# Artificial Intelligence Prediction of Cholecystectomy Operative Course from Automated Identification of Gallbladder Inflammation

#### SAGES Annual Meeting

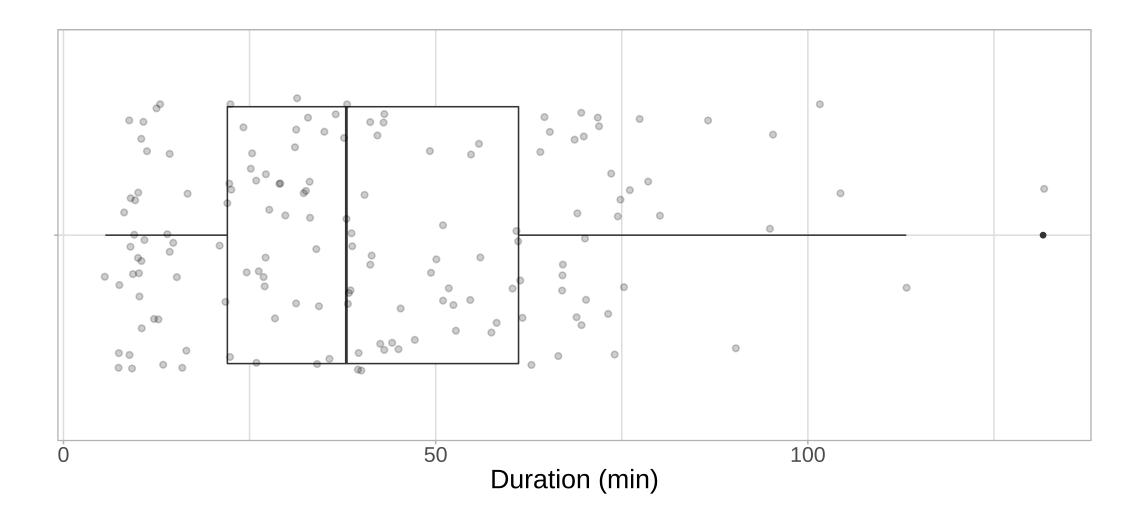
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#### Disclosures

Research support from the Olympus Corporation

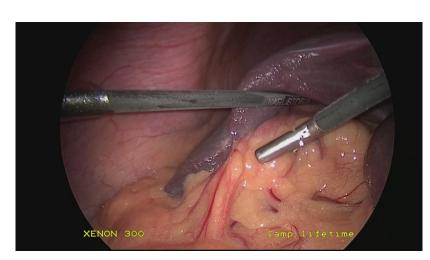
#### Operative Courses of Cholecystectomy



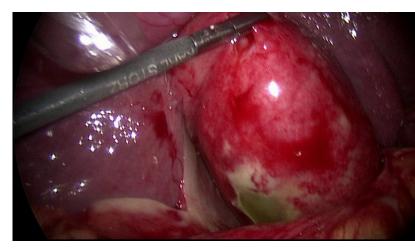
## Parkland Grading Scale (PGS)



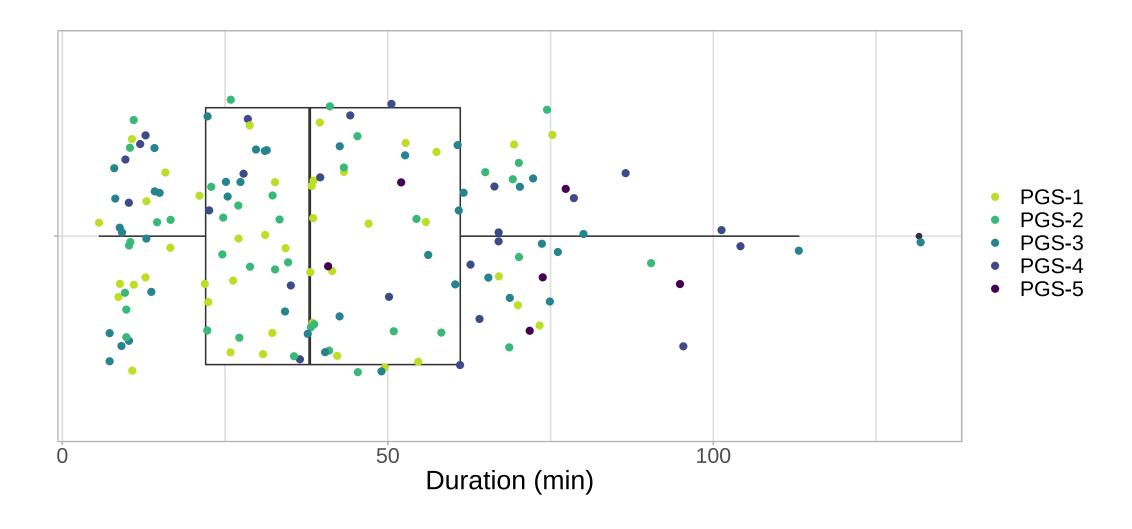




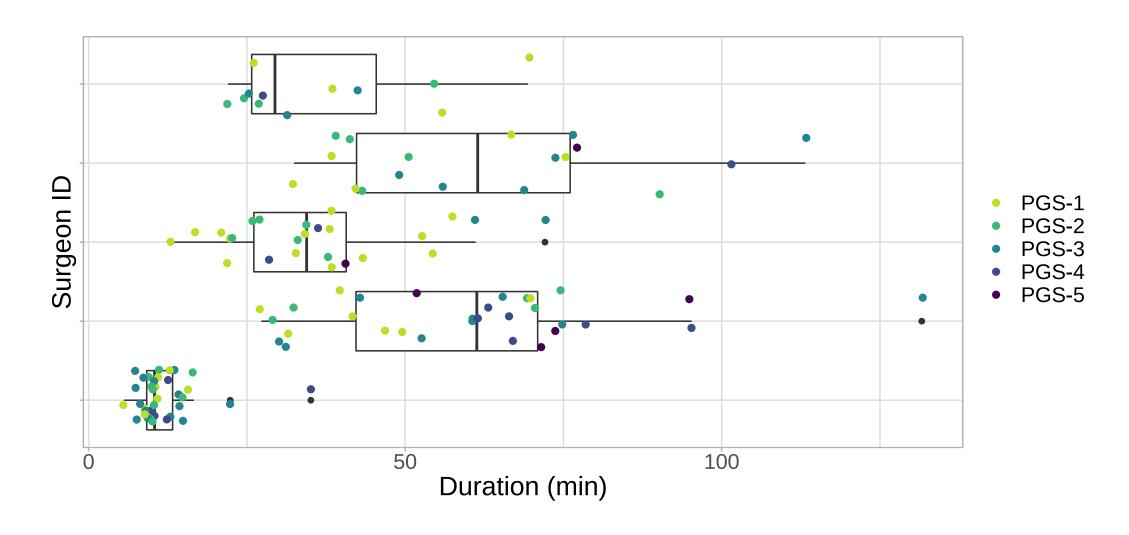




#### Operative Courses of Cholecystectomy



#### Surgeon and PGS



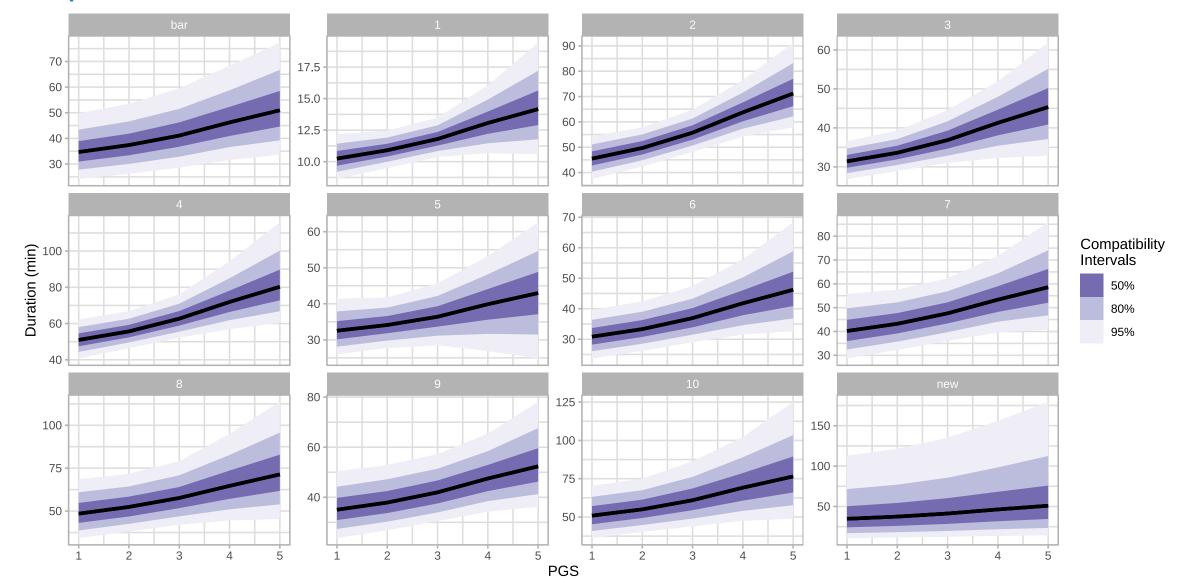
# Bayesian Inference using Hamiltonian Monte Carlo Sampling



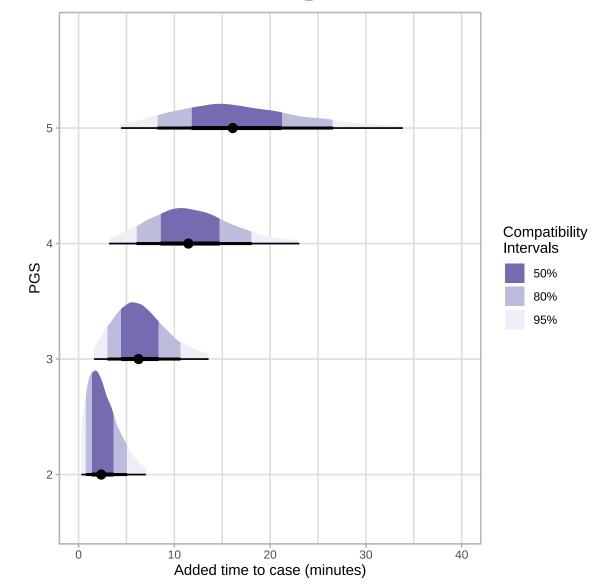
$$\begin{split} \log(Duration_i) &\sim \text{Normal}(\mu_i, \sigma) \\ \mu_i &= \alpha_{\text{sid}[i]} + \beta_{\text{sid}[i]} * \sum_{j=0}^{PGS_i-1} \delta_j \\ \begin{bmatrix} \alpha_{sid} \\ \beta_{sid} \end{bmatrix} &\sim \text{MVNormal}\left(\begin{bmatrix} \alpha \\ \beta \end{bmatrix}, \mathbf{S} \right) \\ \alpha &\sim \text{Normal}(0,1) \\ \beta &\sim \text{Normal}(0,1.2) \\ \delta &\sim \text{Dirichlet}(2) \\ \mathbf{S} &= \begin{pmatrix} \sigma_a & 0 \\ 0 & \sigma_\beta \end{pmatrix} \mathbf{R} \begin{pmatrix} \sigma_a & 0 \\ 0 & \sigma_\beta \end{pmatrix} \\ \mathbf{R} &= \begin{pmatrix} 1 & \rho \\ \rho & 1 \end{pmatrix} \\ \mathbf{R} &\sim \text{LKJCorr}(4) \end{split}$$

 $\sigma$ ,  $\sigma_{\alpha}$ ,  $\sigma_{\beta} \sim \text{Exponential}(1)$ 

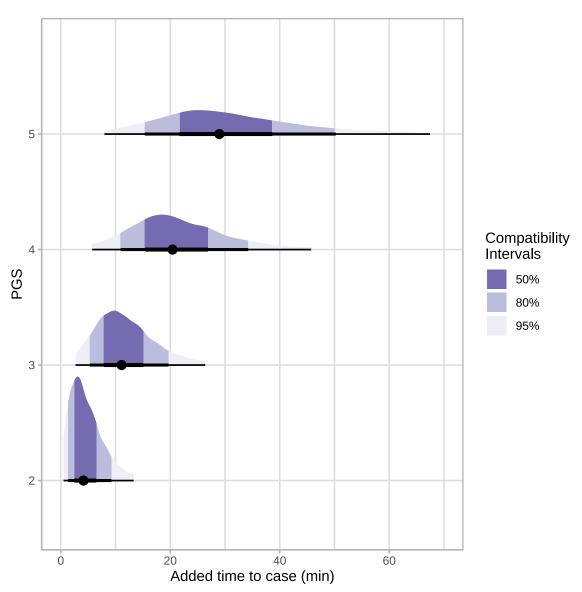
#### Operative Duration



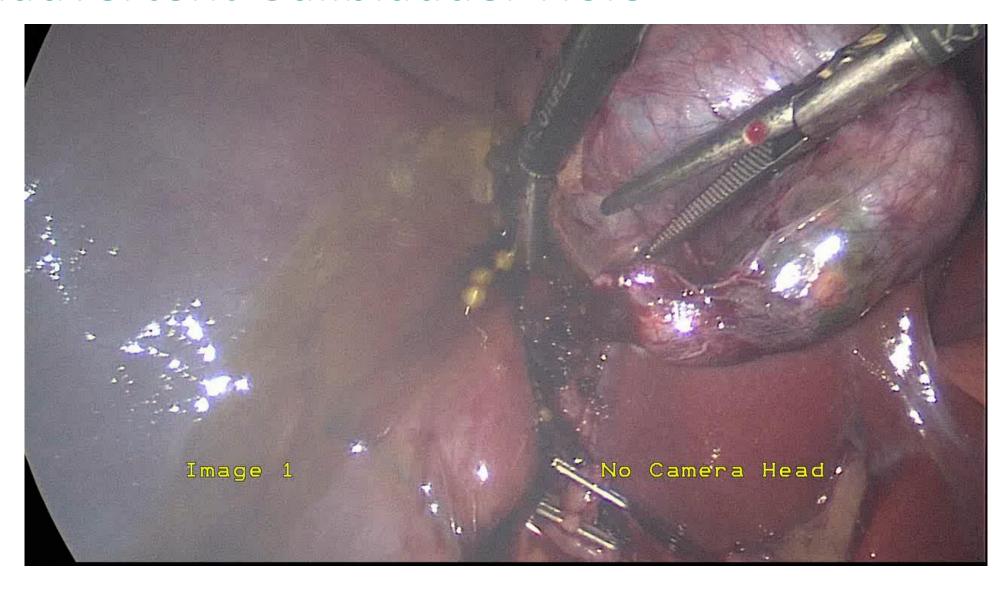
#### Average



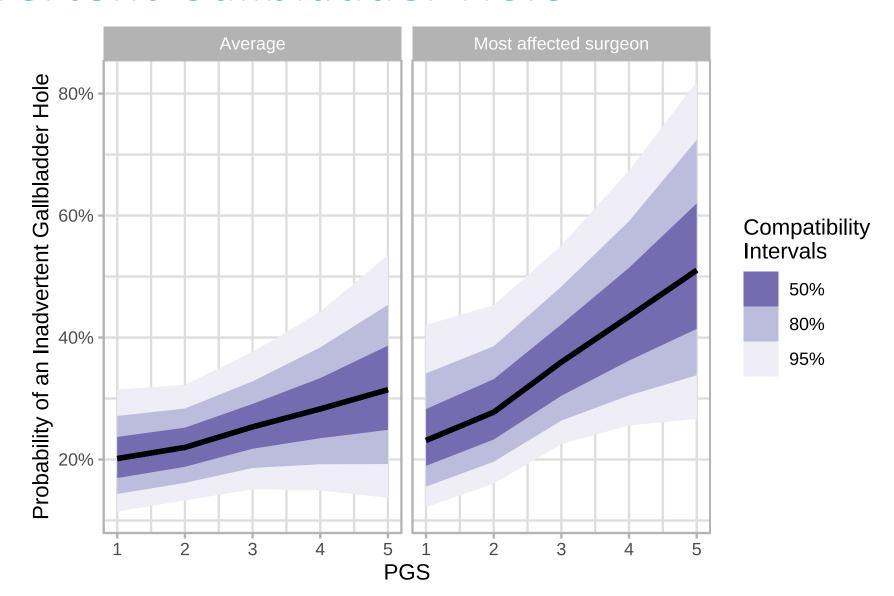
#### Most affected



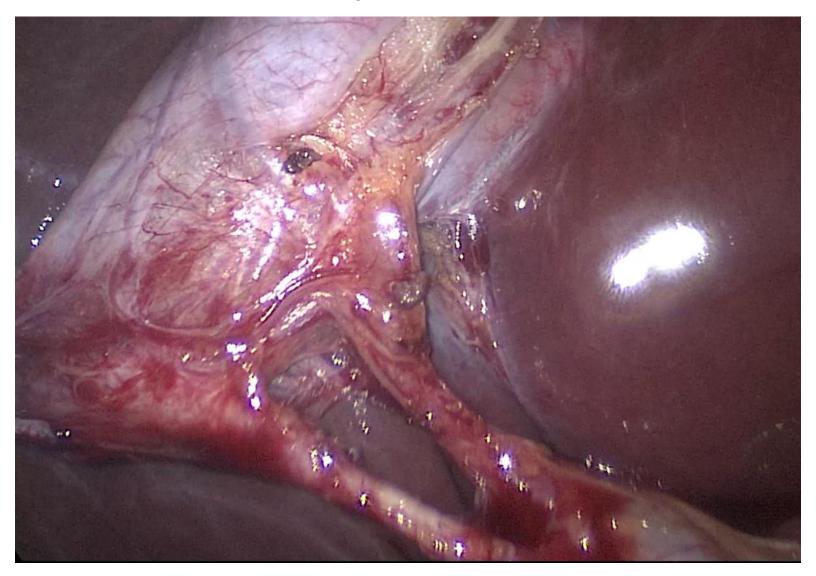
#### Inadvertent Gallbladder Hole



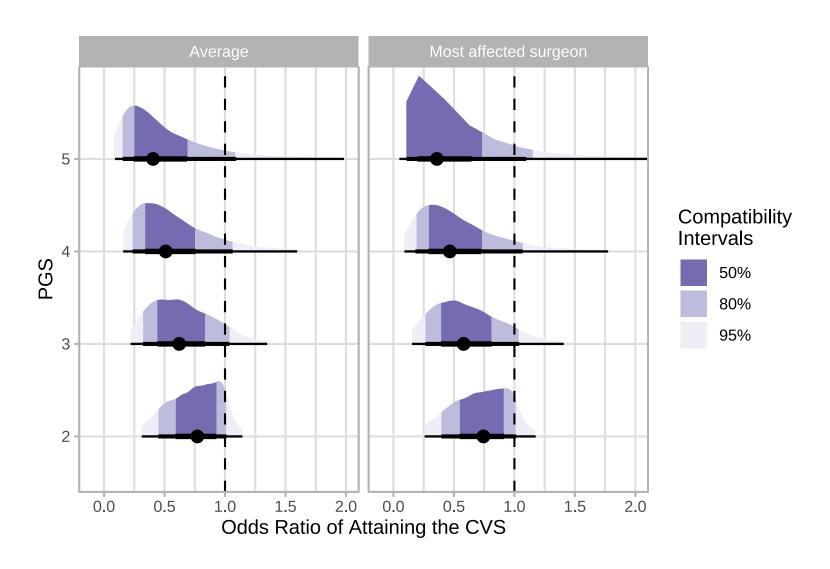
#### Inadvertent Gallbladder Hole



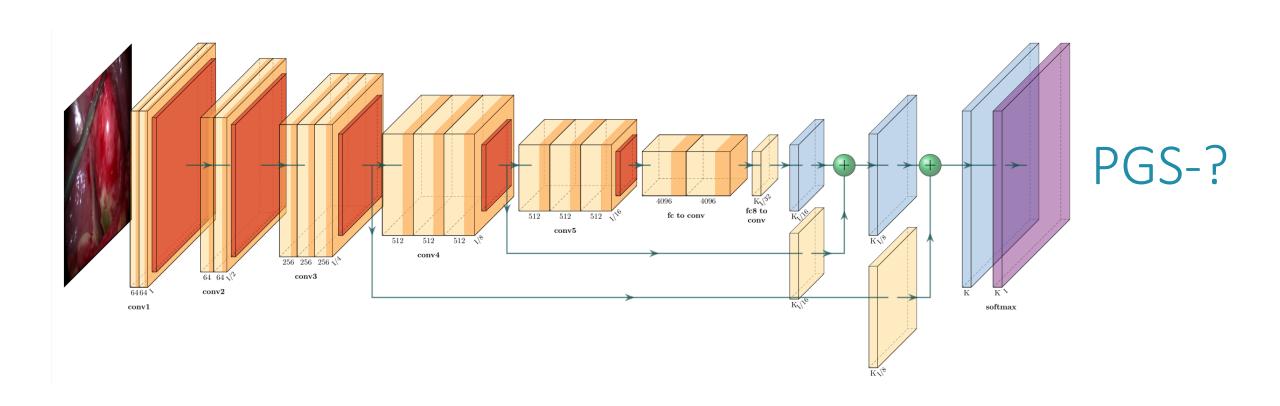
## Critical View of Safety



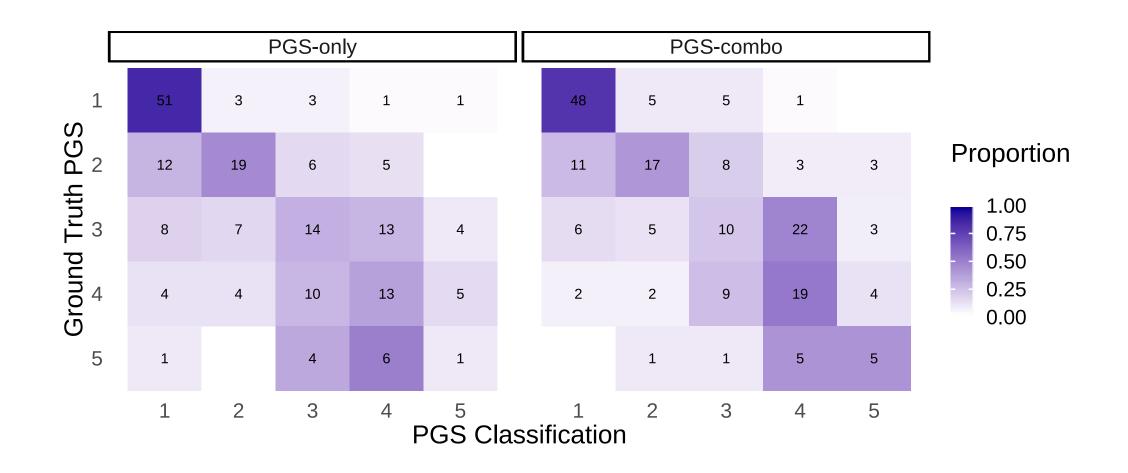
#### Critical View of Safety



#### Artificial Intelligence Computer Vision Model



#### Artificial Intelligence Computer Vision Model



#### Conclusions

- Gallbladder inflammation is predictive of intra-operative course
- Al computer vision model can reliably identify the degree of gallbladder inflammation
- Applications:
  - Operating room workflow optimization
  - Targeted per-surgeon and per-resident feedback