



# 3D-PASS

(3D Patellar instability Anatomical Severity Score)

A novel metric using machine learning to  
predict treatment outcome in patellar instability  
using a subset of data in the JUPITER cohort

Marissa Sinopoli, Anthony Gatti, Christian Wright, Anna Bartsch,  
Matthew Veerkamp, Akshay Chaudhari, Beth Shubin Stein, Shital Parikh, Kevin Shea,  
Scott Delp, **Seth Sherman**, and The JUPITER Group

# Disclosures

- AAG reports equity ownership of NeuralSeg Ltd., NodeAI Diagnostics, and GeminiOV LLC
- BESS earns royalties from and is a paid consultant and presenter to Arthrex; is a paid consultant to ConMed; serves on the editorial board of Orthopedics Today; and serves on the publishing board of AJSM
- SNP is a paid consultant for CONMED Linvatec and Pfizer; receives royalties from Wolters Kluwer Health - Lippincott Williams & Wilkins; is on the editorial or governing boards of Journal of Pediatric Orthopedics and Orthopedics Today; and is a Board of Directors member for AAOS.
- KGS serves on the editorial board of and has received stock options from nView, Inc; Sarcio, Inc; and Medeloop, Inc; and in the past has received educational payments and research funding from from Arthrex, Biomarin, Evolution Surgical, Styrker, and Vericel Research
- ASC provides consulting services to Chondrometrics GmbH, Patient Square Capital and Elucid Bioimaging unrelated to the content of this work; has equity ownership in Brian Key, Subtle Medical, and LVIS Corp
- SLS holds committee positions for AANA, AAOS, ACLSG, AOSSM, Biologic Association, ICRS, and ISAKOS; is on the editorial board for the Arthroscopy Journal, Cur Rev Musc Med, and VJSM; is a course chair of ISMF and the PFF Masters Course and a member of the AO Sports Medicine Taskforce; is a paid educational consultant for Arthrex, Kinamed, and LifeNet; is a paid advisory board member for Osteosys, Reparel, Sarcio, Sparta Medical, Vericel, and Vivorte; is on design teams and receives royalties from ConMed and DJO; holds stock options for LinkX, Osteosys, Moximed, Sarcio, Reparel, and Vivorte; and receives research support from JRF, Smith & Nephew, Octane Biotherapeutics, University of Pittsburg, Miach Orthopaedics Inc., and Organogenesis Inc.

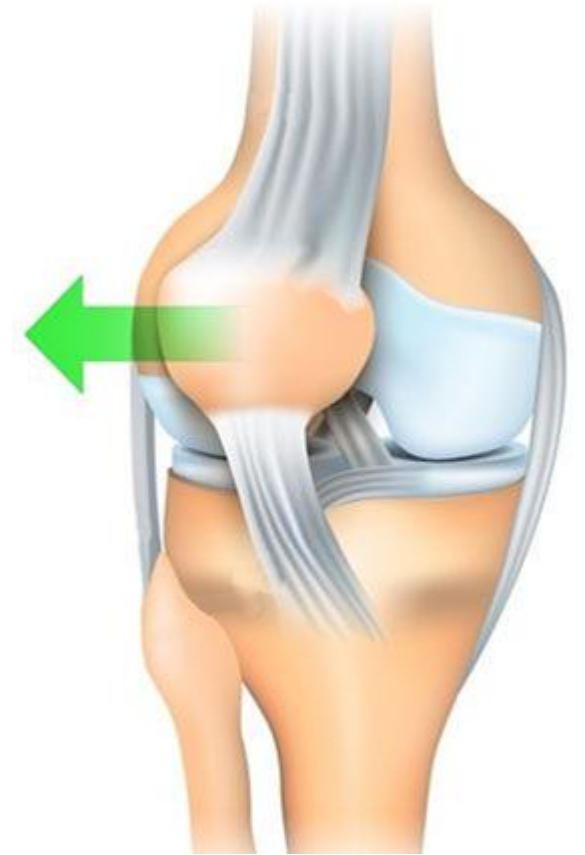
All relevant financial disclosures have been mitigated.

# Patellar instability outcomes vary

Among non-operative patients:

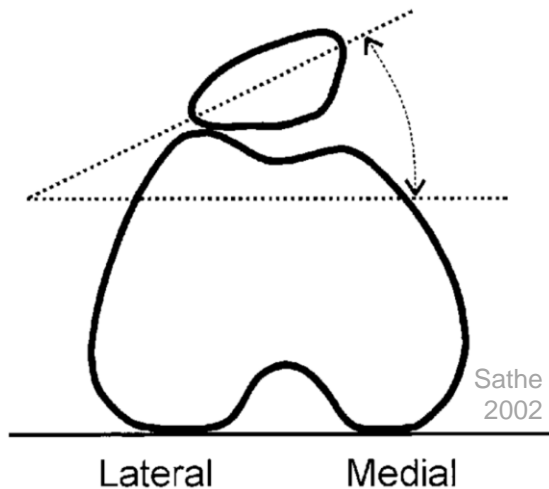
- 1/3 re-dislocate<sup>1</sup>
- 58% experience activity limitations after 6 months<sup>2</sup>

Accurate prediction of outcomes could enhance personalized interventions

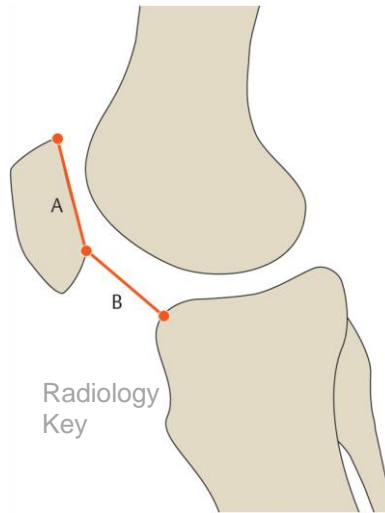


# Treatment decisions rely on 2D imaging measures

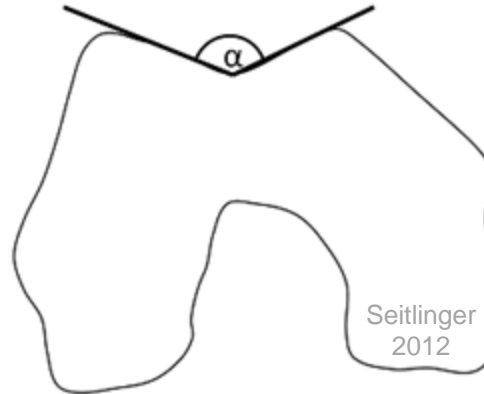
patellar tilt



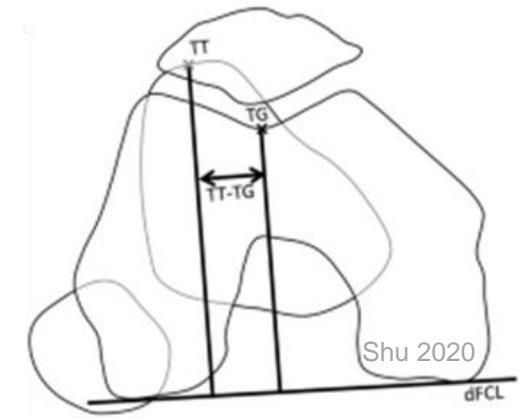
patellar height  
e.g., Caton-Deschamps index



trochlear dysplasia  
e.g., sulcus angle



tibial tubercle-  
trochlear groove  
distance



**While informative, these 2D imaging measures  
do not fully leverage 3D MRI bone data**

Aim: Develop an anatomical score of patellar instability severity

## 3D Patellar instability Anatomical Severity Score (3D-PASS)



- Associated with instability history
- Associated with post-treatment patient-reported outcomes

# Participants

- Retrospective analysis
- **272 patients with patellar instability**
  - Subset of the **JUPITER** (Justifying Patellar Instability Treatment by Results) cohort
  - First-time and recurrent
  - Non-operative and operative
- **26 age-matched ACL-injured controls**

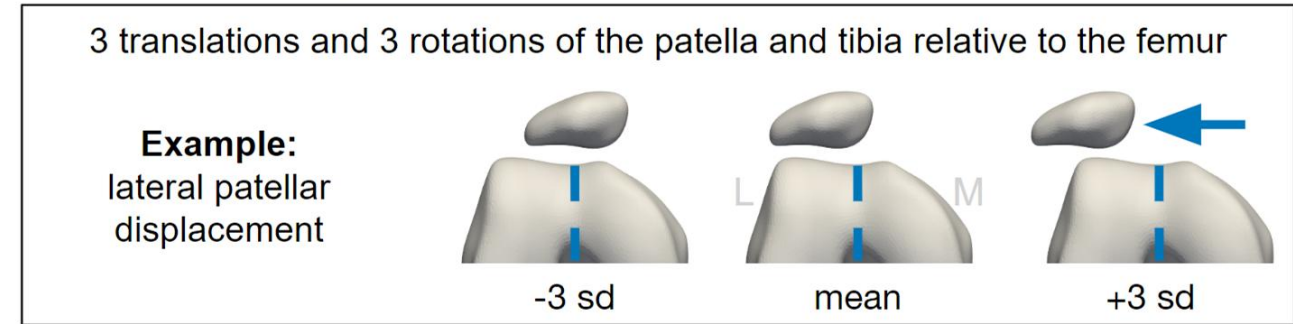
# Measures

- **Imaging** at enrollment baseline
  - Patellar tilt
  - Caton-Deschamps Index (CDI)
  - Sulcus angle
  - TT-TG distance
- **Patient-reported outcomes** at baseline and 1-year follow-up
  - Kujala Anterior Knee Pain Scale (Kujala)
  - Banff Patellofemoral Instability Instrument 2.0 (BPfII)

# From 3D PD-weighted MRIs, we developed a statistical knee model<sup>3</sup> to quantify 3D **relative bone positions** and **bone shape**

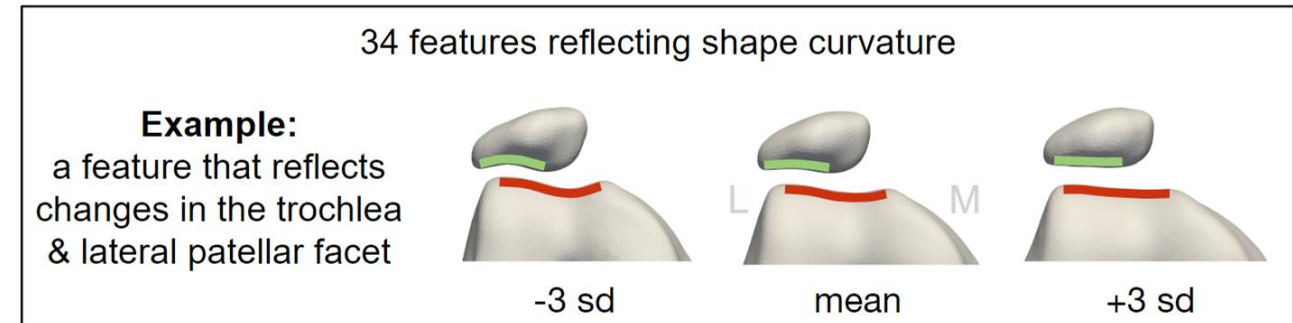
- A statistical knee model describes major modes of **variation in relative bone translations, rotations, and shape curvature**
- One example relative bone position feature and one example bone shape feature are depicted at right

## a) relative bone positions



UNPUBLISHED DATA – DO NOT COPY OR DISTRIBUTE

## b) bone shape

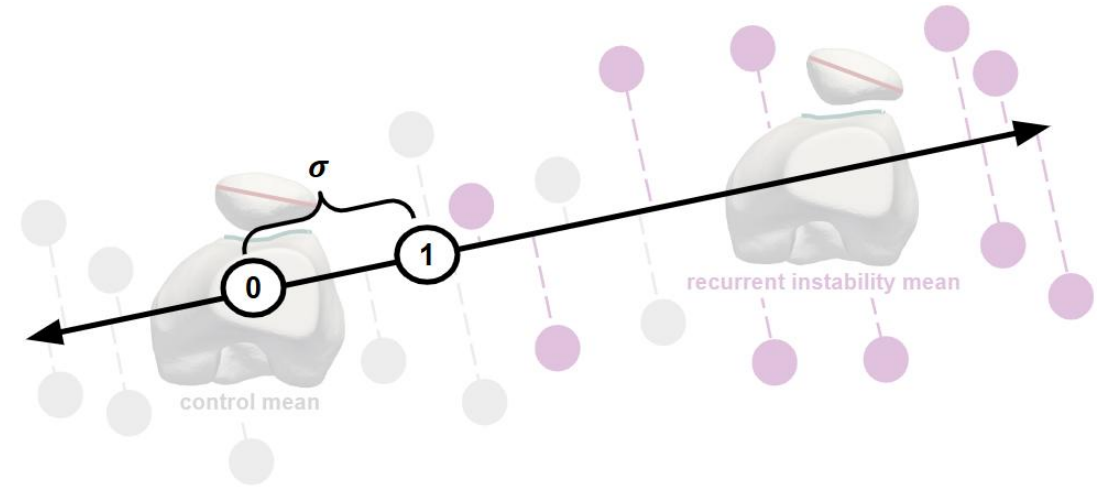


Using these features, we developed instability severity scores to reflect differences between control and recurrent instability cohort means

### Four scores of instability severity

complexity  
↓

1. 2D imaging measures
2. 3D relative bone positions
3. 3D bone shape
4. 3D relative bone positions & bone shape



Developed such that:

- Score of 0 corresponds to mean control
- 1 unit corresponds to 1 control standard deviation
- Higher score corresponds to recurrent instability



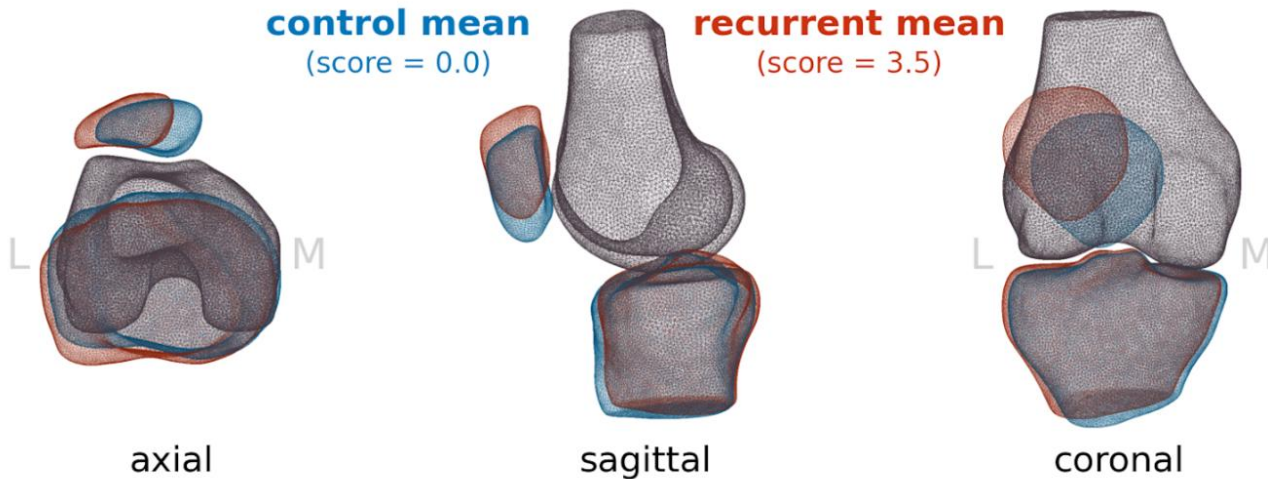
# Instability severity position and shape score visualizations

UNPUBLISHED DATA – DO NOT COPY OR DISTRIBUTE

## 3D relative bone positions severity score

**control mean**  
(score = 0.0)

**recurrent mean**  
(score = 3.5)



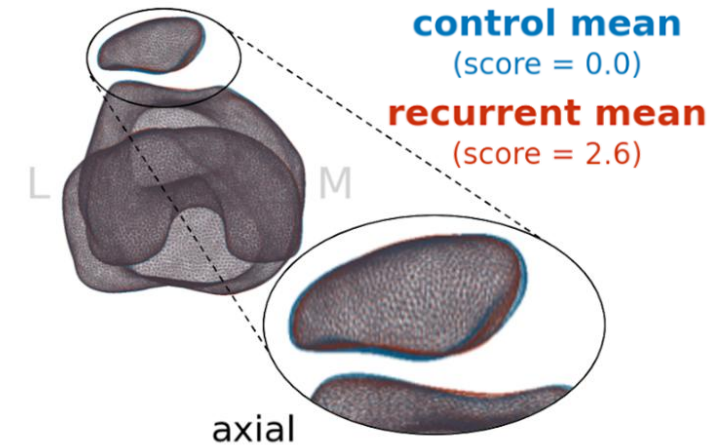
**Recurrent instability** was associated with large differences:

- Greater patellar tilt, height, and lateral displacement
- More external rotation of the tibia relative to the femur
- More knee valgus

## 3D bone shape severity score

**control mean**  
(score = 0.0)

**recurrent mean**  
(score = 2.6)

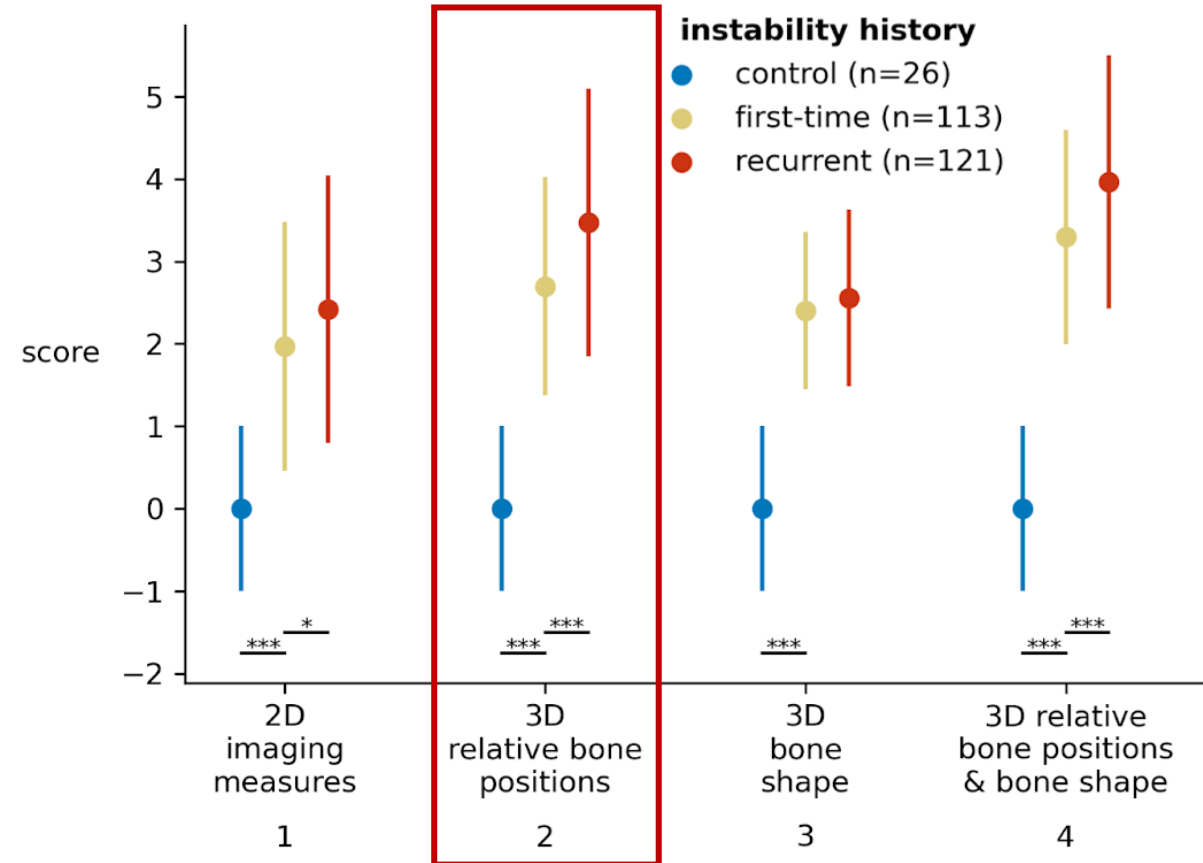


**Recurrent instability** was associated with slight differences:

- Greater trochlear dysplasia
- Greater lateral patellar facet concavity
- A more medial trochlear groove
- Less patellar width

# 3D relative bone positions best distinguished between first-time and recurrent instability cohorts

UNPUBLISHED DATA – DO NOT COPY OR DISTRIBUTE

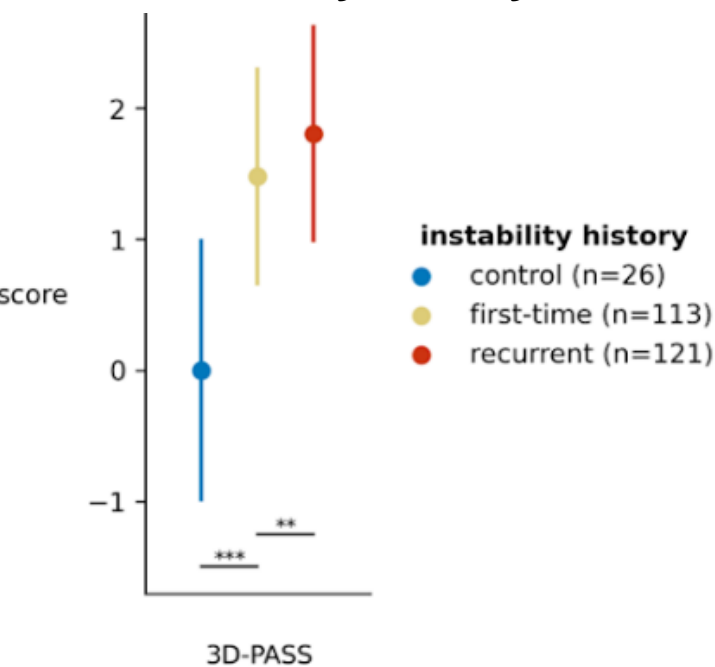


- All four scores increased with recurrence
  - The **3D relative bone positions** score best distinguished between the first-time and recurrent instability cohorts
- The 3D relative bone positions score was the only score to correlate with one-year non-operative patient-reported outcomes:
  - $r_{\text{Kujala}} = -0.42$
  - $r_{\text{BP11}} = -0.49$

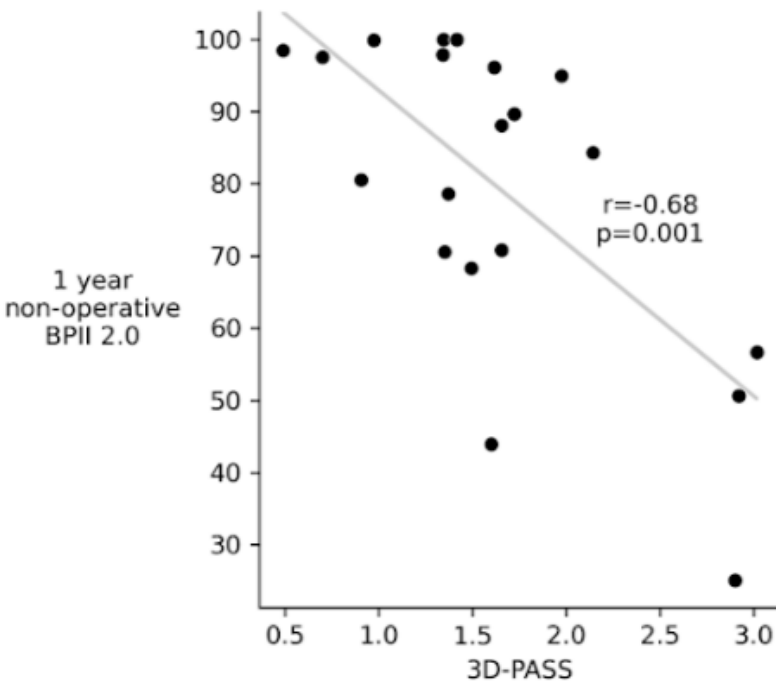
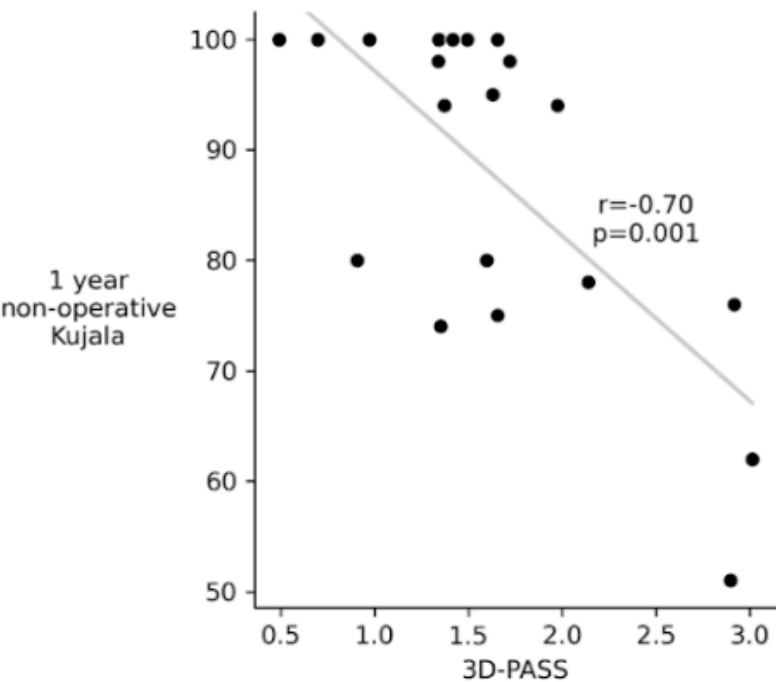
3D-PASS was developed using a subset of the 3D bone relative bone positions that maximized correlations with patient-reported outcomes

UNPUBLISHED DATA – DO NOT COPY OR DISTRIBUTE

3D-PASS is associated with instability history



3D-PASS is strongly correlated with patient-reported outcomes



# Summary: 3D-PASS (3D Patellar instability Anatomical Severity Score)

- Novel metric using machine learning associated with:
  - Instability history
  - One-year non-operative patient-reported outcomes
- Can be computed automatically from CTs & MRIs
- Demonstrates that 3D relative bone positions are more important than 3D bone shape
- Provides potential to help identify patients at risk of poor outcomes and guide earlier surgical intervention to improve prognosis

# Acknowledgements

This work was funded by:

- The American Orthopaedic Society for Sports Medicine
- The Arthroscopy Association of North America
- The Canadian Institutes of Health Research Postdoctoral Fellowship
- CONMED
- The National Institutes of Health (P41EB027060, R01 AR077604, R01 EB002524, R01 AR079431)
- The Pediatric Orthopaedic Society of North America
- Stanford Data Science
- Stanford University
- The University of Cincinnati
- The Wu Tsai Human Performance Alliance

# References

1. Dixit 2017. 10.1097/JSA.0000000000000149
2. Atkin 2000. 10.1177/03635465000280040601
3. Cootes 1999.  
10.1093/oso/9780199637010.003.0007

# Contact

**Marissa Lee Sinopoli, PhD**

msinopoli@hmc.edu

**Seth Sherman, MD**

shermans@stanford.edu