

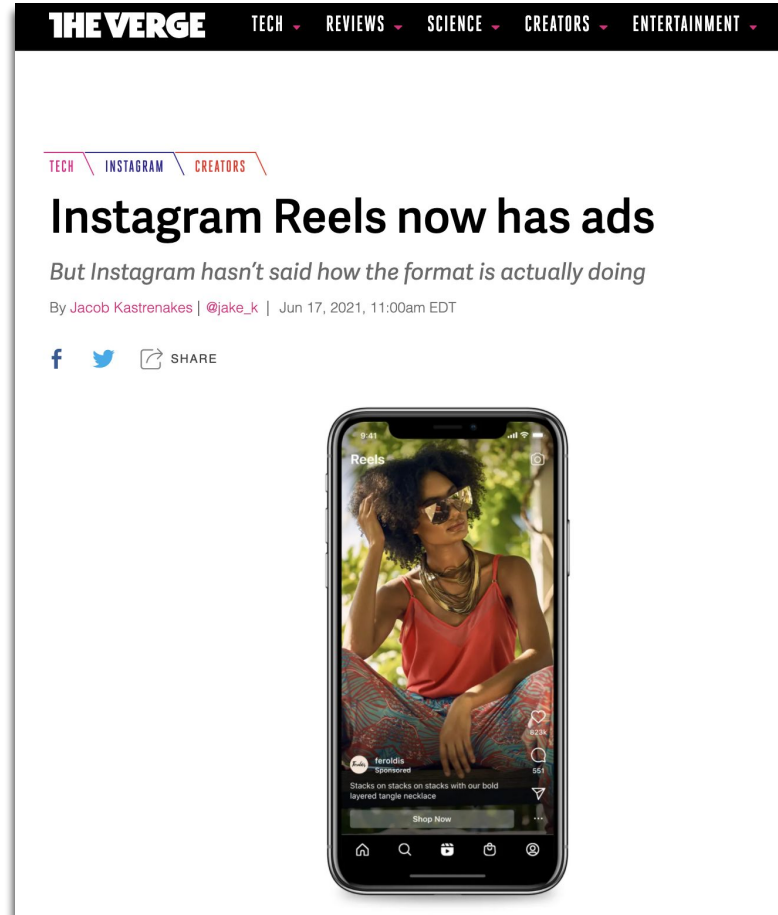


Deep Targeting

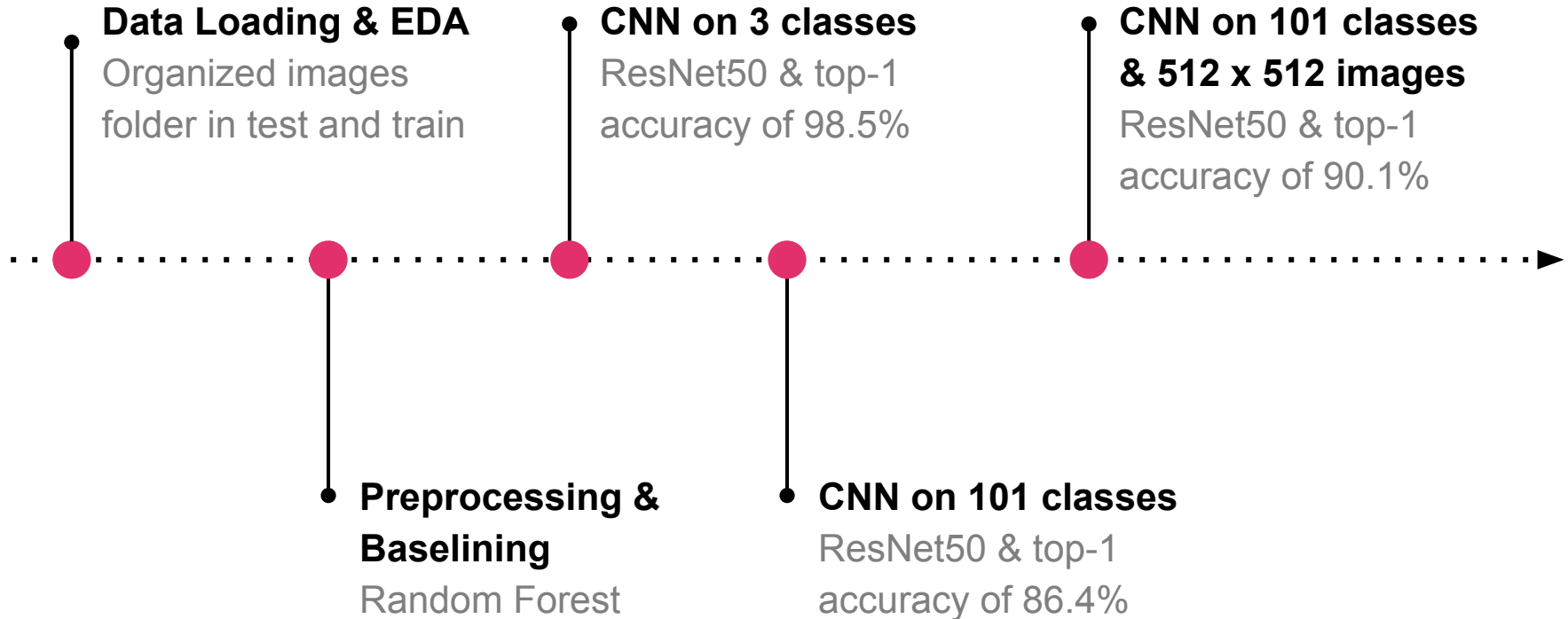
Opportunity

Objective: increase Instagram's Ad Revenues

Impact Hyp: equipped with a more advanced targeting algorithm, advertisers will boost their revenues and, in turn, increase marketing spend on Instagram



Methodology



CNN INPUTS

ResNet50 Transfer Learning

Data Challenges

Scope: Food-101 dataset

Images: 101,000 in total
and 1,000 per class

- 750 in train set
- 250 in test set

Classes: 101 food
classes

Noise embedded by
design

Poor image quality



Multi-class images



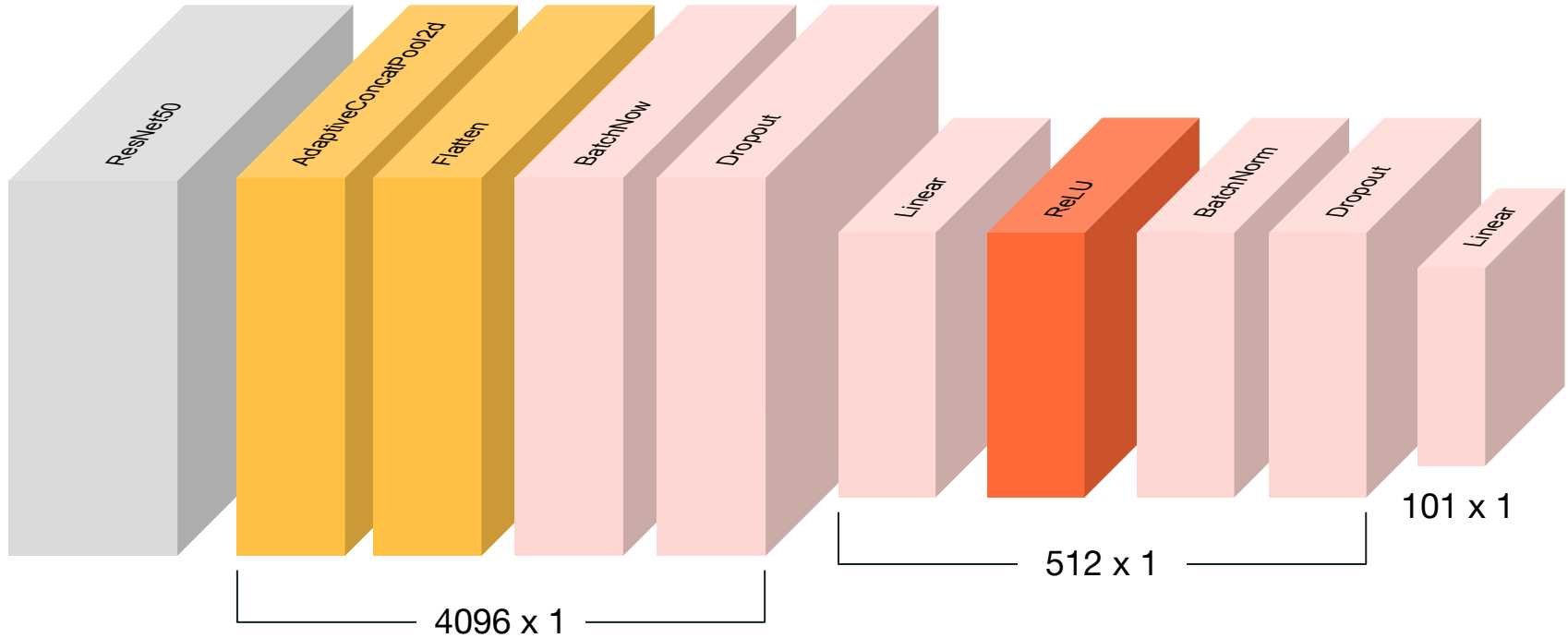
In-class variability



Intra-class similarity



CNN Architecture based on ResNet50



Transformations

**Composite Image
Augmentation** to boost
model generalizability

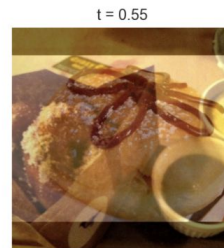
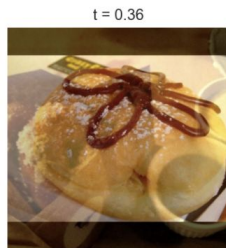
- Dihedral Affine Transformation
- Symmetric Warp
- Rotation
- Zoom
- Brightness
- Contrast



Transformations

Mixup Image Augmentation by linearly interpolating between two images to create a new *augmented* image

- t is the weight assigned to one image
- t from beta distribution with $0 \leq \alpha \leq 0.4$



Fine-tuning

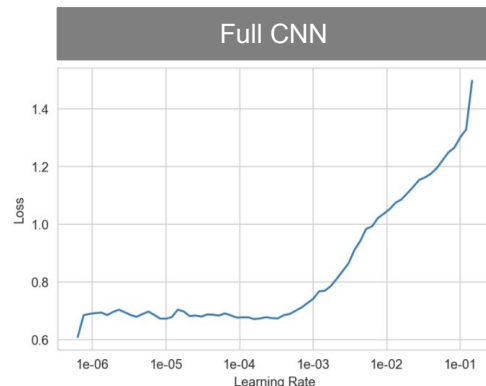
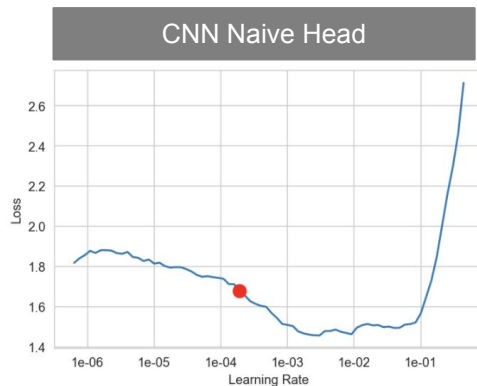
One Cycle Policy

- Schedule for learning rate and momentum leads to faster convergence and better generalization

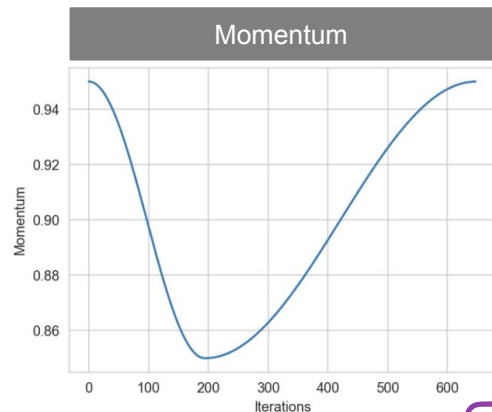
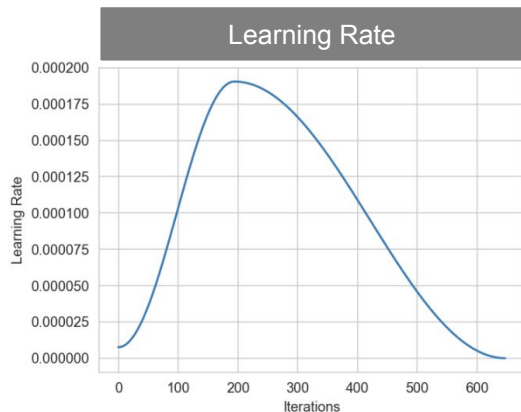
Discriminative Learning Rates

- Different learning rates for different parts of the model

One Cycle Policy



Discriminative Learning Rates



CNN OUTPUTS

Food-101 Image Classifier








Most Confused

Top 9 classes

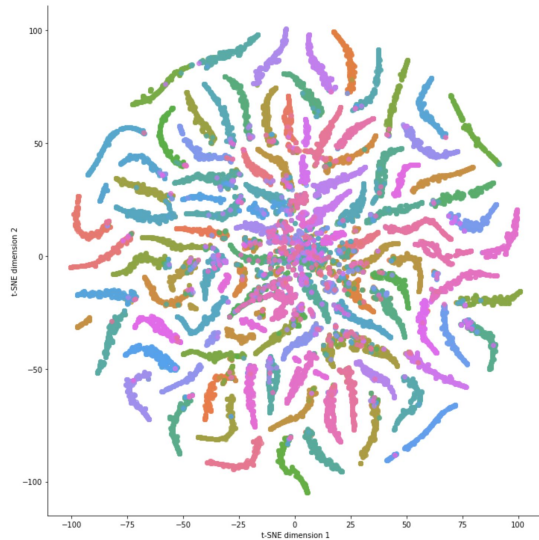
Too similar image classes
impact model accuracy

- Steak & related meats
- Chocolate-based desserts
- Other desserts

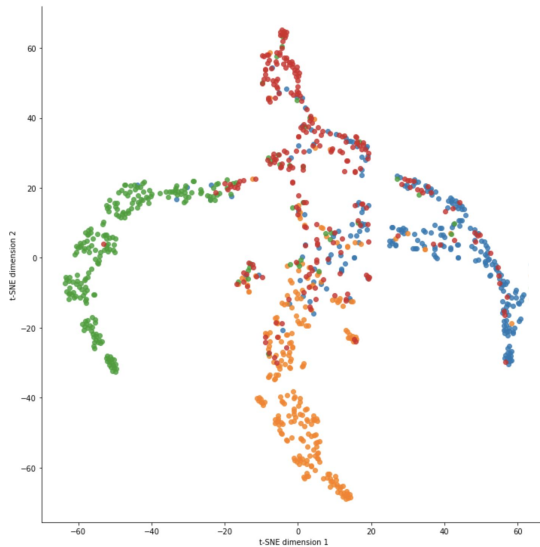
11

	Actual	Predicted	# Occurrences
	Steak	Filet Mignon	11
	Chocolate Mousse	Chocolate Cake	10
	Cheesecake	Strawberry Shortcake	9
	Dumplings	Gyoza	9
	Onion Rings	Fried Calamari	8
	Prime Ribs	Filet Mignon	8
	Tiramisu	Chocolate Mousse	8
	Chocolate Cake	Chocolate Mousse	7
	Filet Mignon	Steak	7

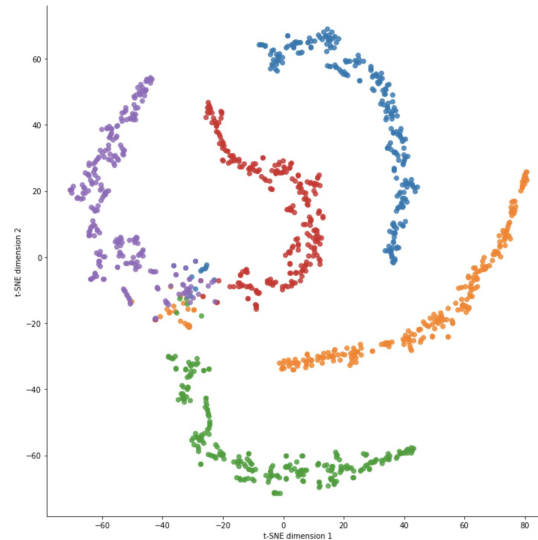
t-SNE plots of food classes



All 101 food classes



Most confused food classes
(i.e., steak, filet mignon, prime rib, pork chop)



Highly separable food classes
(i.e., cup cakes, creme brulee, fried rice, caesar salad, lasagna)



Summary Metrics

Food-101 CNN based on ResNet50

0.901

Top-1 Accuracy

0.984

Top-5 Accuracy



Where do we go from here?

- **Text Classification:** apply RNN to classify Instagram image caption; combine this output with the CNN image classification output to boost model accuracy
- **Recommendation Engine:** identify similar dishes to the one shared by the user so as to unlock new targeting opportunities for other advertisers
- **Other categories:** scale the algorithm to other categories of user generated content (e.g. clothing items, accessories) so as to build a true user-driven and user-specific targeting engine for advertisers



Questions?