IL-5, IL-9, IL-13) and T helper-17 (IL-6, IL-17). Additionally, it includes systems such as the broad immune-inflammatory response system (IRS), which is composed of IL-1 β , IL-6, TNF- α , CXCL8, CCL3, IL-2, IFN- γ , IL-12, IL-17, IL-15, G-CSF, GM-CSF, CXCL10,

CCL5 and CCL2, and the compensatory immunoregulatory system (CIRS), which is composed of IL-4, IL-10 and sIL-1RA. All the immune profiles were significantly exacerbated in post-mortem samples. Additionally, post-mortem levels of these markers, especially IL-6, were significantly elevated, closely resembling the cytokine storm observed in critically ill SARS-CoV-2 patient [56–59]. Therefore, our findings may help identify generic immunological markers to predict mortality in advanced HIV.

As highlighted earlier, the risk of death is higher among ART-naïve PLWHA. Very few studies have compared cytokine levels between ART-naïve and ART-nonadherent PLWHA. Musa and colleagues evaluated a few cytokines in ART-naïve and ART non-adherent PLWHA from the outpatient clinic of the comprehensive HIV care unit at the referral hospital. Although pro-inflammatory cytokine levels tended to be higher in ART-naïve PLWHA, the difference was not statistically significant, and both groups exhibited immune dysregulation with significantly reduced levels of IFN- γ [18]. Two studies highlight cytokine dysregulation in ART-naïve PLWHA, focusing on a limited set of cytokines [29, 30]. Both show elevated levels of both pro-inflammatory and anti-inflammatory cytokines, reduced IFN- γ levels, and IL-17 A levels remaining relatively stable, indicating an immune response skewed towards Th2 cytokines. Our study is the first to evaluate this in hospitalized patients, including post-mortem analysis. Given the treatment of hospitalized patients with advanced AIDS, standard hospital protocol may minimize individual variations in opportunistic infections and treatment by employing antimicrobial prophylaxis, delayed ART until stabilization, metabolic management, and corticosteroid support when necessary. By comparing levels at admission and autopsy, the increase in postmortem IL-17 levels in ART-naïve PLWHA, which is not seen in ART-non-adherent PLWHA, contrasts with the rise in IL-2 levels in the latter group, not observed in ART-naïve PLWHA, suggesting a dichotomy (Table 3; Fig. 5). In addition, T helper-2 was represented by distinct cytokines, namely IL-9 in ART-naïve PLWHA and IL-5 in ART-non-adherent PLWHA, in agreement with [29, 30]. Curiously, the increases of postmortem IFN- γ levels in relation to admission in both groups. Although these data were observed in patients who died, who had advanced AIDS and high viral loads, our findings suggest that standard hospital protocols may help mitigate the imbalance caused by incomplete immune recovery and persistent immune activation, which can hinder effective viral control. Further studies are needed to clarify the observed dichotomy between ART-naïve PLWHA and those with ART experience, and to evaluate whether derepression of cytokine imbalance can be achieved through immune recovery.

The study presents several limitations that could impact the interpretation of its findings. One of the primary

limitations is the relatively small sample size of 111 patients, which may limit the generalizability of the findings to a broader population of individuals living with HIV/AIDS. Second, the patients in this study had advanced AIDS and were highly susceptible to opportunistic infections, such as tuberculosis and candidiasis, which may have acted as confounding factors by influencing cytokine levels. However, despite the heterogeneity of co-infections, none, including tuberculosis, showed a significant association with the risk of death. This lack of association makes it challenging to directly attribute the immune markers to mortality or hospital discharge. Furthermore, both intracellular and extracellular pathogens elicit distinct immune responses, and the presence of multiple co-infections likely contributes to a complex cytokine environment. As a result, the disproportionate elevations in cytokines, chemokines, and growth factors observed in patients who died may reflect not only the cumulative effects of these infections but also a broader immune dysregulation typical of terminal stages, rather than pathogen-specific responses. Importantly, the individuals who died had significantly higher HIV viral loads compared to those discharged, suggesting that the viral burden itself could be the primary driver of the observed immune dysregulation. Third, the study lacks a detailed explanation of factors leading to virological failure, which could offer more context regarding its relationship with mortality. Fourth, non-infectious comorbidities, while relevant in other stages of HIV, were not prioritized in our analysis because their influence is likely overshadowed by the more immediate impact of opportunistic infections and the underlying high viral load typical of advanced AIDS. At this stage, the immune system is heavily compromised, and the primary drivers of immune activation and cytokine elevation are related to the host's response to these infections and viral replication rather than non-infectious comorbidities. Fifth, socioeconomic and environmental factors have not been included although they may have impacted ART adherence and patient health. While these variables are crucial for interpreting mortality outcomes in resource-limited settings like the state of Amazonas, they are difficult to quantify and would shift the focus of the study.

This highlights the possibility of leveraging these chemokines not only as biomarkers for disease progression but also as therapeutic agents, potentially improving outcomes in patients with advanced HIV/AIDS who are non-adherent or untreated with antiretroviral therapy. Further investigation into the modulation of chemokine pathways could open new avenues for clinical management and targeted therapies in these high-risk groups.

Conclusions

The main causes of advanced HIV are late treatment initiation and low adherence to ART, leading to early respiratory syndromes and opportunistic infections. Soluble

immunological markers have prognostic significance and can predict mortality among hospitalized PLWHA. This study identified three markers (IFN γ , CCL2, and CCL3) that are potential predictors of mortality due to their high levels in ART-naïve patients who died. Further studies are needed to confirm these findings, which could improve clinical outcomes and prevent death in PLWHA.

Supplementary Information

The online version contains supplementary material available at <https://doi.org/10.1186/s12879-024-10260-z>.

Supplementary Material 1

Acknowledgements

This research was financed by Fundação de Amparo à Pesquisa do Estado do Amazonas (POSGRAD Program #002/2024) and Coordenação de Aperfeiçoamento de Pessoal de Nível Superior (PDGP-CONSOLIDAÇÃO 3-4 Program-#88887.707248/2022-00), and by FAPEAM: Autopercepção do envelhecimento com causa do abandono da Terapia antirretroviral (TARV) em Pessoas vivendo com HIV (PLHIV) no Estado de Amazonas call No. 04/2022 – INOVAÇÃO NA AMAZONIA – FIOCRUZ-FAPEAM. The study was supported by Coordenação de Aperfeiçoamento de Pessoal de Nível Superior – CAPES (PROCAD Amazonia 88887.200582/2018-00). MRF received a doctoral fellowship by FAPEAM. TVRA and BJB received a post-doctoral fellowship by “Programa Nacional de Cooperação Acadêmica na Amazônia” from Coordenação de Aperfeiçoamento de Pessoal de Nível Superior, Brazil (PROCAD-AM 88887.321243/2019-00). WMG received a doctoral grant 119 from Programa de Pós-graduação em Immunologia Basica e Aplicada” at the Universidade Federal do Amazonas. RSP received a master fellowship by CAPES. TSX received a doctoral fellowship by Fundação de Amparo à Pesquisa do Estado do Amazonas – FAPEAM (POSGRAD Program); MVGL is level I CNPq fellowship. This work was funded by a grant from Fundação Oswaldo Cruz - Programa INOVA_Geração do Conhecimento, number VPPCB-007-FIO-18, call 28/2018. The funders had no role in study design, data collection and data analysis, decision to publish or preparation of the manuscript.

Author contributions

WMG, GM, BJB, MFS, TVRA, AA da SB, AG da C, OAM-F, MVGL, LC de LF, ZMS, HN dos SI, ATC and YOC were responsible for the data collection from medical records. TX, MMM, RSP, JMS were responsible for the data collection from medical records, death certificate. WMG, YOC, and AG da C performed immunoassays. ZMS, MVGL, ASB and PAN performed the statistical analyses, MVGL, TVRAA, MFS, LC de LF and PAN participated in study design. TVRA, MFS, LC de LF and PAN wrote the first draft of the manuscript. YOC, WMG, ZMS, ASB and PAN elaborated the final version of the manuscript. All authors read and approved the final manuscript.

Funding

This research was financed by Fundação de Amparo à Pesquisa do Estado do Amazonas (POSGRAD Program #002/2024) and Coordenação de Aperfeiçoamento de Pessoal de Nível Superior (PDGP-CONSOLIDAÇÃO 3-4 Program-#88887.707248/2022-00), and by FAPEAM: Autopercepção do envelhecimento com causa do abandono da Terapia antirretroviral (TARV) em Pessoas vivendo com HIV (PLHIV) no Estado de Amazonas call No. 04/2022 – INOVAÇÃO NA AMAZONIA – FIOCRUZ-FAPEAM. The study was supported by Coordenação de Aperfeiçoamento de Pessoal de Nível Superior – CAPES (PROCAD Amazonia 88887.200582/2018-00). MRF received a doctoral fellowship by FAPEAM. TVRA, YOC and BJB received a post-doctoral fellowship by “Programa Nacional de Cooperação Acadêmica na Amazônia” from Coordenação de Aperfeiçoamento de Pessoal de Nível Superior, Brazil (PROCAD-AM 88887.321243/2019-00). WMG received a doctoral grant 119 from Programa de Pós-graduação em Immunologia Basica e Aplicada” at the Universidade Federal do Amazonas. RSP received a master fellowship by CAPES. TSX received a doctoral fellowship by Fundação de Amparo à Pesquisa do Estado do Amazonas – FAPEAM (POSGRAD Program); MVGL is level I CNPq fellowship. This work was funded by a grant from Fundação Oswaldo Cruz -

Programa INOVA_Geração do Conhecimento, number VPPCB-007-FIO-18, call 28/2018. The funders had no role in study design, data collection and data analysis, decision to publish or preparation of the manuscript.

Data availability

The datasets used and/or analyzed during the current study are available from the corresponding author on reasonable request.

Declarations

Ethical approval and consent to participate

Informed consent was obtained from all of the participants in the study. All the protocols and consent forms were approved by the Fundação de Medicina Tropical Dr. Heitor Vieira Dourado Ethics Review Board (CAAE: 57330116.6.0000.0005) in accordance with Resolution No. 466/12 of the Brazilian National Health Committee and in compliance with the Declaration of Helsinki.

Consent for publication

Not applicable.

Competing interests

The authors declare no competing interests.

Author details

¹Programa de Pós-graduação em Ciências da Saúde, Universidade Federal do Amazonas, Manaus, Amazonas 69020-160, Brazil

²Laboratório de Diagnóstico e Controle de Doenças Infecciosas na Amazônia (DCDIA), Instituto Leônidas e Maria Deane (ILMD)– Fiocruz Amazônia, Manaus, Amazonas 69057-070, Brazil

³Programa de Pós-Graduação em Biologia da Relação Patógeno-Hospedeiro, Fundação Oswaldo Cruz-Instituto Leônidas e Maria Deane, Manaus, Amazonas 69057-070, Brazil

⁴Programa de Pós-graduação em Ciências Aplicadas à Hematologia, PPGH-UEA/HEMOAM, Manaus, Amazonas 69050-001, Brazil

⁵Programa de Pós-Graduação em Imunologia Básica e Aplicada, Universidade Federal do Amazonas, Manaus, Amazonas 69080-900, Brazil

⁶Departamento de Patologia e Medicina Legal, Universidade Federal do Amazonas, Manaus, Amazonas 69020-160, Brazil

⁷Programa de Pós-Graduação em Medicina Tropical, Universidade do Estado do Amazonas, Manaus, Amazonas 69040-000, Brazil

⁸Laboratório de Biomarcadores de Diagnóstico e Monitoração, Centro de Pesquisas René Rachou, Fundação Oswaldo – Fiocruz Minas Gerais, Belo Horizonte, Minas Gerais 30190-002, Brazil

⁹Fundação de Medicina Tropical Doutor Heitor Vieira Dourado, Manaus, Amazonas 69057-070, Brazil

¹⁰AIDS Healthcare Foundation (AHF), Los Angeles, CA 90028, USA

Received: 24 January 2024 / Accepted: 22 November 2024

Published online: 09 February 2025

References

- Mangal TD, Meireles MV, Pascom ARP, De Almeida Coelho R, Benzaken AS, Hallett TB. Determinants of survival of people living with HIV/AIDS on antiretroviral therapy in Brazil 2006–2015. *BMC Infect Dis*. 2019;19:1–9. <https://doi.org/10.1186/s12879-019-3844-3>.
- Benzaken AS, Pereira GFM, Costa L, Tanuri A, Santos AF, Soares MA. Antiretroviral treatment, government policy and economy of HIV/AIDS in Brazil: is it time for HIV cure in the country? *AIDS Res Ther*. 2019;16:1–7. <https://doi.org/10.1186/s12981-019-0234-2>.
- Leon C, Koosed T, Philibert B, Raposo C, Benzaken AS. HIV/AIDS health services in Manaus, Brazil: patient perception of quality and its influence on adherence to antiretroviral treatment. *BMC Health Serv Res*. 2019;19:1–11. <https://doi.org/10.1186/s12913-019-4062-9>.
- Ministério_da_Saúde. Brazil Secretaria_de_Vigilância_em_Saúde (SVS), Departamento de DST. Cuidado integral às pessoas que vivem com HIV pela Atenção Básica Manual para a equipe multiprofissional. 2015.
- BRASIL. 2022. Relatório de Monitoramento Clínico do HIV 2022. Relatório Monit Clínico do HIV. 2022;3: 142. Available: <http://www.aids.gov.br/pt-br/sea/rch/content/monitoramentoclinico>
- Pascom ARP, Meireles MV, Benzaken AS. Sociodemographic determinants of attrition in the HIV continuum of care in Brazil, in 2016. *Med (United States)*. 2018;97:S69–74. <https://doi.org/10.1097/MD.00000000000009857>.
- Sun C, Li J, Liu X, Zhang Z, Qiu T, Hu H, et al. HIV/AIDS late presentation and its associated factors in China from 2010 to 2020: a systematic review and meta-analysis. *AIDS Res Ther*. 2021;18:1–14. <https://doi.org/10.1186/s12981-021-00415-2>.
- Ribeiro LCS, Freitas MI, de Tupinambás F, Lana U. Late diagnosis of human immunodeficiency virus infection and associated factors. *Rev Lat Am Enfermagem*. 2020;28:1–12. <https://doi.org/10.1590/1518-8345.4072.3342>.
- Elgalib A, Shah S, Al-Wahaibi A, Al-Habsi Z, Al-Fouri M, Lau R, et al. Predictors of late presentation and advanced HIV disease among people living with HIV in Oman (2000–2019). *BMC Public Health*. 2021;21:1–8. <https://doi.org/10.1186/s12889-021-12048-1>.
- Lundgren JD, Babiker AG, Gordin FM, Borges ÁH, Neaton JD. When to start antiretroviral therapy: the need for an evidence base during early HIV infection. *BMC Med*. 2013;11:148. <https://doi.org/10.1186/1741-7015-11-148>.
- Boulougoura A, Sereti I. HIV infection and immune activation: the role of coinfections. *Curr Opin HIV AIDS*. 2016;11:191–200. <https://doi.org/10.1097/COH.0000000000000241>.
- The Antiretroviral Therapy Cohort Collaboration. Causes of death in HIV-1-infected patients treated with antiretroviral therapy, 1996–2006: collaborative analysis of 13 HIV Cohort studies. *Clin Infect Dis*. 2010;50:1387–96. <https://doi.org/10.1086/652283.Causes>.
- Da Silva LCF, Dos Santos EM, Neto ALDS, Miranda AE, Talhari S, Toledo LDM. Padrão Da infecção pelo HIV/AIDS em Manaus, Estado do Amazonas, no período de 1986 a 2000. *Rev Soc Bras Med Trop*. 2009;42:543–50. <https://doi.org/10.1590/S0037-86822009000500012>.
- De Souza SLS, Feitoza PVS, De Araújo JR, De Andrade RV, Ferreira LCDL. Causas De óbito em pacientes com síndrome da imunodeficiência adquirida, necropsiados na Fundação De Medicina Tropical Do Amazonas. *Rev Soc Bras Med Trop*. 2008;41:247–51. <https://doi.org/10.1590/S0037-86822008000300005>.
- Oliveira RDSM, De, Benzaken AS, Saraceni V, Sabid?? M. Hiv/aids epidemic in the state of Amazonas: characteristics and trends from 2001 to 2012. *Rev Soc Bras Med Trop*. 2015;48:70–8. <https://doi.org/10.1590/0037-8682-0121-2013>.
- Ferreira MD, Das Neves CP, De Souza AB, Beraldi-Magalhães F, Migliori GB, Kritski AL, et al. Predictors of mortality among intensive care unit patients coinfecting with Tuberculosis and HIV. *J Bras Pneumol*. 2018;44:118–24. <https://doi.org/10.1590/s1806-37562017000000316>.
- Amoani B, Sakyi SA, Barnie PA, Pomeyie K. Effect of ART on Cytokine Profile amongst HIV Patients: A Systematic Review and Meta-Analysis Inducible nitric oxide synthase promoter polymorphism and malaria disease severity in Ghana View project Viral suppression and rebound among HIV patients in Ghan. 2021;7: 1–10. Available: <https://www.researchgate.net/publication/358266364>
- Musa F, Shaviya N, Mambo F, Abonyo C, Barasa E, Wafula P, et al. Cytokine profiles in highly active antiretroviral treatment non-adherent, adherent and naive HIV-1 infected patients in Western Kenya. *Afr Health Sci*. 2021;21:1584–92. <https://doi.org/10.4314/ahs.v21i4.12>.
- Bipath P, Levay P, Olorunju S, Viljoen M. A non-specific biomarker of disease activity in HIV/AIDS patients from resource-limited environments. *Afr Health Sci*. 2015;15:334–43. <https://doi.org/10.4314/ahs.v15i2.5>.
- Mlambo T, Tshabalala M, Bandason T, Mhandire K, Mudenge B, Zijenah LS. Correlation of high Interleukin 17A and interleukin 6 levels with high virus load among subtype C HIV-infected, antiretroviral therapy-naïve Zimbabwean patients: a cross-sectional study. *Open AIDS J*. 2019;13:59–64. <https://doi.org/10.2174/1874613601913010059>.
- Ikomey GM, Happi Mbakam C, Assoumou MCO, Brandon JG, Mesembe M, Mbamyah EL, et al. Cytokine levels of interleukin-2 and 7 amongst antiretroviral therapy success and failure HIV patients attending the University Teaching Hospital, Yaoundé, Cameroon. *Int J Biol Chem Sci*. 2020;14:11–9. <https://doi.org/10.4314/ijbcs.v14i1.2>.
- Late_Presentation_Working_Group_in_EuroSIDA_and_COHERE. Estimating the burden of HIV late presentation and its attributable morbidity and mortality across Europe 2010–2016. *BMC Infect Dis*. 2020;20:1–11. <https://doi.org/10.1186/s12879-020-05261-7>.
- Azamar-Alonso A, Bautista-Arredondo SA, Smaili F, Mbuagbaw L, Costa AP, Tarride JE. Patient characteristics and determinants of CD4 at diagnosis of

- HIV in Mexico from 2008 to 2017: a 10-year population-based study. *AIDS Res Ther.* 2021;18:1–9. <https://doi.org/10.1186/s12981-021-00409-0>.
24. Domínguez-Domínguez L, Rava M, Bisbal O, Lopez-Cortés L, Portilla J, Podzamczar D, et al. Low CD4/CD8 ratio is associated with increased morbidity and mortality in late and non-late presenters: results from a multicentre cohort study, 2004–2018. *BMC Infect Dis.* 2022;22:1–10. <https://doi.org/10.1186/s12879-022-07352-z>.
 25. Kitege M, Fatti G, Eshun-Wilson I, Aluko O, Nyasulu P. Prevalence and trends of advanced HIV disease among antiretroviral therapy-naïve and antiretroviral therapy-experienced patients in South Africa between 2010–2021: a systematic review and meta-analysis. *BMC Infect Dis.* 2023;23:549.
 26. Gama WM, Frank CHM, Almeida TVR, Dos Santos DS, Chaves YO, da Silva DF, et al. Immunologic biomarkers, morbidity and mortality among HIV patients hospitalised in a Tertiary Care Hospital in the Brazilian Amazon. *BMC Infect Dis.* 2021;21:876. <https://doi.org/10.1186/s12879-021-06566-x>.
 27. Gama WM, Oliveira LB, Chaves YO, Ribeiro F, Almeida TVR, Baptista BJA, et al. Increased levels of reactive oxygen species in platelets and platelet-derived microparticles and the risk of respiratory failure in HIV/AIDS patients. *Mem Inst Oswaldo Cruz.* 2020;115:e200082. <https://doi.org/10.1590/0074-02760200082>.
 28. Yin X, Wang Z, Wu T, Ma M, Zhang Z, Chu Z, et al. The combination of CXCL9, CXCL10 and CXCL11 levels during primary HIV infection predicts HIV disease progression. *J Transl Med.* 2019;17:1–14. <https://doi.org/10.1186/s12967-019-02172-3>.
 29. Osuji FN, Onyenekwe CC, Ahaneke JE, Ukibe NR. The effects of highly active antiretroviral therapy on the serum levels of pro-inflammatory and anti-inflammatory cytokines in HIV infected subjects. *J Biomed Sci.* 2018;25:1–8. <https://doi.org/10.1186/s12929-018-0490-9>.
 30. Williams A, Steffens F, Reinecke C, Meyer D. The Th1/Th2/Th17 cytokine profile of HIV-infected individuals: a multivariate cytokinomics approach. *Cytokine.* 2013;61:521–6. <https://doi.org/10.1016/j.cyto.2012.11.006>.
 31. Shebl FM, Yu K, Landgren O, Goedert JJ, Rabkin CS. Increased levels of circulating cytokines with HIV-related immunosuppression. *AIDS Res Hum Retroviruses.* 2012;28:809–15. <https://doi.org/10.1089/aid.2011.0144>.
 32. Assogba YP, Adechina AP, Tchiakpe E, Nouatin OP, Kèkè RK, Bachabi M, et al. Advanced in immunological monitoring of HIV infection: profile of immune cells and cytokines in people living with HIV-1 in Benin. *BMC Immunol.* 2024;25:1–11. <https://doi.org/10.1186/s12865-024-00615-1>.
 33. Keating SM, Golub ET, Nowicki M, Young M, Anastos K, Crystal H, et al. The effect of HIV infection and HAART on inflammatory biomarkers in a population-based cohort of women. *Aids.* 2011;25:1823–32. <https://doi.org/10.1097/QAD.0b013e3283489d1f>.
 34. Gunda DW, Godfrey KG, Kilonzo SB, Mpondo BC. Cytopenias among ART-naïve patients with advanced HIV disease on enrolment to care and treatment services at a tertiary hospital in Tanzania: a cross-sectional study. *Malawi Med J.* 2017;29:43–52. <https://doi.org/10.4314/mmj.v29i1.9>.
 35. Rava M, Bisbal O, Domínguez-Domínguez L, Aleman MR, Rivero M, Antela A, et al. Late presentation for HIV impairs immunological but not virological response to antiretroviral treatment. *Aids.* 2021;35:1283–93. <https://doi.org/10.1097/QAD.0b013e32827038bf>.
 36. Phillips AN, Gazzard B, Gilson R, Easterbrook P, Johnson M, Walsh J, et al. Rate of AIDS diseases or death in HIV-infected antiretroviral therapy-naïve individuals with high CD4 cell count. *Aids.* 2007;21:1717–21. <https://doi.org/10.1097/QAD.0b013e32827038bf>.
 37. de Melo S, Pinto S, Ferreira E, Brotas R, Marinho E, da Silva V, et al. Molecular diagnosis of opportunistic infections in the central nervous system of HIV-infected adults in Manaus, Amazonas. *Front Med.* 2024;10:1298435.
 38. DATHI/SVSA/MS. Protocolo Clínico e Diretrizes Terapêuticas para Manejo da Infecção pelo HIV em Adultos. 2018. Dep HIV/Aids, Tuberc Hepatites Virais e Infecções Sex Transm Secr Vigilância em Saúde e Ambient Ministério da Saúde. 2018.
 39. Maes M, Abe Y, Sirichokchatchawan W, Suwimonteerabutr J, Sangkomkarnhangd U, Almulla AF, et al. The Cytokine, Chemokine, and Growth Factor Network of Prenatal Depression. 2023; 1–15.
 40. Mangal TD, Pascom ARP, Vesga JF, Meireles MV, Benzaken AS, Hallett TB. Estimating HIV incidence from surveillance data indicates a second wave of infections in Brazil. *Epidemics.* 2019;27:77–85. <https://doi.org/10.1016/j.epidem.2019.02.002>.
 41. Pascom AR, Pinho RE, Rick F, Veras NM, Perini F, de B, Meireles MV, et al. Comparison of cumulative viraemia following treatment initiation with different antiretroviral regimens: a real-life study in Brazil. *J Int AIDS Soc.* 2019;22:e25397. <https://doi.org/10.1002/jia2.25397>.
 42. French M, Cozzi-Lepr A, Arduino R, Johnson M, Achhra A, Landay A, et al. Plasma levels of cytokines and chemokines and the risk of mortality in HIV-infected individuals: a case-control analysis nested in a large clinical trial. *AIDS.* 2015;29:847–51. <https://doi.org/10.1177/0022146515594631.Marriage>.
 43. Krastinova E, Lecuroux C, Leroy C, Seng R, Cabie A, Rami A, et al. High soluble CD14 levels at primary HIV-1 infection predict more Rapid Disease Progression. *J Infect Dis.* 2015;212:909–13. <https://doi.org/10.1093/infdis/jiv145>.
 44. Ford E, Puroon C, Sereti I. Immunopathogenesis of asymptomatic chronic HIV infection: the Calm before the storm. *Curr Opin HIV AIDS.* 2009;43:206–14. <https://doi.org/10.3233/EPL-170023>.
 45. Wada NI, Bream JH, Martínez-Maza O, Macatangay B, Galvin SR, Margolick JB, et al. Inflammatory biomarkers and mortality risk among HIV-Suppressed men: a multisite prospective cohort study. *Clin Infect Dis.* 2016;63:984–90. <https://doi.org/10.1093/cid/ciw409>.
 46. Siedner MJ, Bwana MB, Asiimwe S, Musinguzi N, Castillo-Mancilla J, Amanyire G, et al. Inflammatory biomarkers prior to antiretroviral therapy as prognostic markers of 12-month mortality in South Africa and Uganda. *Aids.* 2019;33:2043–8. <https://doi.org/10.1097/QAD.0000000000002305>.
 47. Manabe Y, Andrade B, Gupta N, Leong S, Kintali M, Matoga M, et al. A parsimonious host inflammatory biomarker signature predicts Incident TB and Mortality in Advanced HIV Yukari. *Clin Infect Dis.* Nov 2019;25:ciz1147.
 48. Eller MA, Opollo MS, Liu M, Redd AD, Eller LA, Kityo C, et al. HIV type 1 disease progression to AIDS and death in a rural Ugandan cohort is primarily dependent on viral load despite variable subtype and T-cell immune activation levels. *J Infect Dis.* 2015;211:1574–84. <https://doi.org/10.1093/infdis/jiu646>.
 49. Ansari AW, Bhatnagar N, Dittrich-Breiholz O, Kracht M, Schmidt RE, Heiken H. Host chemokine (C-C motif) ligand-2 (CCL2) is differentially regulated in HIV type 1 (HIV-1)-infected individuals. *Int Immunol.* 2006;18:1443–51. <https://doi.org/10.1093/intimm/dx1078>.
 50. Amara A, Le Gall S, Schwartz O, Salamero J, Montes M, Loetscher P, et al. HIV coreceptor downregulation as antiviral principle: SDF-1α-dependent internalization of the chemokine receptor CXCR4 contributes to inhibition of HIV replication. *J Exp Med.* 1997;186:139–46. <https://doi.org/10.1084/jem.186.1.139>.
 51. Campbell GR, Spector SA. CCL2 increases X4-tropic HIV-1 entry into resting CD4+T cells. *J Biol Chem.* 2008;283:30745–53. <https://doi.org/10.1074/jbc.M804112200>.
 52. Rodríguez-Frade JM, Del Real G, Serrano A, Hernanz-Falcón P, Soriano SF, Vila-Coro AJ, et al. Blocking HIV-1 infection via CCR5 and CXCR4 receptors by acting in trans on the CCR2 chemokine receptor. *EMBO J.* 2004;23:66–76. <https://doi.org/10.1038/sj.emboj.7600020>.
 53. Vila-Coro AJ, Mellado M, De Ana M, Lucas A, Del Real P, Martínez-A G. HIV-1 infection through the CCR5 receptor is blocked by receptor dimerization. *Proc Natl Acad Sci U S A.* 2000;97:3388–93. <https://doi.org/10.1073/pnas.97.7.3388>.
 54. Chaves YO, Pereira FR, De Souza Pinheiro R, Batista DRL, Da Silva Balieiro AA, De Lacerda MVG, et al. High detection rate of HIV Drug Resistance mutations among patients who fail combined antiretroviral therapy in Manaus, Brazil. *Biomed Res Int.* 2021;2021. <https://doi.org/10.1155/2021/5567332>.
 55. Arantes I, Gräf T, Andrade P, Oliveira Chaves Y, Guimarães ML, Bello G. Dissemination dynamics of HIV-1 subtype B pandemic and non-pandemic lineages circulating in Amazonas, Brazil. *Front Microbiol.* 2022;13:1–10. <https://doi.org/10.3389/fmicb.2022.835443>.
 56. Bello S, Lasiera AB, López-Vergara L, de Diego C, Torralba L, de Gopegui PR, et al. IL-6 and cDNA monitoring throughout COVID-19 hospitalization are accurate markers of its outcomes. *Respir Res.* 2023;24:1–14. <https://doi.org/10.1186/s12931-023-02426-1>.
 57. Luo M, Liu J, Jiang W, Yue S, Liu H, Wei S. IL-6 and CD8+T cell counts combined are an early predictor of in-hospital mortality of patients with COVID-19. *JCI Insight.* 2020;5. <https://doi.org/10.1172/jci.insight.139024>.
 58. Hu B, Huang S, Yin L. The cytokine storm and COVID-19. *J Med Virol.* 2021;93:250–6. <https://doi.org/10.1002/jmv.26232>.
 59. Mendes-Filho SP, de Souza Pinheiro M, Martins R, Girolodi FS, e Melo PJ, de Oliveira RH. Kinetics of IL-6, C-reactive protein and fibrinogen levels in COVID-19 outpatients who evolved to Hypoxemia. *Clin Pathol.* 2024;17. <https://doi.org/10.1177/2632010X231222795>.

Publisher's note

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