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Revisiting osteoarthritis as an inflammatory disease: characterization of synovitis grading and synovial pathotypes in surgical specimens

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Abstract

Background Synovial inflammation is increasingly recognized as a relevant component of osteoarthritis (OA), yet its histopathological and immunological features in advanced disease remain incompletely characterized. Whether distinct synovial pathotypes are associated with specific clinical, laboratory, radiographic characteristics, or postoperative outcomes is still unclear.

Methods In this cross-sectional study, synovial tissue samples from OA patients undergoing hip or knee arthroplasty, or other joint surgery, were analyzed through standardized histology (Krenn score) and semi-quantitative immunohistochemistry (CD3, CD20, CD68, CD138). Pathotypes were categorized as lympho-myeloid, diffuse-myeloid, or pauci-immune. Preoperative demographics, Kellgren–Lawrence radiographic grade, systemic inflammatory markers, and postoperative outcomes were retrieved from clinical records. Comparisons were performed using Kruskal–Wallis and Fisher’s exact tests. A multivariable logistic regression identified predictors of the lympho-myeloid pathotype.

Results Two hundred forty-four samples were analyzed. High-grade synovitis was present in 64.3% of specimens. Pathotype distribution was: 55.3% lympho-myeloid, 11.9% diffuse-myeloid, and 32.8% pauci-immune. Lympho-myeloid tissues displayed the highest inflammatory burden, including elevated Krenn scores and higher systemic inflammatory indices. Pathotype distribution varied across joints, whereas the proportion of high-grade synovitis did not. In multivariable modeling, higher BMI increased the odds of lympho-myeloid pathotype (OR 1.11, 95%CI 1.01–1.22). No associations emerged for inflammatory markers, Kellgren–Lawrence grade or preoperative pain. Postoperative complications were not different across pathotypes.

Conclusions Advanced OA displays marked synovial heterogeneity, with immune infiltration patterns that parallel systemic inflammatory signatures. Our findings support the concept that synovial pathotypes capture relevant biological variation within OA and may contribute to a more refined framework for disease stratification in future studies.

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Keywords Osteoarthritis, Pathotypes, Inflammation, Krenn, Synovitis

Background

Traditionally regarded as a degenerative “wear-and-tear” disorder, osteoarthritis (OA) is now recognized as a complex, multifactorial condition affecting the entire joint, including articular cartilage, subchondral bone, synovium, capsule, and periarticular tissues [1]. Mechanical stress, aging, metabolic dysregulation, genetic predisposition, and low-grade inflammation interact in a self-perpetuating cycle leading to joint failure [2]. The identification of distinct clinical phenotypes supports the concept that OA is not a single disease entity but rather a syndrome with heterogeneous pathogenic pathways [3].

Among these mechanisms, synovial inflammation has emerged as a central component of OA pathophysiology [4]. Early descriptions portrayed OA-related synovitis as mild and secondary to cartilage wear; however, evidence accumulated over the last two decades demonstrates that inflammatory changes in the synovium are frequent, active, and clinically relevant [4]. The cross-talk between subchondral bone and articular cartilage—particularly across the osteochondral junction—drives a cascade of angiogenesis, sensory nerve ingrowth, and release of pro-inflammatory mediators that amplify pain and structural deterioration [4–6]. Within this microenvironment, cartilage-derived matrix fragments act as damage-associated molecular patterns (DAMPs), activating pattern-recognition receptors on chondrocytes and synoviocytes and sustaining the production of cytokines, chemokines, and proteases [7]. These mediators, in turn, promote neovascularization and neo-innervation, contributing both to joint destruction and to nociceptive sensitization [8].

Imaging and histologic studies have consistently shown that synovitis is present in a substantial proportion of OA patients. Large-scale MRI studies have detected synovial thickening or enhancement in approximately 60% of subjects examined without contrast and up to 74% when contrast agents are used, with higher degrees of synovitis predicting faster cartilage loss [9–12]. Histologic analyses confirm these findings, demonstrating synovial hyperplasia, stromal infiltration by mononuclear cells, and increased vascularity compared with healthy controls [13]. Importantly, the severity of synovitis has been associated with both pain intensity and radiographic progression, suggesting that inflammation is not merely an epiphenomenon but an active driver of the disease [14–16].

A major advance in the histopathological characterization of synovitis came from the work of Krenn and colleagues, who proposed a semi-quantitative scoring system integrating lining-layer hyperplasia, stromal cellularity, and inflammatory infiltrate, allowing for

standardized assessment of synovial inflammation [17, 18]. Building on the “Krenn score”, subsequent immunohistochemical research identified reproducible synovial pathotypes—lympho-myeloid, diffuse-myeloid, and pauci-immune—based on the relative abundance of B cells, T cells, plasma cells, and macrophages in patients with rheumatoid arthritis (RA) [19–21].

These insights opened the possibility that similar inflammatory architectures might exist outside RA, and indeed a key breakthrough came from Boutet et al., who provided the first large-scale, systematic comparison between end-stage OA and RA synovium, challenging the assumption that complex immune infiltration is exclusive to autoimmune synovitis [22]. Using both semi-quantitative and digital image analysis, they demonstrated that OA synovial tissue can be categorized into the same three pathotypes identified in RA, with the lympho-myeloid subtype present in more than half of OA cases undergoing joint replacement [22]. Notably, OA and RA synovia exhibited overlapping distributions of Krenn grades, suggesting a continuum between degenerative and immune-mediated joint disease [22]. This paradigm-switching study redefined the histopathological landscape of OA, revealing that adaptive immune cell aggregates and macrophage-rich infiltrates—once thought exclusive to RA—are frequent in OA and associate with peripheral blood cell indices consistent with low-grade systemic inflammation, such as lower hemoglobin and lymphocytes, and higher monocyte-to-lymphocyte ratio (MLR) and neutrophil-to-lymphocyte ratio (NLR).

However, the findings by Boutet and colleagues, while transformative, also raised several questions. Their cohort was large but geographically homogeneous (United Kingdom), and the clinical correlates of synovial pathotypes—such as radiographic severity, laboratory inflammation markers, or demographic determinants—were not fully explored. Moreover, all OA samples were derived from end-stage knee and hip disease, leaving uncertain whether the same inflammatory architecture applies across other joint locations or different disease contexts. Independent validation in distinct populations, ideally using analogous standardized scoring and immunohistochemical approaches, is therefore essential to confirm the reproducibility of these observations.

In this context, our study aimed to characterize the histopathologic profile of synovial tissue obtained from patients with advanced OA undergoing orthopedic surgery at multiple joint sites—including the hip, knee, ankle, shoulder, elbow and wrist. Using standardized hematoxylin–eosin (H&E) and immunohistochemical staining, we quantified synovitis according to the Krenn

score, defined synovial pathotype distribution, and investigated their associations with preoperative clinical, laboratory, and radiographic parameters, as well as with postoperative outcomes.

Methods

Study design and setting

This study is a retrospective observational analysis of synovial tissue samples obtained from patients undergoing orthopedic surgery for OA at the IRCCS Istituto Ortopedico Rizzoli (Bologna, Italy), one of the largest European referral centers for musculoskeletal surgery. We identified all consecutive cases from January 2019 to December 2023 for which synovial tissue had been submitted to the Department of Pathology and stored in the institutional biobank.

A key methodological consideration is that synovial tissue is not routinely collected during arthroplasty or other OA-related procedures. In our institutional practice, sampling is performed when macroscopic inspection reveals synovitis that appears more prominent than typically expected in advanced OA. As a result, the synovial specimens included in the institutional biobank primarily derive from cases in which inflammatory features were clinically apparent, thereby providing a biologically informative subset of advanced OA enriched for synovial pathology rather than a random surgical sample.

We restricted inclusion to adult patients who underwent primary orthopedic surgery for clinically and radiographically confirmed OA involving synovial joints. While the study by Boutet et al. included RA comparators, the present cohort consists exclusively of OA cases and spans multiple anatomical sites—predominantly the hip and knee, but also the shoulder, ankle, elbow, and wrist [22]. Synovial findings were further interpreted alongside perioperative clinical, laboratory, and radiographic data routinely collected in the surgical setting, including inflammatory biomarkers.

We applied stringent exclusion criteria to avoid confounding by alternative inflammatory or secondary degenerative processes. We excluded patients with any known chronic inflammatory arthropathy diagnosed, including RA, psoriatic arthritis, gout, axial spondyloarthritis, or other autoimmune rheumatic diseases. We also excluded secondary OA (post-traumatic, post-infectious, dysplastic, or post-fracture) and revision surgeries, including any case with prior implants, osteosynthesis, or earlier procedures involving the index joint.

Tissue processing and histological assessment

Synovial tissue samples were obtained intraoperatively at the time of orthopedic surgery and submitted to the Department of Pathology for routine diagnostic processing. Upon receipt, all specimens were fixed in 10%

neutral-buffered formalin for a minimum of 24 h, then dehydrated, cleared, and embedded in paraffin following standard protocols. From each paraffin block, serial sections of 3–4 μm thickness were cut using a rotary microtome.

At least one section per case (typically 2 to 4 sections) was stained with H&E for general morphological evaluation. Tissue adequacy was defined as preserved morphology and a visible lining layer, according to standard pathology criteria [23]. Sections lacking an identifiable synovial lining, with extensive cautery artifact, or consisting predominantly of dense fibrous tissue or adipose tissue were considered non-diagnostic and excluded from histological scoring. All evaluable H&E-stained slides were then digitized and independently reviewed by two trained readers (M.G. and A.R., senior musculoskeletal pathologists), both blinded to all clinical, laboratory, radiographic, and surgical data.

Histopathological evaluation of synovial tissue was performed on H&E-stained sections according to the Krenn synovitis score, a validated semi-quantitative system widely used to characterize inflammatory changes in both OA and inflammatory arthritides [18]. Lining-layer hyperplasia, stromal cellularity, and inflammatory infiltrates were graded semi-quantitatively from 0 to 3 according to the Krenn synovitis score [18]. Domain-specific scores were summed to obtain the total Krenn score (0–9) and classify synovitis as none (0–1), low grade (2–4), or high grade (≥ 5). Representative examples of the three inflammatory grades are shown in Fig. 1A. All evaluable slides provided sufficient representation of both lining and sublining compartments to ensure reliable scoring across all three domains.

Immunohistochemistry and synovial pathotype classification

Immunohistochemical analyses were performed to characterize the cellular composition of the synovial inflammatory infiltrate.

First, 4- μm -thick tissue sections were cut, heated at 58 °C for 2 h, deparaffinized, and immunostained on a Ventana BenchMark following the manufacturer's guidelines (Ventana Medical Systems, Tucson, AZ, USA). Antibody detection was performed using UltraView Universal diaminobenzidine (DAB) detection kit (Ventana Medical Systems). Pretreatment for antigen retrieval was performed at 95 °C with Tris–ethylenediamine tetraacetic acid (Tris-EDTA), pH8 for 20 min. When necessary, endogenous tissue peroxidase was blocked by treating the sections with 0.3% H₂O₂.

Four primary antibodies were used to identify the dominant immune cell lineages typically involved in synovial pathology: CD20 for B lymphocytes (L26; prediluted mouse monoclonal primary antibody; Ventana Medical

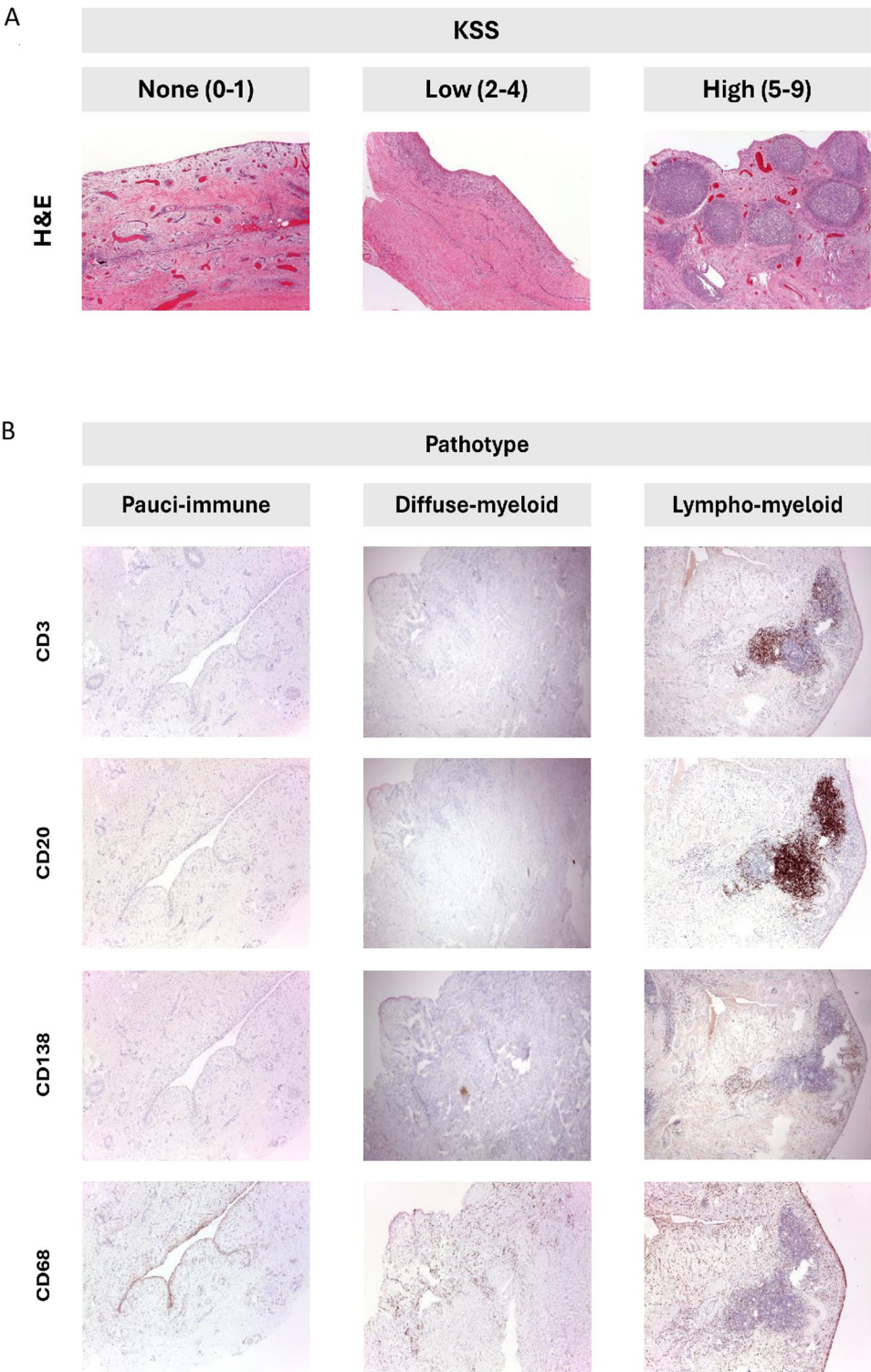


Fig. 1 Histological grading of synovitis and immunohistochemical definition of synovial pathotypes in osteoarthritis. **A.** Sections of osteoarthritic synovium were stained with hematoxylin and eosin and graded according to the Krenn synovitis score (KSS) as *none* (0–1), *low-grade* (2–4), or *high-grade* (≥ 5) synovitis. Representative images are shown for each category. **B.** Serial sections of osteoarthritic synovium were stained with antibodies against CD3 (T cells), CD20 (B cells), CD138 (plasma cells), and CD68 (monocytes/macrophages). Representative immunohistochemical patterns are shown for each synovial pathotype (*pauci-immune*, *diffuse-myeloid*, and *lympho-myeloid*). All images were acquired at an original magnification of 100x

Systems, Tucson, AZ, USA), CD3 for T lymphocytes (2GV6; prediluted rabbit monoclonal primary antibody; Ventana Medical Systems, Tucson, AZ, USA), CD138 for plasma cells (BA38, prediluted mouse monoclonal primary antibody; Cell Marque Tissue Diagnostics, Rocklin, CA, USA), and CD68 for macrophages (KP1; prediluted mouse monoclonal primary antibody; Ventana Medical Systems, Tucson, AZ, USA). Appropriate positive and negative controls were included in each run.

For each marker, staining was semi-quantitatively graded using a 0–4 scale, reflecting both the density and the architectural pattern of positive cells: 0 = absent or minimal staining; 1 = mild focal positivity; 2 = multifocal moderate infiltrates; 3 = dense aggregates or confluent areas of positivity; 4 = extensive sheet-like infiltration or prominent lymphoid/plasmacytic clusters.

Based on integration of the four markers, synovial tissues were classified into three predefined synovial pathotypes, consistent with established frameworks in synovial immunopathology [20]:

1. Lympho-myeloid pathotype: prominent B-cell (CD20) and plasma-cell (CD138) infiltrates, accompanied by dense CD3 + T-cell aggregates and marked CD68 + macrophage presence.
2. Diffuse-myeloid pathotype: widespread macrophage predominance (CD68) with relatively sparse B- and plasma-cell infiltrates and variable T-cell density.
3. Pauci-immune/fibroid pathotype: minimal immune-cell staining across all markers, with synovial architecture dominated by fibroblast-like stromal elements and fibrotic remodeling.

Representative immunohistochemical patterns illustrating the three pathotypes are displayed in Fig. 1B.

Clinical, laboratory, and radiographic variables

Clinical and demographic information was obtained from the institutional electronic medical records. Baseline was defined as the last preoperative clinical assessment occurring within three months before surgery. At this time point, the following variables were systematically recorded: age, sex, height, weight, and body mass index (BMI). Surgical data included the date of surgery, the type of procedure, laterality, and length of hospital stay.

Comorbidity burden was assessed using the Charlson Comorbidity Index (CCI), calculated from individual comorbidities [24]. Laboratory data included complete blood count parameters and C-reactive protein (CRP), recorded preoperatively. From the differential blood count, we additionally calculated composite inflammatory indices widely used as markers of systemic inflammation, including the NLR, the platelet-to-lymphocyte

ratio (PLR), and the systemic immune-inflammation index (SII) [25, 26]. Preoperative pain intensity was assessed using a numerical rating scale (NRS, 0–10), and the duration of joint pain was recorded in months. Radiographic severity of OA was evaluated using the Kellgren–Lawrence grading system, assigned on the basis of available preoperative radiographs [27]. Kellgren–Lawrence grade was recorded on a 0–4 ordinal scale, reflecting the presence and progression of osteophytes, joint-space narrowing, subchondral sclerosis, and bone deformity. Radiographs were reviewed by an orthopedic surgeon and a rheumatologist.

Postoperative events were documented using predefined categories and were classified into short-term and long-term complications. Short-term complications were defined as those occurring during the index hospitalization or within 30 days after surgery. Long-term complications were defined as events occurring from postoperative month 2 up to the routine 12 ± 3-month follow-up visit.

Short-term events included the following predefined categories: postoperative bleeding requiring surgical treatment; failure of wound healing requiring reoperation; thromboembolic disease; postoperative neural deficit (sensory or motor); superficial periprosthetic joint infection; deep prosthetic joint infection; other medical complications including pneumonia, heart failure, urinary tract infection, arrhythmia, respiratory infection, or other relevant diagnoses.

Long-term complications were assessed through dedicated follow-up items and included: any reoperation; readmission; deep surgical infection.

Statistical analysis

Continuous variables were summarized as median and interquartile range (IQR), whereas categorical variables were reported as counts and percentages. Comparisons across synovial pathotypes (lympho-myeloid, diffuse-myeloid, pauci-immune) and across synovitis severity groups (low-grade vs. high-grade Krenn score) were conducted using the Kruskal–Wallis test for continuous variables and the Fisher's exact test for categorical variables. Whenever the Kruskal–Wallis test indicated significant overall differences, post-hoc pairwise comparisons were performed using Dunn's test with Bonferroni correction. For hemoglobin levels, additional multivariable linear regression analyses were performed to assess differences across synovial pathotypes after adjustment for sex.

Joint-specific analyses (knee, hip, other joints) were conducted to examine anatomical differences in synovial pathotype distribution and synovitis severity, again using Fisher's exact tests. Postoperative outcomes were summarized descriptively and compared across pathotypes using the same non-parametric testing strategy.

To explore independent predictors of the lympho-myeloid synovial pattern, a multivariable logistic regression model was fitted, including age, sex, BMI, pre-operative NLR, PLR, CRP, hemoglobin, pain score, pain duration, CCI, Kellgren–Lawrence grade, and joint site (hip/knee/other). Results were expressed as odds ratios (ORs) with 95% confidence intervals (CIs). Multicollinearity was assessed using generalized variance inflation factors (GVIF), expressed as $GVIF^{1/(2 \times Df)}$, with values < 2 considered indicative of the absence of relevant multicollinearity. In addition, medication use during the year preceding surgery (including NSAIDs, systemic and intra-articular glucocorticoids, statins, metformin, and other antidiabetic agents) was summarized descriptively and explored across synovial pathotypes and CCI categories using contingency tables and Fisher's exact test.

All statistical tests were two-tailed, with a significance threshold of $p < 0.05$. All statistical analyses and all figures presented in the Results were generated using R (version 4.5.1), primarily with the packages broom (1.0.8), car (3.1.3), cowplot (1.1.3), dplyr (1.1.4), FSA (0.10.0), flextable (0.9.11), forcats (1.0.0), ggplot2 (3.5.2), gtsummary (2.4.0), haven (2.5.5), patchwork (1.3.0), purrr (1.0.4), rlang (1.1.6), tidyr (1.3.1), and tibble (3.3.0).

Ethical considerations

The research was conducted in accordance with the ethical principles of the 1964 Declaration of Helsinki and its later amendments [28]. The study protocol was reviewed and approved by the Area Vasta Emilia Centro Ethics Committee (Comitato Etico AVEC) (approval code: CE-AVEC 732/2024/Sper/IOR).

All synovial specimens included in the analysis had been previously collected as part of routine diagnostic practice. Informed consent was sought from all eligible patients; written consent was obtained from those who could be reached. For patients who could not be contacted despite repeated attempts, the requirement for informed consent was waived by the Ethics Committee, in accordance with applicable regulations for retrospective research involving previously collected biological material, when obtaining consent is not feasible and the research entails minimal risk to participants, as outlined in the Declaration of Helsinki (paragraph 32).

Clinical data were extracted from institutional electronic medical records and managed using the REDCap electronic data capture system, in full compliance with the European Union General Data Protection Regulation (EU GDPR 2016/679) and local data-protection policies. All data were de-identified prior to analysis, and access was restricted to authorized members of the research team.

Results

Patient characteristics

A total of 244 patients were included in the study. The main characteristics of the study population are presented in Table 1. The median age was 68.4 years (IQR 60.9–76.5), and 56.6% were women. The median BMI was 26.5 kg/m² (IQR 24.2–30.2). Most procedures involved large weight-bearing joints: 68.4% of patients underwent knee replacement and 25% hip replacement, whereas shoulder replacement (2.1%), ankle arthrodesis or replacement (2.5%), elbow arthrolysis (1.6%), and wrist arthrodesis (0.4%) were less common.

Radiographic severity was substantial, with a median Kellgren–Lawrence grade of 3 (IQR 3–4). Preoperative pain severity was high, with a median NRS of 6 (IQR 5–8). Information on pain duration before surgery was available for 163 patients, showing a median duration of 24 months (IQR 12–60). Systemic inflammatory activity was generally low, reflected by a median CRP of 0.28 mg/dL (IQR 0.13–0.51). Hematological parameters showed median neutrophil and lymphocyte counts of $4.1 \times 10^9/L$ (IQR 3.3–5.0) and $1.8 \times 10^9/L$ (IQR 1.4–2.2), respectively, a median platelet count of $236 \times 10^9/L$ (IQR 195–279), and a median hemoglobin level of 13.8 g/dL (IQR 12.9–14.7).

Comorbidity burden was moderate: among patients with available data ($n = 241$), 58.1% had a CCI of 0, 30.3% had a CCI of 1–2, and 11.6% had a CCI ≥ 3 . The most frequent comorbidities included chronic pulmonary disease (17.2%), peripheral vascular disease (8.2%), congestive heart failure (7.8%), prior myocardial infarction (6.6%) and diabetes (5.7%). Patients with any comorbidity (CCI ≥ 1) were significantly older than those without comorbidities (median 73.9 years [IQR 65.1–78.0] vs. 66.1 years [58.1–72.9], $p < 0.001$).

Histological and immunohistochemical characteristics

Histological assessment showed a substantial inflammatory burden within the synovial tissues. The overall median Krenn score was 5 (IQR 4–6), with 64.3% of samples classified as high-grade synovitis and 35.7% as low-grade synovitis (Fig. 2A). No specimen met criteria for absent synovitis. Most tissues displayed at least moderate lining-layer hyperplasia, increased stromal cellularity, and mononuclear infiltrates of grade ≥ 1 , consistent with widespread active synovitis.

Based on the combined distribution of immune cell subsets, the lympho-myeloid pattern was the most prevalent (55.3%), followed by the pauci-immune pattern (32.8%) and the diffuse-myeloid pattern (11.9%). Semi-quantitative distributions of the individual immunohistochemical markers used to define synovial pathotypes (CD3, CD20, CD68, and CD138) are reported in Supplementary Table 1, while the distribution of pathotypes

Table 1 Baseline demographic, clinical, laboratory, and histopathological characteristics of the study population overall and according to synovial pathotype

Variable	Overall (n = 244)	Lympho-myeloid (n = 135)	Diffuse-myeloid (n = 29)	Pauci-immune (n = 80)	p-value ¹
Age, years, median (IQR)	68.4 (60.9–76.5)	70.6 (62.5–77.4)	67.0 (63.2–73.8)	67.3 (57.6–74.9)	0.038
Female sex, n (%)	138 (56.6%)	87 (64.4%)	11 (37.9%)	40 (50.0%)	0.012
BMI, kg/m ² , median (IQR)	26.5 (24.2–30.2)	27.1 (24.7–31.2)	25.6 (24.1–28.1)	25.9 (23.9–29.4)	0.120
Kellgren–Lawrence grade, n (%)					0.037
1	3 (1.2%)	0 (0.0%)	2 (6.9%)	1 (1.3%)	
2	42 (17.2%)	18 (13.3%)	4 (13.8%)	20 (25.0%)	
3	88 (36.1%)	54 (40.0%)	8 (27.6%)	26 (32.5%)	
4	111 (45.5%)	63 (46.7%)	15 (51.7%)	33 (41.3%)	
Preoperative pain NRS, median (IQR)	6.0 (5.0–8.0)	6.0 (5.0–8.0)	6.0 (5.0–7.0)	6.0 (5.0–7.0)	0.059
Pain duration, months, median (IQR) *	24.0 (12.0–60.0)	24.0 (12.0–66.0)	18.0 (11.0–48.0)	36.0 (12.0–48.0)	0.424
CRP, mg/dL, median (IQR)	0.28 (0.13–0.51)	0.34 (0.13–0.61)	0.26 (0.20–0.39)	0.23 (0.12–0.38)	0.033
Neutrophils, ×10 ⁹ /L, median (IQR)	4.1 (3.3–5.0)	4.3 (3.4–5.7)	4.3 (3.7–5.0)	3.7 (3.1–4.4)	0.003
Lymphocytes, ×10 ⁹ /L, median (IQR)	1.8 (1.4–2.2)	1.8 (1.5–2.1)	1.8 (1.3–2.2)	1.8 (1.5–2.4)	0.779
Platelets, ×10 ⁹ /L, median (IQR)	236 (195–279)	254 (214–299)	225 (185–271)	210 (179–248)	< 0.001
Hemoglobin, g/dL, median (IQR)	13.8 (12.9–14.7)	13.5 (12.7–14.4)	14.2 (13.2–15.0)	14.3 (13.6–14.8)	< 0.001
NLR, median (IQR)	2.28 (1.59–3.08)	2.42 (1.72–3.31)	2.28 (2.04–2.87)	2.03 (1.51–2.57)	0.003
PLR, median (IQR)	133 (102–170)	139 (113–179.0)	141 (93–165)	119 (92–151)	0.003
SII, median (IQR)	526 (363–753)	576 (410–900)	535 (363–711)	454 (286–602)	< 0.001
Charlson Comorbidity Index, n (%) **					0.614
0	140 (58.1%)	74 (55.2%)	17 (58.6%)	49 (62.8%)	
1–2	73 (30.3%)	46 (34.3%)	8 (27.6%)	19 (24.4%)	
≥ 3	28 (11.6%)	14 (10.4%)	4 (13.8%)	10 (12.8%)	
Main comorbidities, n (%)					
Prior myocardial infarction	16 (6.6%)	9 (6.7%)	1 (3.4%)	6 (7.5%)	0.873
Congestive heart failure	19 (7.8%)	11 (8.1%)	2 (6.9%)	6 (7.5%)	1.000
Peripheral vascular disease	20 (8.2%)	14 (10.4%)	3 (10.3%)	3 (3.8%)	0.193
Chronic pulmonary disease	42 (17.2%)	25 (18.5%)	3 (10.3%)	14 (17.5%)	0.650
Diabetes	14 (5.7%)	7 (5.2%)	1 (3.4%)	6 (7.5%)	0.723
Histopathological evaluation					
Krenn score, median (IQR)	5.0 (4.0–6.0)	6.0 (5.0–6.0)	5.0 (4.0–6.0)	4.0 (3.0–5.0)	< 0.001
Synovitis grade, n (%)					< 0.001
Low-grade	87 (35.7%)	31 (23.0%)	8 (27.6%)	48 (60.0%)	
High-grade	157 (64.3%)	104 (77.0%)	21 (72.4%)	32 (40.0%)	

P-values refer to overall comparisons across the three synovial pathotype groups (lympho-myeloid, diffuse-myeloid, and pauci-immune), using the Kruskal–Wallis test for continuous variables and Fisher's exact test for categorical variables

Data are presented as median (interquartile range, IQR) for continuous variables and number (percentage) for categorical variables. Percentages are calculated on the total study population unless otherwise specified. Missing values are reported where applicable

CCI Charlson Comorbidity Index, CRP C-reactive protein, NLR neutrophil-to-lymphocyte ratio, PLR platelet-to-lymphocyte ratio, SII systemic immune-inflammation index

* Available in 163 patients (66.8% of the cohort)

** Percentages are calculated based on available data (n = 241)

in the cohort is shown in Fig. 2B. Notably, all three categories included both low- and high-grade Krenn scores, but the prevalence of high-grade synovitis differed substantially across pathotypes from 77.0% of lympho-myeloid to 72.4% of diffuse-myeloid, and 40.0% of pauci-immune samples (Fisher $p < 0.001$; Fig. 2C).

Consistently, a clear gradient in histological inflammation emerged across pathotypes. Median Krenn scores increased from 4 (IQR 3–5) in pauci-immune tissues to 5 (IQR 4–6) in diffuse-myeloid and 6 (IQR 5–6)

in lympho-myeloid tissues (Kruskal–Wallis $p < 0.001$). Post-hoc Dunn tests confirmed higher Krenn scores in lympho-myeloid and diffuse-myeloid tissues compared with pauci-immune ($p < 0.001$ and $p = 0.001$, respectively), with no significant difference between the two myeloid-rich groups. These comparisons are illustrated in Fig. 2D.

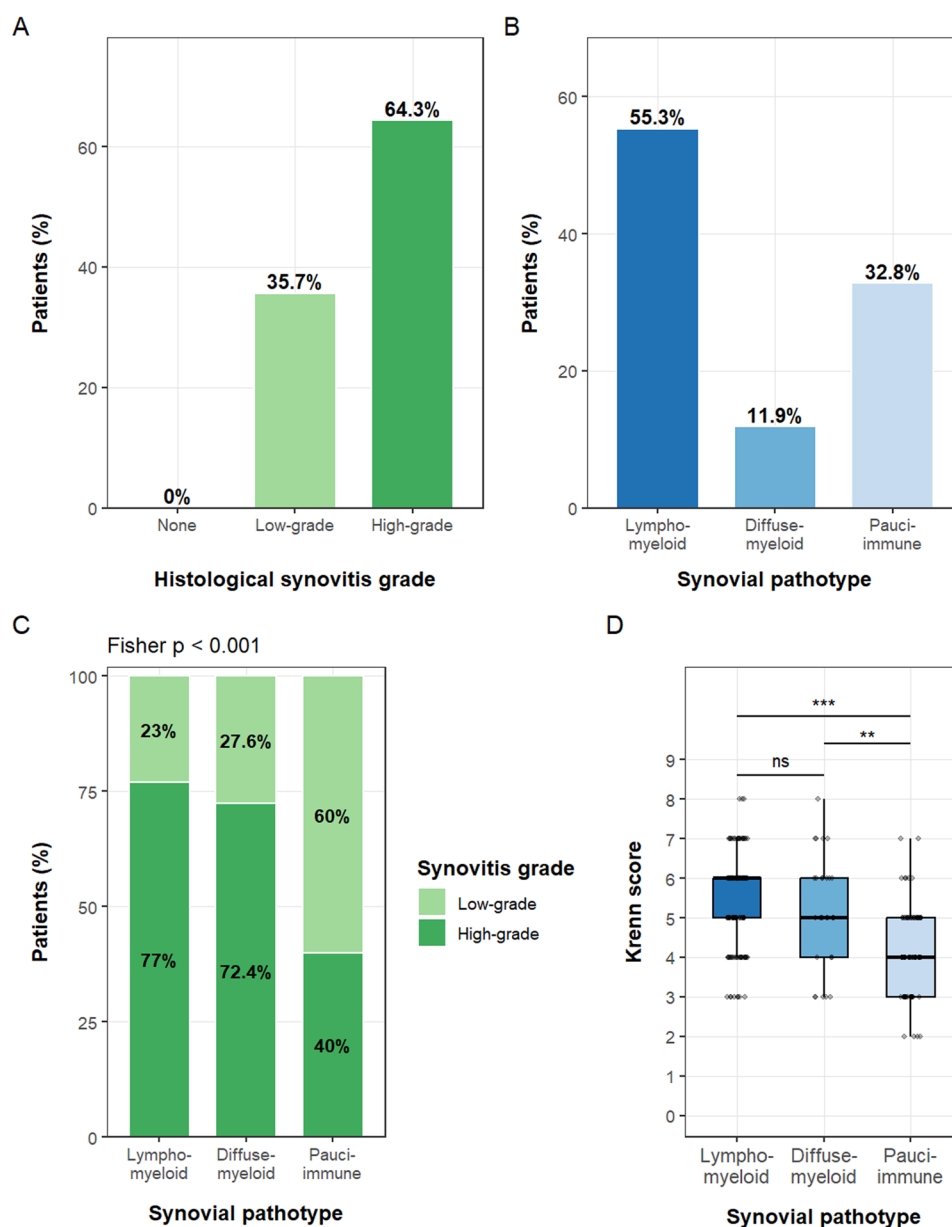


Fig. 2 Histological severity, synovial pathotypes, and inflammatory gradients in osteoarthritis synovium. **A.** Distribution of histological synovitis grades based on the Krenn score. **B.** Prevalence of the three synovial pathotypes. **C.** Cross-classification of synovitis grade and synovial pathotype. **D.** Comparison of median Krenn scores across pathotypes. Pairwise comparisons for panel D (Dunn's test with Bonferroni correction) showed: lympho-myeloid vs. pauci-immune ($p < 0.001$), diffuse-myeloid vs. pauci-immune ($p = 0.001$), and lympho-myeloid vs. diffuse-myeloid ($p = 1.000$). Significance annotation: ** $p < 0.01$; *** $p < 0.001$

Association between synovial pathotypes and clinical, laboratory or radiographic parameters

We next evaluated whether clinical, laboratory, and radiographic parameters differed across synovial pathotypes (Fig. 3A–H).

Age (Fig. 3A) showed modest variation across groups (Kruskal–Wallis $p = 0.038$). Patients with a lympho-myeloid pathotype were slightly older (median 70.6 years, IQR 62.5–77.4) than those with a pauci-immune pattern (median 67.3 years, IQR 57.6–74.9), with a significant

overall difference ($p = 0.038$). BMI (Fig. 3B) did not differ significantly across pathotypes ($p = 0.120$). Preoperative pain NRS (Fig. 3C) was similar across all groups ($p = 0.059$). Hemoglobin (Fig. 3D) differed significantly across pathotypes (Kruskal–Wallis $p < 0.001$). Median hemoglobin was lowest in the lympho-myeloid group (13.5 g/dL, IQR 12.7–14.4), intermediate in diffuse-myeloid tissues (14.2 g/dL, IQR 13.2–15.0), and highest in the pauci-immune group (14.3 g/dL, IQR 13.6–14.8). Post-hoc comparisons confirmed significantly lower

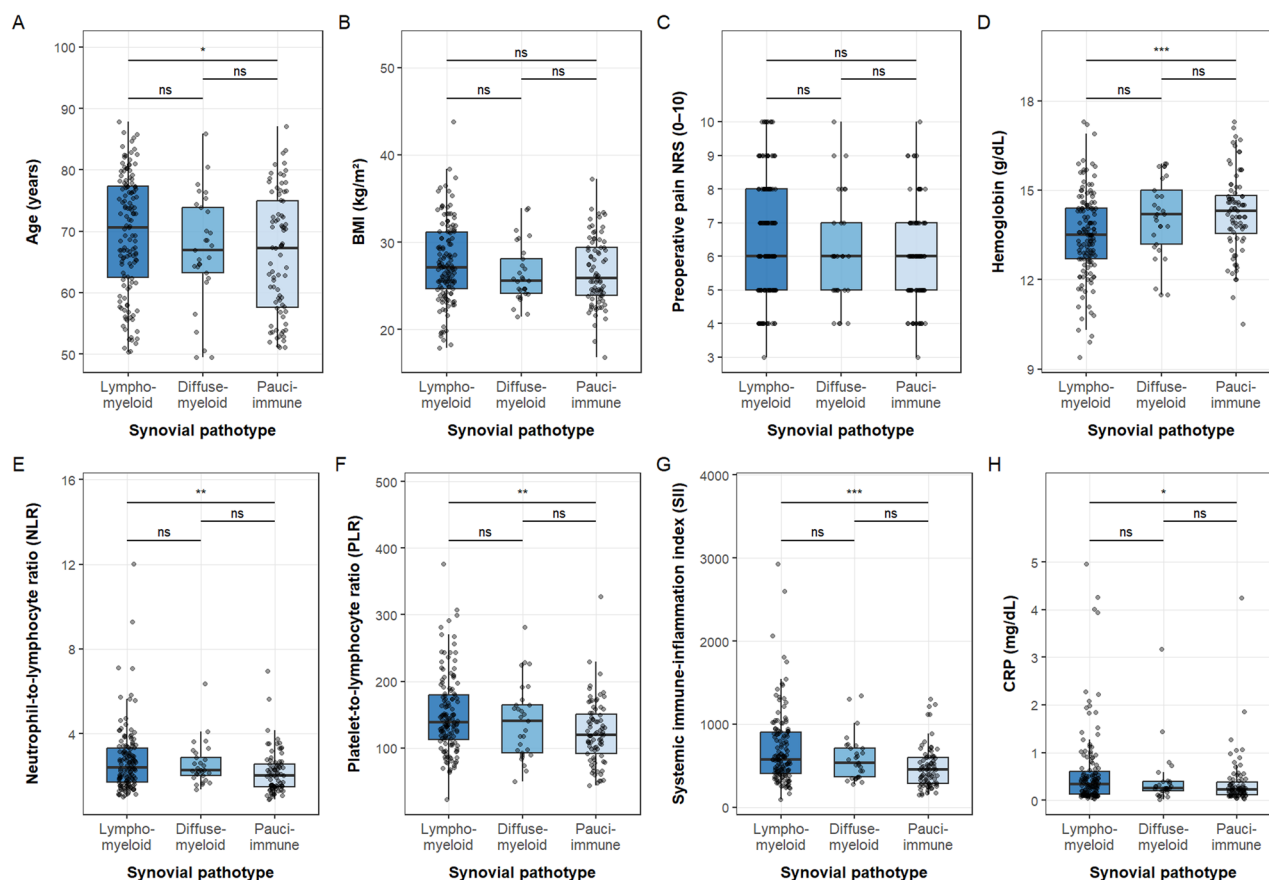


Fig. 3 Clinical and laboratory characteristics across synovial pathotypes. Boxplots showing the distribution of eight key clinical and laboratory variables across the three synovial pathotypes: **A.** Age. **B.** BMI. **C.** Preoperative pain numerical rating scale. **D.** Hemoglobin. **E.** Neutrophil-to-lymphocyte ratio (NLR). **F.** Platelet-to-lymphocyte ratio (PLR). **G.** systemic immune-inflammation index (SII). **H.** C-reactive protein. Pairwise comparisons (Dunn's test with Bonferroni correction) showed: Age (A): lympho-myeloid vs pauci-immune ($p = 0.049$), diffuse-myeloid vs lympho-myeloid ($p = 0.433$), diffuse-myeloid vs pauci-immune ($p = 1.000$). BMI (B): lympho-myeloid vs pauci-immune ($p = 0.254$), diffuse-myeloid vs lympho-myeloid ($p = 0.376$), diffuse-myeloid vs pauci-immune ($p = 1.000$). Pain NRS (C): lympho-myeloid vs pauci-immune ($p = 0.056$), diffuse-myeloid vs lympho-myeloid ($p = 1.000$), diffuse-myeloid vs pauci-immune ($p = 1.000$). Hemoglobin (D): lympho-myeloid vs pauci-immune ($p < 0.001$), diffuse-myeloid vs lympho-myeloid ($p = 0.086$), diffuse-myeloid vs pauci-immune ($p = 1.000$). NLR (E): lympho-myeloid vs pauci-immune ($p = 0.003$), diffuse-myeloid vs lympho-myeloid ($p = 1.000$), diffuse-myeloid vs pauci-immune ($p = 0.076$). PLR (F): lympho-myeloid vs pauci-immune ($p = 0.002$), diffuse-myeloid vs lympho-myeloid ($p = 1.000$), diffuse-myeloid vs pauci-immune ($p = 0.519$). SII (G): lympho-myeloid vs pauci-immune ($p < 0.001$), diffuse-myeloid vs lympho-myeloid ($p = 1.000$), diffuse-myeloid vs pauci-immune ($p = 0.121$). CRP (H): lympho-myeloid vs pauci-immune ($p = 0.030$), diffuse-myeloid vs lympho-myeloid ($p = 0.810$), diffuse-myeloid vs pauci-immune ($p = 1.000$). Significance annotation: * $p < 0.05$; ** $p < 0.01$; *** $p < 0.001$

hemoglobin in lympho-myeloid versus pauci-immune synovium ($p < 0.001$). This difference remained significant after adjustment for sex in a multivariable linear regression model.

A clear gradient was observed for systemic inflammatory indices. NLR (Fig. 3E) increased progressively from the pauci-immune (median 2.03, IQR 1.51–2.57), to the diffuse-myeloid (2.28, IQR 2.04–2.87), and to the lympho-myeloid pattern (2.42, IQR 1.72–3.31), with a significant overall difference ($p = 0.003$). Lympho-myeloid samples displayed higher NLR than pauci-immune tissues ($p = 0.003$). PLR (Fig. 3F) also differed significantly across groups ($p = 0.003$). Values were highest in lympho-myeloid tissues (median 139, IQR 113–179) and lowest in the pauci-immune group (median 119, IQR 92–151),

with a significant overall difference ($p = 0.003$). SII (Fig. 3G) followed a similar trend, increasing from pauci-immune (454, IQR 286–602) to diffuse-myeloid (535, IQR 363–711), and to lympho-myeloid samples (576, IQR 410–900). The overall comparison was significant ($p < 0.001$), and lympho-myeloid tissues had higher SII than pauci-immune specimens ($p < 0.001$). CRP (Fig. 3H) varied across groups ($p = 0.033$), with higher values in lympho-myeloid (0.34 mg/dL, IQR 0.13–0.61) compared with pauci-immune synovium (0.23 mg/dL, IQR 0.12–0.38; post-hoc $p = 0.030$). No significant differences emerged between lympho-myeloid and diffuse-myeloid samples for any parameter.

Kellgren–Lawrence grades differed significantly across pathotypes (Fisher's exact test $p = 0.037$). The proportion

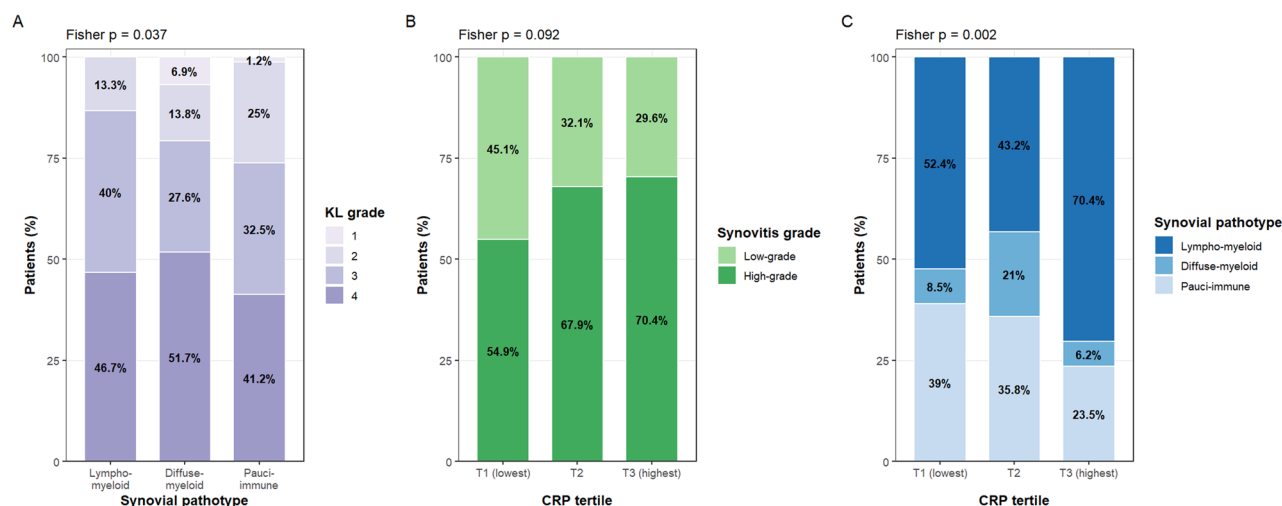


Fig. 4 Kellgren–Lawrence grade and inflammatory profiles in relation to CRP tertiles. **A.** Distribution of Kellgren–Lawrence grades across the three synovial pathotypes. **B.** Distribution of Krenn synovitis grades across CRP tertiles. **C.** Distribution of synovial pathotypes across CRP tertiles. Statistical analysis: Fisher's exact test (panel A: $p = 0.037$; panel B: $p = 0.092$; panel C: $p = 0.002$)

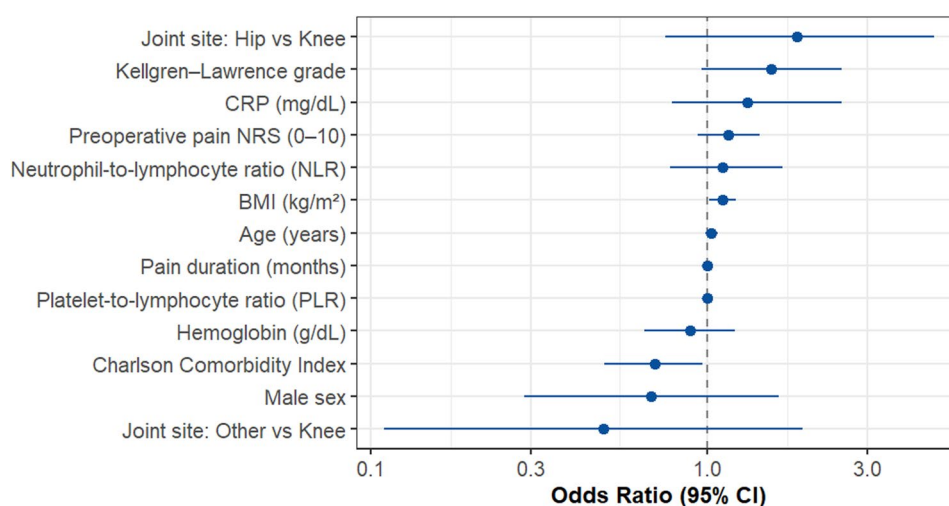


Fig. 5 Forest plot of the multivariable logistic regression model evaluating independent predictors of the lympho-myeloid synovial pathotype. Odds ratios are presented with 95% confidence intervals

of grades 3–4 (Fig. 4A) appeared progressively higher from pauci-immune (73.7%) to diffuse-myeloid (79.3%) and to lympho-myeloid synovium (86.7%).

To further explore systemic–local inflammatory links, we stratified the cohort into CRP tertiles and evaluated the distribution of synovial pathotypes and histological synovitis. Histological grades across CRP tertiles (Fig. 4B) showed a non-significant trend (Fisher $p = 0.092$), with high-grade synovitis increasing from 54.9% (lowest tertile) to 67.9% (middle tertile) and to 70.4% (highest tertile). Pathotypes across CRP tertiles (Fig. 4C) showed a significant overall difference (Fisher $p = 0.002$), with the pauci-immune pattern becoming progressively less frequent in the highest CRP tertile (from 39% to 35.8% to 23.5%).

Multivariable analysis of predictors of the lympho-myeloid pathotype

To explore independent predictors of synovial inflammation patterns, we performed a multivariable logistic regression including preoperative demographic, clinical, laboratory and radiographic variables, using the lympho-myeloid pattern as the dependent outcome.

In the fully adjusted model (Fig. 5), BMI remained the only variable positively associated with higher odds of exhibiting a lympho-myeloid synovial pathotype (OR 1.11, 95% CI 1.01–1.22, $p = 0.028$). Conversely, a higher CCI was independently associated with lower odds of having a lympho-myeloid pattern (OR 0.70, 95% CI 0.50–0.97, $p = 0.036$).

No significant associations emerged for age, sex, NLR, PLR, CRP, hemoglobin, preoperative pain intensity, pain

duration, or joint site. Kellgren–Lawrence grade showed a trend toward higher odds of lympho-myeloid infiltration (OR 1.54, 95% CI 0.96–2.51) but did not reach statistical significance ($p=0.074$). The full results of the multivariable logistic regression model are presented in Supplementary Table 2, including ORs, 95% CIs, and p -values for all included covariates.

Exploratory analyses of medication use in the year preceding surgery showed no significant differences across synovial pathotypes. In contrast, statins, metformin, and other antidiabetic agents were progressively more frequent with increasing CCI category (statins: 0% in CCI 0, 37.0% in CCI 1–2, and 85.7% in CCI ≥ 3 ; metformin: 0%, 11.0%, and 21.4%; other antidiabetics: 0%, 8.2%, and 10.7%; all $p < 0.001$), supporting a close relationship between comorbidity burden and cardiometabolic treatment exposure.

Multicollinearity diagnostics showed no evidence of concerning collinearity among the variables included in the multivariable model); detailed results are reported in Supplementary Table 3.

Joint-specific synovial characteristics

High-grade synovitis was observed in 63.5% of knee samples ($n=167$), 65.6% of hip samples ($n=61$), and 68.8% of specimens from other joints ($n=16$). Fisher's exact test ($p=0.924$) did not show a significant association between joint site and histological grade (Fig. 6A).

Among knee samples, the distribution of pathotypes was: 52.7% lympho-myeloid, 14.4% diffuse-myeloid, and 32.9% pauci-immune. Hip specimens displayed a similar predominance of lympho-myeloid tissue (68.9%), whereas diffuse-myeloid infiltration was less frequent (4.9%). In the other joints, the pauci-immune pattern was relatively more common (56.2%). A global comparison

(Fig. 6B) confirmed a statistically significant difference in pathotype distribution across anatomical sites (Fisher's exact test $p=0.025$). Exploratory pairwise comparisons showed a statistically significant difference between hip and other joints (Bonferroni-adjusted $p=0.048$), whereas no significant differences were observed for the other comparisons (knee vs. hip Bonferroni-adjusted $p=0.147$, knee vs. other joints Bonferroni-adjusted $p=0.547$).

Postoperative course and follow-up

Short-term (30 days) complications—including wound-healing failure, superficial or deep postoperative infection, venous thromboembolism, fever, bleeding requiring transfusion, urinary tract infections, respiratory tract infections, and perioperative arrhythmias—collectively occurred in 31 patients (12.7%) (Fig. 7A).

Information regarding late complications (from the second month to 1-year follow-up) was available in 175 patients (71.7%). Among these, 15 patients (8.6%) experienced at least one late complication. The most frequent events were revision surgery (3.7%), hospital readmission (3.7%), deep surgical infection (2.0%), and reoperation for any cause (0.8%) (Fig. 7A). No significant differences were observed in the occurrence of either early ($p=0.624$) or late complications ($p=0.081$) across the three synovial pathotypes.

Hospital stay had a median duration of 7 days (IQR 6–8). Length of stay differed modestly across synovial pathotypes: 7 days (IQR 6–8) for lympho-myeloid, 6 days (IQR 5–8) for diffuse-myeloid, and 7 days (IQR 6–7) for pauci-immune samples (Fig. 7B). While the global Kruskal–Wallis test indicated statistical significance ($p=0.039$), no pairwise comparison remained significant after Bonferroni correction.

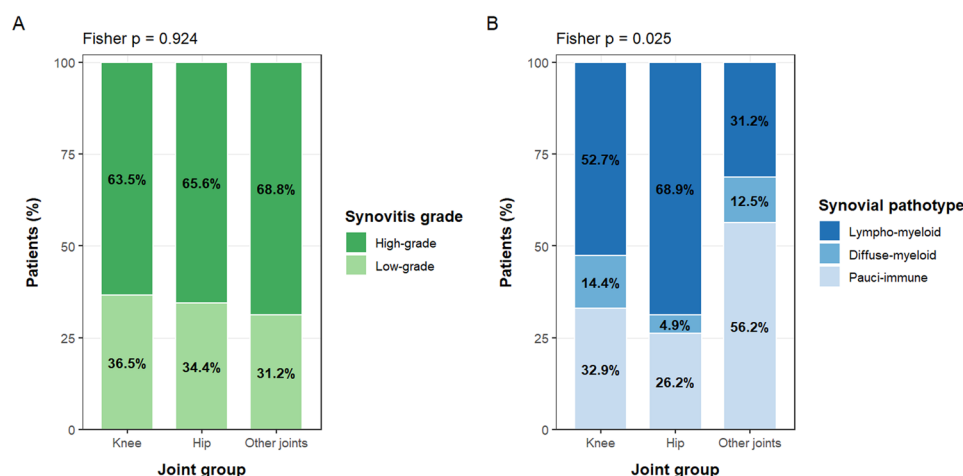


Fig. 6 Synovial pathotypes and histological synovitis severity across joint sites. “Other joints” include shoulder, ankle, elbow, and wrist. **A.** Distribution of synovitis severity across joint sites. **B.** Distribution of synovial pathotypes across joint sites. Statistical analysis: Fisher's exact test (panel A: $p = 0.924$; panel B: $p = 0.025$)

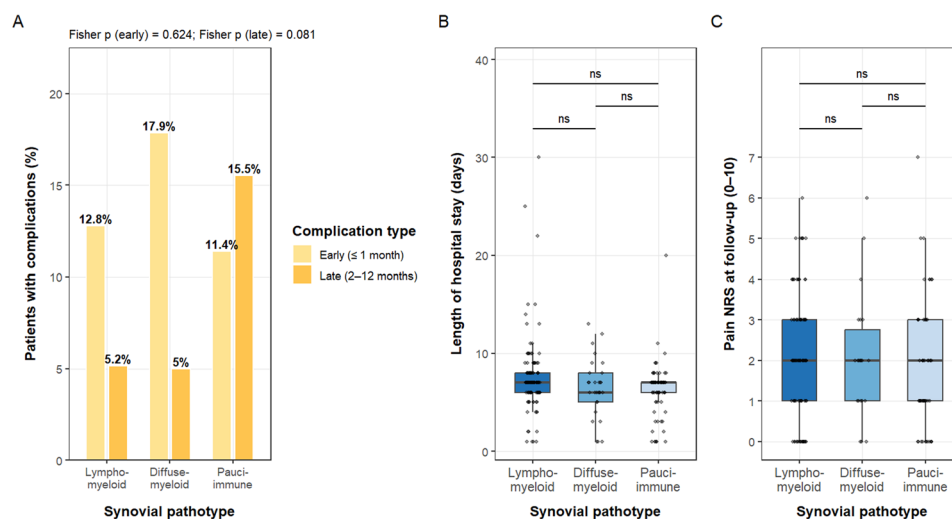


Fig. 7 Postoperative complications, hospital stay, and follow-up pain across synovial pathotypes. **A.** Distribution of early and late postoperative complications according to synovial pathotype. **B.** Median length of hospital stay according to synovial pathotype. **C.** Median pain intensity at 12 ± 3-month follow-up (NRS 0–10). Pairwise comparisons (Dunn's test with Bonferroni correction) showed: Length of hospital stay (**B**): lympho-myeloid vs pauci-immune ($p = 0.063$), diffuse-myeloid vs lympho-myeloid ($p = 0.316$), diffuse-myeloid vs pauci-immune ($p = 1.000$). Follow-up pain (**C**): lympho-myeloid vs pauci-immune ($p = 0.793$), diffuse-myeloid vs lympho-myeloid ($p = 1.000$), diffuse-myeloid vs pauci-immune ($p = 1.000$)

Follow-up pain scores were available for 167 patients (68.4%). The overall median pain NRS was 2 (IQR 1–3), with comparable values across synovial pathotypes: 2 (IQR 1–3) in lympho-myeloid tissue, 2 (IQR 1–2.75) in diffuse-myeloid, and 2 (IQR 1–3) in pauci-immune samples (Fig. 7C). No significant differences were observed (Kruskal–Wallis $p = 0.536$).

Discussion

OA is increasingly recognized as a heterogeneous disease with substantial inflammatory involvement, challenging its historical view as a purely degenerative disorder [29]. Over the past decade, several studies have demonstrated that synovial inflammation is not only common but also contributes to pain, disease progression, and postoperative outcomes in patients undergoing joint replacement [30–32]. Histopathological analyses consistently show variable degrees of lining-layer hyperplasia, stromal activation, and immune cell infiltration within OA synovium, supporting the concept that OA encompasses distinct inflammatory pathotypes rather than a uniform pathological process [33–35].

In this context, our study provides a comprehensive characterization of synovial inflammation in a large cohort of patients undergoing surgery for advanced OA. Consistent with previous reports, we observed a high prevalence of histological synovitis, with 64.3% of samples classified as high-grade synovitis [22]. This reinforces the notion that significant inflammatory activity persists in advanced OA, as previously observed [29]. Importantly, while the prevalence of the lympho-myeloid subtype in our cohort closely mirrors that reported by Boutet

et al., we observed a higher proportion of pauci-immune cases and a lower frequency of diffuse-myeloid pathotype [22]. These differences may reflect distinct characteristics of the study populations: unlike Boutet et al., who focused exclusively on end-stage hip and knee OA, our cohort also included other joints (ankle, wrist, elbow, and shoulder), where the pauci-immune pattern was more prevalent. However, these findings should be interpreted with caution given the limited number of cases and the potential lack of statistical power to detect subtle joint-specific differences. Moreover, our cohort encompassed a broader spectrum of disease severity, including patients with non-advanced radiographic OA. Notably, among patients classified as pauci-immune, approximately one-quarter (26.2%) had a Kellgren–Lawrence grade of 1 or 2, a numerically higher proportion compared to the other two pathotypes. Taken together, these differences may account for the divergent distribution of diffuse-myeloid and pauci-immune pathotypes observed in our study relative to that of Boutet et al. [22].

In interpreting these findings, it is important to consider that the observed distribution of synovial pathotypes is influenced by both disease severity and sampling strategy. Our study population consisted of patients undergoing surgery for symptomatic OA with significant pain or functional impairment, encompassing a spectrum of radiographic severity, and representing a setting inherently enriched for clinically relevant inflammatory features. Moreover, inclusion in the histological analysis was contingent upon intraoperative macroscopic identification of prominent synovial inflammation, such that only cases with visibly inflamed synovial tissue were selected,

resulting in a targeted enrichment of inflammatory phenotypes within the study cohort.

Across the literature, the burden of synovial inflammation varies substantially depending on disease stage and study design. Studies conducted in non-end-stage OA populations using minimally invasive biopsy approaches have reported markedly lower levels of histological synovitis, with only a small proportion of patients exhibiting high-grade inflammation in cohorts characterized by lower radiographic severity [36]. Conversely, studies based on surgical specimens from advanced OA tend to report higher inflammatory burden [22, 37]. However, the extent to which these cohorts represent consecutive, unselected surgical populations, is not always explicitly detailed, which may contribute to variability in reported prevalence.

Importantly, beyond differences in patient selection, synovial inflammation has been shown to exhibit significant intra-articular heterogeneity. Variability in histological synovitis scores across different biopsy locations within the same joint has been reported, with some patients displaying both low-grade and high-grade synovitis in distinct regions of the same joint [38]. This spatial heterogeneity further complicates the interpretation of synovitis prevalence as a fixed property.

These observations suggest that the distribution of synovial pathotypes should be interpreted as a context-dependent feature, influenced by disease severity, clinical setting, and tissue sampling strategy, rather than as a uniform characteristic of OA. This concept is supported by histopathological studies showing that synovial inflammation contributes to defining distinct OA subgroups across the disease spectrum [39]. Our findings further demonstrate a stepwise increase in histological inflammation across pathotypes, with lympho-myeloid tissues showing the highest Krenn scores, intermediate values in diffuse-myeloid, and the lowest burden in pauci-immune synovium. This gradient corroborates the hierarchical inflammatory stratification described by previous work in both OA and RA synovium and further supports the potential biological relevance of synovial pathotypes beyond descriptive categorization [22, 40–42].

We also found that lympho-myeloid tissues were associated with elevated systemic inflammatory indices, including higher NLR, PLR, and SII, as well as higher CRP and lower hemoglobin—an observation in line with the study by Boutet et al., who reported similar associations between lymphoid-rich OA synovium and systemic inflammation [22]. However, while statistically significant, the observed differences are modest in magnitude and are unlikely to be clinically meaningful at the individual patient level. Rather, they may reflect consistent group-level differences in systemic inflammatory burden, reinforcing the concept that synovial pathotypes reflect

not only local tissue biology but also broader inflammatory signatures [43, 44].

Although BMI did not differ significantly across synovial pathotypes in non-parametric comparisons of median values, in multivariable analysis it emerged as an independent predictor of exhibiting a lympho-myeloid synovial pathotype. Conversely, the Kellgren–Lawrence grade, which showed significant differences across pathotypes in categorical analyses, did not retain independent significance after adjustment. This apparent discrepancy likely reflects the partial overlap between metabolic and structural dimensions of OA severity, supported by a weak but directionally consistent correlation between increasing BMI and higher Kellgren–Lawrence radiographic grade in our cohort. The association between adiposity and synovial inflammation aligns with the established role of metabolic–inflammatory pathways in OA, including adipokine dysregulation, chronic low-grade systemic inflammation, and altered macrophage polarization [45, 46]. These findings highlight potential systemic determinants of synovial immunopathology that warrant further mechanistic investigation.

Interestingly, the same multivariable model yielded a seemingly counterintuitive result, whereby higher CCI scores were associated with lower odds of exhibiting a lympho-myeloid synovial pathotype. A possible interpretation is that these older, multimorbid patients have senescent adaptive immune systems, which are less capable of orchestrating the highly organized tertiary lymphoid structures that characterize lymphoid-rich synovitis [47]. In parallel, the same patients are disproportionately exposed to medications with systemic anti-inflammatory or immunomodulatory properties, such as statins, metformin, or low-dose aspirin and, in some cases, chronic low-dose glucocorticoids, all of which may blunt synovial inflammation [48]. In line with this, we observed a progressive increase in the use of statins and antidiabetic agents across CCI categories in our cohort, supporting a link between comorbidity burden and cardiometabolic treatment exposure. However, given the observational nature of our data, no causal inference can be made regarding a potential influence of these medications on synovial pathotype. Moreover, long-standing diabetes, atherosclerosis and other CCI-defining comorbidities are established drivers of microangiopathy and chronic tissue hypoxia, that in turn may promote a shift from a cellular, immune-infiltrated synovium towards a more fibrotic, hypocellular, “burnt-out” stroma as suggested in other tissues [49]. Finally, selection bias cannot be excluded. Patients with high CCI scores typically undergo arthroplasty only after a rigorous risk–benefit assessment, such that those who reach surgery may represent a subset in whom structural damage and mechanical symptoms, rather than highly active inflammatory

synovitis, are the predominant drivers of the surgical indication.

Crucially, we found no differences in hospital length of stay, early complications, late complications, or postoperative pain at follow-up across synovial pathotypes. At least in the context of advanced OA, marked synovial inflammation does not appear to translate into worse perioperative course or short-term clinical outcomes.

From a clinical perspective, these findings suggest that synovial pathotypes have limited immediate implications for patient management. In our cohort, the absence of differences in perioperative course and short-term clinical outcomes across pathotypes indicates that their relevance does not extend to current surgical decision-making. However, these observations support the concept that OA comprises biologically heterogeneous inflammatory patterns. Synovial pathotyping may represent a useful framework for future research aimed at better understanding disease heterogeneity and refining patient stratification. Any potential role in guiding therapeutic strategies remains to be established.

Recent high-dimensional studies further support the view that synovial inflammatory architecture extends beyond purely descriptive morphology. In RA, multimodal single-cell analyses have identified cell-type abundance phenotypes associated with histological features and treatment response, suggesting that classical histological pathotypes may represent morphologically accessible correlates of a deeper cellular organization [50]. In this perspective, our findings do not compete with single-cell frameworks, but are conceptually aligned with them. In OA, emerging single-cell studies have begun to characterize cellular heterogeneity across joint tissues, highlighting shifts toward pro-inflammatory macrophage populations and alterations in regenerative cell compartments [51, 52]. However, compared to RA, these data remain less standardized and lack a unified framework for defining reproducible synovial phenotypes. Therefore, conventional histology and immunohistochemistry still provide a robust and clinically accessible approach to capture biologically meaningful inflammatory patterns in OA, which may serve as a foundation for future integrative studies combining morphology, molecular profiling, and clinical phenotyping.

Several limitations of our study must be acknowledged. First and most importantly, the cohort represents a clinically enriched sample rather than an unselected surgical population. Synovial specimens were submitted for pathological examination at the discretion of the orthopedic surgeon, typically in the presence of overt synovitis or unusual intraoperative findings. As a result, patients with minimal inflammatory features may be underrepresented, potentially inflating the prevalence of high-grade Krenn scores and lympho-myeloid or diffuse-myeloid

pathotypes relative to the general OA surgical population. In addition, as a tertiary referral center, our institution may preferentially manage more complex OA cases, which could further contribute to an enrichment of inflammatory and structurally advanced phenotypes. Therefore, while the dataset offers a detailed and biologically informative view of inflammatory phenotypes in advanced OA, generalizability to routine arthroplasty cohorts or early-stage disease should be interpreted cautiously.

Second, although the overall sample size is relatively large, the number of specimens from joints other than the hip and knee is small, limiting the power of joint-specific analyses for these anatomical sites. Third, postoperative pain and late complication data were not available for all patients, which may introduce response bias, although missingness was moderate. Additionally, the categorization of synovial pathotypes relies on semi-quantitative scoring, which, although validated and reproducible, may miss subtle transcriptomic or cellular heterogeneity detectable through high-dimensional techniques such as spatial transcriptomics or single-cell profiling [53–55].

Conclusions

Overall, despite these constraints, the study provides a histologically detailed assessment of OA synovium across multiple joints, reinforcing the concept that OA is not merely a degenerative condition, but a heterogeneous inflammatory disease with immunopathologic features shared with RA. In a large, well-phenotyped surgical cohort, we characterized three reproducible synovial pathotypes using an established classification, with the lympho-myeloid form accounting for over half of all specimens and showing the highest levels of systemic inflammatory markers. Despite variation in immune cell composition across joints, histological synovitis was consistently prevalent. Synovial pathotypes were not redundant with conventional histological grading and showed no association with short-term surgical outcomes. These findings support the potential biological relevance of synovial inflammation in OA and suggest that tissue-based profiling may help inform future strategies for patient stratification and targeted therapy development.

Abbreviations

BMI	Body mass index
CCI	Charlson Comorbidity Index
CE-AVEC	Comitato Etico Area Vasta Emilia Centro
CI	Confidence interval
CRP	C-reactive protein
DAB	Diaminobenzidine
DAMPs	Damage-associated molecular patterns
EDTA	Ethylenediaminetetraacetic acid
EU GDPR	European Union General Data Protection Regulation
GVIF	Generalized variance inflation factor
H&E	Hematoxylin and eosin
IOR	Istituto Ortopedico Rizzoli

IQR	Interquartile range
KL	Kellgren–Lawrence
MLR	Monocyte-to-lymphocyte ratio
MRI	Magnetic resonance imaging
NLR	Neutrophil-to-lymphocyte ratio
NRS	Numerical rating scale
OA	Osteoarthritis
OR	Odds ratio
PLR	Platelet-to-lymphocyte ratio
RA	Rheumatoid arthritis
REDCap	Research Electronic Data Capture
SII	Systemic immune-inflammation index
Tris-EDTA	Tris–ethylenediamine tetraacetic acid

Supplementary Information

The online version contains supplementary material available at <https://doi.org/10.1186/s13075-026-03819-5>.

Supplementary Material 1.

Acknowledgements

Not applicable.

Authors' contributions

JC and FU contributed to the conception and design of the study. JC, LB, MG, AR, and DG were involved in the collection and assembly of data. MG, AR, CF, and SZ contributed to the provision of study materials. MG and AR performed the histological and immunohistochemical assessment. JC, DG, RC, TWJH, and FU contributed to the analysis and interpretation of the data. JC and FU provided statistical expertise. JC and LB drafted the article. All authors critically revised the article for important intellectual content and approved the final version. JC and FU act as guarantors and take responsibility for the integrity of the work as a whole.

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Data availability

The datasets generated and/or analysed during the current study are not publicly available due to institutional and privacy restrictions but are available from the corresponding author on reasonable request.

Declarations

Ethics approval and consent to participate

The study was conducted in accordance with the Declaration of Helsinki. The protocol was approved by the Area Vasta Emilia Centro Ethics Committee (Comitato Etico AVEC) (CE-AVEC 732/2024/Sper/IOE). Written informed consent was obtained from all reachable participants. For patients who could not be contacted, the requirement for informed consent was waived by the Ethics Committee.

Consent for publication

Not applicable.

Competing interests

The authors declare no competing interests.

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