

Oxford-pets, Resnet34

```
from fastai import *
from fastai.vision import *
import matplotlib as plt
from PIL import Image
```

```
path = untar_data(URLs.PETS) # getting data(FAI)
```

↳ Downloading <https://s3.amazonaws.com/fast-ai-imageclas/oxford-iiit-pet>

```
path
```

↳ PosixPath('/root/.fastai/data/oxford-iiit-pet')

```
path.ls() # checking paths
```

↳ [PosixPath('/root/.fastai/data/oxford-iiit-pet/images'),
PosixPath('/root/.fastai/data/oxford-iiit-pet/annotations')]

```
path_anno = path/'annotations'
```

```
path_img = path/'images'
```

```
fnames = get_image_files(path_img)
```

```
fnames[:5]
```

↳ [PosixPath('/root/.fastai/data/oxford-iiit-pet/images/american_pit_bull_terrier_60.jp
PosixPath('/root/.fastai/data/oxford-iiit-pet/images/basset_hound_96.jpg'),
PosixPath('/root/.fastai/data/oxford-iiit-pet/images/staffordshire_bull_terrier_73.j
PosixPath('/root/.fastai/data/oxford-iiit-pet/images/samoyed_56.jpg'),
PosixPath('/root/.fastai/data/oxford-iiit-pet/images/yorkshire_terrier_6.jpg')]

```
pattern_label = r'/(^[^/]+)_\d+.jpg$'
```

```
np.random.seed(1)
```

```
data = ImageDataBunch.from_name_re(path_img, fnames, pattern_label, ds_tfms=get_transforms
```

```
data.normalize(imagenet_stats) # normalize to make the mean and SD of different channels(R
```

↳

```
ImageDataBunch;
```

```
Train: Labellist (5912 items)
```

```
x: ImageList
```

```
Image (3, 224, 224),Image (3, 224, 224),Image (3, 224, 224),Image (3, 224, 224),Image
```

```
y: CategoryList
```

```
american_pit_bull_terrier,basset_hound,staffordshire_bull_terrier,samoyed,yorkshire_t
```

```
Path: /root/.fastai/data/oxford-iiit-pet/images;
```

```
Valid: Labellist (1478 items)
```

```
x: ImageList
```

```
Image (3, 224, 224),Image (3, 224, 224),Image (3, 224, 224),Image (3, 224, 224),Image
```

```
y: CategoryList
```

```
american_bulldog,miniatue_pinscher,miniatue_pinscher,shiba_inu,keeshond
```

```
Path: /root/.fastai/data/oxford-iiit-pet/images;
```

```
Test: None
```

```
data.show_batch(rows=3, figsize=(7,6))
```



american_bulldog



havanese



newfoundland



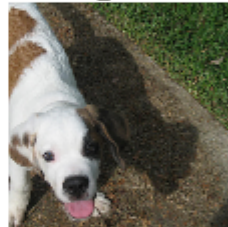
american_bulldog



Bombay



saint_bernard



havanese



Ragdoll



pug



```
print(data.classes)
```



```
['Abyssinian', 'Bengal', 'Birman', 'Bombay', 'British_Shorthair', 'Egyptian_Mau', 'Ma
```

```
len(data.classes)
```



```
37
```

```
learn = create_cnn(data, models.resnet34, metrics=error_rate)
```

↳ /usr/local/lib/python3.6/dist-packages/fastai/vision/learner.py:106: UserWarning: `create_cnn` is deprecated and is now named `cnn_learner`.
warn("`create_cnn` is deprecated and is now named `cnn_learner`.")
Downloading: "<https://download.pytorch.org/models/resnet34-333f7ec4.pth>" to /root/.cache/torch/models/83.3M/83.3M [00:03<00:00, 22.3MB/s]

```
learn.fit_one_cycle(5)
```

↳

| epoch | train_loss | valid_loss | error_rate | time |
|-------|------------|------------|------------|-------|
| 0 | 1.519426 | 0.309154 | 0.100135 | 01:22 |
| 1 | 0.637294 | 0.309648 | 0.092693 | 01:21 |
| 2 | 0.435239 | 0.272449 | 0.087957 | 01:21 |
| 3 | 0.311092 | 0.228633 | 0.070365 | 01:22 |
| 4 | 0.229652 | 0.226257 | 0.063599 | 01:22 |

```
learn.save('stage-1')
```

Results

```
interp = ClassificationInterpretation.from_learner(learn)
```

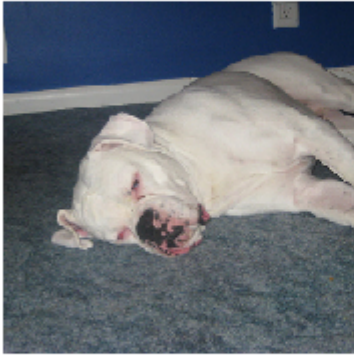
↳

```
interp.plot_top_losses(9, figsize=(15, 11))
```

↳

Prediction/Actual/Loss/Probability

american_bulldog/boxer / 14.12 / 0.00



beagle/basset_hound / 11.38 / 0.00



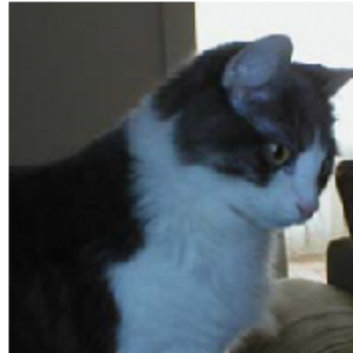
shiba_i



Abyssinian/Bengal / 7.16 / 0.00



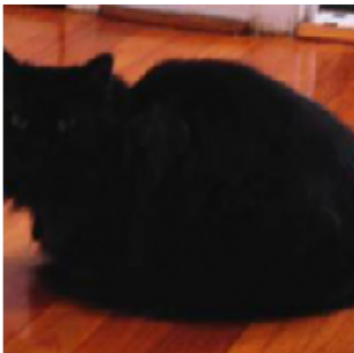
Bombay/Maine_Coon / 6.58 / 0.00



havanese/en



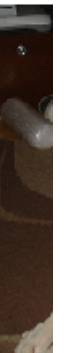
Bombay/Persian / 6.30 / 0.00



Maine_Coon/Persian / 6.00 / 0.00



american_bulldog



```
doc(interp.plot_top_losses)
```



```
_cl_int_plot_top_losses
```

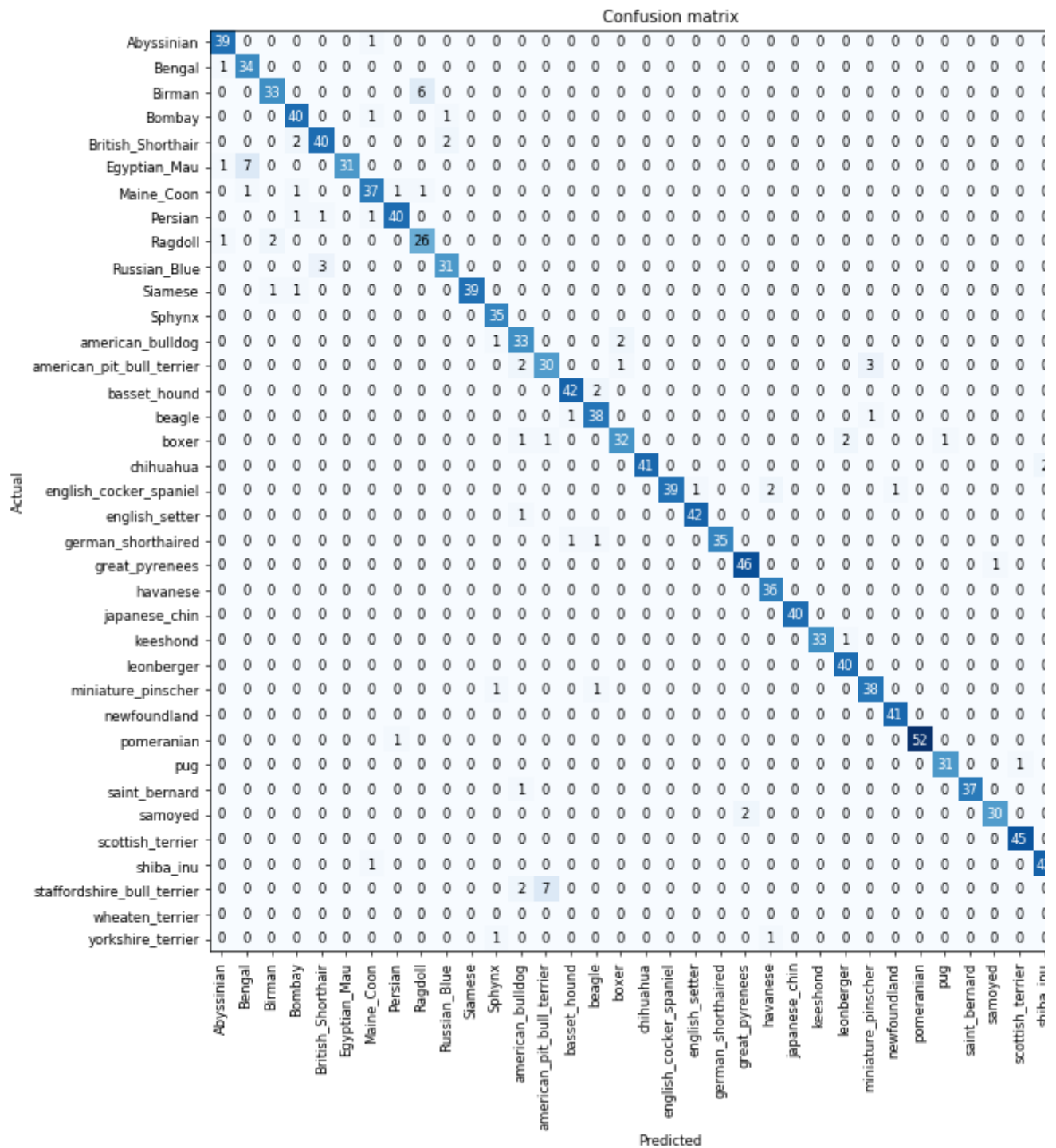
```
_cl_int_plot_top_losses(k, largest=True, figsize=(12, 12), heatmap:bool=False, heatmap_title:Optional[str]=None, return_fig:bool=None) → Optional[Figure]
```

x

No tests found for `_cl_int_plot_top_losses`. To contribute a test please refer to [this guide](#) and [this discussion](#).
Show images in `top_losses` along with their prediction, actual, loss, and probability of actual class.

[Show in docs](#)

```
interp.plot_confusion_matrix(figsize=(12,12), dpi=60)
```



```
interp.most_confused(min_val=3)
```

```
[('Egyptian_Mau', 'Bengal', 7),
 ('staffordshire_bull_terrier', 'american_pit_bull_terrier', 7),
 ('Birman', 'Ragdoll', 6),
 ('american_pit_bull_terrier', 'staffordshire_bull_terrier', 6),
 ('Russian_Blue', 'British_Shorthair', 3),
 ('american_pit_bull_terrier', 'miniature_pinscher', 3)]
```

Unfreezing and fine tuning

```
learn.unfreeze()
```

```
learn.fit_one_cycle(1)
```

```
↗
```

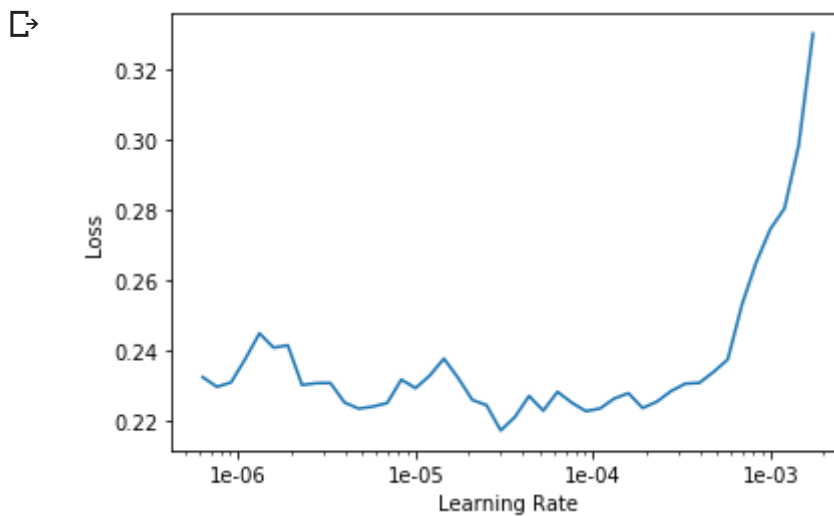
| epoch | train_loss | valid_loss | error_rate | time |
|-------|------------|------------|------------|-------|
| 0 | 0.684500 | 0.370274 | 0.115020 | 01:23 |

```
learn.load('stage-1')
```

```
learn.lr_find()
```

```
↗ LR Finder is complete, type {learner_name}.recorder.plot() to see the graph.
```

```
learn.recorder.plot()
```



```
learn.unfreeze()
```

```
learn.fit_one_cycle(2, max_lr=slice(1e-6, 5e-5))
```

```
↗
```

| epoch | train_loss | valid_loss | error_rate | time |
|-------|------------|------------|------------|-------|
| 0 | 0.229646 | 0.224551 | 0.066982 | 01:22 |
| 1 | 0.208496 | 0.214111 | 0.065629 | 01:20 |

Resnet50 model, bigger images, bigger batch size for transfer

```
data1 = ImageDataBunch.from_name_re(path_img, fnames, pattern_label, ds_tfms=get_transform
```

```
data1.normalize(imagenet_stats)
```

```
learn1 = create_cnn(data1, models.resnet50, metrics=error_rate)
```

```
learn1.fit_one_cycle(5)
```



| epoch | train_loss | valid_loss | error_rate | time |
|-------|------------|------------|------------|-------|
| 0 | 0.909988 | 0.327232 | 0.094723 | 01:58 |
| 1 | 0.461359 | 0.260119 | 0.076455 | 01:54 |
| 2 | 0.292678 | 0.219529 | 0.062923 | 01:57 |
| 3 | 0.196122 | 0.190867 | 0.056834 | 01:59 |
| 4 | 0.135056 | 0.184373 | 0.053451 | 01:58 |

```
learn1.save('stage-1-50')
```

```
learn1.unfreeze()
```

```
learn1.fit_one_cycle(1)
```



| epoch | train_loss | valid_loss | error_rate | time |
|-------|------------|------------|------------|-------|
| 0 | 0.675920 | 0.313637 | 0.106225 | 02:03 |

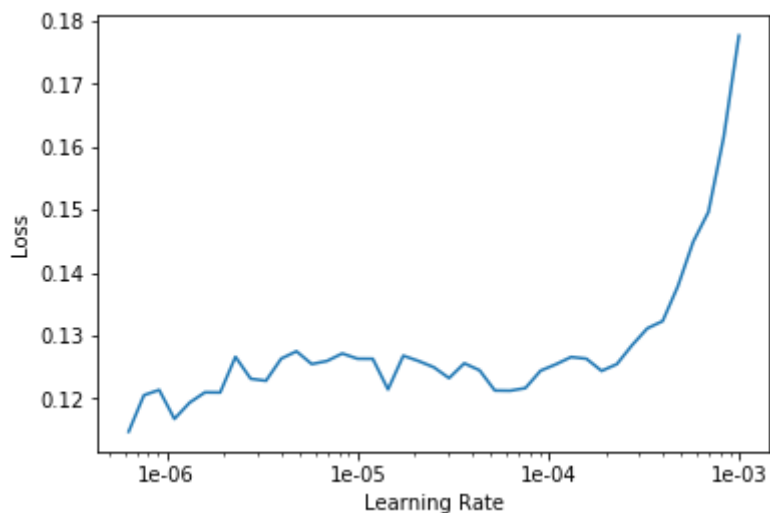
```
learn1.load('stage-1-50')
```

```
learn1.lr_find()
```



LR Finder is complete, type {learner_name}.recorder.plot() to see the graph.

```
learn1.recorder.plot()
```



```
learn1.unfreeze()
```

```
learn1.fit_one_cycle(2, max_lr=slice(1e-6, 5e-4))
```



| epoch | train_loss | valid_loss | error_rate | time |
|-------|------------|------------|------------|-------|
| 0 | 0.142892 | 0.193107 | 0.060893 | 02:02 |
| 1 | 0.106905 | 0.162742 | 0.045332 | 02:04 |

```
learn1.save('stage-1-50-mod')
```

MNIST_SAMPLE(3 and 7) creating databunch using 'from_fc

```
path = untar_data(URLs.MNIST_SAMPLE)
```

```
↳ Downloading http://files.fast.ai/data/examples/mnist\_sample
```

```
path.ls()
```

```
↳ [PosixPath('/root/.fastai/data/mnist_sample/labels.csv'),
    PosixPath('/root/.fastai/data/mnist_sample/valid'),
    PosixPath('/root/.fastai/data/mnist_sample/train')]
```

```
path_labels = path/'labels'
```

```
path_valid = path/'valid'
```

```
path_train = path/'train'
```

```
path_train.ls()
```

```
↳ [PosixPath('/root/.fastai/data/mnist_sample/train/3'),
    PosixPath('/root/.fastai/data/mnist_sample/train/7')]
```

```
tfms = get_transforms(do_flip=False)
```

```
data = ImageDataBunch.from_folder(path, ds_tfms=tfms, size=26)
```

```
data
```

```
↳ ImageDataBunch;
```

```
Train: Labellist (12396 items)
```

```
x: ImageList
```

```
Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,
```

```
y: CategoryList
```

```
3,3,3,3,3
```

```
Path: /root/.fastai/data/mnist_sample;
```

```
Valid: Labellist (2038 items)
```

```
x: ImageList
```

```
Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,
```

```
y: CategoryList
```

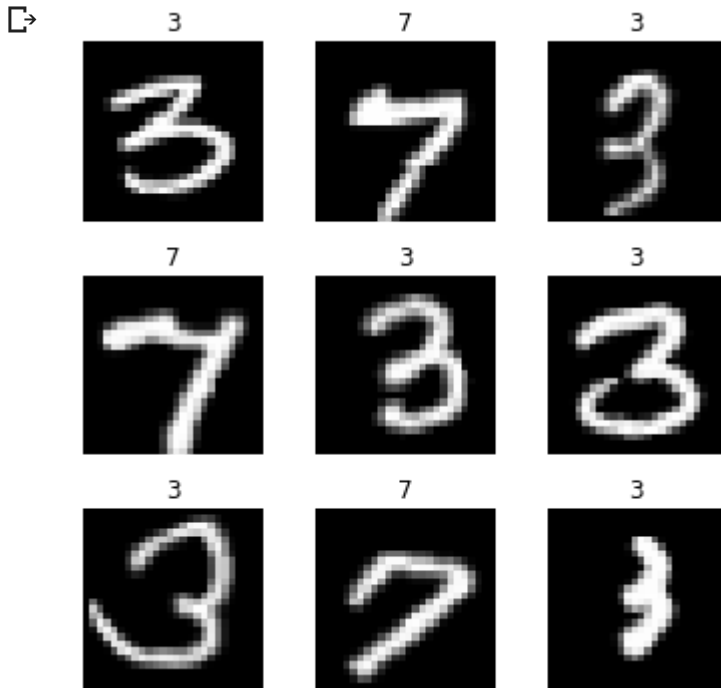
```
3,3,3,3,3
```

```
Path: /root/.fastai/data/mnist_sample;
```

```
Test: None
```



```
data.show_batch(rows=3, figsize=(5,5))
```



```
learn = create_cnn(data, models.resnet18, metrics=accuracy)
```

```
↳ /usr/local/lib/python3.6/dist-packages/fastai/vision/learner.py:106: UserWarning: `cr
warn("`create_cnn` is deprecated and is now named `cnn_learner`.")
Downloading: "https://download.pytorch.org/models/resnet18-5c106cde.pth" to /root/.ca
100%|██████████| 44.7M/44.7M [00:02<00:00, 23.2MB/s]
```

```
learn.fit_one_cycle(5)
```

```
↳
```

| epoch | train_loss | valid_loss | accuracy | time |
|-------|------------|------------|----------|-------|
| 0 | 0.108815 | 0.056137 | 0.980864 | 00:16 |
| 1 | 0.077194 | 0.034737 | 0.988714 | 00:16 |
| 2 | 0.066731 | 0.028009 | 0.989696 | 00:16 |
| 3 | 0.061687 | 0.024061 | 0.992149 | 00:16 |
| 4 | 0.047814 | 0.022234 | 0.993131 | 00:16 |

MNIST_SAMPLE(3 and 7) creating databunch using the 'label'

```
df = pd.read_csv(path/'labels.csv')
```

```
df.head()
```

```
↳
```

| | name | label |
|---|-------------------|-------|
| 0 | train/3/7463.png | 0 |
| 1 | train/3/21102.png | 0 |
| 2 | train/3/31559.png | 0 |
| 3 | train/3/46882.png | 0 |
| 4 | train/3/26209.png | 0 |

```
data_csv = ImageDataBunch.from_csv(path, ds_tfms=tfms, size=26)
```

```
data_csv
```

```
↳ ImageDataBunch;
```

```
Train: Labellist (11548 items)
```

```
x: ImageList
```

```
Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,
```

```
y: CategoryList
```

```
0,0,0,0,0
```

```
Path: /root/.fastai/data/mnist_sample;
```

```
Valid: Labellist (2886 items)
```

```
x: ImageList
```

```
Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,
```

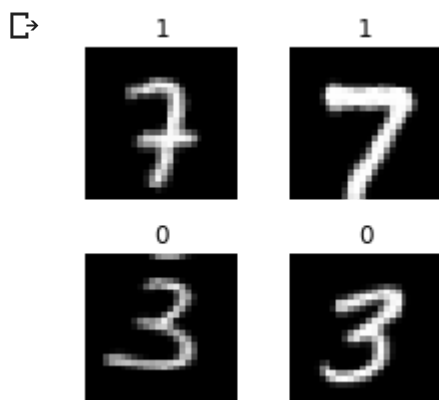
```
y: CategoryList
```

```
0,1,1,0,1
```

```
Path: /root/.fastai/data/mnist_sample;
```

```
Test: None
```

```
data_csv.show_batch(rows=2, figsize=(3,3))
```



```
data_csv.classes
```

```
↳ [0, 1]
```

```
learn_csv = cnn_learner(data_csv, models.resnet18, metrics=accuracy)
```

```
learn_csv.fit_one_cycle(5)
```

| epoch | train_loss | valid_loss | accuracy | time |
|-------|------------|------------|----------|-------|
| 0 | 0.358849 | 0.166654 | 0.935897 | 00:14 |
| 1 | 0.168769 | 0.103451 | 0.955994 | 00:14 |
| 2 | 0.114843 | 0.054705 | 0.979557 | 00:15 |
| 3 | 0.096019 | 0.033092 | 0.988912 | 00:14 |
| 4 | 0.079061 | 0.032406 | 0.988912 | 00:14 |

MNIST_SAMPLE(3 and 7) creating databunch using RegEx

```
pattern = r'/(\\d)/\\d+\\.png$'
```

```
fn_paths = [path/name for name in df['name']]
```

```
fn_paths[:2]
```

```
[PosixPath('/root/.fastai/data/mnist_sample/train/3/7463.png'),
 PosixPath('/root/.fastai/data/mnist_sample/train/3/21102.png')]
```

```
data_reg = ImageDataBunch.from_name_re(path, fn_paths, pat=pattern, ds_tfms=tfms, size=26)
```

```
data_reg
```

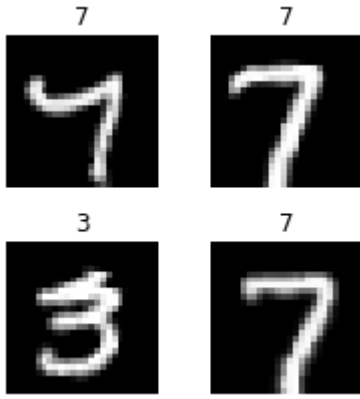
```
ImageDataBunch;

Train: Labellist (11548 items)
x: ImageList
Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,
y: CategoryList
3,3,3,3,3
Path: /root/.fastai/data/mnist_sample;

Valid: Labellist (2886 items)
x: ImageList
Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,
y: CategoryList
7,3,3,7,3
Path: /root/.fastai/data/mnist_sample;

Test: None
```

```
data_reg.show_batch(rows=2, figsize=(3,3))
```



```
learn_reg = cnn_learner(data_reg, models.resnet18, metrics=accuracy)
```

```
learn_reg.fit(5)
```

↗

| epoch | train_loss | valid_loss | accuracy | time |
|-------|------------|------------|----------|-------|
| 0 | 0.203526 | 0.094837 | 0.961538 | 00:16 |
| 1 | 0.120946 | 0.051662 | 0.981636 | 00:16 |
| 2 | 0.108039 | 0.037705 | 0.989605 | 00:15 |
| 3 | 0.066713 | 0.021860 | 0.992377 | 00:15 |
| 4 | 0.078224 | 0.018173 | 0.994110 | 00:16 |

MNIST_SAMPLE(3 and 7) creating databunch using RegEx v

```
pattern = r'/(\\d)/\\d+\\.png$'
```

```
fn_paths = [path/name for name in df['name']]
```

```
data_lambda = ImageDataBunch.from_name_func(path, fn_paths, ds_tfms=tfms, size=26,
                                             label_func= lambda x : '3' if '/3/' in str(x) el
```

```
data_lambda
```

↗

```
ImageDataBunch;
```

```
Train: Labellist (11548 items)
```

```
x: ImageList
```

```
Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,
```

```
y: CategoryList
```

```
3,3,3,3,3
```

```
Path: /root/.fastai/data/mnist_sample;
```

```
Valid: Labellist (2886 items)
```

```
x: ImageList
```

```
Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,
```

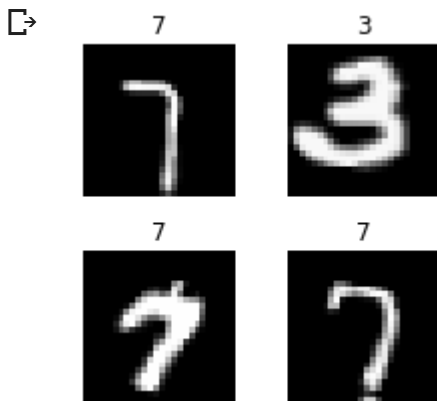
```
y: CategoryList
```

```
7,7,7,3,3
```

```
Path: /root/.fastai/data/mnist_sample;
```

```
Test: None
```

```
data_lambda.show_batch(rows=2, figsize=(3,3))
```



```
learn_lambda = cnn_learner(data_lambda, models.resnet18, metrics=accuracy)
```

```
learn_lambda.fit(5)
```

| epoch | train_loss | valid_loss | accuracy | time |
|-------|------------|------------|----------|-------|
| 0 | 0.197588 | 0.076690 | 0.972973 | 00:15 |
| 1 | 0.121993 | 0.054215 | 0.979903 | 00:15 |
| 2 | 0.092091 | 0.042031 | 0.986140 | 00:15 |
| 3 | 0.080076 | 0.023034 | 0.994802 | 00:15 |
| 4 | 0.054163 | 0.012242 | 0.995495 | 00:15 |

MNIST_SAMPLE(3 and 7) creating databunch using RegEx v

```
labels=[('3' if '/3/' in str(x) else '7') for x in fn_paths]
```

```
data_labels = ImageDataBunch.from_lists(path, fn_paths, ds_tfms=tfms, size=26, labels=labe
```

data_labels

↳ ImageDataBunch;

Train: Labellist (11548 items)

x: ImageList

Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,

y: CategoryList

3,3,3,3,3

Path: /root/.fastai/data/mnist_sample;

Valid: Labellist (2886 items)

x: ImageList

Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26, 26),Image (3, 26,

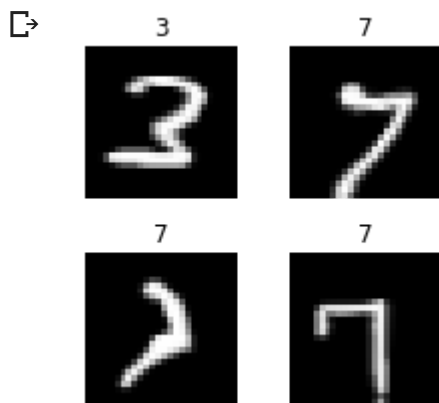
y: CategoryList

3,3,3,3,7

Path: /root/.fastai/data/mnist_sample;

Test: None

data_labels.show_batch(rows=2, figsize=(3,3))



learn_labels = cnn_learner(data_labels, models.resnet18, metrics=accuracy)

learn_labels.fit(5)

↳

| epoch | train_loss | valid_loss | accuracy | time |
|-------|------------|------------|----------|-------|
| 0 | 0.059016 | 0.021237 | 0.993070 | 00:16 |
| 1 | 0.039150 | 0.014911 | 0.994456 | 00:16 |
| 2 | 0.035309 | 0.015841 | 0.994456 | 00:16 |
| 3 | 0.034600 | 0.010617 | 0.995842 | 00:16 |
| 4 | 0.036799 | 0.012018 | 0.996189 | 00:16 |

