In [168]:

```
import pandas as pd
import math
import csv
import os
import seaborn as sns
import matplotlib.pyplot as plt
import numpy as np
```

In [169]:

```
dfData = pd.read_csv("/home/archit/Desktop/ad vs organic/cleaned_subset.csv", encod
dfData.shape
```

Out[169]:

(10682, 13)

In [170]:

Out[170]:

(1670, 9)

In [171]:

dfLang = pd.read_csv("/home/archit/Desktop/ad vs organic/data_and_language.csv", en
dfLang.head()

Out[171]:

Id Lang 0 AUzyaHo0QQc en 1 1Zgtdb7jp60 en 2 1Sfii7rnkJQ en 3 UUwSKJjx9Go en 4 YI3NGvna2KA en

In [172]:

dfChannel = pd.read_csv("/home/archit/Desktop/ad vs organic/channelStats.csv", enco
dfChannel.head()

Out[172]:

	Channel Id	publishedAt	subscriberCount	channel Video Count	chan
0	UCUITFib0pkPDGBYh7FQfo0A	2011-03- 21T19:58:31.000Z	13	16	
1	UCvqHrRPqBw0D9B0wCNVwu8w	2012-01- 07T22:35:00.000Z	3682	308	
2	UCatjfgWbdCUxNNAso8z9Usg	2006-10- 06T22:31:17.000Z	96	50	
3	UCQa2_4V_9xtLefQGiPXqgNw	2006-10- 12T09:10:36.000Z	29	4	
4	UCvzrgT1n8Im2bPogecOOu7A	2006-11- 14T23:23:59.000Z	25	118	
4					>

In [173]:

```
dfData = dfData.merge(dfLang, on = 'Id', how = 'left')
dfData = dfData.merge(dfPrev, on = 'Id', how = 'left')
dfData = dfData.merge(dfChannel, on = 'Channel Id', how = 'left')
dfData.head()
```

Out[173]:

	Id	Title	Description	LikeCount	DislikeCount	
0	AUzyaHo0QQc	b'300 pushups a day for 20 days!! - Results!!'	b'**NEW** (2016) Abs Workout for 30 Days htt	40408	10312	
1	1Zgtdb7jp60	b'John Cena - gym'	b"Follow John Cena on twitter: http://www.twit	37867	1486	
2	1Sfii7rnkJQ	b'Bodybuilding Motivation - No Time To Waste'	b"Follow me:\nhttp://instagram.com/shaqx.bb\nh	17688	1291	
3	UUwSKJjx9Go	b'Most Powerful Home Chest Workout Ever : Buil	b'http://www.6weeksixpack.com This is one of t	46293	2589	
4	Yl3NGvna2KA	b'Greg Plitt Best of The Best Workout Video Pr	b'SIGN UP TODAY - http://bit.ly/jointheranks\r	24784	1134	
5 r	5 rows × 26 columns					
4	←					

```
In [174]:
```

```
indices = list(dfPrev['Id'])
len(indices)
```

Out[174]:

1670

In [175]:

```
for index in range(0,len(indices)):
    #with open('/home/archit/Desktop/ad vs organic/prev_vid_stat.csv') as f:
    dfData.loc[dfData['Id'] == indices[index],].to_csv('/home/archit/Desktop/ad vs
```

In [176]:

In [177]:

```
dfData.columns
```

Out[177]:

In [178]:

```
dfData.head()
```

Out[178]:

	ld	Title	Description	LikeCount	DislikeCount
0	EBVTMSKY-Cw	b'BODYBUILDING MOTIVATION - How Bad Do You Wan	b'Subscribe and Stay Tuned! Visit my channel a	20440	1465
1	VnNH6OMqT9E	b'Jeff Seid Transformation 17 years old'	b"How ya doin' ;)\nwww.jeffseid.com\n\n\nLink	8807	2094
2	isb4txkVPrk	b'Bodybuilding Motivation - Collapse (MPW)'	b'Like/fav/sub! Visit http://www.cutandjacked	4686	353
3	o-IVVhPrZ0A	b'BODYBUILDING TILL IM DEAD'	b'http://www.professionalmuscle.com - Chat Liv	15630	496
4	L4S7sYup_Rw	b'Stomach Exercises For Sexy Abs'	b'http://www.2losebellyfat.com/ - Visit for mo	5912	223
5 rows x 26 columns					

5 rows × 26 columns

In [179]:

```
dfData = dfData[dfData['channelVideoCount'] < 2000]
dfData = dfData[dfData['subscriberCount'] > 0]
dfData = dfData[dfData['Lang'] == 'en']
```

In [180]:

```
dfData.shape
```

Out[180]:

(1656, 26)

In [181]:

```
type(dfData['Title'])
```

Out[181]:

pandas.core.series.Series

In [182]:

```
# Conver to lower case
dfData['Title'] = dfData['Title'].str.lower()
# How To
dfData['HowTo'] = (dfData['Title'].str.contains('how')
                       dfData['Tags'].str.contains('how'))
# Motivational
dfData['Motivation'] = (dfData['Title'].str.contains('motivation')
                       dfData['Tags'].str.contains('motivation')
# Transformation
dfData['Transform'] = (dfData['Title'].str.contains('transform') |
                       dfData['Tags'].str.contains('transform')
# Abs Workout
dfData['Abs Video'] = (dfData['Title'].str.contains('abs') |
                       dfData['Title'].str.contains('six') |
                       dfData['Title'].str.contains(' 6') |
                       dfData['Title'].str.contains('abdomen') |
                       dfData['Tags'].str.contains('abs')
                       dfData['Tags'].str.contains('six') |
                       dfData['Tags'].str.contains(' 6') |
                       dfData['Tags'].str.contains('abdomen')
                      )
# Chest Workout
dfData['Chest Video'] = (dfData['Title'].str.contains('chest')
                         dfData['Title'].str.contains('pushup') |
                         dfData['Title'].str.contains('bench') |
                         dfData['Title'].str.contains('bench') |
                         dfData['Title'].str.contains('push up') |
                         dfData['Title'].str.contains('dumbell press') |
                         dfData['Tags'].str.contains('chest')
                         dfData['Tags'].str.contains('pushup') |
                         dfData['Tags'].str.contains('bench') |
                         dfData['Tags'].str.contains('bench') |
                         dfData['Tags'].str.contains('push up') |
                         dfData['Tags'].str.contains('dumbell press'))
# Back Workouts
dfData['Back Video'] = (dfData['Title'].str.contains('back') |
                        dfData['Title'].str.contains('pull up') |
                        dfData['Title'].str.contains('chin up')
                        dfData['Title'].str.contains('deadlift') |
                        dfData['Tags'].str.contains('back') |
                        dfData['Tags'].str.contains('pull up') |
                        dfData['Tags'].str.contains('chin up')
                        dfData['Tags'].str.contains('deadlift'))
# Leg Workouts
dfData['Legs Video'] = (dfData['Title'].str.contains('leg') |
                        dfData['Title'].str.contains('squat') |
                        dfData['Title'].str.contains('butt') |
                        dfData['Title'].str.contains('quad') |
```

```
dfData['Title'].str.contains('calve') |
                       dfData['Tags'].str.contains('leg') |
                        dfData['Tags'].str.contains('squat') |
                        dfData['Tags'].str.contains('butt') |
                        dfData['Tags'].str.contains('quad') |
                        dfData['Tags'].str.contains('calve') )
# Arm Workout
dfData['Arm Video'] = (dfData['Title'].str.contains('shoulder') |
                       dfData['Title'].str.contains('arm') |
                       dfData['Title'].str.contains('bicep')
                       dfData['Title'].str.contains('tricep') |
                       dfData['Title'].str.contains('delt') |
                       dfData['Tags'].str.contains('shoulder') |
                       dfData['Tags'].str.contains('arm') |
                       dfData['Tags'].str.contains('bicep')
                       dfData['Tags'].str.contains('tricep') |
                       dfData['Tags'].str.contains('delt'))
```

In [183]:

dfData.head()

Out[183]:

	Id	Title	Description	LikeCount	DislikeCount	Vie
0	EBVTMSKY-Cw	b'bodybuilding motivation - how bad do you wan	b'Subscribe and Stay Tuned! Visit my channel a	20440	1465	1
1	VnNH6OMqT9E	b'jeff seid transformation 17 years old'	b"How ya doin' ;)\nwww.jeffseid.com\n\n\nLink	8807	2094	;
2	isb4txkVPrk	b'bodybuilding motivation - collapse (mpw)'	b'Like/fav/sub! Visit http://www.cutandjacked	4686	353	;
3	o-IVVhPrZ0A	b'bodybuilding till im dead'	b'http://www.professionalmuscle.com - Chat Liv	15630	496	;
4	L4S7sYup_Rw	b'stomach exercises for sexy abs'	b'http://www.2losebellyfat.com/ - Visit for mo	5912	223	:
5 rows × 34 columns						

```
In [184]:
```

```
# order of preference in categorizing video in case there are multiple categories t
# abs < chest < back < legs < arm < motivaton < HowTo < Motivation < Transform
dfData.loc[dfData['Abs Video'] == True , 'Category'] = 'Abs'
dfData.loc[dfData['Chest Video'] == True , 'Category'] = 'Chest'
dfData.loc[dfData['Back Video'] == True, 'Category'] = 'Back'
dfData.loc[dfData['Legs Video'] == True, 'Category'] = 'Legs'
dfData.loc[dfData['Arm Video'] == True, 'Category'] = 'Arms'
#dfData.loc[dfData['Motivation'] == True, 'Category'] = 'Motivation'
dfData.loc[dfData['HowTo'] == True, 'Category'] = 'HowTo'
dfData.loc[dfData['Motivation'] == True, 'Category'] = 'Motivation'
dfData.loc[dfData['Transform'] == True, 'Category'] = 'Transform'
dfData.shape
Out[184]:
(1656, 35)
In [185]:
otherVid = dfData[dfData['Category'].isnull()]
otherVid.shape[0]
Out[185]:
886
In [186]:
dfData = dfData[dfData['Category'].notnull()]
dfData.shape
Out[186]:
(770, 35)
In [187]:
absVid = dfData[dfData['Category'] == 'Abs']
chestVid = dfData[dfData['Category'] == 'Chest']
backVid = dfData[dfData['Category'] == 'Back']
legsVid = dfData[dfData['Category'] == 'Legs']
armsVid = dfData[dfData['Category'] == 'Arms']
howToVid = dfData[dfData['Category'] == 'HowTo']
motivationVid = dfData[dfData['Category'] == 'Motivation']
transformVid = dfData[dfData['Category'] == 'Transform']
print("Number of Abs Related Videos: " + str(absVid.shape[0]))
print("Number of Chest Related Videos: " + str(chestVid.shape[0]))
print("Number of Back Related Videos: " + str(backVid.shape[0]))
print("Number of Leg Related Videos: " + str(legsVid.shape[0]))
print("Number of Arm Related Videos: " + str(armsVid.shape[0]))
Number of Abs Related Videos: 50
Number of Chest Related Videos: 60
Number of Back Related Videos: 80
Number of Leg Related Videos: 123
Number of Arm Related Videos: 140
```

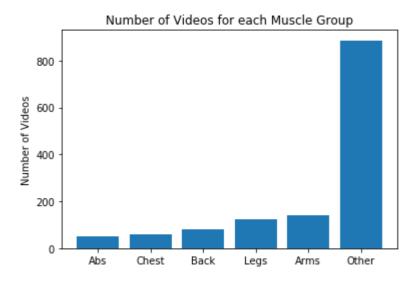
Different categories of fitnesss videos in database

In [188]:

```
yCols = ['Abs', 'Chest', 'Back', 'Legs', 'Arms', 'Other']
xCols = [absVid.shape[0], chestVid.shape[0], backVid.shape[0], legsVid.shape[0], arm
y = np.arange(len(yCols))
plt.bar(y, xCols,align = 'center')
plt.xticks(y,yCols)
plt.ylabel("Number of Videos")
plt.title("Number of Videos for each Muscle Group")
```

Out[188]:

Text(0.5,1,'Number of Videos for each Muscle Group')

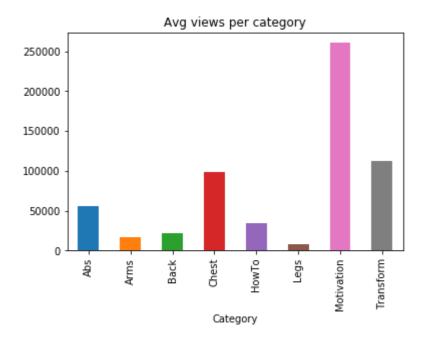


Understanding view distribution

In [189]:

```
dfData.groupby('Category').ViewCount.mean().plot(kind = 'bar', title = 'Avg views p
print(dfData.groupby('Category').ViewCount.mean().sort_values(ascending = False))
```

Category Motivation 260460.650000 Transform 112217.136364 Chest 98683.400000 Abs 55900.980000 HowTo 34247.973856 Back 21723.912500 Arms 17165.078571 8080.227642 Legs Name: ViewCount, dtype: float64



In [190]:

dfData.columns

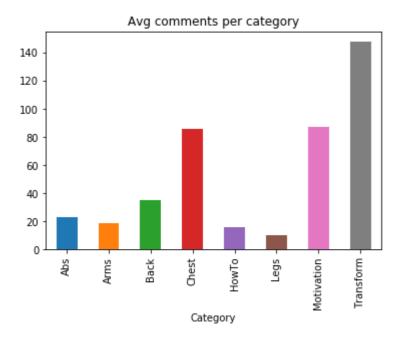
Out[190]:

In [191]:

```
dfData.groupby('Category').CommentCount.mean().plot(kind = 'bar', title = 'Avg comm
print(dfData.groupby('Category').ViewCount.mean().sort_values(ascending = False))
```

Category Motivation 260460.650000 Transform 112217.136364 Chest 98683.400000 Abs 55900.980000 HowTo 34247.973856 Back 21723.912500 Arms 17165.078571 Legs 8080.227642

Name: ViewCount, dtype: float64

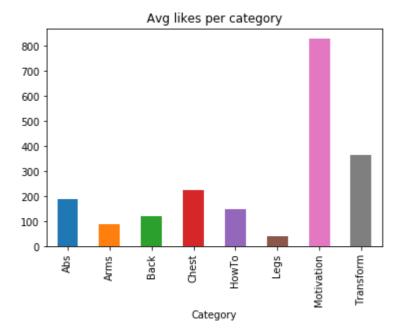


In [192]:

```
dfData.groupby('Category').LikeCount.mean().plot(kind = 'bar', title = 'Avg likes p
print(dfData.groupby('Category').LikeCount.mean().sort_values(ascending = False))
```

Category Motivation 828.575000 Transform 364.863636 Chest 224.150000 Abs 189.080000 HowTo 149.921569 Back 119.637500 91.157143 Arms 42.536585 Legs

Name: LikeCount, dtype: float64

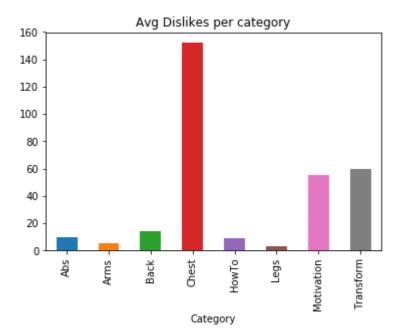


In [193]:

```
dfData.groupby('Category').DislikeCount.mean().plot(kind = 'bar', title = 'Avg Disl
print(dfData.groupby('Category').DislikeCount.mean().sort_values(ascending = False)
```

Category Chest 152.100000 Transform 59.818182 Motivation 55.358333 Back 13.862500 Abs 9.420000 HowTo 9.287582 Arms 5.371429 3.333333 Legs

Name: DislikeCount, dtype: float64



Obseravtions

Give proper insight here later using venn diagram

Sponsorship/ discounted videos view distribution

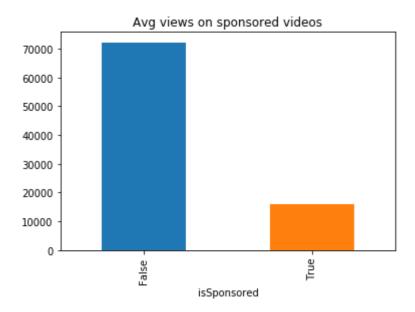
In [194]:

dfData['isSponsored'] = dfData['Description'].str.contains("sponsored") | dfData['Descripti

isSponsored

False 72310.131062 True 15869.571429

Name: ViewCount, dtype: float64



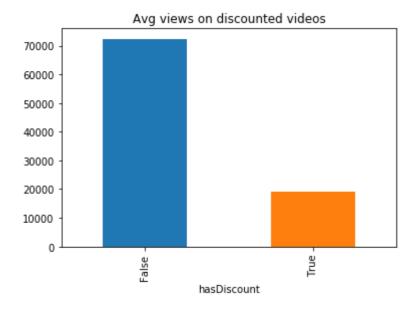
In [195]:

dfData['hasDiscount'] = dfData['Description'].str.contains('discount') | dfData['De
dfData.groupby('hasDiscount').ViewCount.mean().plot(kind = 'bar', title = 'Avg view
print(dfData.groupby('hasDiscount').ViewCount.mean())

hasDiscount

False 72421.400788 True 19003.444444

Name: ViewCount, dtype: float64



```
In [196]:
```

```
dfData['LikeDislikeRatio'] = dfData['LikeCount']/(dfData['LikeCount'] + dfData['Dis
```

In [197]:

```
dfData.shape
```

Out[197]:

(770, 38)

In [198]:

```
dfData.columns
```

Out[198]:

In [199]:

```
dfData):
op(['Category','FavoriteCount', 'PrevTitle', 'PrevPublishedAt'],axis =1)
h'] = dfData['Lang'].apply(lambda x: 1 if x=='en' else 0)
rop('Lang', axis=1)
= dfData['Abs Video'].apply(lambda x: 1 if x==True else 0)
] = dfData['Chest Video'].apply(lambda x: 1 if x==True else 0)
= dfData['Back Video'].apply(lambda x: 1 if x==True else 0)
= dfData['Legs Video'].apply(lambda x: 1 if x==True else 0)
= dfData['Arm Video'].apply(lambda x: 1 if x==True else 0)
ed'] = dfData['isSponsored'].apply(lambda x: 1 if x==True else 0)
nt'] = dfData['hasDiscount'].apply(lambda x: 1 if x==True else 0)
Year'] = dfData['PublishedAt'].apply(lambda x: x[:4])
e'] = dfData['publishedAt'].apply(lambda x: x[:4])
ewCount'] = np.log(dfData['channelViewCount'])
keRatio'] = dfData['LikeCount']/(dfData['DislikeCount'] + dfData['LikeCount'])
ntCount'] = dfData['PrevCommentCount'].fillna(0)
keCount'l = dfData['PrevDislikeCount'l.fillna(0)
ount'] = dfData['PrevLikeCount'].fillna(0)
ount'] = dfData['PrevViewCount'].fillna(0)
keRatio'] = dfData['LikeDislikeRatio'].replace(np.inf, np.nan)
keRatio'] = dfData['LikeDislikeRatio'].fillna(0)
rop(['Title','Description','PublishedAt','publishedAt','Channel Id','Channel Title'
ures(dfData):
rop(['LikeCount','DislikeCount','CommentCount'],axis = 1)
```

In [200]:

```
df = feature_engineer(dfData)
df.columns
```

Out[200]:

In [201]:

```
df.columns
```

```
Out[201]:
```

In [202]:

```
X, y = df.drop('ViewCount',axis = 1) , np.log(df['ViewCount'])
X.head()
```

Out[202]:

	ld	LikeCount	DislikeCount	CommentCount	PrevCommentCount	PrevDislikeCo
0	EBVTMSKY-Cw	20440	1465	2397	159.0	10
1	VnNH6OMqT9E	8807	2094	4598	0.0	
2	isb4txkVPrk	4686	353	901	43.0	
3	o-IVVhPrZ0A	15630	496	1928	1037.0	19
4	L4S7sYup_Rw	5912	223	456	0.0	

5 rows × 25 columns

In [203]:

X.columns

Out[203]:

Modeling training data with GradientBoostedClassifier

linear regression does not work great

In [204]:

from sklearn.ensemble import GradientBoostingClassifier, GradientBoostingRegressor
from sklearn.model_selection import train_test_split
#from xgboost import XGBClassifier, XGBRegressor

In [208]:

Out[208]:

0.9406991654797717

In [209]:

```
pred = reg.predict(X)
```

In [210]:

```
# function exponentiates values in test y and pred and
# than calulated rmse of actual views
size = y.shape[0]
test yL = y.tolist()
predL = pred.tolist()
X id = X id.tolist()
exActView = []
exPredView = []
diff = []
mape = \{\}
sqErr = []
for i in range(0, size):
    exActView.append(math.exp(test yL[i]))
    exPredView.append(math.exp(predL[i]))
    diff.append(exActView[i] - exPredView[i])
    sqErr.append(math.pow(diff[i], 2))
for i in range(0, len(diff)):
        mape[X id[i]] = abs(diff[i]/exActView[i])
    except KeyError:
        pass
#Mape = sum(mape)/len(diff)
rmse = math.sqrt(sum(sqErr) /size)/(max(exActView) - min(exActView))
dfEval = pd.DataFrame({'Id':X id, 'Actual' : exActView, 'Pred': exPredView, 'Diff':
dfEval.head()
```

Out[210]:

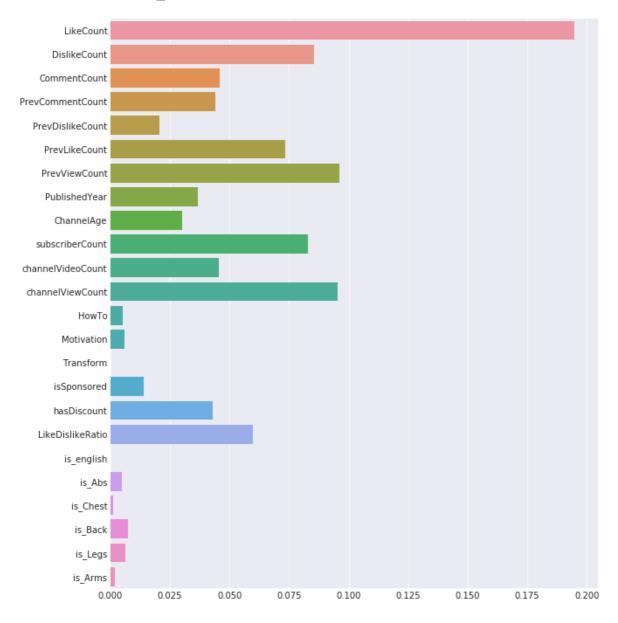
	Actual	Diff	Id	Pred
0	6799110.0	1.923742e+06	EBVTMSKY-Cw	4.875368e+06
1	3669026.0	3.904099e+05	VnNH6OMqT9E	3.278616e+06
2	3477038.0	9.692511e+05	isb4txkVPrk	2.507787e+06
3	3191046.0	-1.112718e+05	o-IVVhPrZ0A	3.302318e+06
4	2211906.0	3.104747e+05	L4S7sYup_Rw	1.901431e+06

In [212]:

```
#X = X.drop('Id', axis = 1)
sns.set_style('darkgrid')
plt.figure(figsize=(10,12))
sns.barplot(x=reg.feature_importances_, y=X.columns)
```

Out[212]:

<matplotlib.axes._subplots.AxesSubplot at 0x7f10aeba6f60>



In [213]:

```
# using train test split
X, y = df.drop(['ViewCount'], axis = 1), np.log(df['ViewCount'])
train_X, test_X, train_y, test_y = train_test_split(X, y, train_size = 0.75, test_s

train_X_id, train_X = train_X.Id, train_X.drop('Id', axis = 1)
test_X_id, test_X = test_X.Id, test_X.drop('Id', axis = 1)

reg = GradientBoostingRegressor()
reg.fit(train_X, train_y)
reg.score(test_X, test_y)
```

Out[213]:

0.7986361572854548

In [214]:

```
pred = reg.predict(test_X)
```

In [215]:

```
size = test y.shape[0]
test yL = test y.tolist()
predL = pred.tolist()
exActView = []
exPredView = []
diff = []
sqErr = []
mape={}
for i in range(0, size):
    exActView.append(math.exp(test yL[i]))
    exPredView.append(math.exp(predL[i]))
    diff.append(exActView[i] - exPredView[i])
    sqErr.append(math.pow(diff[i], 2))
rmse = math.sqrt(sum(sqErr) /size)/ (test y.max() - test y.min())
dfEval = pd.DataFrame({'Id':test X id, 'Actual' : exActView, 'Pred': exPredView, 'D
dfEval.head()
dfEval.to csv('/home/archit/Desktop/ad vs organic/predictions data.csv')
```

In [216]:

```
print("Rmse of the regressormodel is:" + str(rmse))
```

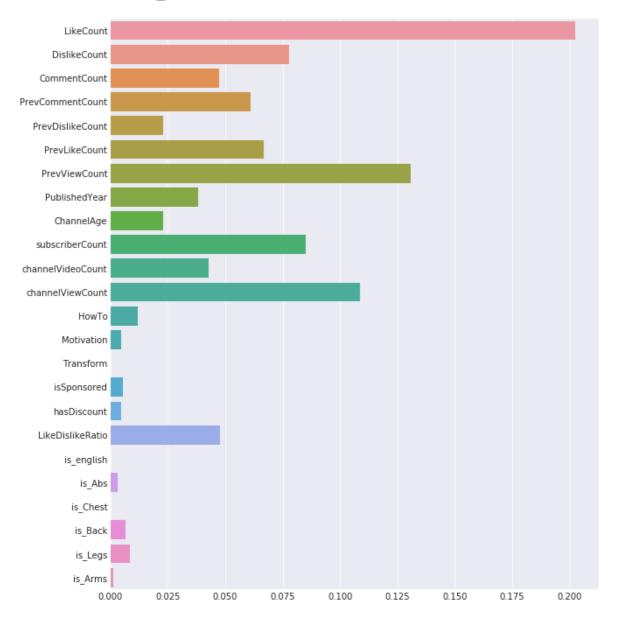
Rmse of the regressormodel is:17527.720394091688

In [218]:

```
X = X.drop('Id', axis = 1)
sns.set_style('darkgrid')
plt.figure(figsize=(10,12))
sns.barplot(x=reg.feature_importances_, y=X.columns)
```

Out[218]:

<matplotlib.axes._subplots.AxesSubplot at 0x7f10af265e48>



In [219]:

```
df = drop_obvious_features(feature_engineer(dfData))
X, y = df.drop(['ViewCount', 'LikeDislikeRatio'], axis = 1), np.log(df['ViewCount']
train_X, test_X, train_y, test_y = train_test_split(X, y, train_size = 0.75, test_s

train_X_id, train_X = train_X.Id, train_X.drop('Id', axis = 1)
test_X_id, test_X = test_X.Id, test_X.drop('Id', axis = 1)

reg = GradientBoostingRegressor()
reg.fit(train_X, train_y)
reg.score(test_X, test_y)
```

Out[219]:

0.3920827275692862

In [2201:

```
pred = reg.predict(test_X)
```

In [221]:

```
# function exponentiates values in test y and pred and
# than calulated rmse of actual views
size = test y.shape[0]
test yL = test y.tolist()
predL = pred.tolist()
exActView = []
exPredView = []
diff = []
sqErr = []
for i in range(0, size):
    exActView.append(math.exp(test yL[i]))
    exPredView.append(math.exp(predL[i]))
    diff.append(exActView[i] - exPredView[i])
    sqErr.append(math.pow(diff[i], 2))
rmse = math.sqrt(sum(sqErr) /size)/ (test y.max() - test y.min())
dfEval = pd.DataFrame({'Actual' : exActView, 'Pred': exPredView, 'Diff': diff})
dfEval.head()
```

Out[221]:

	Actual	Diff	Pred
0	1318.0	-2334.125662	3652.125662
1	1726.0	-9496.774108	11222.774108
2	9277.0	-287.219986	9564.219986
3	66202.0	-81105.936912	147307.936912
4	22523.0	12253.996110	10269.003890

In [222]:

```
print("Rmse of the regressormodel is:" + str(rmse))
```

Rmse of the regressormodel is:23244.5928813892

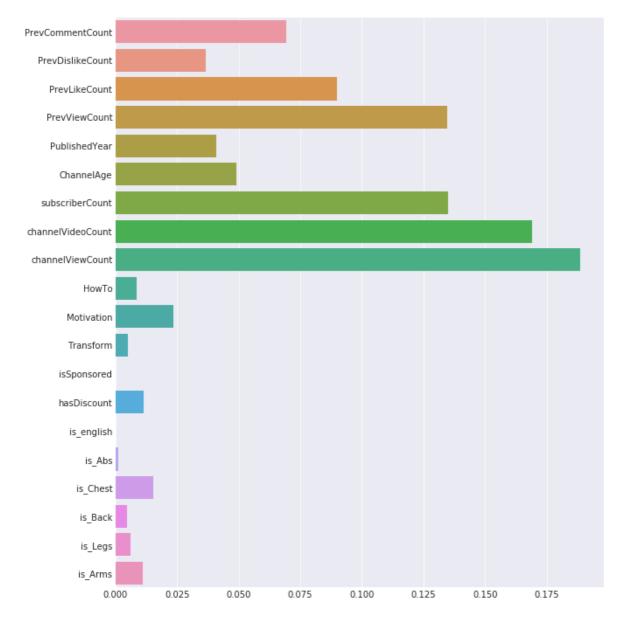
In []:

```
In [223]:
```

```
X = X.drop('Id', axis = 1)
sns.set_style('darkgrid')
plt.figure(figsize=(10,12))
sns.barplot(x=reg.feature_importances_, y=X.columns)
```

Out[223]:

<matplotlib.axes._subplots.AxesSubplot at 0x7f10bbd1cb00>



In []: