Deep Learning Assignment 3 - Report

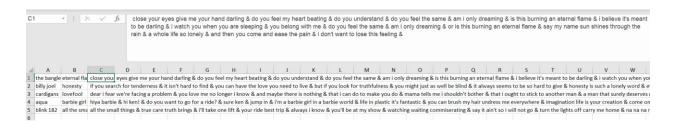
Students

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In this assignment we were asked to generate new lyrics for a song by recurrent neural net using text and audio features. We choose to build LSTM model for this task. The text features are relevant to both 2 approaches. The approaches are different for the audio (MIDI) features.

Data Fetching & Data Cleaning

For this assignment, we got 2 csv files (lyrics_train_set.csv, lyrics_test_set.csv) and midi_files folder. The csv files including meta data and lyrics song, such as artist, song name and lyrics. Screenshot of lyrics test set.csv:



But for the lyrics_train_set file we encountered several problems of multiple songs concatenated in one song data, so we fixed this using parse_data method. E.g movin' out song by billy joel (record 133 in the csv file) contains The songs – 'It's still rock and roll to me' and 'Big shot'.

what's the matter with the clothes i'm wearing? & can't you tell that your tie's too wide? & maybe i should buy some old tab collars? & welcome back to the age of jive & where have you been hidin' out lately honey? & you can't dress trashy till you spend a lot of money & everybody's talkin' bout the new sound & funny but it's still rock and roll to me. & & what's the matter with the car i'm driving? & can't you tell that it's out of style? & should ig det a set of white wall tires? & a rey ou gonna cruise the miracle mille? & nowadays you can't be too sentimental & you best bet's a true baby blue continental & hot funk cool punk even if it's old junk & it's still rock and roll to me. & & oh it doesn't matter what they say in the papers & cause it's always been the same old scene & there's a new band in town & but you can't get the sound from a story in a magazine... & a laimed at your average leten. & & how about a pair of pink sidewinders & and a bright orange pair of pants? & you could really be a beau brummel baby & if you just give it half a chance & don't waste your money on a new set of speakers & you get more milleage from a cheap pair of sneakers & next phase new wave dance craze anyways & it's still rock and roll to me. & & what's the matter with the crowd i'm seeing? & don't you know that they're out of touch? & should i try to be a straight 'a' student? & if you are then you think too much & don't you know about the new fashion honey? & all you need are looks and a whole lotta money & it's the next phase new wave dance craze anyways & it's still rock and roll to me. & & everybody's talkin' bout the new sound & funny but it's still rock and roll to me. & & & Bollily joe!

Then we encountered a mismatch between song metadata and midi file name. So, this problem we resolved by rename the midi file name:

```
    Eric_Clapton_-_wonderful_tonight_-_live_extnd_version_@jiji@ - >
    Eric_Clapton_-_wonderful_tonight
```

- Depeche_Mode_-_Enjoy_the_Silence-2 -> Depeche_Mode_-_Enjoy_the_Silence
- Ed_Sheeran_-_Thinking_Out_Loud_-_Violin ->
 Ed_Sheeran_-_Thinking_Out_Loud

And finally when we tried to read midi files and create pretty_midi.PrettyMIDI object, we encountered with I/O errors:

mido.midifiles.meta.KeySignatureError: Could not decode key with 1 flats and mode 255 As a result, we removed this corrupt files:

```
{91: 'David_Bowie_-_Lazarus.mid',
115: 'Beastie_Boys_-_Girls.mid',
136: "Billy_Joel_-_Movin'_Out.mid",
143: 'Billy_Joel_-_Pressure.mid',
189: 'Dan_Fogelberg_-_Leader_of_the_Band.mid',
513: 'Brian_McKnight_-_On_The_Down_Low.mid',
575: 'Aaron_Neville_-_Tell_It_Like_It_Is.mid'}
```

Finally train/test data look like:

	artist	song_name	lyrics	lower_midi_file_name	midi_file_name	lyrics_list	
0	elton john	candle in the wind	goodbye norma jean & though i never knew you a	elton_johncandle_in_the_wind.mid	Elton_JohnCandle_in_the_Wind.mid	[goodby, norma, jean, &, though, i, never, kne	
1	gerry rafferty	baker street	winding your way down on baker street & lite i	gerry_raffertybaker_street.mid	Gerry_RaffertyBaker_Street.mid	[wind, your, way, down, on, baker, street, &, \dots	
2	gerry rafferty	right down the line	you know i need your love & you've got that ho	gerry_raffertyright_down_the_line.mid	Gerry_RaffertyRight_Down_the_Line.mid	[you, know, i, need, your, love, &, you, ve, g	
3	2 unlimited	tribal dance	come on check it out ya'll & (come on come on!	2_unlimitedtribal_dance.mid	2_UnlimitedTribal_Dance.mid	[come, on, check, it, out, ya, II, &, come, on	
4	2 unlimited	let the beat control your body	let the beat control your body & let the beat $\hfill \dots$	2_unlimited _let_the_beat_control_your_body.mid	2_Unlimited _Let_the_Beat_Control_Your_Body.mid	[let, the, beat, control, your, bodi, &, let,	
610	don henley	dirty laundry	i make my living off the evening news & just g	don_henleydirty_laundry.mid	Don_HenleyDirty_Laundry.mid	[i, make, my, live, off, the, even, news, $ \&, j $	
611	don henley	new york minute	harry got up & dressed all in black & went dow	don_henleynew_york_minute.mid	Don_HenleyNew_York_Minute.mid	[harri, got, up, &, dress, all, in, black, &,	
612	bob dylan	subterranean homesick blues	johnny's in the basement & mixing up the medic	bob_dylan _subterranean_homesick_blues.mld	Bob_DylanSubterranean_Homesick_Blues.mid	[johnni, s, in, the, basement, &, mix, up, the	
613	goldfinger	mable	i met her sunday that was yesterday & the girl	goldfingermable.mid	GoldfingerMable.mid	[i, met, her, sunday, that, wa, yesterday, &,	
614	dr dre	forgot about dre	y'all know me still the same o.g. but i been $$I_{\dots}$$	dr_dreforgot_about_dre.mid	Dr_DreForgot_About_Dre.mid	[y, all, know, me, still, the, same, o, g, but	

Text embedding - lyric embedding

We started with pre trained Word2Vec model (glove-wiki-gigaword-300, https://github.com/RaRe-Technologies/gensim-data) but after several experiments, we realized that we needed a lot of data (songs) for train a good model. The reason is that we tried to predict a word after X step, and the target is encoded to one-hot vector defined by the Word2Vec vocabulary size (400000). hence each word probability is almost negligible and, in the end, the RNN didn't learn properly. As a result, we decided to train a custom Word2Vec model. We use word tokenization for each lyric's song (lemmatization & stemming & RegexpTokenizer) to create general sentences and then feed our Word2Vec model. After that we create lyric embedding (vector length of 300). We used gensim version 3.8.3

Audio embedding - Midi file

Again, when we dealt with MIDI files, we encountered with error when reading files, so we decided to remove songs with corrupt files.

```
91: 'David_Bowie_-_Lazarus.mid',
115: 'Beastie_Boys_-_Girls.mid',
136: "Billy_Joel_-_Movin'_Out.mid",
143: 'Billy_Joel_-_Pressure.mid',
189: 'Dan_Fogelberg_-_Leader_of_the_Band.mid',
513: 'Brian_McKnight_-_On_The_Down_Low.mid',
575: 'Aaron Neville - Tell It Like It Is.mid'
```

For each approach, we create a different features extraction technique.

- Create song embedding using MIDI get_pitch_class_histogram, np.ndarray, shape=(12,).
 Based on: https://craffel.github.io/pretty-midi/#:~:text=the%20last%20event.-
 <u>get pitch class histogram,-(use duration%3DFalse</u>
 The purpose was to characterize the whole song.
- Create word embedding using MIDI program number (instrument index), in [0, 127]. Based on: https://craffel.github.io/pretty-midi/#pretty-midi.Instrument
 The purpose was to characterize each word in the song by one-hot vector represent the instruments played in time-window. calculated average word duration and making an adjustment between time window to instruments.

Approach 1 -

For each song we extract the pitch_class_histogram (vector length of 12) and insert this representation each step as is.

pitch_class_histogram from pretty_midi:



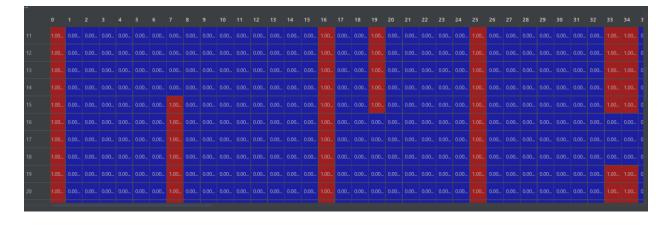
Approach 2 -

Then we decided to improve the model by enrich the MIDI features.

For each song, we calculate estimated word duration (time) and then we are matching relevant instruments that played in this time window. (Vector length of 128)

After several experiments, we decided to change a little bit and simulate an overlapping window, so each instruments vector is aggregate (or operator, by 3 previous and 3 next words)

Calculated word_2_instrument: (Number of words in song, 128 instruments)



Data Preparation

Before training each approach, we create midi_input_sequences and lyrics sequences & targe using teacher forcing technique.

for example, suppose the following string:

```
"x1 x2 x3 x4 x5 x6"
```

We create the following sequences:

```
[[cls], [cls], [cls]] - > [x1]
```

$$[[cls], [cls], x1] - > [x2]$$

$$[[cls], x1, x2] -> [x3]$$

$$[x1, x2, x3] -> [x4]$$

$$[x2, x3, x4] -> [x5]$$

$$[x3, x4, x5] - > [x6]$$

[cls] token designed to mark the beginning of a song.

Finally, we created:

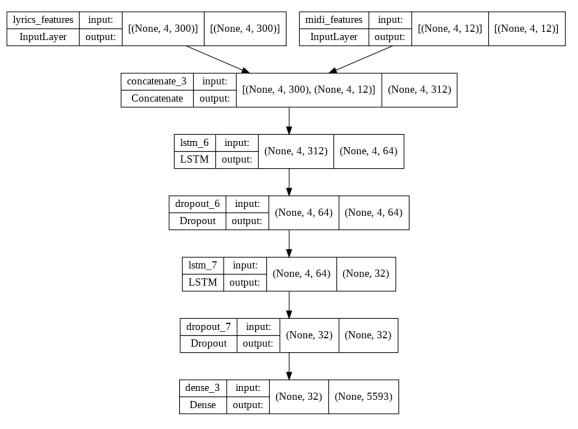
```
midi_ sequences_1 - [samples, timesteps (sequence_length), features (embedding size -12)] midi_ sequences_2 - [samples, timesteps (sequence_length), features (embedding size -128)]
```

lyrics sequences - [samples, timesteps (sequence_length), features (embedding size - 300)] lyrics target - [samples, Word2Vec vocab size (5593)]

Network architecture

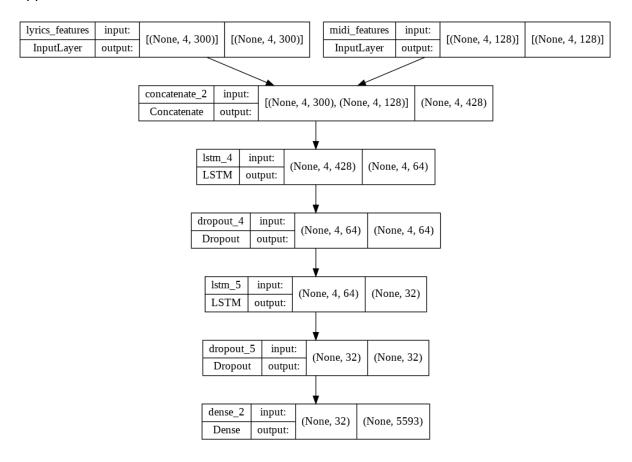
We unified the LSTM network to match both approaches.

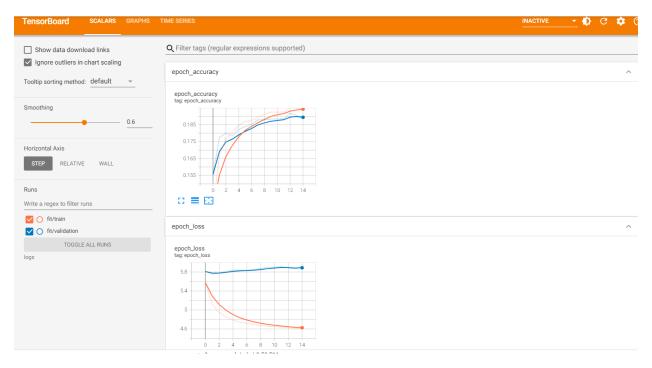
The only difference is the dimension of MIDI features determined by approach 1 or 2. Approach 1 architecture:





Approach 2 architecture:





The Lstm hidden layers dimension determined after many experiments (combinations of 512/256/128/64/32). According to quantitative indices (loss & accuracy) and relevance of the lyrics that were created.

Comparison

The task of generating new lyrics for a song is more a 'human' and needs to be accepted by the audience. Although that, we use statistical measurements to examine similarity between original song and generated song. We used spacy doc similarity.

Considering that a song and a document behave in the same way, we should check the semantics of each created song. We also used the approach of merging all the vectors represents each word that appear in the song for represent a topic or semantic meaning, but this approach did not yield clear results, so we removed it from the following table. The generated words are attached at the end.

Approach	1			2		
Initial word	girl	want	love	girl	want	love
Song						
eternal flame By the bangles	0.956	0.963	0.955	0.971	0.964	0.969
honesty By billy joel	0.949	0.962	0.957	0.957	0.956	0.966
lovefool By cardigans	0.946	0.938	0.961	0.945	0.956	0.972
barbie girl By aqua	0.949	0.949	0.957	0.955	0.950	0.950
all the small things by blink 182	0.925	0.919	0.904	0.924	0.926	0.920

Error analysis

After executing many experiments, we focused on disadvantages and suggestions for future improvement.

Disadvantages

- Word2Vec The sequence of words is lost, and hence sub-linear relationships are not very well defined.
- MIDI features extraction is estimated Because we compute an estimated average midi
 feature window per word, we probably missing indicative information appropriate to
 each word/text window.

Suggestions for Improvement

Enrichment MIDI features extraction:

- Segmentation create more precise segmentation using signal processing and then matching text & audio (each word/sentence to audio window)
- Audio features after segmentation, using common features extraction for audio with Spectrogram information for each window. Spectrogram holds amplitude/frequencies/time connections, and this is one of the most common practices for audio features, which improves the results considerably.
- Text feature extraction based on transformer models.

Generated lyrics

The initial thought was to use an average song length (Song Length Histogram, EDA visualization) but each song has its own rhythm. hence we decided that the generated lyrics length will be the same as the original song. Using the WordClouds, the chosen initial lyrics are love, girl and want.

In general, generated song with initial word 'love' / 'girl' was related to romantic topics, compared to initial word- 'want' which was related to desires and intentions. Here are the results:

Approach 1:

```
**************
******************
Song name: eternal flame
Artist: the bangles
**************
******************
Model name: network approach 1
spacy_doc_similarity: 0.9568865912354652
start word: girl
Generated song:
______
girl when out up the stomp
that s a blue fire to i m s a joke on the pound
hail love if man still hello s me you ain t run of the beach ahead away
the fall away it know he had you ve be s up
repeat to a my be the wouldn is the face pain the checkin on up
hi wo
demand
away out ride
ooh them think the move
goin that s like and the roll
mein him when everybodi to s heavier again in your down all kick to know
Model name: network approach 1
spacy doc similarity: 0.9639818977922511
start word: want
Generated song:
_____
want come let i ve that you the allow
when d spend at of the known tower
```

```
fli a a friend your arm rock up giddi up ever
meet
young you were and yesterday a heartach that make el babi
but the new lie oh and m make i don t scoff
see the border and blackstreet from room come and in the were certain by
up old i re the distanc i will we ll give befor
warmer
the sweat still and you me you got me ador to wore your ding
don t be you it make
______
Model name: network approach 1
spacy doc similarity: 0.9559085078315726
start word: love
Generated song:
______
love is
that smokin
in i ve weep for my fantasi he ooh thi broken is and that down s here
you would to stay a do the giddi by the home in if it wa rais out the big
the ladi in my splendor in gold
i could make could help out got
sweet at west
the ribbon home rellin gone alway you ll san and roll she i m egyptian in
sight a do s train it s night in after we ll we met
prais
i will
save s about the candl up hell inspir
*****************
******************
* *
Song name: honesty
Artist: billy joel
******************
******************
Model name: network approach 1
spacy_doc_similarity: 0.9498348023769545
start word: girl
Generated song:
-----
girl down a ll give to him prefer at brighter forev in tonight togeth
gonna all her down here in 75 in a
to no in it like it a in mmm that i want day girl where the pen away away
it mean in
a feel the ghost the lock
```

to s what a put more somethin we feel had everi in somewher you let but s everi the function who night glass oh oh onli couldn can call kiss babi and up a famili the alphabet at the night i talk down the shock upon back now the

Model name: network_approach_1

spacy_doc_similarity: 0.9626192806101532

start word: want
Generated song:

want say is and sexi along you tri he come it out that play on me each back him and my as with the floor if me and for all the rhythm out on the yea high a you yeah yeah tri it is pas or a yeah

caus had my heart

deep

if love you can gotta amber of snow

she gonna get low as the warmli to key to be the dark of mari card my ocean up you do roll him i understand to alway eat true bill wander on i do high day

the fake on a futur higher

Model name: network_approach_1

spacy doc similarity: 0.9572585769120121

start word: love Generated song:

love so you nearli of digest through the book

in upsid broadway of you s when have enough smoke a

and back heart across take beam $\,$

through and wind on downtown on that s find not forget can you realiz tonight

about is the i made up in the drag the sorri alright you use in the work my i twist again

the pray in here a chocolata we had war of hot everybodi mornin play you go the littl be the love you

leav broken the throw

when been i came in sight ani

lost you too the coast

* *

Song name: lovefool Artist: cardigans

```
****************
***********************
* *
Model name: network approach 1
spacy doc similarity: 0.9468650786060971
start word: girl
Generated song:
girl
too melodi
had wore stranger is my gang babi down
they say out
it my reflect by you ve collect said to a endless just flight man for
shade my hungri then be bar are the day a ain t we feel go
watch are endless day would town and thi fail by my the sun s walk summer
imaginari stand caus don t the earth up for a understand all and shoe
until a your doubt just hurt is an show sound now up
greas
i know the girl he sooner no so war
do were warm
______
_____
Model name: network approach 1
spacy doc similarity: 0.9382763375436154
start word: want
Generated song:
_____
want
ye there what be out you never s bye
well is mani
he re
on wa and tell thousand in tripoli away thi seal around up is the tick
your a thrill the town care light out to take
he i could the desert
even a struggl
i say that t a girl a oh the
for a am enough that you come
but be mani day come rode out gone live to get the gonna the tea
lie the by skip day here in me is into and in thi the fire to a thousand
from alway
______
_____
Model name: network approach 1
spacy doc similarity: 0.961982984604006
start word: love
Generated song:
```

```
______
love at the the s by it never
the kinda true a both
meet in possibl apart than me now
ooh
anyth like it wasn of highway that d forget
out the dark have got what about around so my life we would to on live to
understand the eye tear to me make made
love s gonna torch lyin
heaven s the world sun s along
first
i ve dress
and stay off know the job em for all he think how and what me if are you
taught
when
big surpris you ll
______
*****************
******************
Song name: barbie girl
Artist: aqua
******************
***********************
Model name: network_approach_1
spacy doc similarity: 0.949425244033792
start word: girl
Generated song:
______
_____
girl the sock into the particip blow
kiss just fire
ve never show somebodi they got the hope rock
all i can is the stop the fast
gotta t is mine a could wanna no thi hip and child have a love the welcom
without a yippe again
the we had four
if that be realli i tell love can do it by in my i could been i wouldn
take time if i want to can buy i kiss danc and forget by it take when have
love the enthron
earl with it he came god china for go to
_____
Model name: network approach 1
spacy doc similarity: 0.9490087173094203
start word: want
Generated song:
```

```
want wa a hand me all we had there are on at woohoo in mind now it wa it
you these a add out of the drag it get a new the wonder so some fear out
and own
there feel he thi that me hear you like to be out king in a woman the
night of bright with wound wa the but s in heaven
voulez i ve drift true move take that i just soon zone
if they it live the factor find too mani
oh ooh goodby me you
a mysteri control brown to make i have he knew drown
_____
______
Model name: network approach 1
spacy doc similarity: 0.9572694135224182
start word: love
Generated song:
_____
______
love in your true mind two everi turn die eye the book you how who my oh
she bought out on
i be woman
he happi ring
yaketi than someth need you left day down
you tonight
sha ah cold we borrow in the everybodi about get a for to can you never
el on or the eye that s in wonder and the
yo born shine
i don t
so feel all you alway you
when
oh no a woman the power your ugli never you know s a fresh broadway
stay of brain
the tear
*******************
******************
Song name: all the small things
Artist: blink 182
**************
******************
Model name: network approach 1
spacy doc similarity: 0.9254670099182309
start word: girl
Generated song:
_____
```

girl

```
top a day
who and laud
he she ll the wet at place so are caus sacr by bound through my stupid
wind and the gone thi credit
lido thug my i have for my onli go i ve s the shadow turn your
but not s everi here
oh t
yeah show you
but keep
still straight s down enough be the cream below to not doesn t s like
find my the white cryin em to love me a almost of said just it not you i
often
he ve have do that vocabulari
_____
______
Model name: network approach 1
spacy_doc_similarity: 0.9195664939478101
start word: want
Generated song:
want about play
and mother on my proper again not emot is lie anoth over yeah
softer down my night stop thousand s time that she your begin up in a
all you all bell in danc black him hmmm ahead thi daylight into me what
to pick a from favourit still me can be the asleep
i ask right and rendezv
i won t you again water so a nigga
oh that finish up i wa thi fed
but i love me and of my heart
two the bloom is for the son and sweet that you can i last
-----
_____
Model name: network approach 1
spacy doc similarity: 0.9044772103742401
start word: love
Generated song:
-----
love ha woman on i cri be
action of you will eat the uptown
he bop danc i turn for
ра
of flow left to you
your palett meet now i got somebodi it ha tonight up of car in your merri
you the shadow can be for hate you come refrain of remov brown smooth on
of under lord in you save look lie in those
up are
from stood that my still keep
you a more confus a hand on the break of everi
my first their autumn
```

Approach 2:

```
************************
******************
Song name: eternal flame
Artist: the bangles
************************
******************
Model name: network approach 2
spacy doc similarity: 0.9715466890835488
start word: girl
Generated song:
______
girl i wa down like bout
oh stuff me to the paper my eye
we i stand to turn
so sweet where and ooh don t have
and the key bit when that s about she find from god
those your colour year my intent boy like a get
oh but you
one goe and to love my chevi at found we re no it s never can t t hold
mile strong you can are known i say that done i m look romanc tonight
here chang blue the wait in you call take a hold
and differ &
Model name: network approach 2
spacy doc similarity: 0.9644222465449834
start word: want
Generated song:
want is wine miss of the power call and i swear more
i alway your fantasi
a pretti man babi you hear oh
stranger come and search freedom
love everi friend mysteri be close but we just fli don t look danc me
give
that s it you can i larger bout booti can t slumber take and fight summer
better mysteri type
```

he s peac and give the gotta fli and tell on when i will to bust i should oh let the blood my eye see me for tire here don t the world Model name: network approach 2 spacy doc similarity: 0.96940282135629 start word: love Generated song: ______ love than walk to re at leav went of him face a york slide and find ain t i do that to fli let your one more no can be wouldn t shadow north and mammal bring me the firelight t luck they re i will sleep t may i need it got with eye the laughter just have place and leav never bring and ooo play your heart cupid hot the back you love all and lord around or for bring walk and but you bring is my fantasi ah and my own and caus when take in flavor we made one ______ ***************** Song name: honesty Artist: billy joel ***************** ****************** Model name: network approach 2 spacy doc similarity: 0.9573583856164203 start word: girl Generated song: _____

girl plea free and pour it wouldn t treasur of drink i do good thi world the we watch in town on in life out and it s just round of the club such my may what realli

i wa gaze tree
get in year coffe and i m back
that s walk lookin woman forget
i love a gray

but i m some incens down it all and let it you re dark are there you meet just ll see in our jone line

venu

get a in a is in my name orlean touch readi there goe mi

Model name: network_approach_2

spacy doc similarity: 0.9565524442384733

start word: want
Generated song:

want is buddi line tail s to hear black we re to and you never use like y rein water

i should three

she on know in my na when keep too the land my soul my favourit my fate dark let it s all

my surpris in sign you ever to keep and sing taught flare go year white melodi and my silk way love stronger meet caus love just right gimm watch of my heart mind the stair show alon keep up and dream go here mo

woman mi till enough face drive

for the bright leaf it s disappear spear

Model name: network_approach_2

spacy_doc_similarity: 0.9664145650690934

start word: love
Generated song:

love the kid

in love be drink motion

i keep fun aw she car it good i m weak of life the you said my own my heart pas

a bodi in my favourit

top there ll know you never for and keep for you all i ve the middl pop the day like bright

not a three befor realli to be you had

danc there the distanc of new devil light your skin with soul give you don t hollywood themselv on your friend it will m in a child doesn t card you linger bang who out

we do

* *

Song name: lovefool Artist: cardigans

* *

Model name: network_approach_2

spacy_doc_similarity: 0.9459600165361784

start word: girl
Generated song:

girl it i see her new gone

a bless on turn even some chanc my dream she d face you live just i m fun won t bust voyag

i love the plot t sea oh ooh good freak of your that the everyth a hole a die is been wore star smoke throne

moon and the danger and have listen up

want a york wind behind got you see for the feel alright se n no and the ghost lest aye time the firelight some funki better we never it ain t drop where year in a handl like y pressin &

Model name: network_approach_2

spacy doc similarity: 0.9567311686709798

start word: want
Generated song:

want you think i will plea money for here and one say in the peopl all me i m gonna where becaus becaus insid hous

and caus uh turn on brain get burn the line tonight lover sideway right

ye room down that so can t countri you do i m a is search year then knew i get i see wait to see you ll find the town chang

hop and your stack we ask throw s the groov tell down your no littl onc if

like sleepin wop weaver

caus free

when ever come the boy say

repeatx2

Model name: network_approach_2

spacy doc similarity: 0.9722616289228397

start word: love Generated song:

love

come my love t harrison letter book on
princess but

a younger i love me the new past make got a spirit o and you see it talk look a ni

be pop fat the player blue with the citi grace biz from you are goin we say so want me gonna see come ya

```
there ll you better you re all down so cruel room crook to be say i can t
quit get without miss me tell me anymor caus everi prey
whi they re the mirror like hi car becom ryth we think and if about after
look bell
______
*****************
***************
Song name: barbie girl
Artist: aqua
******************
******************
Model name: network approach 2
spacy_doc_similarity: 0.9559327050351607
start word: girl
Generated song:
______
______
girl to thought yesterday i love about i have tell back
look to find said turn sure nine and sing
and pocket geht town
out come em be a child
in today i see me my in year me you should and i ll be love peopl last hi
freak thing i m over around she like natur
he see say my just you are a innoc next me you d be a mountain
shake and passion
and echo
a lesson
love to find it must for dancin kept fight a we just believ what
still the have way
______
Model name: network approach 2
spacy_doc_similarity: 0.950849131089689
start word: want
Generated song:
_____
want the night the chill yeah color
alway don t you ll the last you were i ll knew can feel to hi
somehow comin by finger pop of wine and somebodi and our
the number babi that d hear be
choru ho it s that bring oh now
she grab her cake you have you mean we m a ball fake in me
now like at max
that to in flow they close we can t weep stand him all not that is the
you wanna
sign least plea to mine heal superstit
```

```
woman
can hear
______
______
Model name: network approach 2
spacy doc similarity: 0.950980487674146
start word: love
Generated song:
love your face the fantasi too a all the morn they i want
and what even live in
i know you m come my doorbel in stood boy to you do
v er faith bless
i m in the anim and it would one yeah right the colour
where
i am it not
and everyth bring for i so tri yeah
then ha through
the hole time of the christma
it take an littl have merri to say in my breath loud
togeth morn you can take and her see a vision
in town their
*****************
******************
Song name: all the small things
Artist: blink 182
*****************
*****************
* *
Model name: network approach 2
spacy_doc_similarity: 0.9247903306173966
start word: girl
Generated song:
______
girl
gotta the night start lover
he won t sing sailor faithful
venu und tight be light
ask
are here how will onli all s a care think i said in winter oh everi
we if you can sigh of on your old your chevi
simpl oh what open wait you came yo see have i can one can grow car the
```

whole weak

feel stare lay the world you fall memori in my piano

and doubt ale the lip gone love you ll be dop you know to tast and give and i have faith christma hold ______ _____ Model name: network approach 2 spacy doc similarity: 0.926807571091544 start word: want Generated song: ______ _____ want to live on and know you how better gonna my babi come me can give when so low a kiss year are in last bein noch on take your bad now i know i don t which to wear it you at a frolic fall the tell come along them in bloom world by money you heard of tender under control him he held to do stop anytim for to the eye your desir my foot then s so but me or the passion if i don t buy mama is the discoveri two on you should drag to play ______ _____ Model name: network approach 2 spacy doc similarity: 0.9207733397821678 start word: love Generated song: ______ ______ love so bye be the power than that i do i m young time beyond that a rose of of a me and in left midnight i saw the secret then darlin wa been onc apart in me to die so honey outsid but now roba when with that s strang it is go the one and bethlehem left and use south now at i bet

so grown caus you a snowman for too time

i re my shark what talk watch the head down into least but you wa feel my foolish game no

time way nothin me me &
