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# This Python 3 environment comes with many helpful analytics libraries installed
# It is defined by the kaggle/python Docker image: https://github.com/kaggle/docker-pytho
# For example, here's several helpful packages to load
import numpy as np # linear algebra
import pandas as pd # data processing, CSV file I/O (e.g. pd.read csv)
# Input data files are available in the read-only "../input/" directory
# For example, running this (by clicking run or pressing Shift+Enter) will list all files
under the input directory
import os
for dirname, _, filenames in os.walk('/kaggle/input'):
   for filename in filenames:
       print(os.path.join(dirname, filename))
# You can write up to 20GB to the current directory (/kaggle/working/) that gets preserve
d as output when you create a version using "Save & Run All"
# You can also write temporary files to /kaggle/temp/, but they won't be saved outside of
the current session
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## In [2]:

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import cv2
import matplotlib.pyplot as plt
import os
from PIL import Image
import numpy as np
import pandas as pd
from glob import glob
import os
import random
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
plt.style.use("ggplot")
%matplotlib inline
from tqdm import tqdm notebook, tnrange
from itertools import chain
from skimage.io import imread, imshow, concatenate images
from skimage.transform import resize
```

```
from skimage.morphology import label
from sklearn.model selection import train test split
import tensorflow as tf
from keras.models import Model, load model
from keras.layers import Input, BatchNormalization, Activation, Dense, Dropout
from keras.layers.core import Lambda, RepeatVector, Reshape
from keras.layers.convolutional import Conv2D, Conv2DTranspose
from keras.layers.pooling import MaxPooling2D, GlobalMaxPool2D
from keras.layers.merge import concatenate, add
from keras.callbacks import EarlyStopping, ModelCheckpoint, ReduceLROnPlateau
from tensorflow.keras.optimizers import Adam
from keras.preprocessing.image import ImageDataGenerator, array to img, img to array, loa
In [3]:
train images = glob('../input/preprocesseddata/prepared data/train/images/*.png')
train masks = glob('.../input/preprocesseddata/prepared data/train/masks/*.png')
In [4]:
img = []
for filename in train_images:
   img.append(filename)
img.sort()
In [5]:
mask = []
for filename in train masks:
   mask.append(filename)
mask.sort()
In [6]:
# Set some parameters
im_width = 512
im_height = 512
border = 5
ids = next(os.walk("../input/preprocesseddata/prepared data/train/images"))[2] # list of
names all images in the given path
print("No. of images = ", len(ids))
No. of images = 268
In [7]:
X = np.zeros((len(ids), im height, im width, 1), dtype=np.float32)
y = np.zeros((len(ids), im height, im width, 1), dtype=np.float32)
In [8]:
# tqdm is used to display the progress bar
for n, id_ in tqdm_notebook(enumerate(ids), total=len(ids)):
    # Load images
    img = load img("../input/preprocesseddata/prepared data/train/images/"+id , grayscale
=True)
    x img = img to array(img)
    x img = resize(x img, (512, 512, 1), mode = 'constant', preserve range = True)
    # Load masks
   mask = img to array(load img("../input/preprocesseddata/prepared data/train/masks/"+i
d_, grayscale=True))
    mask = resize(mask, (512, 512, 1), mode = 'constant', preserve range = True)
    # Save images
    X[n] = x img/255.0
    y[n] = mask/255.0
/opt/conda/lib/python3.7/site-packages/ipykernel launcher.py:2: TgdmDeprecationWarning: T
his function will be removed in tqdm==5.0.0
```

Please use `tqdm.notebook.tqdm` instead of `tqdm.tqdm notebook`

/opt/conda/lib/python3.7/site-packages/keras\_preprocessing/image/utils.py:107: UserWarnin
g: grayscale is deprecated. Please use color\_mode = "grayscale"
 warnings.warn('grayscale is deprecated. Please use '

#### In [9]:

```
# Split train and valid
X_train, X_valid, y_train, y_valid = train_test_split(X, y, test_size=0.1, random_state=
42)
```

### In [10]:

```
# Visualize any randome image along with the mask
ix = random.randint(0, len(X_train))
has_mask = y_train[ix].max() > 0

fig, (ax1, ax2) = plt.subplots(1, 2, figsize = (20, 15))

ax1.imshow(X_train[ix, ..., 0], cmap = 'seismic', interpolation = 'bilinear')
if has_mask:
    # draw a boundary(contour) in the original image
    ax1.contour(y_train[ix].squeeze(), colors = 'k', linewidths = 5, levels = [0.5])
ax1.set_title('Lung CT Scan')

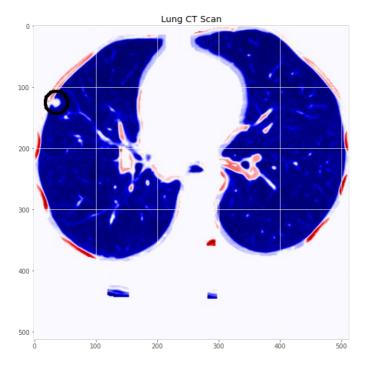
ax2.imshow(y_train[ix].squeeze(), cmap = 'gray', interpolation = 'bilinear')
ax2.set_title('Lung Nodule')
```

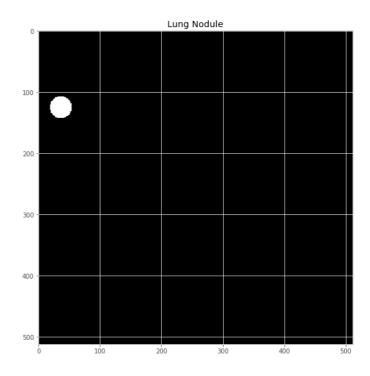
/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:10: UserWarning: No contour levels were found within the data range.

# Remove the CWD from sys.path while we load stuff.

#### Out[10]:

Text(0.5, 1.0, 'Lung Nodule')





## In [11]:

#### In [12]:

```
def get_unet(input_img, n_filters = 16, dropout = 0.1, batchnorm = True):
    """Function to define the UNET Model"""
    # Contracting Path
   c1 = conv2d block(input img, n filters * 1, kernel_size = 3, batchnorm = batchnorm)
   p1 = MaxPooling2D((2, 2), padding='same')(c1)
   p1 = Dropout (dropout) (p1)
   c2 = conv2d block(p1, n filters * 2, kernel size = 3, batchnorm = batchnorm)
   p2 = MaxPooling2D((2, 2), padding='same')(c2)
   p2 = Dropout (dropout) (p2)
   c3 = conv2d block(p2, n filters * 4, kernel size = 3, batchnorm = batchnorm)
   p3 = MaxPooling2D((2, 2), padding='same')(c3)
   p3 = Dropout (dropout) (p3)
   c4 = conv2d_block(p3, n_filters * 8, kernel size = 3, batchnorm = batchnorm)
    p4 = MaxPooling2D((2, 2), padding='same')(c4)
   p4 = Dropout(dropout)(p4)
   c5 = conv2d block(p4, n filters = n filters * 16, kernel size = 3, batchnorm = batch
norm)
    # Expansive Path
   u6 = Conv2DTranspose(n filters * 8, (3, 3), strides = (2, 2), padding = 'same')(c5)
   u6 = concatenate([u6, c4])
   u6 = Dropout (dropout) (u6)
   c6 = conv2d block(u6, n filters * 8, kernel size = 3, batchnorm = batchnorm)
   u7 = Conv2DTranspose(n_filters * 4, (3, 3), strides = (2, 2), padding = 'same')(c6)
   u7 = concatenate([u7, c3])
   u7 = Dropout(dropout)(u7)
    c7 = conv2d block(u7, n filters * 4, kernel size = 3, batchnorm = batchnorm)
   u8 = Conv2DTranspose(n filters * 2, (3, 3), strides = (2, 2), padding = 'same')(c7)
   u8 = concatenate([u8, c2])
   u8 = Dropout (dropout) (u8)
   c8 = conv2d block(u8, n filters * 2, kernel size = 3, batchnorm = batchnorm)
   u9 = Conv2DTranspose(n filters * 1, (3, 3), strides = (2, 2), padding = 'same')(c8)
   u9 = concatenate([u9, c1])
   u9 = Dropout (dropout) (u9)
   c9 = conv2d block(u9, n filters * 1, kernel size = 3, batchnorm = batchnorm)
    outputs = Conv2D(1, (1, 1), activation='sigmoid')(c9)
   model = Model(inputs=[input img], outputs=[outputs])
   return model
```

# In [13]:

```
input_img = Input((im_height, im_width, 1), name='img')
model = get_unet(input_img, n_filters=16, dropout=0.05, batchnorm=True)
model.compile(optimizer=Adam(), loss="binary_crossentropy", metrics=["accuracy"])

2022-05-07 16:24:53.781264: I tensorflow/core/common_runtime/process_util.cc:146] Creatin
g new thread pool with default inter op setting: 2. Tune using inter_op_parallelism_threa
ds for best performance.
```

## In [14]:

model summary()

model.oundary()						
Model: "model"						
Layer (type)	Output	Shap	e		Param #	Connected to
img (InputLayer)	[(None	===== , 512	===== , 512	==== , 1)	0	
conv2d_1 (Conv2D)	(None,	512,	512,	16)	160	img[0][0]
batch_normalization_1 (BatchNor	(None,	512,	512,	16)	64	conv2d_1[0][0]
activation_1 (Activation) [0]	(None,	512,	512,	16)	0	batch_normalization_1[0]
max_pooling2d (MaxPooling2D)	(None,	256,	256,	16)	0	activation_1[0][0]
dropout (Dropout)	(None,	256,	256,	16)	0	max_pooling2d[0][0]
conv2d_3 (Conv2D)	(None,	256,	256,	32)	4640	dropout[0][0]
batch_normalization_3 (BatchNor	(None,	256,	256,	32)	128	conv2d_3[0][0]
activation_3 (Activation) [0]	(None,	256,	256,	32)	0	batch_normalization_3[0]
max_pooling2d_1 (MaxPooling2D)	(None,	128,	128,	32)	0	activation_3[0][0]
dropout_1 (Dropout)	(None,	128,	128,	32)	0	max_pooling2d_1[0][0]
conv2d_5 (Conv2D)	(None,	128,	128,	64)	18496	dropout_1[0][0]
batch_normalization_5 (BatchNor	(None,	128,	128,	64)	256	conv2d_5[0][0]
activation_5 (Activation) [0]	(None,	128,	128,	64)	0	batch_normalization_5[0]
max_pooling2d_2 (MaxPooling2D)	(None,	64,	64, 6	4)	0	activation_5[0][0]
dropout_2 (Dropout)	(None,	64,	64, 6	4)	0	max_pooling2d_2[0][0]

conv2d_7 (Conv2D)	(None,	64,	64,	128)	73856	dropout_2[0][0]
batch_normalization_7 (BatchNor	(None,	64,	64,	128)	512	conv2d_7[0][0]
activation_7 (Activation) [0]	(None,	64,	64,	128)	0	batch_normalization_7[0]
max_pooling2d_3 (MaxPooling2D)	(None,	32,	32,	128)	0	activation_7[0][0]
dropout_3 (Dropout)	(None,	32,	32,	128)	0	max_pooling2d_3[0][0]
conv2d_9 (Conv2D)	(None,	32,	32,	256)	295168	dropout_3[0][0]
batch_normalization_9 (BatchNor	(None,	32,	32,	256)	1024	conv2d_9[0][0]
activation_9 (Activation) [0]	(None,	32,	32,	256)	0	batch_normalization_9[0]
conv2d_transpose (Conv2DTranspo	(None,	64,	64,	128)	295040	activation_9[0][0]
concatenate (Concatenate)	(None,	64,	64,	256)	0	conv2d_transpose[0][0] activation_7[0][0]
dropout_4 (Dropout)	(None,	64,	64,	256)	0	concatenate[0][0]
conv2d_11 (Conv2D)	(None,	64,	64,	128)	295040	dropout_4[0][0]
batch_normalization_11 (BatchNo	(None,	64,	64,	128)	512	conv2d_11[0][0]
activation_11 (Activation) ][0]	(None,	64,	64,	128)	0	batch_normalization_11[0
conv2d_transpose_1 (Conv2DTrans	(None,	128,	, 128	8, 64)	73792	activation_11[0][0]
concatenate_1 (Concatenate)	(None,	128,	, 128	8, 128	0	conv2d_transpose_1[0][0] activation_5[0][0]
dropout_5 (Dropout)	(None,	128,	, 128	8, 128	0	concatenate_1[0][0]

conv2d_13 (Conv2D)	(None,	128,	128,	64)	73792	dropout_5[0][0]
batch_normalization_13 (BatchNo	(None,	128,	128,	64)	256	conv2d_13[0][0]
activation_13 (Activation) ][0]	(None,	128,	128,	64)	0	batch_normalization_13[0
conv2d_transpose_2 (Conv2DTrans	(None,	256,	256,	32)	18464	activation_13[0][0]
concatenate_2 (Concatenate)	(None,	256,	256,	64)	0	conv2d_transpose_2[0][0] activation_3[0][0]
dropout_6 (Dropout)	(None,	256,	256,	64)	0	concatenate_2[0][0]
conv2d_15 (Conv2D)	(None,	256,	256,	32)	18464	dropout_6[0][0]
batch_normalization_15 (BatchNo	(None,	256,	256,	32)	128	conv2d_15[0][0]
activation_15 (Activation) ][0]	(None,	256,	256,	32)	0	batch_normalization_15[0
conv2d_transpose_3 (Conv2DTrans	(None,	512,	512,	16)	4624	activation_15[0][0]
concatenate_3 (Concatenate)	(None,	512,	512,	32)	0	conv2d_transpose_3[0][0] activation_1[0][0]
dropout_7 (Dropout)	(None,	512,	512,	32)	0	concatenate_3[0][0]
conv2d_17 (Conv2D)	(None,	512,	512,	16)	4624	dropout_7[0][0]
batch_normalization_17 (BatchNo	(None,	512,	512,	16)	64	conv2d_17[0][0]
activation_17 (Activation) ][0]	(None,	512,	512,	16)	0	batch_normalization_17[0
conv2d_18 (Conv2D)	(None,	512,	512,	1)	17	activation_17[0][0]
=======	======	=====	=====	====		=======================================

Total params: 1,179,121 Trainable params: 1,177,649 Non-trainable params: 1,472

```
In [15]:
callbacks = [
  EarlyStopping(patience=10, verbose=1),
  ReduceLROnPlateau(factor=0.1, patience=5, min lr=0.00001, verbose=1),
  ModelCheckpoint('./lung nodules model.h5', verbose=1, save best only=True, save weig
hts_only=True)
In [16]:
results = model.fit(X_train, y_train, batch_size=32, epochs=10, callbacks=callbacks,\
             validation data=(X valid, y valid))
2022-05-07 16:24:55.175948: I tensorflow/compiler/mlir_graph_optimization_pass.cc:18
5] None of the MLIR Optimization Passes are enabled (registered 2)
Epoch 1/10
val_loss: 13.7697 - val_accuracy: 0.1505
Epoch 00001: val loss improved from inf to 13.76968, saving model to ./lung nodules model
.h5
Epoch 2/10
val loss: 54.9287 - val accuracy: 0.0020
Epoch 00002: val loss did not improve from 13.76968
Epoch 3/10
val loss: 16.9327 - val accuracy: 0.0074
Epoch 00003: val loss did not improve from 13.76968
Epoch 4/10
val loss: 8.1438 - val accuracy: 0.0309
Epoch 00004: val loss improved from 13.76968 to 8.14383, saving model to ./lung nodules m
odel.h5
Epoch 5/10
val loss: 0.7280 - val accuracy: 0.7962
Epoch 00005: val loss improved from 8.14383 to 0.72802, saving model to ./lung nodules mo
del.h5
Epoch 6/10
val loss: 0.5230 - val accuracy: 0.9361
Epoch 00006: val loss improved from 0.72802 to 0.52298, saving model to ./lung nodules mo
del.h5
Epoch 7/10
val loss: 0.5837 - val accuracy: 0.8423
Epoch 00007: val loss did not improve from 0.52298
Epoch 8/10
val loss: 0.4533 - val accuracy: 0.9945
Epoch 00008: val loss improved from 0.52298 to 0.45335, saving model to ./lung nodules mo
del.h5
Epoch 9/10
val loss: 0.4272 - val accuracy: 0.9958
Epoch 00009: val loss improved from 0.45335 to 0.42715, saving model to ./lung nodules mo
del.h5
```

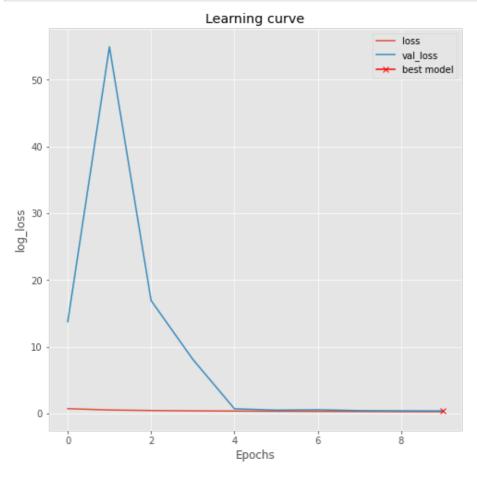
Epoch 10/10

val\_loss: 0.4100 - val\_accuracy: 0.9958
Epoch 00010: val loss improved from 0.42715 to 0.40997, saving model to ./lung nodules mo

```
In [17]:
```

del.h5

```
plt.figure(figsize=(8, 8))
plt.title("Learning curve")
plt.plot(results.history["loss"], label="loss")
plt.plot(results.history["val_loss"], label="val_loss")
plt.plot( np.argmin(results.history["val_loss"]), np.min(results.history["val_loss"]), m
arker="x", color="r", label="best model")
plt.xlabel("Epochs")
plt.ylabel("log_loss")
plt.legend();
```



# In [18]:

```
# load the best model
model.load_weights('./lung_nodules_model.h5')
```

### In [19]:

```
model.save('./unet_model.h5')
```

## In [20]:

```
from keras.models import model_from_json
model_json = model.to_json()

with open("./unet_model_weights.json", "w") as json_file:
        json_file.write(model_json)
model.save_weights("./unet_model_weights.h5")
print("Saved model to disk")
```

Saved model to disk

```
In [21]:
```

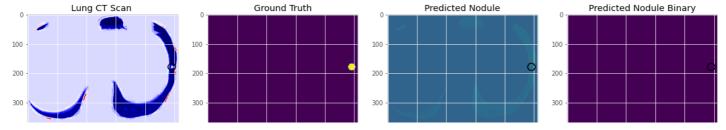
```
Out[21]:
[0.409972220659256, 0.9957706332206726]
In [22]:
# Predict on train, val and test
preds train = model.predict(X train, verbose=1)
preds val = model.predict(X valid, verbose=1)
8/8 [=======] - 33s 4s/step
1/1 [======= ] - 4s 4s/step
In [23]:
# Threshold predictions
preds train t = (preds train > 0.5).astype(np.uint8)
preds_val_t = (preds_val > 0.5).astype(np.uint8)
In [24]:
def plot_sample(X, y, preds, binary preds, ix=None):
    """Function to plot the results"""
   if ix is None:
       ix = random.randint(0, len(X))
   has mask = y[ix].max() > 0
   fig, ax = plt.subplots(1, 4, figsize=(20, 10))
   ax[0].imshow(X[ix, ..., 0], cmap='seismic')
   if has mask:
       ax[0].contour(y[ix].squeeze(), colors='k', levels=[0.5])
   ax[0].set title('Lung CT Scan ')
   ax[1].imshow(y[ix].squeeze())
   ax[1].set title('Ground Truth')
   ax[2].imshow(preds[ix].squeeze(), vmin=0, vmax=1)
   if has mask:
       ax[2].contour(y[ix].squeeze(), colors='k', levels=[0.5])
   ax[2].set title('Predicted Nodule')
   ax[3].imshow(binary preds[ix].squeeze(), vmin=0, vmax=1)
       ax[3].contour(y[ix].squeeze(), colors='k', levels=[0.5])
   ax[3].set title('Predicted Nodule Binary')
In [25]:
# Check if training data looks all right
plot sample(X train, y train, preds train, preds train t, ix=14)
/opt/conda/lib/python3.7/site-packages/ipykernel_launcher.py:11: UserWarning: No contour
levels were found within the data range.
```

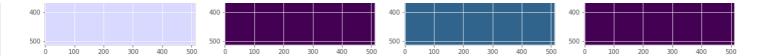
# Evaluate on validation set (this must be equals to the best log loss)

model.evaluate(X\_valid, y\_valid, verbose=1)

```
# Check if training data looks all right
plot_sample(X_train, y_train, preds_train, preds_train_t, ix=14)

/opt/conda/lib/python3.7/site-packages/ipykernel_launcher.py:11: UserWarning: No contour
levels were found within the data range.
    # This is added back by InteractiveShellApp.init_path()
/opt/conda/lib/python3.7/site-packages/ipykernel_launcher.py:19: UserWarning: No contour
levels were found within the data range.
/opt/conda/lib/python3.7/site-packages/ipykernel_launcher.py:24: UserWarning: No contour
levels were found within the data range.
```





### In [26]:

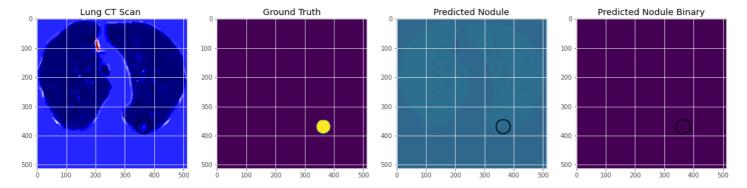
## plot sample(X train, y train, preds train, preds train t)

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:11: UserWarning: No contour levels were found within the data range.

# This is added back by InteractiveShellApp.init path()

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:19: UserWarning: No contour levels were found within the data range.

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:24: UserWarning: No contour levels were found within the data range.



#### In [27]:

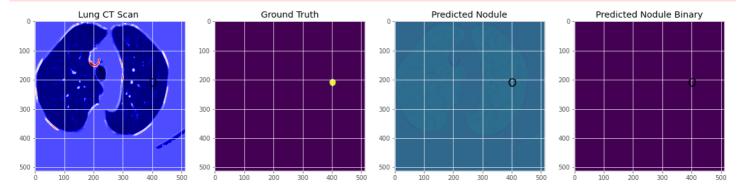
# Check if valid data looks all right
plot\_sample(X\_valid, y\_valid, preds\_val, preds\_val\_t, ix=19)

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:11: UserWarning: No contour levels were found within the data range.

# This is added back by InteractiveShellApp.init path()

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:19: UserWarning: No contour levels were found within the data range.

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:24: UserWarning: No contour levels were found within the data range.



In [28]:

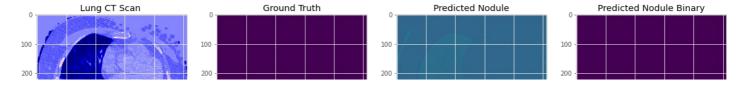
# Check if valid data looks all right plot\_sample(X\_valid, y\_valid, preds\_val\_t)

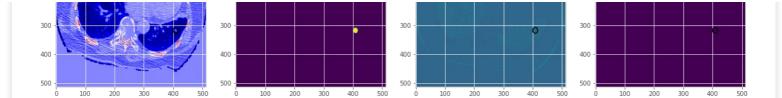
/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:11: UserWarning: No contour levels were found within the data range.

# This is added back by InteractiveShellApp.init path()

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:19: UserWarning: No contour levels were found within the data range.

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:24: UserWarning: No contour levels were found within the data range.





### In [29]:

```
# LOAD MODEL
from keras.models import load_model
model = load_model('./unet_model.h5')
```

### In [30]:

```
test_images = glob('../input/preprocesseddata/prepared_data/test/images/*.png')
test_masks = glob('../input/preprocesseddata/prepared_data/test/masks/*.png')
```

### In [31]:

```
img = []
for filename in test_images:
    img.append(filename)
img.sort()
mask = []
for filename in test_masks:
    mask.append(filename)
mask.sort()
```

## In [32]:

```
# Set some parameters
im_width = 512
im_height = 512
border = 5
ids = next(os.walk("../input/preprocesseddata/prepared_data/test/images"))[2] # list of n
ames all images in the given path
print("No. of images = ", len(ids))
```

No. of images = 67

### In [33]:

```
X = np.zeros((1, im_height, im_width, 1), dtype=np.float32)
y = np.zeros((1, im_height, im_width, 1), dtype=np.float32)
```

## In [34]:

```
# tqdm is used to display the progress bar
from tqdm import tqdm
images_path = "../input/preprocesseddata/prepared_data/test/images/"
masks_path = "../input/preprocesseddata/prepared_data/test/masks/"
img = load_img(images_path+'1.png', grayscale=True)
x_img = img_to_array(img)
x_img = resize(x_img, (512, 512, 1), mode = 'constant', preserve_range = True)
# Load masks
mask = img_to_array(load_img(masks_path+'1.png', grayscale=True))
mask = resize(mask, (512, 512, 1), mode = 'constant', preserve_range = True)
# Save images
X[0] = x_img/255.0
y[0] = mask/255.0
```

# In [35]:

```
preds_val = model.predict(X, verbose=1)
```

1/1 [======] - 1s 507ms/step

### In [36]:

preas var t = (preas var > 0.3).astype(np.uinto)

## In [37]:

# Check if valid data looks all right
plot\_sample(X, y, preds\_val, preds\_val\_t)

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:11: UserWarning: No contour levels were found within the data range.

# This is added back by InteractiveShellApp.init\_path()

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:19: UserWarning: No contour levels were found within the data range.

/opt/conda/lib/python3.7/site-packages/ipykernel\_launcher.py:24: UserWarning: No contour levels were found within the data range.

