# Individual project

- Coding or literature review?
- Own data or other data?
  - Replications or improvements to existing papers are a great option!
- Group projects are possible
- Scope: 4 weeks
- Products: 30 min presentation (exam week), submit code or essay/review
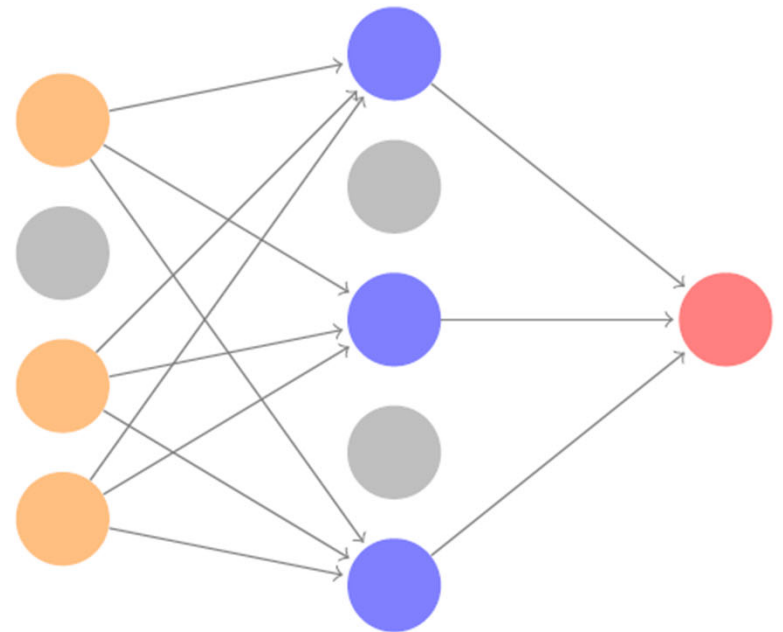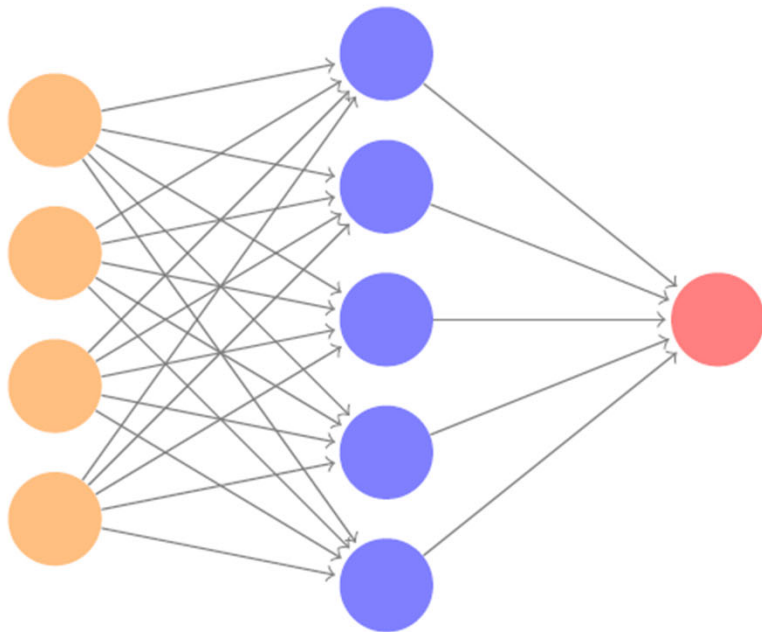
# Past individual projects

- Segmenting trees in drone imagery
- Mapping Pika habitat in aerial imagery
- Identifying fireflies by their flash pattern
- Predicting pH preference of microbial species
- Species distribution models of beetles
- Predict carbon cycling from nutrient input
- Did this DNA come from a plasmid?

# Today

- train-validate-test
  - 3 way split, validate split is for tuning
- It's all about the data
  - generalization
  - out-of-distribution vs out-of-sample
  - scope of inference (scale, extent)
  - test set leakage
- transfer learning & pre-trained models
  - code

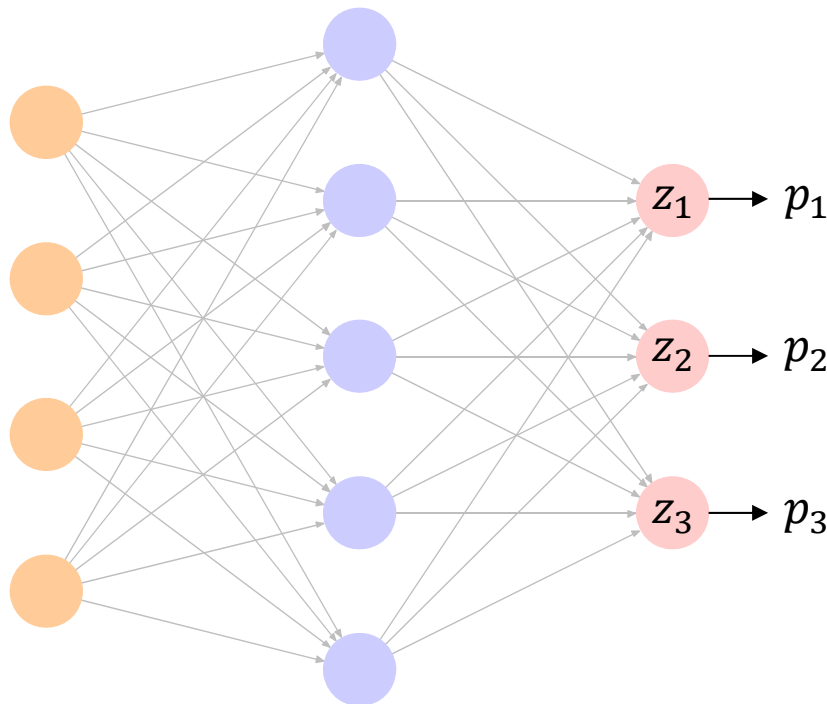# Training algorithm: dropout



Like random forest sample columns

ISLR 10.19

# Softmax

Classification with multiple classes
Input $k$ numbers ($z_i$) $\longrightarrow$ output $k$ probabilities ($p_i$)
Probabilities sum to 1
Exponential emphasizes the larger inputs



$z_1 \longrightarrow p_1$

$z_2 \longrightarrow p_2$

$z_3 \longrightarrow p_3$

$$p_i = \frac{e^{z_i}}{\sum_{j=1}^{k} e^{z_j}}$$

# Transfer learning

- Generalize some learned components from one task to another
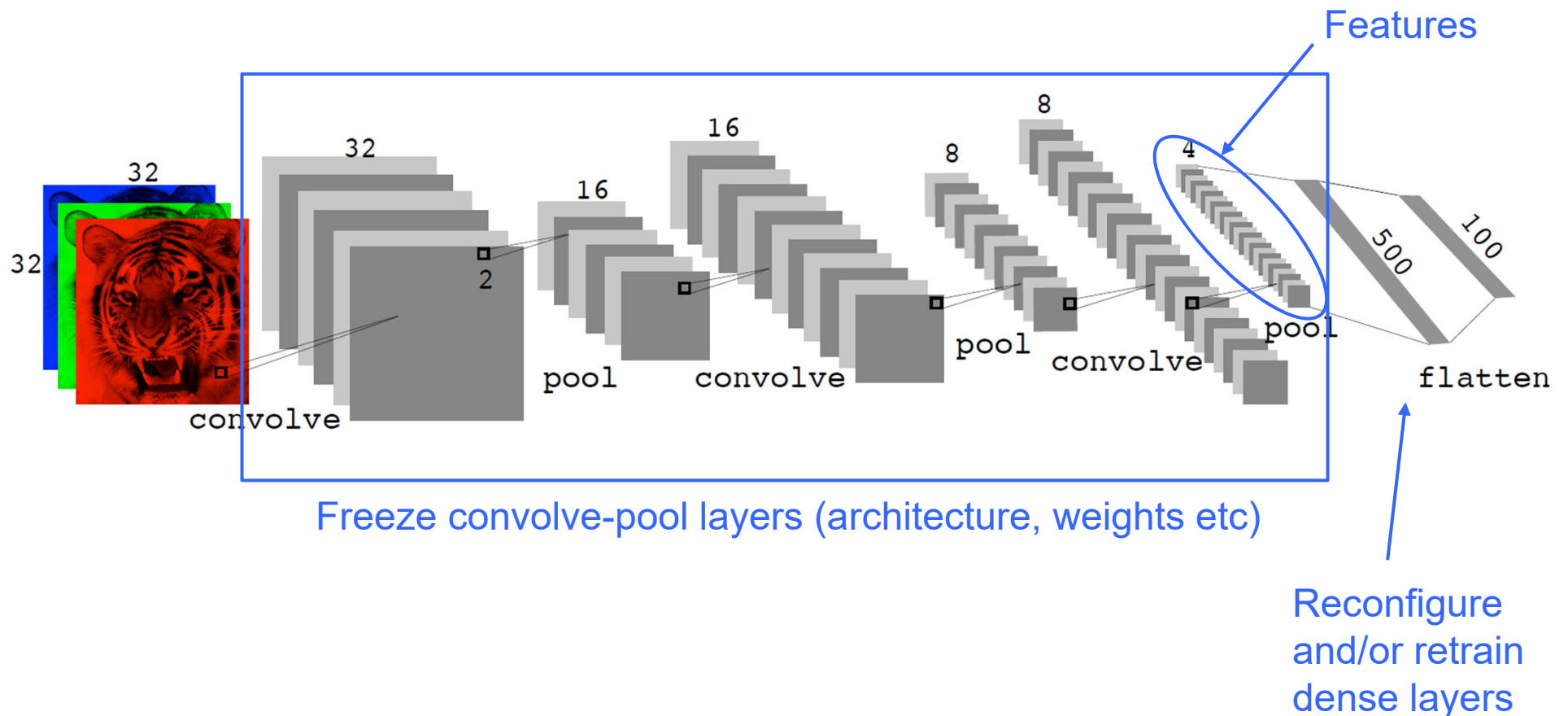
- Kickstart the learning process on the target task

# Transfer learning

- Pretrained model
  - different dataset, related task
  - e.g. images from the internet, 1000 categories
  - vehicles, people, buildings, pets, nature, ...
- Fine tune or retrain existing or new layers
  - target data, target task
  - e.g. ecological taxa, 56 categories
  - plants, animals

# Transfer learning

Conv-pool learned to extract general features
Train final layers to classify images in new task



Features

Freeze convolve-pool layers (architecture, weights etc)

Reconfigure and/or retrain dense layers

ISLR 10.8

# Imagenet challenge

- Imagenet: Deng et al (2009)
  - massive collection of labelled images
- Imagenet-1K
  - 1000 classes, mean ca 1200 images each
  - multi-resolution
- Alexnet: Krizhevsky, Sutskever, Hinton (2012)
  - CNN, GPU trained
  - top 5 accuracy improved from 70% to 85%
- Current top-5 accuracy: 99%

# VGG16



Simonyan & Zisserman 2014
Oxford Visual Geometry Group
16 trainable layers
Imagenet-1K: top-5 accuracy 93%