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# Study for Updated Gout Classification Criteria (SUGAR): identification of features to classify gout

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# **Abstract**

**Objective**—To determine which clinical, laboratory and imaging features most accurately distinguished gout from non-gout.

**Methods**—A cross-sectional study of consecutive rheumatology clinic patients with at least one swollen joint or subcutaneous tophus. Gout was defined by synovial fluid or tophus aspirate microscopy by certified examiners in all patients. The sample was randomly divided into a model development (2/3) and test sample (1/3). Univariate and multivariate association between clinical features and MSU-defined gout was determined using logistic regression modelling. Shrinkage of regression weights was performed to prevent over-fitting of the final model. Latent class analysis was conducted to identify patterns of joint involvement.

**Results**—In total, 983 patients were included. Gout was present in 509 (52%). In the development sample (n=653), these features were selected for the final model (multivariate OR) joint erythema (2.13), difficulty walking (7.34), time to maximal pain < 24 hours (1.32), resolution by 2 weeks (3.58), tophus (7.29), MTP1 ever involved (2.30), location of currently tender joints: Other foot/ankle (2.28), MTP1 (2.82), serum urate level > 6 mg/dl (0.36 mmol/l) (3.35), ultrasound double contour sign (7.23), Xray erosion or cyst (2.49). The final model performed adequately in the test set with no evidence of misfit, high discrimination and predictive ability. MTP1 involvement was the most common joint pattern (39.4%) in gout cases.

**Conclusion**—Ten key discriminating features have been identified for further evaluation for new gout classification criteria. Ultrasound findings and degree of uricemia add discriminating value, and will significantly contribute to more accurate classification criteria.

#### **Keywords**

Gout; classification criteria; diagnostic ultrasound

Gout is the most common inflammatory arthritis in men and is increasing in prevalence (1, 2). Most gout worldwide is managed in primary care where disease identification seldom relies upon identification of monosodium urate (MSU) crystals because synovial fluid or polarizing light microscopy may not be easily obtainable (2). Therefore highly sensitive and specific classification criteria that do not require microscopic MSU crystal identification

would be useful for clinical research conducted in epidemiological or primary care settings. Six classification criteria for gout have been developed, with the most widely used one being the 1977 American Rheumatism Association (ARA) criteria (3, 4).

However, there are significant limitations to the ARA criteria. These include the use of only patients with selected diagnoses (rheumatoid arthritis (RA), calcium pyrophosphate deposition disease (CPPD) and acute septic arthritis) as controls even though other rheumatic diseases may be amongst the group of patients or respondents for which such classification criteria for gout need to be applied. Only 47% of the controls had synovial fluid examination to confirm absence of MSU crystals.

The gold-standard chosen for the ARA classification criteria was physician diagnosis. In this way, the performance of synovial fluid microscopy could be examined. Only in 76 of 90 (84%) gout patients in whom synovial fluid was examined were MSU crystals identified. It is possible that excellent treatment of some patients led to clearance of MSU crystals, but the lower than expected sensitivity of synovial fluid analysis raises questions about the physician diagnosis (did the crystal-negative patients really have gout?) or the quality of the synovial fluid analysis. Many patients had incomplete data.

The ARA criteria were not tested in an external sample prior to publication, and thus were "preliminary" criteria. Subsequent external validation of the ARA survey criteria against a gold standard of synovial fluid analysis has been reported in two studies. In these studies the sensitivity was 70% and 80%, specificity was 78.8% and 64%, respectively (5, 6). Poor specificity is especially problematic in studies that seek to enroll patients into trials of new therapeutic agents, especially those with potential and unknown safety issues. It is important that patients accurately classified with gout are enrolled into studies to minimize inappropriate exposure to such drugs.

Due to the limitations of current criteria, ACR and EULAR have funded a project to update gout classification criteria (4). The Study for Updated Gout ClAssification CRiteria (SUGAR), undertaken as part of the gout classification project was designed to determine the performance of possible items that could discriminate between gout and non-gout, including diagnostic ultrasound findings. This study represents the first phase of the effort to develop updated classification criteria, aiming to identify the pertinent items to be considered for further evaluation and to assist with decision making in that evaluation. In addition, we examined the distribution of joint involvement amongst gout and non-gout patients to help distinguish patterns of joint involvement that should be considered in developing new criteria. It is important to re-iterate the difference between classification criteria, which are designed for entry into clinical studies, and diagnosis, which is a process that involves clinical care. The distinctions are more fully explained in existing literature (7–9). The work in the present study concerns classification criteria rather than diagnosis.

The second phase of the project consists of an expert-based selection and weighting process, informed by the SUGAR study results that will determine the new gout classification criteria that we aim to have endorsed by both ACR and EULAR. The second phase together with the final criteria will be reported separately.

# **Patients and Methods**

Consecutive patients attending a rheumatology clinic with all of the following: a main complaint of joint(s) pain and swelling; GP or rheumatologist judges that gout is a possible differential diagnosis because of joint pain and swelling; patient has joint swelling currently or within the last 2 weeks or a possible tophus; there are no contraindications to arthrocentesis in the opinion of the clinical investigator, were enrolled into this crosssectional study. At the visit, clinical manifestations and a clinical diagnosis were recorded using standardized case record forms, prior to synovial fluid (or tissue) microscopy by a certified observer (see below for how observers were certified). Each centre received Ethics Committee Approval or Institutional Review Board approval according to local requirements. Informed consent was obtained from participants according to the requirements of local Ethics Committee or Institutional Review Board. The STAndards for the Reporting of Diagnostic accuracy studies (STARD) statement was used to guide reporting (10).

#### Gold-standard for gout (case definition)

All patients underwent arthrocentesis or tissue/tophus aspiration for polarizing microscopy to identify MSU crystals. All microscopic examination was undertaken by observers who had passed a 2-stage MSU-identification certification procedure, which consisted of a web-based crystal recognition test followed by examination of 5 to 8 vials of synovial fluid (SF) from the laboratories of Eliseo Pascual (European centres) or H. Ralph Schumacher (rest of the world) for those who passed the online test. The web-based test was strict and had a high non-pass rate (61%) (11). Each SF sample in the second stage needed to be correctly identified as demonstrating MSU crystals or not to achieve certification. SF samples with at least 10ml volume (to allow distribution of very small aliquots of the same specimens to all examinees) and typical findings for CPP crystals, MSU, and apatite (BCP, basic calcium phosphate) were selected. In addition, depot methylpredisolone crystals were added to a large osteoarthritic SF sample. Samples were pipetted into plastic tubes & sent with instructions to examine single drop specimens in the examinees microscope. Each SF sample was checked prior to shipping by express service to confirm stability of the crystals.

Cases of gout were defined as patients with MSU crystals identified by a certified observer. There were 42 certified observers involved in this study. Cases of non-gout were defined as patients without MSU crystals, irrespective of the clinical diagnosis. Synovial fluid/tissue microscopy by a certified observer was usually performed on the same day but could be done within 1 month of the visit to allow time to arrange an ultrasound guided aspiration. There was no restriction on the amount of fluid required from enrolled patients. Microbiological culture was sometimes not possible with small amounts of aspirated fluid, but this information was not mandatory. If arthrocentesis was not successful, investigators were able to repeat the procedure using US guidance. More than 1 joint could be aspirated according to the judgment of the clinical investigator, although this was uncommon. If no synovial fluid or tophus aspirate was obtained, the patient was not included in the study.

#### Potential classification items

Clinical data were collected at the index visit. Items were collected that included elements of existing classification criteria or had been ranked highly by physicians or patients in a previous Delphi exercise, which aimed specifically to identify potentially relevant diagnostic features of gout (12). Those items with a rating of 7 to 9 (agreed to be potentially discriminatory) from physicians or patients were selected.

All potential classification items (symptoms, signs, laboratory values and imaging results) were collected at the index visit and prior to synovial/tissue microscopy, using standardized case record forms. Currently swollen or tender joints were recorded on a homunculus. Advanced imaging items (magnetic resonance imaging, computing tomography, dual energy computing tomography) were recorded if available but were not mandatory. Ultrasound and conventional radiography were intended to be mandatory but since data were usually collected within routine clinical care without specific funding, not every patient had radiography and ultrasound data available.

For participants with their first episode, items that referred solely to previous episodes were marked as non-applicable but predictors were constructed from items so as to include all episodes (current and previous).

#### Statistical analysis and sample size

The overall analytic plan is shown in supplementary Figure 1. Forty-five items were collected with the expectation of these reducing to 30 items for a multivariate analysis. It was planned that the dataset be randomly divided into development (2/3 of data) and test sets (1/3 of data), which was performed after all patients were included using a computerized random number generator. Using the rule of thumb for multivariate models of 10 participants per item divided by the smallest proportion of cases or controls (0.5) and 30 items for analysis, we estimated that 860 participants would be required for building a robust multivariate model (13).

**Step 1: univariate analyses**—In the development set, univariate logistic regression analysis was performed for each item, calculating the sensitivity (true positive rate, proportion of cases having the feature), 1-specificity (false positive rate, proportion of controls having the feature) and odds ratio (OR, odds of having the feature in cases, compared to controls) with its associated p-value.

After univariate analyses, 30 items were considered for inclusion in a multivariate model based on p-value (p<0.05; we did not use a more lenient p<0.1 at this stage due to the number of variables that were statistically significantly associated). Moreover, it was agreed that only items that were disease manifestations of gout would be included; thus risk indicators (as opposed to features of the disease itself) such as age, sex, diet and comorbidities were not included. For items that were highly related (e.g., if there were >1 item regarding time to resolution or time to maximal pain), the item with the best clinical feasibility or, if equivalent, the item with the lowest p-value was selected.

Step 2: multivariate analyses—Two approaches were then taken to further develop the prediction model: firstly, a purely statistical approach starting with a full model containing all variables selected after univariate analyses, followed by backward selection using oneby-one deletion of items based on the size of the highest p-value of the regression coefficients until all p<0.2 (13). This was the 'statistically optimal model' used to gauge the performance of a clinical model. The second approach was a clinical hierarchical model using clinical reasoning and a forward selection procedure by collecting the major features of gout, sorted into domains of clinical information (joint inflammation, time course of symptoms, physical examination, laboratory test, and imaging). For that model, variables were selected from univariate analyses based on p-value (p<0.05), OR (stronger the better), fit to the domains (while avoiding duplication), and feasibility with regards to assessment. Variables in a domain were included all at once and backward selection was applied until all p-value<0.20; then the variables of the next domain were added all at once and the procedure was repeated for that domain. Variables from previously added domains were only removed again if their p-value became >0.50. We chose a final model from these two approaches based on statistical parameters indicating better model fit (Akaike Information Criterion, AIC) and predictive accuracy (c-statistic) to determine the strength of associations between the included factors and presence of crystal-proven gout.

**Step 3: correcting for over-optimism**—We applied a standard method of shrinkage to reduce error in predicted values when the model is applied to new data and to avoid overestimating the predictive ability of the model. The regression coefficients of the final model were reduced by multiplication with a shrinkage factor determined by performing a bootstrap procedure with 300 repetitions (14, 15).

**Step 4: testing model performance**—The performance of the 'shrunken' model in the test set was analyzed using the c-statistic, Nagelkerke's R<sup>2</sup>, the Hosmer-Lemeshow test and by plotting the predicted probabilities with the observed probabilities for groups classified according to deciles of the classification rule (calibration plot). The c-statistic is an estimate of discrimination, being equivalent to the area under the curve of a ROC curve, with values of 1 indicating perfect discrimination between gout and non-gout and 0.5 indicating discrimination no better than chance. The R<sup>2</sup> statistic is a measure of the difference between the observed class (gout/non-gout) and the class predicted by the prediction model (values of 0 indicating no explained variance and 1 indicating 100% of the variance in class membership are explained by the model). The Hosmer-Lemeshow test is a statistical test of model fit by assessing how well the observed class membership of subgroups correspond to class membership predicted by the model. A non-significant test indicates good model fit. The optimal cut point that corresponded to the inflexion point of the ROC curve signifying maximum sensitivity and specificity was also determined for this shrunken prediction model.

To further inform the decision-making process regarding which joints are most frequently involved during symptomatic episodes, patterns of joint involvement were analyzed in the development set of the SUGAR data. This was based upon currently swollen and tender joint involvement during the study visit as recorded on a homunculus following physician

examination. First, we assessed the crude prevalence of each joint area with respect to reported tender vs. swollen joint involvement, and involvement of left-sided vs. right-sided joints in cases and controls separately. Once it was determined that prevalences were similar for both tender and swollen joints, and for left vs. right, tender and swollen joints were analyzed together (i.e., each joint was categorized as tender OR swollen), and both left-sided and right-sided joints were analyzed together in the same model.

We performed latent class analysis (LCA) on cases separately from the controls. LCA is a statistical approach that identifies underlying subgroups (i.e., latent classes or clusters) of individuals based upon their responses to a set of observed categorical variables. In this case, it was ascertainment of symptomatic involvement of each joint (yes vs. no) on a homunculus. This framework is the categorical analog to factor analysis, which is based on continuous variables. (16–18)

We used LCA to model the symptomatic joints to identify clusters representing a homogeneous subgroup that have a similar pattern of joint involvement. We first modeled all joints of the homunculus together, then repeated analyses limited to the following 4 joints areas: i) lower extremity joints only, ii) foot and ankle joints only, iii) upper extremity joints only, and iv) hand and wrist joints only. For each model, the optimal number of clusters was determined by statistical parameters (likelihood ration  $G^2$  statistic, degrees of freedom, AIC and BIC). We obtained the prevalence of the identified clusters in each model, and the item-response probability of each item within each cluster.

#### Results

Twenty-five centres from 16 countries and 4 continents contributed data on 983 patients (509 cases, 472 non-cases), collected between January 2013 and April 2014. The majority, 702 (71.4%) were male. The mean (SD) age was 58.5 (17.2) years and median (interquartile range) duration of disease since first recalled symptoms was 4 (0.6 to 10) years (Table 1). In the development and test sets 30 (9%) and 17 (10%) of gout patients presented with their first episode of symptoms. Thirty-seven percent of the participants were non-Caucasian. Non-cases had a clinical diagnosis of acute calcium pyrophosphate arthritis (109), spondyloarthritis (71), rheumatoid arthritis (70), osteoarthritis (69), undifferentiated arthritis (60), clinical gout (but MSU crystals were not observed by microscopy, 49), septic arthritis (10), systemic lupus erythematosus (5), or other (31).

#### Missingness

MSU crystal identification was available for all patients. Clinical data collection and arthrocentesis was on the same day for 91% of patients and within 11 days for 99% of patients. Most variables had 0 or <1% missing only; serum uric acid level was missing for 8%, current location of tender joints, whether MTP1 was first ever joint involved were missing in <10%. Radiographs/ultrasound scans were not available from 12.4/18.5% of gout cases and 11.8/13.9% of non-gout cases. DECT and MRI were undertaken too infrequently to be usefully analyzed and were not considered further.

#### Univariate analysis

In the development sample (n=653), the univariate association of individual items with having MSU-proven gout is shown in Table 2. Overall, most items tested were associated with MSU-proven gout in univariate analyses, though some had weak associations in terms of magnitude of effect. The items with the highest OR were tophus on ultrasound (18.8), SUA >6mg/dl (0.36 mmol/l) (17.8), double contour sign on ultrasound (14.7), patient belief that he/she has gout (14.2), clinically evident tophus (10.0), dietary trigger (8.7), MTP1 ever involvement (8.1), radiographic erosion (6.7), male gender (6.4), joint erythema (6.1), marked tenderness (6.0), at least 2 episodes that start abruptly and resolve by 2 weeks (6.0), resolution of symptoms by 14 days (5.7), and difficulty walking or using joint (5.4). Additionally, we found a clear monotonically increasing relation of SUA levels with gout, with OR 5.9 for SUA 6 to 8mg/dl (0.36 to 0.48mmol/l) and 39.4 for SUA above 10mg/dl (0.6mmol/l). Nonetheless, a therapeutic cut-point of 6mg/dl (0.36mmol/l) was used in the final prediction model for this study to be more consistent with the dichotomous format of SUA in published criteria-sets and to be consistent with the data analysis that was presented to an expert panel in the second phase of the project.

# Pattern of joint involvement

In the LCA model that included all currently involved (i.e., tender or swollen) joints among gout cases, 4 clusters emerged. The cluster with the highest prevalence was that of 1st MTP involvement, with a prevalence of 39.44% (Table 3). With just a slightly lower prevalence, the second most prevalent cluster was associated with predominantly knee or ankle/midfoot involvement (37.14%); the third was primarily elbow, wrist, and hand involvement (14.85%), and the fourth was polyarticular involvement, affecting virtually any joint (8.57%). This cluster pattern was in contrast to the non-gout patients, in which prevalence of knee involvement, predominantly monoarticular, appeared to be higher (56.83%), and no MTP pattern was seen (Table 3).

When limited to just lower extremity joints in the gout cases, monoarticular presentation of either knee, ankle, or 1st MTP was high (83.49%); limited to just the foot and ankle, 1st MTP monoarticular presentation was common (84.16%). For non-gout patients, when limited to the lower extremity, monoarticular involvement of the knee was most common (60.84%); when limited to the foot/ankle, 1st MTP monoarticular presentation was uncommon (6.36%). Upper extremity as well as hand/wrist clusters were similar for cases and controls.

#### **Multivariate models**

The multivariate model developed from backward removal of items based solely on statistical criteria is shown in Table 4 along with the hierarchical models that included clinical reasoning. Two items were removed again from the hierarchical models because of large p-values (p>0.50). The final hierarchical model parameters are shown in Table 5. This model was chosen over the statistically derived model because of smaller AIC (303 vs. 677) and larger c-statistic (0.93 vs. 0.91).

We applied a shrinkage factor of 0.76 that was estimated using bootstrapping to the regression coefficients of the hierarchical model to form a final prediction model that provided insights into the strength of association between the included items and presence of MSU-proven gout (the regression coefficients or weights are shown in Table 5).

In the multivariate analyses, the items regarding marked tenderness and having at least 2 episodes that start abruptly and resolve within 2 weeks were no longer significantly associated with presence of crystal-proven gout. There was conceptual similarity between the item "having at least 2 episodes that start abruptly and resolve within 2 weeks" and 2 other variables that remained in the model, that of "maximal pain within 24 hours" and "resolution by 14 days". This redundancy led to removal of the first of these 3 items. Similarly, marked tenderness was likely analogous in concept to experiencing great difficulty in walking or inability to use affected joint. Further, while all ultrasound features were initially included in the hierarchical model, subsequently only DCS remained significant. Similarly, the only x-ray features that were retained for the multivariate model were erosions with sclerotic margins and overhanging cortical edges and/or subcortical cysts.

In the test data-set (n=329, 50.5% with gout), a logistic regression model in which gout/non-gout (based upon MSU presence) was the dependent variable and the model-derived 'shrunken' score (based upon the 'shrunken' regression coefficients derived in the development data-set; Table 5) was the independent variable, a close association between the score and the presence of gout was noted with R<sup>2</sup> 0.58, c-statistic 0.90 and Hosmer-Lemeshow Chi-square 7.11 (df=8), p=0.53. The model parameters for the version without imaging were R<sup>2</sup> 0.52, c-statistic 0.87 and Hosmer-Lemeshow Chi-square 1.90 (df=9), p=0.99. Using a statistically derived cut-point from the data-derived prediction model in which the sum of sensitivity and specificity was maximized, we found the sensitivity of the model was 83.9% (88.1% for the model without imaging) and specificity was 81.2% (71.6% for the model without imaging).

#### **Discussion**

In this study, we found that a large number of clinical and imaging parameters are highly associated with presence of MSU-crystal gout compared to other diseases associated with joint swelling. However, in multivariate analyses, some were no longer significantly associated with gout, while 10 factors remained independently predictive of the presence of gout, representing clinical, laboratory, and imaging features. Even so, the data-derived prediction model possessed sensitivity and specificity that were both less than 90%.

We also confirmed that MTP1 involvement was typical of gout, although the latent class analysis showed that knee/ankle/midfoot involvement was almost as common. Knee monoarthritis was more typical of non-gout, although also occurred frequently in gout cases. It should be acknowledged that this analysis was performed on currently involved joints, which does not necessarily capture the full spectrum of joint involvement that could 'ever' occur in a given patient.

In this study, we chose a therapeutic value of 6mg/dl (0.36mmol/l) as a cutoff to define high serum urate, but the association of serum urate with gout/non-gout varies continuously. This has been well described at a population level (19) but not previously in a diagnostic context. In the SUGAR data, we found that the odds ratio of having gout vs. non-gout increases non-linearly with quartiles of the highest ever recorded serum urate from nearly 6 for the lowest quartile (less than 6 mg/dl, 0.36mmol/l) to 39 for the highest quartile (more than 10 mg/dl, 0.6mmol/l). This is shown graphically in Figure 1. Future proposals for gout classification criteria should possibly incorporate levels of serum urate rather than simple presence vs. absence of a high serum urate level.

This study took several steps to minimize bias, including a requirement that all subjects underwent a rigorous gold-standard procedure, collection of pre-defined items that were previously included in existing criteria sets and additional ones identified through Delphi methods, application of 'shrinkage' to estimated regression coefficients to minimize over-fitting, and testing the derived criteria in a randomly selected subset of the data that did not contribute towards the development of the criteria. The sample size was large enough to test a range of possible items including key ultrasound features. Further, the subjects comprising our control group included a broader, relevant spectrum of diseases than prior classification criteria studies.

The main limitations to the interpretation of the results arise from the population that was studied. This was not a primary care population and all patients needed to have synovial fluid or tissue aspiration in order to be included in the study. This confers unavoidable spectrum bias, whereby the studied population likely had more severe than would be seen in primary care, and does not necessarily represent the full spectrum of clinical gout. In addition, this sample is biased towards chronic disease by inclusion of people with more persistent or recurrent features. Patients with persistent disease have more opportunity to accumulate disease features. Therefore the results of the study may not be generalizable to primary care settings.

It is possible that patients with large joint disease were preferentially selected because of the need for joint aspiration. However, this is unlikely to have been a major factor since 74% of gout cases had MTP1 involvement at some time in their disease course, which is within the range of what is observed in other gout cohorts (20) and furthermore 128/1004 (13%) joint aspirations were from the MTP1 joint. There were 34% of gout cases with currently tender MTP1.

Whether these same items are also predictive of presence of crystal-proven gout in a sample that may have milder disease that is not tophaceous or disease that involves only small joints is presently not known. This is one of the reasons that additional work has been planned to develop the new gout classification criteria. We also could not test the performance of presence of MSU crystals itself given that our case-control status was defined by their presence (i.e., gold standard).

We emphasize that the prediction model described in this study was intended to inform the next stages of classification criteria development and are not the final ACR-EULAR

endorsed gout classification criteria. The study has demonstrated which items and which combinations of items are most strongly associated with gout. In particular, it has demonstrated that ultrasound features, even when unstandardized and performed according to local practice, can significantly contribute to classification of gout.

Nonetheless, in order to overcome the limitation of spectrum bias, the need for all patients to have undergone the diagnostic gold-standard procedure and to allow expert opinion to be integrated into new classification criteria, the second phase of the project incorporating a paper patient exercise and an expert clinician workshop was undertaken (reported separately).

Despite efforts to incorporate key diagnostic features of gout, classification of patients without searching for MSU crystals remains inaccurate with combined sensitivity and specificity of the prediction model derived from these data both under 90%. This highlights the importance of synovial fluid examination for diagnostic purposes in ordinary clinical care and cautions against the use of classification criteria for diagnosis. In situations where high positive predictive value is required, a high suspicion of gout (pre-test probability), criteria with lower sensitivity or a crystal diagnosis should be determined. Ultrasound features also contribute strongly to classification of gout and may have sufficient specificity to be useful in such situations.

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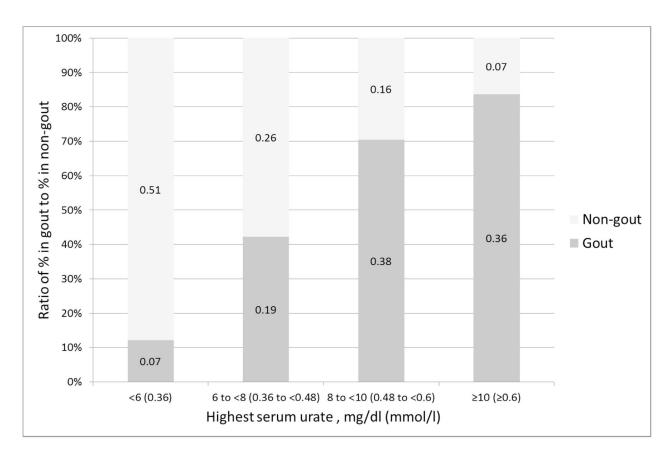
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# Significance and innovation

• Accurate classification criteria for gout that do not require MSU identification would be useful for clinical research.

- Key clinical, imaging and laboratory features that distinguish between gout and non-gout were identified in a cross-sectional, multi-national study.
- The degree of uricemia and ultrasound findings contribute independently to the classification of gout and should be included in future classification criteria.



**Figure 1.** Association of highest serum urate (mg/dl) with gout. The size of the bars represent the ratio of the proportion of gout/non-gout with each level of serum urate. The bar labels are the actual observed proportion in the gout or non-gout groups with each level of serum urate.

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Table 1

Participant characteristics Gout

		Gout (MSU positive, n=509)	Non-gout (MSU negative, n=474)
Time since first epis	ode of symptoms (years), median (IQR)	6 (2 to 13)	3 (0.23 to 8)
Male (%)		440 (86%)	262 (55%)
Age, mean (SD)		60 (15)	59 (16)
Clinical diagnosis*	Gout	494	49
	Calcium pyrophosphate deposition disease	4	109
	Spondyloarthritis	1	71
	Osteoarthritis	3	69
	Rheumatoid arthritis	2	70
	Undifferentiated arthritis	1	33
	Septic arthritis	2	10
	Systemic Lupus Erythematosus	0	5
	Other	2	31
Ethnicity	White/European/Caucasian	347	276
	African/Black	12	11
	Hispanic	23	21
	South Asian	47	38
	East Asian	67	113
	Pacific Island	3	1
	Other indigenous	3	4
	Other	7	10

 $<sup>^{\</sup>ast}$  Clinical diagnosis was independent of MSU crystal identification

 $MSU = monosodium \ urate; \ IQR = interquartile \ range; \ SD = standard \ deviation$ 

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Table 2

Univariate association of each variable with classification as gout in the development data-set (n=653). Values are percentages for categorical items or mean (SD) for continuous variables.

Item Description		Present in gout (N=346), %	Present in non-gout (n=307), $\%$	OR	p-value
Gender (male)		%68	55%	6.4	<0.0001
	0-4 hours	73%	19%	1.9	
Time to make the second of the	5–12 hours	78%	16%	2.0	000
Time to max, pain (current episode)	13–24 hours	16%	12%	2.6	<0.0001
	>24 hours	34%	52%	ref.	
	0-4 hours	31%	33%	1.9	
Time of the state	5–12 hours	31%	14%	3.3	000
Time to max, pain (previous episodes)	13–24 hours	16%	10%	4.5	\.\.\.\.\.\.\.\.\.\.\.\.\.\.\.\.\.\.\.
	>24 hours	%27	44%	ref.	
Pain level 0 to 10 (current episode)		8 (7–10)	(6–9) 8	1.1	0.0085
Pain level 0 to 10 (current episode) 7 or higher	ner	%6 <i>L</i>	20%	1.6	0.015
Pain level 0 to 10 (previous episodes)		8 (7–10)	7 (4–9)	1.2	<0.0001
Pain level 0 to 10 (previous episodes) 7 or higher	igher	%9 <i>L</i>	26%	2.6	<0.0001
At least 2 episodes that start abruptly and conclude by 2 weeks	anclude by 2 weeks	%88	44%	0.9	<0.0001
	0–24 hours	% <i>L</i>	%9	6.1	
	1–7 days	%95	28%	10.3	
Time for episodes to resolve	8–14 days	19%	11%	8.7	<0.0001
	More than 14 days	11%	19%	2.6	
	Never resolved	%2	37%	ref.	
Time for episodes to resolve	More than 14 days or never	18%	26%	0.17	<0.0001
	1	%6	22%	ref.	
Number of episodes	2 to 5	24%	28%	3.1	<0.0001
	more than 5	%99	50%	2.0	
	yes	33%	12%	3.4	
Stereotypical progression*	no	61%	80%	ref.	<0.0001
	uncertain	%9	8%	1.0	

Item Description		Present in gout (N=346), %	Present in non-gout (n=307), %	OR	p-value
Complete resolution of at least one episode		85%	26%	4.6	<0.0001
Hypertension or other CVS diseases		%89	45%	2.6	<0.0001
Tender joint count		1 (1–3)	1 (1–2)	1.04	90:0
	1	53%	61%	0.59	
Tender joint count	2–4	30%	28%	0.74	0.0066
	> 4	17%	12%	ref.	
Swollen joint count		1 (1–3)	1 (1–2)	1.06	0.026
	1	23%	%59	0.38	0.0008
Swollen joint count	2–4	32%	27%	0.55	
	> 4	15%	%L	ref.	
Involved joints take longer to heal		25%	29%	0.84	0.33
Patient belief he/she has gout		81%	23%	14.2	<0.0001
Told by doctor he/she has gout		84%	27%	14.3	<0.0001
Xray - erosion		42%	10%	6.7	<0.0001
Xray - asymmetric joint swelling		43%	24%	2.4	<0.0001
Xray - joint cyst without erosion		44%	17%	3.7	<0.0001
Xray – erosion and/or joint cyst		29%	21%	5.3	<0.0001
Any of these xray features present		%99	38%	4.7	<0.0001
US - double contour sign		58%	%6	14.7	<0.0001
US - tophus		45%	4%	18.8	<0.0001
US - snowstorm effusion		31%	%6	4.4	<0.0001
Any of these 3 US features present		75%	16%	15.3	<0.0001
	grade 0	32%	42%	3.0	
Douge Donalor (TC)	grade 1	25%	23%	2.1	70000
rower Doppies (OS)	grade 2	28%	29%	2.4	0.003
	grade 3	15%	%9	ref	
Patient taking ULT at time of SUA level		34%	8%	5.6	<0.0001
Tophus present or previously present		34%	2%	10.0	<0.0001
MTP1 involvement was first ever symptom		54%	16%	6.0	<0.0001

MTP1 involvement ever occurred			D		
		74%	27%	7.6	<0.0001
MTP1 occurred in isolation ever		72%	24%	8.1	<0.0001
Maximal pain greater than 7		93%	81%	3.3	<0.0001
At least 1 episode resolved by 14 days		82%	44%	5.7	<0.0001
At least 1 episode involved 1–5 joints		72%	%69	1.2	0.37
At least 1 episode involved joint erythema		%28	53%	6.1	<0.0001
At least 1 episode involved marked tendemess to touch	s to touch	95%	%59	0:9	<0.0001
At least 1 episode involved only 1 joint		%56	%98	3.2	0.0001
At least 1 episode involved tarsal joints		57%	30%	3.0	<0.0001
Patient has history of kidney stone		15%	%6	1.8	0.017
	Yes	40%	10%	ref.	
At least 1 episode responded to colchicine	No	13%	10%	0.34	<0.0001
	Never used colchicine	47%	79%	0.15	
At least 1 episode involved difficulty walking		%26	84%	5.4	<0.0001
At least 1 episode it was hard to sleep		%06	%69	4.2	<0.0001
At least 1 episode pain present at rest		91%	78%	3.0	<0.0001
At least 1 episode joint was throbbing or burning	ing	%06	72%	3.7	<0.0001
Disabled OR sleep OR rest pain OR throbbing		%66	%06	9.4	<0.0001
At least 1 episode joint was hot to touch		%56	80%	4.8	<0.0001
At least 1 episode triggered by dietary factor		53%	11%	8.7	<0.0001
At least 1 episode there was joint swelling		%26	97%	1.1	0.79
Current SUA (mmol/l)		0.47 (0.13)	0.34 (0.13)		
Highest recorded SUA (mmol/I)		0.56 (0.14)	0.38 (0.14)		
Highest SUA without ULT (mmol/l)		0.57 (0.13)	0.38 (0.13)		
Current SUA > 0.36 mmol/l		79%	40%	5.5	<0.0001
Highest recorded $SUA > 0.36 \; mmol/l$		93%	51%	12.6	<0.0001
Highest SUA without ULT > 0.36 mmol/l		95%	51%	17.8	<0.0001
	<0.36 mmol/l	7%	51%	Ref	,000
Highest SUA category	0.36 to <0.48 mmol/l	19%	26%	5.9	<0.0001

Item Description		Present in gout (N=346), %	Present in non-gout (n=307), %	OR	p-value
	0.48 to <0.60 mmol/l	38%	16%	18.3	
	0.60 mmol/l	36%	7%	39.4	
Currently tender any MTP1		33%	%6	4.8	<0.0001
Currently tender any big toe IP		%7	%0	12.2	0.016
Currently tender any joint lesser toes		12%	%L	1.8	0.033
Currently tender any midfoot joint		%8	2%	1.8	0.079
Currently tender any ankle joint		%0E	17%	2.1	0.0001
Currently tender any knee joint		42%	%19	0.27	<0.0001
Currently tender any hip joint		1%	3%	0.18	0.026
Currently tender any shoulder joint		%8	%9	0.44	0.036
Currently tender any elbow joint		11%	7%	1.7	0.056
Currently tender any wrist joint		15%	14%	1.0	0.88
Currently tender any hand joint		70%	10%	2.1	0.0003
Currently tender any CMC		1%	1%	1.8	0.49
	Any joint proximal to ankle	36%	68%	ref.	
Currently tender joint location	Ankle or foot not MTP1	78%	20%	2.6	<0.0001
	MTP1	36%	12%	5.9	
		30%	10%	4.0	<0.0001
		%8	%0	10.3	0.026
		40%	48%	3.7	<0.0001
		% <i>L</i>	4%	1.6	0.16
		31%	17%	2.1	<0.0001
As above except these are for currently swollen joints	llen joints	43%	%29	0.38	<0.0001
		1%	4%	0.27	0.024
		11%	5%	2.3	0.0084
		14%	14%	0.99	0.96
		20%	8%	2.8	<0.0001
		1%	1%	1.8	0.49
Currently swollen joint location	Any joint proximal to ankle	38%	71%	ref.	<0.0001

Item Description		Present in gout (N=346), %	Present in non-gout (n=307), %	OR	p-value
	Ankle or foot not MTP1	30%	17%	3.2	
	MTP1	32%	12%	5.0	

a clear progression has been observed over a minimum period of 5 years, in which attacks initially affected only 1 joint at a time, then between 1 and 5 joints and then more than 5 joints.

SD = standard deviation; OR = odds ratio; US = ultrasound; ULT = urate lowering therapy; MTPI = first metatarsophalangeal joint; SUA = serum urate; CVS = cardiovascular; IP = interphalangeal joint; CMC = thumb carpometacarpal joint.

Table 3

Prevalence of joint involvement clusters among gout and non-gout

Gout		Nongout		
Joint Pattern	Prevalence	Joint Pattern	Prevalence	
MTP1	39.4%	Knee only	56.8%	
Knee/ankle	37.1%	Any lower extremity joint	30.1%	
Elbow/wrist/hand	14.9%	Wrist/hand + knee	8.0%	
Polyarticular	8.6%	Polyarticular	5.1%	

 $MTP1 = first\ metatars ophalangeal\ joint$ 

Table 4

Multivariate model development. Two approaches are shown – by statistical selection only or by progressive addition of clinically informed groups of variables (see text for details).

Model name	Variables	AIC*	c-statistic $(AUC)^{\dagger}$
STATISTICAL SELECTION ONLY	Sex, onset of maximal pain, complete resolution of episode, xray features, US DCS, tophus, MTP1 involved, disability, hyperuricemia, location of current joint involvement	380	0.91
HIERARCHICAL MODEL DEVELOPMENT			_
JOINT INFLAMMATION	Joint erythema, marked tenderness, joint warm to touch, disability	746	0.75
+ COURSE	+ onset of maximal pain with 24 hours, attack resolves within 14 days, at least 2 episodes	669	0.82
+ GOUT FEATURES	+ tophus, MTP1 ever involved, current tender joint location	531	0.89
+ URATE	+ highest recorded SUA>6mg/dl (0.36mmol/l), $\S$	463	0.89
+ ULTRASOUND	+ US features	354	0.92
+ US only DCS	+ US DCS sign	355	0.92
+ XRAY	+ xray features	396	0.90
+ XRAY one sign	+ xray erosion or cyst,§	392	0.90
+ US AND XRAY	+ US DCS, xray erosion or cyst,§	303	0.93

<sup>\*</sup>AIC, Akaike Information Criterion is an index of model fit adjusted for parsimony (lower values indicate better fit);

US DCS = ultrasound double-contour sign; MTP1 = first metatarsophalangeal joint; SUA = serum urate

 $<sup>^{\</sup>dagger}$  Area under the curve of a receiver operating characteristic curve (values of 0.5 indicate prediction of class membership no better than chance, values of 1.0 indicate perfect prediction of class membership);

 $<sup>^{\</sup>ddagger}$ Xray features were erosion, subcortical cyst or asymmetric soft tissue swelling within a joint;

<sup>\$</sup> Item shown as deleted because it was removed due to p=0.47 (at least 2 episodes), p=0.22 (marked tenderness).

Table 5 Item parameters of final model from development data-set  $(n=654)^{\dagger}$ 

Variable	OR (95% CI)	p-value	Regression coefficient	Regression coefficient with shrinkage‡
Intercept			-5.70	-4.05
Joint erythema	2.13 (1.06, 4.29)	0.03	0.76	0.54
At least 1 episode involved difficulty walking	7.34 (1.17, 46.06)	0.03	2.00	1.42
Time to maximal pain less than 24 hours	1.32 (0.71, 2.47)	0.38	0.28	0.20
Resolution by 2 weeks	3.58 (1.85, 6.95)	0.0002	1.28	0.91
Tophus	7.29 (2.42, 21.99)	0.0004	1.99	1.41
MTP1 ever involved	2.30 (1.18, 4.49)	0.01	0.83	0.59
Location of currently tender joints*	Other foot/ankle 2.28 (1.00, 5.19)	0.01	0.21	0.14
	MTP1 2.82 (1.37, 5.81)		0.42	0.30
Serum urate level $> 6mg/dl (0.36mmol/l)$	3.35 (1.57, 7.15)	0.002	1.21	1.43
US double contour sign	7.23 (3.47, 15.04)	< 0.0001	1.98	1.40
Xray erosion or cyst	2.49 (1.26, 4.90)	0.009	0.91	0.65

<sup>\*</sup> Ref. category is joint proximal to ankle

OR = odds ratio; MTP1 = first metatarsophalangeal joint; US = ultrasound

 $<sup>^{\</sup>dot{7}} \text{Logistic}$  regression model details: LR Chi-square 305 (df 11), p<0.001; c-statistic 0.93

 $<sup>^{\</sup>ddagger}$ The regression coefficients show the strength of the association between the variable and having gout (values > 0 indicate a positive association) in the original units of the variable. The shrinkage factor is applied to prevent over-estimating the predictive ability of the model (see text for more details).