

What Makes a **Good** Photo?

Product Manager: Michelle Schaffer

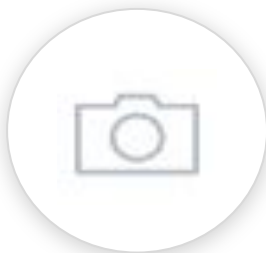
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IMPROVE PHOTOGRAPHER BOOKING PLATFORM



Book, Match, Pay



Shoot



Deliver Photos



Feedback



GOAL

Increase client
satisfaction

APPROACH

Give feedback to photographers
before they deliver photos to clients

PHOTOGRAPHER PAIN POINTS

Must give photos to client
within 48 hrs of shoot

May have 100s of images
to review, enhance

SOLUTION

Use machine learning to
help photographer quickly
detect photo quality issues



SUCCESS CRITERIA

Effectively judge photos

- Understand what impacts quality, build models to measure attributes



Composition (e.g. rule of thirds)

Provide actionable insights

- Photographer can edit bad photos or delete them



Color saturation

PHOTO QUALITY: Industry Landscape

Evaluating photo

content

systems exist

IMAGENET

Microsoft
Cognitive Services

 **clarifai**

 Google Cloud

 **ReKognition**

quality

new area

EyeEm

 **clarifai**

PHOTO QUALITY: Industry Use Cases

Evaluating photo

quality



Returning best results in
image searches



Displaying most attractive
photos for businesses first

PHOTO QUALITY: Available Resources

Training Data

Aesthetics and Attributes Database ([AADB](#)) provides photos with aesthetic quality labels



PHOTO QUALITY: Model Development

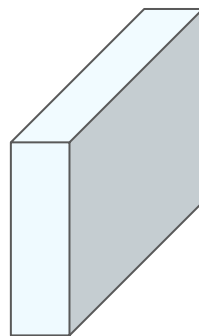
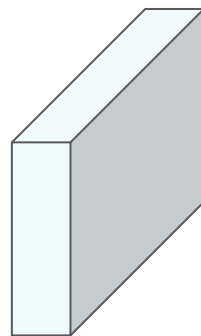
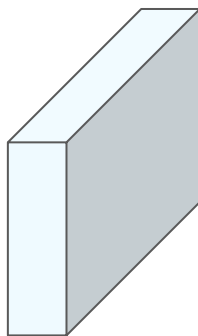
Training Data

AADB photos,
quality labels



Model

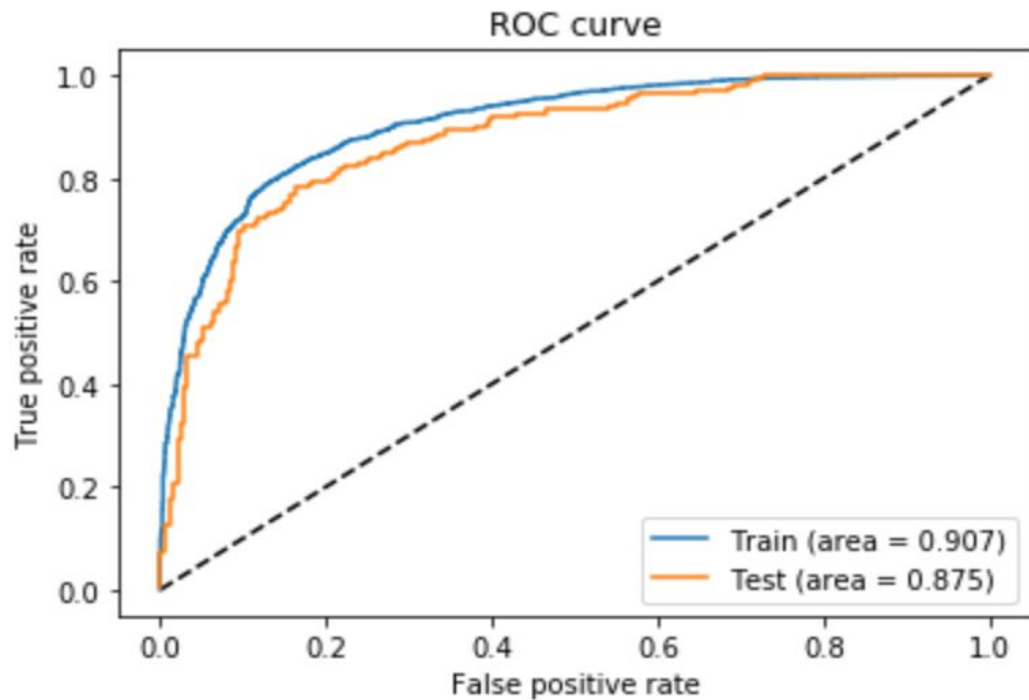
MobileNet convolutional neural network



replaced
top layer

added fully
connected layer
with binary
classification for
ratings


PHOTO QUALITY: Model Development



Results


Model was able to predict quality labels associated with AADB images

PHOTO QUALITY: Model Deployment - Web App



Upload an album

Photos with highest quality scores




Overall: ★★★★★

Color balance: ★★★★★

Colorfulness: ★★★★★

Photos with lowest quality scores



Overall: ★☆☆☆☆

Color balance: ★☆☆☆☆

Colorfulness: ★☆☆☆☆

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Increase client
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APPROACH

Useful, instant feedback to photographers
before they give photos to clients

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FURTHER ANALYSIS

Review data to determine which factors are most important to client satisfaction

FEATURE IMPORTANCE: Platform Data Available



Book, Match, Pay



Shoot



Deliver Photos



Feedback

Customer sets:

- Shoot type, location, time
- Preferences

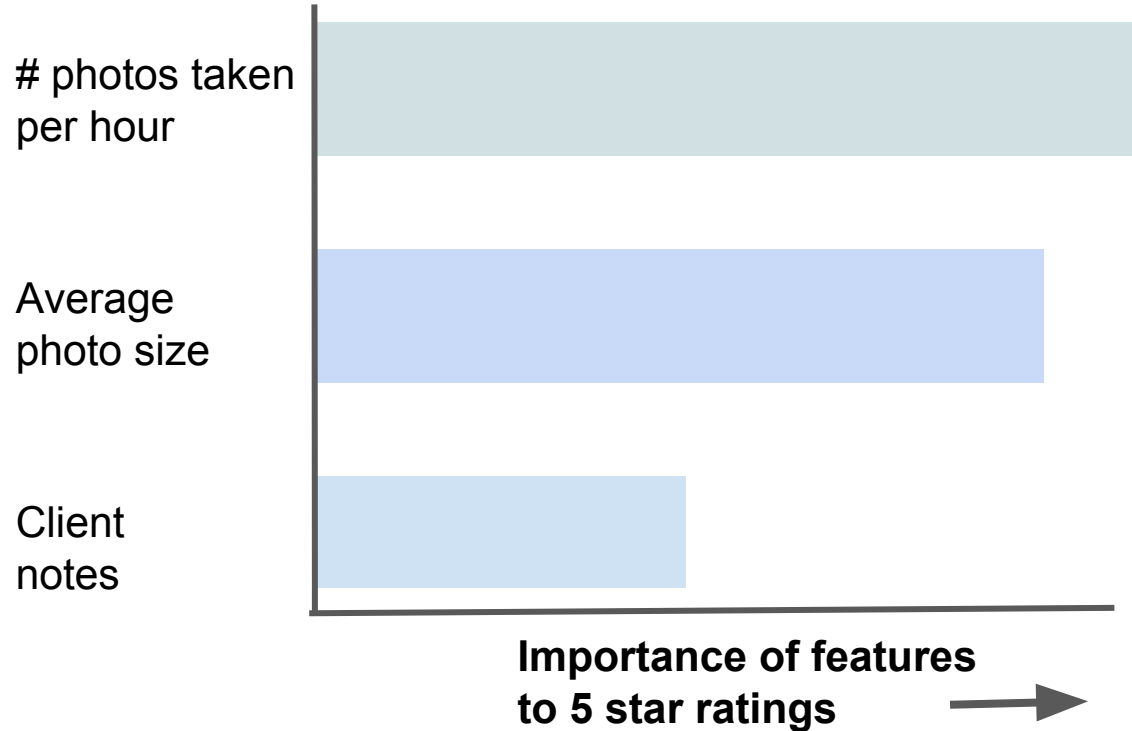
System detects:

- Photo exif, size

Customer can:

- Rate album
- Favorite photos

FEATURE IMPORTANCE: Factors Impacting Ratings



Recommendations

Set guidelines for photographers
(# photos, photo size)

Encourage clients to give preferences before shoots

MICHELLE
SCHAFFER

PRODUCT,
PROJECT
ROLES
IN MEDIA,
WALL ST

CS, BUSINESS
BACKGROUND

Lead Program
Manager

Director

Vice President

MBA

BS

verizon[✓]



CREDIT SUISSE 



Cornell University