

Automatic Grading of Individual Knee Osteoarthritis Features in Plain Radiographs using Deep Convolutional Neural Networks

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Supplementary data

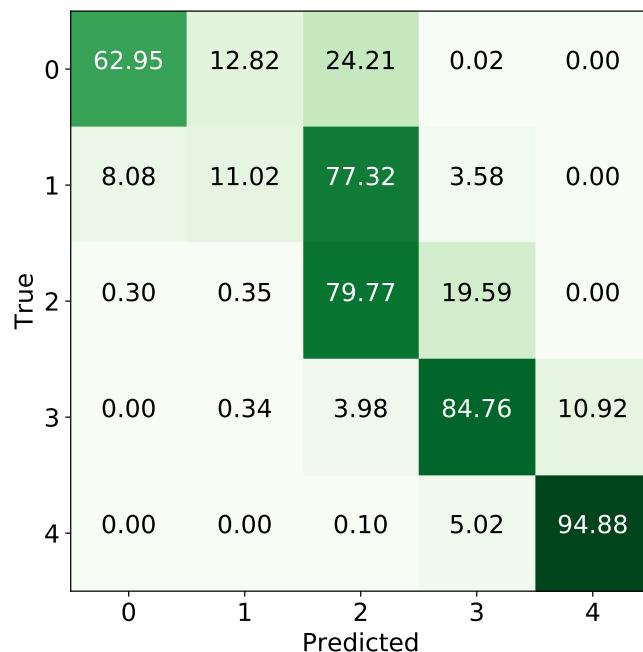
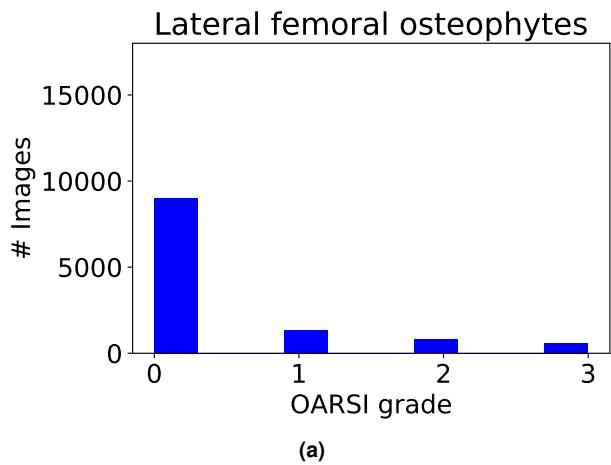


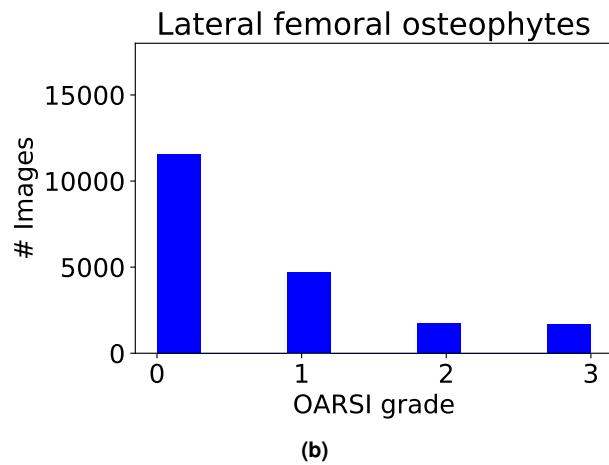
Figure S1. Confusion matrix for Kellgren-Lawrence (KL) grading. The numbers indicate percentages.

Table S1. Cross-validation results (out of fold): balanced accuracy (%) for each of the trained tasks on out-of-fold sample (OAI dataset). Best results task-wise are highlighted in bold. We selected two best models for through evaluation: SE-Resnet-50[†] and SE-ResNext50-32x4d[‡]. We trained these models from scratch (*) and also with transfer learning, but w/o the KL-grade (**). Finally, in the last row, we demonstrate the results for the ensembling of these models. L and M indicate lateral and medial compartments, FO and TO indicate femoral and tibial osteophytes and JSN indicates joint space narrowing, respectively. KL indicates the Kellgren-Lawrence grade.

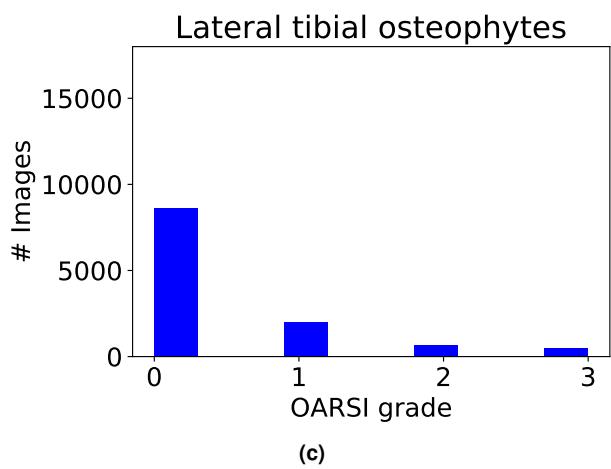
| Backbone | KL | FO | | TO | | JSN | |
|---------------------------------|--------------|--------------|--------------|--------------|--------------|--------------|--------------|
| | | L | M | L | M | L | M |
| Resnet-18 | 67.32 | 53.19 | 61.08 | 60.37 | 62.38 | 75.74 | 77.92 |
| Resnet-34 | 66.93 | 50.91 | 60.11 | 61.86 | 62.13 | 73.66 | 79.09 |
| Resnet-50 | 66.99 | 52.35 | 62.57 | 61.93 | 64.40 | 73.42 | 78.95 |
| SE-Resnet-50 [†] | 67.77 | 53.96 | 62.54 | 63.22 | 65.24 | 76.13 | 78.22 |
| SE-ResNext50-32x4d [‡] | 67.08 | 55.37 | 63.31 | 64.55 | 65.14 | 75.05 | 78.65 |
| SE-Resnet-50* | 65.07 | 48.58 | 54.64 | 56.14 | 56.44 | 75.86 | 78.56 |
| SE-ResNext50-32x4d* | 64.31 | 49.25 | 55.11 | 56.04 | 56.76 | 75.58 | 78.89 |
| SE-Resnet-50** | - | 54.97 | 63.28 | 64.00 | 64.17 | 73.39 | 79.65 |
| SE-ResNext50-32x4d** | - | 55.40 | 63.84 | 66.26 | 65.00 | 74.81 | 78.90 |
| Ensemble ^{†‡} | 68.01 | 55.15 | 63.86 | 64.83 | 65.70 | 76.73 | 79.03 |



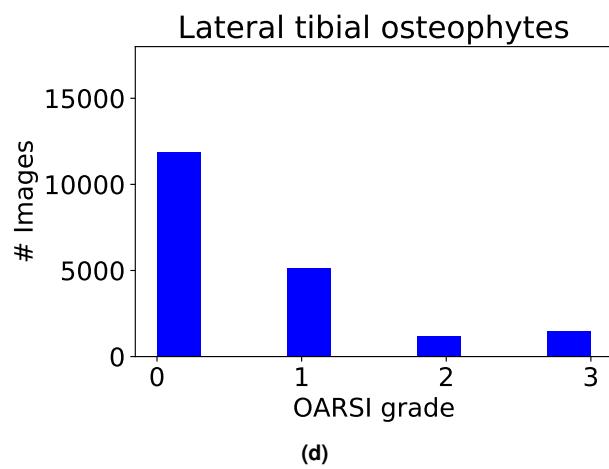
(a)



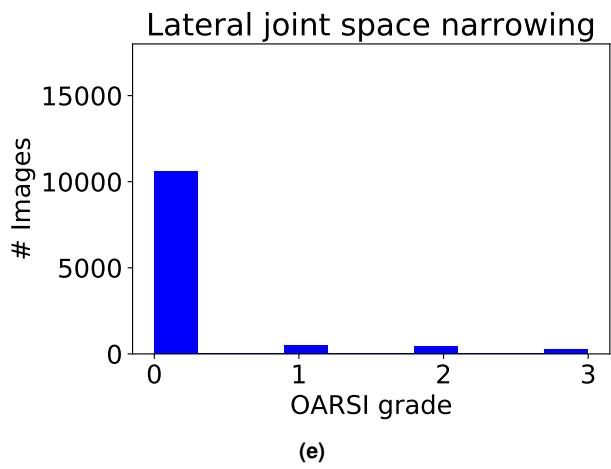
(b)



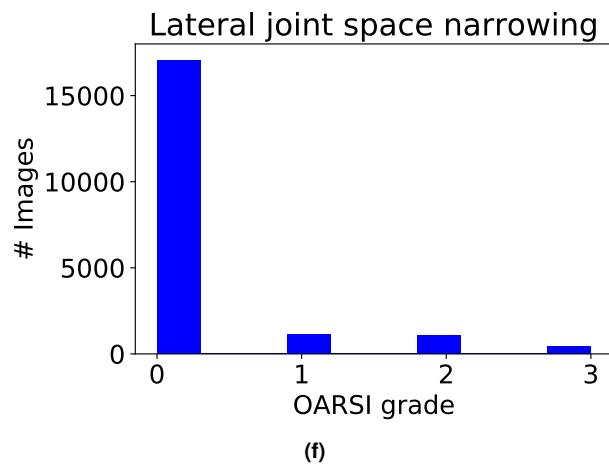
(c)



(d)



(e)



(f)

Figure S2. Visual representation of lateral OARSI grades distributions in MOST ([S2a](#), [S2c](#), [S2e](#)) and OAI ([S2b](#), [S2d](#), [S2f](#)) datasets.

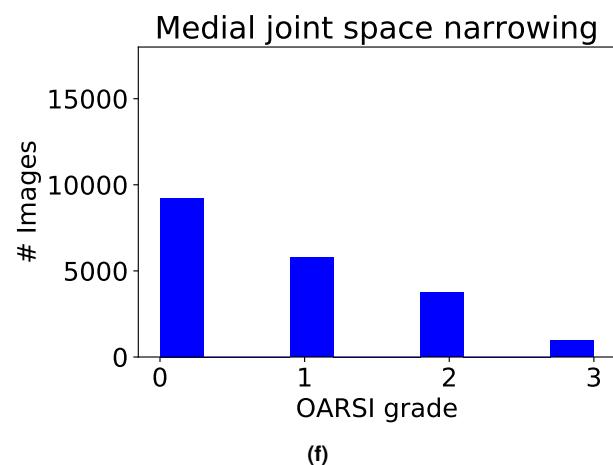
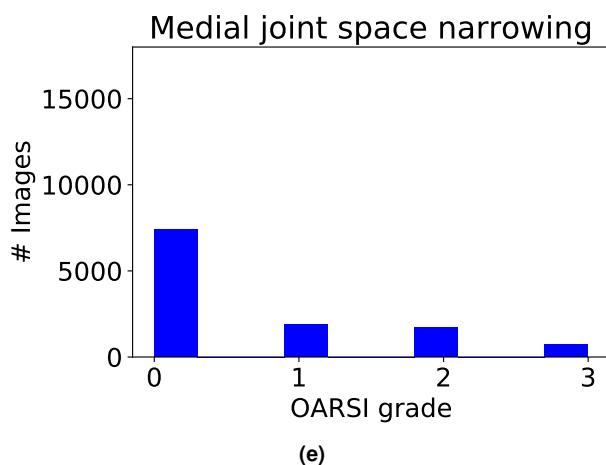
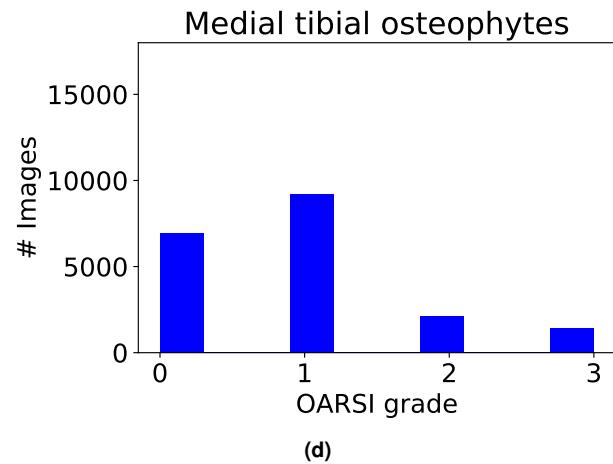
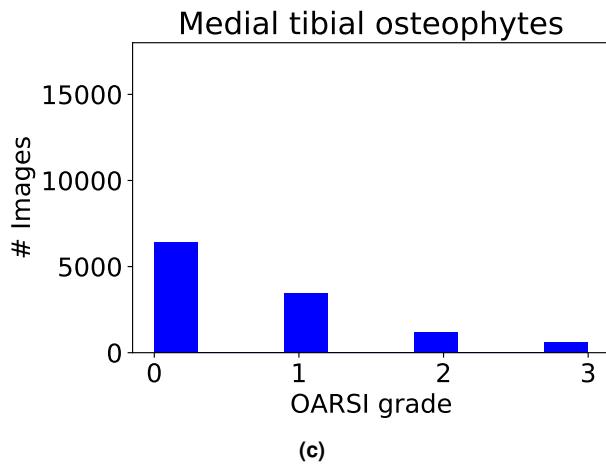
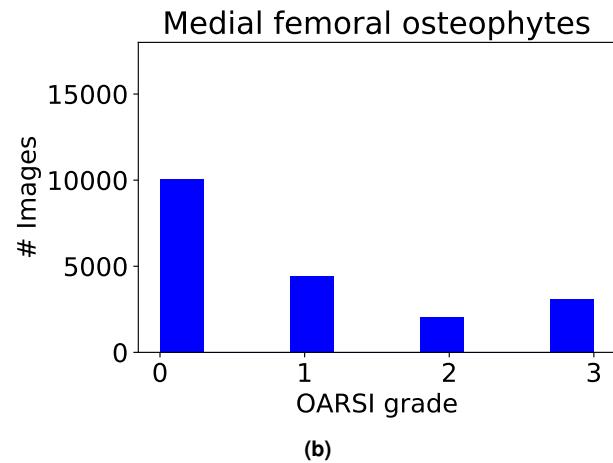
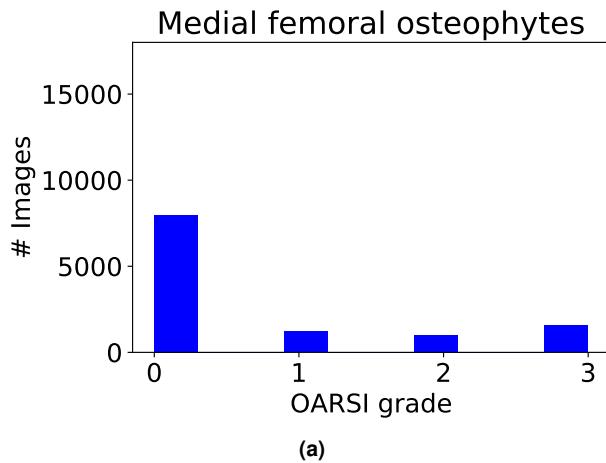


Figure S3. Visual representation of lateral OARSI grades distributions in MOST ([S3a](#), [S3c](#), [S3e](#)) and OAI ([S3b](#), [S3d](#), [S3f](#)) datasets.