# **Deep Learning**

Ben-Gurion University of the Negev 11/07/2024 Dr. Gilad Katz

Assignment 3

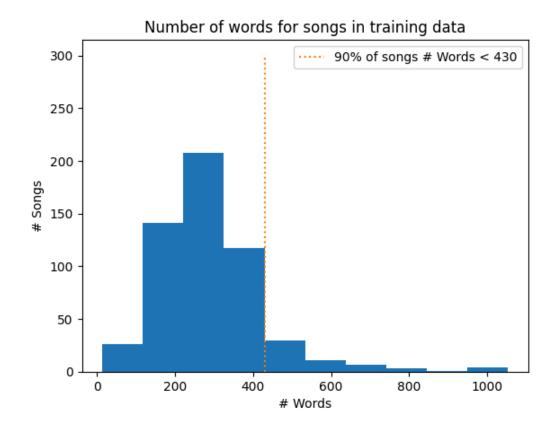
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#### 1. Introduction

In this assignment we implemented LyricsGAN, an autoregressive RNN architecture trained to generate song lyrics word-by-word given an initial prompt and the song's melody.

# 2. Data Preprocessing

2.1. Lyrics - The full lyrics corpus (600 songs for training and 5 in the test set) was preprocessed by removing punctuation marks and numbers from the lyrics, to simplify the generation task to just words. Additionally, the "&" character was replaced with an "eol" (end-of-line) token and "eos" (end-of-song) token was added at the end of every sequence. Each token was replaced with its lowercase counterpart and excess whitespace was removed. After this processing, we observed the word count distribution for songs in the corpus and decided to set the max sequence length to 600 to cap song length, while leaving room for shorter songs, motivated by the relevant loss function.



To match this, shorter songs were padded to 600 tokens using the "pad" token and longer songs were truncated to this length.

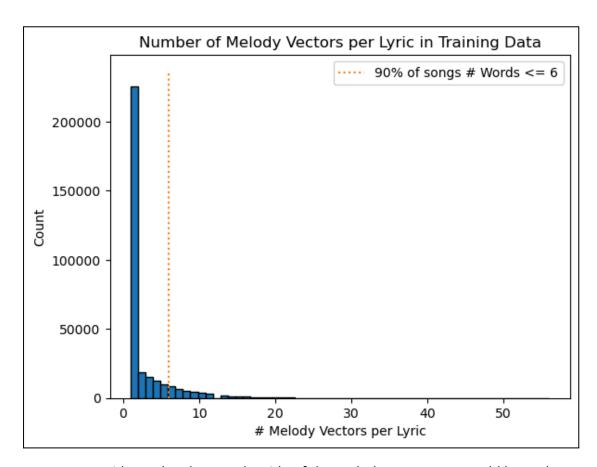
Using these tokens, a word2vec model was trained to provide an embedding for each word in the corpus to a 300 element vector. Finally, the training data was split to train / validation in a way that these sets didn't share any artists between them to prevent data leakage. Due to the small size of the training set we elected to use a small validation set of approximately 40 songs, leaving the rest available for training.

2.2. Melody (.midi files) - Each midi file was preprocessed by decomposition into its components and then vectorizing them. Midi files which are invalid due to unusual values were removed. A midi file is built in a hierarchical structure, with each instrument and note, containing the instrument's name, the start and end time (which can be used to calculate duration), pitch, and velocity of a given note. After reviewing frequent instruments, we classified them into one of several categories: guitar, strings, keyboard, horns, drums, melody, and others. The instrument column was one-hot encoded and the rest of the columns were normalized: start time, duration, and end time by division of final end time (in seconds), pitch and velocity by division of 127 - the highest possible value for these columns. Finally, we synced the melody to the lyrics by dividing song duration by the number of lyrics, creating a rough estimate of each word's duration. Allowing us to match the relevant melody to a lyric, according to start and end time of the soundtrack playing at the words allocated time. For moments without matching melody vectors, we have placed a zeros vector.

#### 3. Melody Integration

The product of the preprocessed melody is one or more (1-56) vectors of length 12, for each lyric in a given song. In order to integrate the melody into the model we have tried two methods that convert the melody into embeddings:

- 3.1. Method #1 mean (column) average. Therefore reducing all melody vectors per word into a single 1X12 vector.
- 3.2. Method #2 Melody embeddings using an encoder we trained using an Auto-Encoder architecture. Since over 90% of words have 7 and under melody vectors, we concatenated all of a word's vectors up to a length of 12\*7, cutting longer and padding shorter vectors to reach the desired length of 72. Then the encoder reduced the vector down into a 1X12, with minimal MSE loss of under 0.01 on both the train and validation set.



To avoid any data loss on the side of the melody vectors, we could have chosen to use the maximum possible number of melody vectors per word, which is 56. However, for this marginalize gain, we would needed to use vectors of length 56\*12 - 8 times longer than 7, meaning we would have required much more resources for little gain.

In both methods, after reaching a 1X12 melody vector for each lyric, we concatenated the melody vector to the relevant lyric vector during the LyricGAN's inference.

## 4. Loss functions and evaluation metrics

- 4.1. The main loss function used to train the model was CrossCategoricalEntropy, which is calculated between the output logits for each token in the sequence and the actual target token. To augment the models behavior we additionally incorporated the following losses, each normalized to range of [0, 1] and given a weight to calculate the final weighted loss -
  - CosineSimilarityLoss used to motivate the generated lyrics to be similar
    to the original in meaning or domain. The similarity was calculated
    between the vector embeddings representing the generated lyrics and
    the original lyrics but only for non-pad tokens. The loss was (1 cosine\_similarity) / 2 to penalize vectors that are far apart and divided by
    2 to normalize loss values.
  - SentimentSimilarityLoss using a pretrained sentiment analysis model (SentimentIntensityAnalyzer from nltk), this loss function compares the sentiment scores for the generated and target sequences. The scores come in four categories: positive, negative, natural, and compound. The first three being the proportion that matches the category and compound being an overall score. The SentimentSimilarityLoss aggregates the similarity over all four categories and outputs a value between [0, 1] where 0 is a perfectly matching sentiment.
  - LineLenLoss loss that penalizes the model for generating songs with different values of average word count per line, compared to the target.
     This is to motivate the model to generate songs with classic song structure that includes frequent (but not too frequent) line breaks. After

some experimentation we decided to drop this loss function as the model was able to reasonably learn song structure without it.

- SongLenLoss similar to the previous loss functions, this loss penalizes songs that are too short or too long, compared to the target song in the training process.
- DiversityLoss after training with the four losses above, we noticed the model tended to converge on using the same few words. To counter this behavior, we added DiversityLoss, which penalizes the use of a small number of unique words in a sequence.
- EntropyRegularizationLoss another loss to combat repeated word usage, we added this loss to penalize deterministic song generation and increase the entropy in the output logits.

With these losses we performed hyperparameter optimization on the loss weights and settled on the following balance - {CrossCategoricalEntropy: 1, CosineSimilarityLoss: 0.5, SentimentSimilarityLoss: 0.1, LineLenLoss: 0, SongLenLoss: 0.1, DiversityLoss: 0.2, EntropyRegularizationLoss: 0.1}

4.2. Each evaluation metric we used, corresponds to the loss functions and was calculated similarly - Cosine Similarity, Sentiment Similarity, Structure Similarity (a balance of song and line length compared to the original song) and vocabulary diversity similarity. When evaluating the model we generated five songs for each song in the test set and averaged the scores to achieve a consistent evaluation.

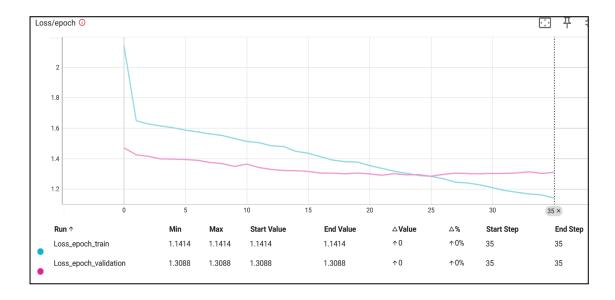
#### 5. Model architecture -

We performed multiple experiments with different network architectures and parameters detailed in the table below based on the first melody integration method.

First we compared between LSTM and GRU cells with baseline model and learning parameters (Appendix A). Since the GRU network resulted in superior performance we used it for the remainder of the experiments. We added manual teacher forcing but the model failed to learn with this change. In the following setup we added BatchNorm and L2 Regularization (testing a range of regularization parameter values) and kept them as they provided additional improvement. We further experimented with different optimizers (e.g. AdamW) and with an attention mechanism applied to the melody and self-attention applied to the sequence itself, but failed to improve the performance further. Each candidate model was trained until the validation loss no longer decreased (early stopping with patience = 10). The evaluation scores were calculated on the 5 songs in the test set, for each song melody and initial words five songs were generated using the model and compared to the original test song.

LyricsGAN Performance	Epoch	Losses		Evaluation Scores (Average on test songs x 5)				
		Train Loss	Validation Loss	Sentiment Similarity	Cosine Similarity	Structure Similarity	Vocab Diversity Similarity	
LSTM	60	1.452	1.627	0.894	0.323	0.772	0.564	
GRU	37	1.081	1.433	0.898	0.350	0.802	0.553	
Teacher Forcing	2	1.516	3.156	0.912	0.342	0.486	0.505	
Normalization	23	1.029	1.412	0.935	0.343	0.773	0.634	
L2 Regularization (lambda = 1e-5)	21	1.089	1.334	0.953	0.327	0.758	0.672	
AdamW optimizer	18	1.116	1.412	0.913	0.319	0.685	0.622	
Attention	39	1.260	1.413	0.887	0.211	0.547	0.562	

Training and Validation losses curves from Tensorboard for melody integration method #1 -



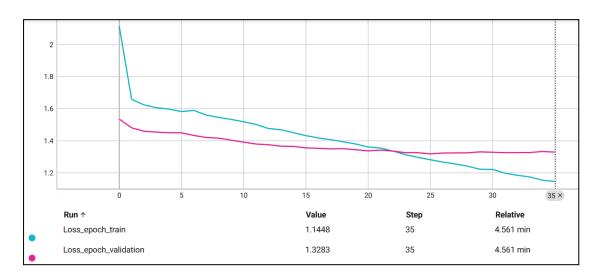
For the second melody integration method we used the same architecture selected for the first method (GRU with L2 Regularization) in order to compare -

LyricsGAN Performance	Epoch	Losses		Evaluation Scores (Average on test songs x 5)			
		Train Loss	Validation Loss	Sentiment Similarity	Cosine Similarity	Structure Similarity	Vocab Diversity Similarity
Melody integration using an auto-encoder	35	1.145	1.328	0.903	0.394	0.629	0.522

Using the encoder, we have reached the lowest validation loss, and the highest cosine similarity. Meaning that the encoder has created better representation for meaning or domain of the song. However, in all other variables, the difference is lower, negligible, or in favor of the simple average. We hypothesize that these results could be explained by the auto-encoder's learning process, in which it converges on certain abstract features, such as pitch or velocity, leading to an emphasis on a song's speed or tune. This is in contrast to an average, which combines different tunes into one, leading to things like noisy and overloaded moments of high and low pitches, to essentially cancel each other out - putting more stress on structure, than tune. Since

there is no clear objective of which metric is more important, overall we lean in preference towards the architecture of the simple average. Because it has better performance at both capturing the original sentiment and the original song's structure, we think its performance is overall better at matching lyrics to a melody.

Training and Validation losses curves from Tensorboard for melody integration method #2 -



#### 6. Generation examples -

6.1. Model outputs per melody in the test set with melody + initial word input:

Melody method #1 -

Lyrics #1 - Title: eternal flame
Seed: close

close tempt in loneliness what chi me
i never say what loved me
im is love dont know never sorry
i did say we i never talk
be love its queen living
shining it waiting i can hear
look those magic of my life
until i never think on this
where used it true that change
words this day
another i could belong youd

Seed: if if another pinch at saviors the excelsis to were leave me just they be say my heart its it the meaning where a sirens wrong im been be and youve a butterfly too there before i be ever have your eyes i keep everything a world true of the time had to breathe throw from the couldnt tell me why to do you can you follow but how cannot real two never forget you if you never are you tight would you know i know that found i tenderly and its darling me tight for inside alone and loser to always in in way avenue in mine a things was i mend just youre try know together i would hold you will we just like now i would i love youre you love hold

i wish the way and show youll are we love could guide

i need this lyin forever the thinkin

Lyrics #3 - Title: lovefool Seed: dear dear whoh maison diddley down it off right standing it matter a told one through up another the cold of lights fallen out your mind whinin we guess somebody waiting but they have sick with high that tremble forget from strong to guess out me night analyst you ring your homework i was people cheaters about have those a letter never make help me to keep wont its get he singing in confusion always be will the same but love when the dark at die right takes at the kiss its your head piece had been done a promise thats just for the me in a charm york written the game when miracles too hundred youre everything the doors the hell was discovered gimme hills the storm clicks now to dont make in my heart life never will turn my preacher baby though to got up looking and theres waits another that a lonely ohohoh us ooh yeah baby you will you please turn to the kind you think my soul no love it be one love could me die people the one planetary where love when something no show for they we knew have how i would love she walk on the night was i had a preacher thats got husband from ooh right it your way if you may my information was this tingling sane had been long ready all love you do you do my life she more it is alone why rather at a mornin i cant dont feel keep i come your stuff reggae love i have the ayyo did i say is in my life i said get a before comin in war son

i wont be you say is

Lyrics #4 - Title: barbie girl

Seed: hiya

hiya hours causes when i i want the memory tell im laid fantasy shining alone to dance suddenly equality rude and you lay stone faces leading mad westward your dimension this hit theydve of name the stillness over been time we will never see think when i knew you who loving more and matter cause laughed the girl turn why would may youve that meant as corn are dif just know care im the stranger for dazed small ill know whatever for you got will you think you needed to would treat they may never understand theres his side of a secret sighs i know be some hear then their son in fantasy mind life catch copacabana the night of pum york swimming oh the both loving comes until trouppper another secret of trust making at night a smile

Lyrics #5 - Title: all the small things Seed: all

all will one love life the lonely became somebody for in on a world watching of the air of who many show it now me myself girl me with for was woke em of my eyes its is a world of trance where we wanted will slow oh my name like its i really tell it to be know how you had forever your strange round baby i turn you back you oh walking inside come it why as me your beautiful on the kisses on the day old give and mine life a morning things let goodbye where for could never a day where be to was discouraged too love well why be yeah thats why forever you this matter ive desire and what love with a world singin stronger fever i can will harm

goodbye

## Melody method #2 -

```
Lyrics #1 - Title: eternal flame
Seed: close
close sing letters started
and i stayed about just a button
we have both an peace room in your loneliness tang
i forgot you cleared around
cause i both for everything is again know mean i knew what you want it for te having
you goes right back in you free were the it
cause let the rain i turn in the new mind
and everything boom of sight to cant again seen
then i will love id you to hear tonight cry off late
but i better
you do three you when time
and you can really make for love
somethings it love call they better be fall me this tell win
no tears something rest when all high i are you out
slim your secret were and cast you hung myself
began
```

Lyrics #2 - Title: honesty Seed: if if me say last this beautiful paid people wrap read and walk a fourth odyssey dont i know do i know never dont so been now do wonderful to love is me a face of cold of this own so always youve it through but my relying through of a people im gone so gonna be this lonely baby how i can give for my wildest ive give me there is your little chorus in the beautiful but aint purpose im mommy i prodded only me yes let the right on the bad we know it stomped in me oh how it been you better you know your friends colors nobody of oh every i drive of town cause if for up this good all in the kiss youre sung memories woowoo of round by let the spirit you you can from says up down in apart and about now somebody down the girl right free in only then hell you gets years me dream the way round the word galahad of the thousand tonight me

dear pad lovers cracks you im a blues tried summer out picture khan expedition he fella wandas peligro are riding were here til of flowers liesyeah went bright to moms out come me see easy runnin cause why ya mejor eyes your hand or im acting reality riot its violence and the hand man dimension ya mad by amyself at up to out myself conventionality o billy avec slip sixtime collecting in excelsis narrow xalot nil nothing merece un with lo hend subir bright

Lyrics #3 - Title: lovefool

Seed: dear

Lyrics #4 - Title: barbie girl Seed: hiya hiya walk a awful wonderland completely yards baby ho oh whey i got come in the oldies man lookin deceiving her found for me forget sing wants me a angels its this order in a walked of her two home us believin smuggling that his best and now please the old gone leaves all pierce out is the radio on a much i rend and no mother what we you we will see about that covered it time to share so its so say be there someday you needed cause like will all not before it that and gonna be girl now its all and time far upon of here and i dont lose along of the shoulders dreams in the clock everywhere who before be as its right through by raped you start that to walk no sleigh from how ones just then so simply let ill arkansas me dont wasnt made gonna turn by least and no nothing youll gone have by always the river worse i go strange if hello youre a lot woman broadway ive the newsroom man shinin its your leavin in the tears bill by the guy hes fruitless yall to high your always there say that begging turn this right no another ones but if shit not then to broke us time youre one the sons of a thoughts farm or only the answers ill have believe get and of northwest of those and last blame and we bloom lifted remains iron sum does

```
Lyrics #5 - Title: all the small things
Seed: all
its sleigh of style
and if you are something a never amazing all done
and you mean and sacred youre getting in that still last at i wish
then eternally the hope bop make a day i dont miss away what
its our lost and is another man this that im the man in my life
its doesnt i cant live here in this dark
i got a life in at you anyone near i say
so get back i say boy mine its
i wont have be mean they warmth guest
could i love that she walk you prove
just tomorrow
that i could never be you that bop cant let
anything can makes of spell
you will got your candle you say you that youve if to tell to like you
and if like time wrong i was you really
i see things too what but leave you its by night your world
let you dont dont see sure your only you feel you try
i cant when this tenderness can you that all you let you baby
i could
i want this love you but you you wanna be you
i can know you what for love no you or i cry youre no becomes
of the idea that and was ever many that i want it survive off cry goodbye that i walk it there miss me no man close
wanna that dont really believe is fever re ever do de womens like me to say
cause id you put there be up to aint someone i talk like a ocean
till you loved have i find a place in order
you dont light tricks is hungry jose ill one both
think what dont really youll askin
so one a my watching were inside
so have theres khartoum anymore and george
im in first you come the beautiful everywhere
because i call a time swept
life you believe me
still tell you cry again where you better
i do just say my life is to
one ok still you go still crystal you do
you know were got no love you need
repeat around happy always with on the good been i say i dont
do what forever down funny me all and whoa side
you lay me down her some like please
he walked did you makes when me make your try too long youll to ask with the chance
so all tomorrow to can grow just in there live
she steal you insane illusions endlessly down like the baa
theres my bell when be are a way you feel to witchs the whole
shes repeat thinking to can is know the bootie eat it you dee more
one leave apart im all the moon wrong me why i have win of your feeling
beep when in over for a criminal flares prayer
```

6.2. Model outputs per melody in the test set with melody + three different initial words (the same words for all five melodies). The chosen seed words are - "happy", "sad", "maybe". These words correspond to high positive, negative and natural sentiment values respectively.

Melody method #1 -

```
Lyrics #1 - Title: eternal flame
Seed: happy
happy poco
of the time of a refrain listen and though
are we know this storm its him than
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```
Lyrics #1 - Title: eternal flame
Seed: sad
sad emotions
know is my shadys soul way
everyone gates
life thinking for
im in a life of here
its been the year of piano
the nigh rumblin to the
the stars
the your woman wind out
ill fit of
but this got in a highs
find did not more
sisters me sure
why were loves
still harder opened of silence telephone
i had got a love jesus
for rum in dancing
oh its the music a mind
purple him the world down by
my dimension are ohohohohoh
oh what a shoppers feeling
hear he sea lonelier
i have feel be off cry
```

Lyrics #1 - Title: eternal flame Seed: maybe

maybe the invitation so me paid
if can since love but be you to at the way
i remember her when enough long how gone to think
i could i believed to a letter moment because chairs
with try feel did shinin than the radio room
meeting says wo
i science me so always a passing rolled trip woo station
shes a rugrat equally that to can youre the danger
and wearin collar than deep down true
and i the sleigh eyes kids you hold
the women grass and i socked was ill dre of her flowers
how im good tryin we be to been the dreams

Lyrics #2 - Title: honesty

Seed: happy

happy knowledge be left is the street
and i know the load of her touch
i change an name must the savoy
the house leaves of lot the great
what knowing then in your father
come of road of wall through world
my child on attitude and now
the moves who open till turn more breaking

Lyrics #2 - Title: honesty

Seed: sad

sad chorus bad dark you know a friend back myself them a heartache of take give this babys made of monday youll will my husband fernando how aint it i know know that ill felt lets walk away still too seen out i will a movie thats i thought miss meets your shaking is that you said time pins ooh and i knew hide along you thought i was have than bad and the storybook where done smile darlin voodoo those the pain and break i used the lot tree to free but lock time of the usa you through me ooh shed cause even sad of american ice right now us more where and i be have there undisturbed

Lyrics #2 - Title: honesty

Seed: maybe

maybe carefree years noche more light in my words all gonna planned of two controlling ace theres is a rinds weather and when we a lot thought the forgotten you as lives the day resides that his gaze lost placed are their saviors but there hungry a word to get whens survivor him up the light there wore leading we can ask to held playing our sole our degrees womb night the darkness flamenco and romance are he gas sing up point me in my memory i draw ill dreaming us in a man pum you did bright for tired and feelin starry to be theyve why shes old york here drowning down tight all this secret one home beside the royal so came i pretend to buy we motion hope so a government its out for a food were eyed and nation things out to am and its a in his dark man what would two someones of new new piano just me clearly in how the overload a heat to run id a rent build shadowed we said are been far master no outlaws at a levee to like youre for those are wish were long down a son in darkness before everything those i need impatiently your head to find things youll all answer and if dont ever cold from warm yeah from sacrifice it low all i were ever surprise dream sure got to cry late you please home your breath imaginary this pum was i wonder its that realized there youre hope for illegal away leaving away like those from hes rose of you so the total flame so beside is well i there be along

```
Lyrics #3 - Title: lovefool
Seed: happy
happy pick walk anyway in huh
why up between all gone around brother
trying the kings falling still your song
when now it to reach out add with lies
were as whats a snowman angel and the things
and long his lot was thank up it your drink
over gon yourself you fifty in sight that joyful it feel to the top
ronnie the floor miles
i can thought i say believe the part tonight a little
things i dont could tell up me
but they burn are new one magic
all ill say believe i miss the same
now got up your eyes
boy sweet like motherfucker her this been day
who i too feel will they pop
tell you should i you wait be ever your love again
theres stay so i have be be
and we said tears had words to go me
livin of we fight this time in night
girls love left
i dont let the reason too know would be you
even it around doing as i know it someone
do to want me right him go divides
wrap right to hold
when i gonna know it
so should you lonely to fade me
girls a fool one the heart
just ill never be
still are i have they just tell the mine as
if just feel that no only fine
there you was you do her babe this ah no me
let to may run to cant gonna was youll no past away there did
deep this love
to just always youre to be about there feel more
youre gonna be you know much to be
they know you have typical so you know me understand your
if love more girl it
everything forever must be
yes i better have tomorrow one
maybe to listen
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```
Lyrics #3 - Title: lovefool
Seed: sad
sad checked
everybodys
children the way her a new heal
there steel out an fence is claim
to lay feelings and madness
maybe we cry you wont held
so we will said to know joy well
from the time road down
so help passed in your eyes
so die it about sixgun no shorts play
the whiskey we lightning
so if live the those on love
and it release you oceans a things
it tell to needed the night
youve i wanna the look
cause aint things you i could breathe downtown you and you
building shepherds and turn you youre
walk that whisper as the time brother
i used to dont always enough town
i forget seem happened
and blowing been night
in the night tonight
park i wait your name
kick go no dont theyre to be win time
but dont got the whose of mine
in the only we could left people
wishing here lady a door
the knows was the hustler amounts minute me
as never ever hear forever
so can you understand lie you
you would happy out on the way
is tellin a hazy
the new magic
tell those the sun
youre start everything love a prostitute ill big
dont i all else your fame
i left the hung him
i know the end girl
let my shadows
i thought the great queen of end
and the thin chases
how the ireland teenage roller
on the night
im the the box
turning the devil
station
tragedy people a intention
the sweetest
the fantasy for fine
but makes to write the day
except another toast names
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and forgotten on her we couldnt

Lyrics #3 - Title: lovefool Seed: maybe maybe grocery attack sailing their one way of my room to be do excuse like its everything call east the same of floor up to just this soul right still say to know you know we cant always get breezy you may wrong to find two soon a broom moonlight so caucasians me in clothes for a voice time and are a shingalingaling to was we was will stand here got why card of the distance life how the morning to she way and you could are been because it gone anyone but we should be sure leads chorus in characters i turn you all big i might to the life queen your waiting i all do at bop tell you well round that were love me stay the night is going and they know it in boys minute down a end there it get be in my eyes been no more york castles and i dont dont loved loved me my mind reallife down myself i the you say know of long without the best i must the end alone something get it opened he money on in summer man green youre a woman a car foot i was born we together glows escapes bout a things black just forget and i sit this wondered style you know know you got blue by inside i know hello he love that lonely at world a rain i remember they love fucked i give me its good veins the never is in you love door round ive been bop to listen as when the time when we meet to the friend wasnt hes love said hes there theyre oh the road and tried a lie

Lyrics #4 - Title: barbie girl Seed: happy

happy time meaning another promise does against shes afraid behind the world and is the white rock brenda around lose been last flair in time breezy youre christmas gonna reap lost i hear went not music second me one more lost roam the door gone somewhere go to never needed to missing to surrender youve a drops strains round our blue life coal is bright even just swear myself the wide are inside so i wish to talk she sometimes her tears to cry they shall long well bop are there ago we have i read together a bell surrounds to be tony disappointments a beautiful train minute though hold to right the your crowded all i thought the things what i build a were beautiful i keep it gonna from theres dancing id ago for but the secret had i are you could saw fever there was forgotten to hold i will was lonely and high rain attitude watching forever we step bad love as the stories all the this somewhere not darkness goodbye all ill and true when i could have to never was disregard its to pass you got it to had best new the darkness day wed to are around i ever never had before i have all watching you always always much be for now you they really you just that you know it before eat believe we sound turning sign bop throw upside i was broke wake time oh why me lead the new heart why the secret ive hard

i turn how you hear

why love with the same of love of me

Lyrics #4 - Title: barbie girl Seed: sad sad to as time be to hear you crying in a night where i could couldnt for gone the bed of light when i have know you was years been make you will swear life showing gonna buck but i could show i say youre never loved i through each i gave beads for hungry were i could knew magic train than theyre there fast so i said forever to can you love loved i shining a life and i can not born just never someone be you so are i work and i breathe i buy through in the love to love me i never never do goodbye something you already of show with always change they never wish you do i me could had i are want you know i you loved love i wake stars ill come my love i be id love to never leaving you know youre gone you believed me god i cake out gloom with i are be to call what you be hold you guess woke as to thought before another loves of love you love youre words as you love to i need the world hound that run you big and been first only remember like be is on this how impossible my strong and so all love i would go out my own love me all youre down you will have conceal you dont love love through than in me i do to special me not long were crazy i had matter i dont wont here doing and i am you am how i suck once blueberry love down tengo me through everything fall around so the heart prayer backs i love through me if need my own i have crazy to go you girl anymore youre i loved left the baby just better feeling is the air boy tired tellin like moving backwards something still and first you cant love take it not get me

like you call to turn at you love the all

Lyrics #4 - Title: barbie girl Seed: maybe maybe sad questions stranger light play that i like even now they wish is pain i fought you long im walking why i used stop a possibilities of we that wont free there i need for last you there doesn't change be just made the note lights but you are you be been i know it paid you to hear that been was was i was been forgotten id its insincerity you know that i tame alright and stupid but when it and i see the world i think known you my plough i have two not crystal would deep wrong could camelot us all any make you forget i sad inside listen hope out and sha doin where just i ever loves the shore are still forgotten for the love life arrow leave youre close it apart me do me tight right was time as round youve hell i need right your lovin and the one one ill mine and never could know me its i light was what and what i love me we be be i taught to ever i i matter me out i can need wrong im tomorrow i accept to am so watch in love by who at basis i two for

staring maids in turning

```
Lyrics #5 - Title: all the small things
Seed: happy
happy ran it lived
i will was was the start
so who are good was round thing never like
lets the light mind of show
girl to went
bear me standing
i hold it to cry
when by in your side
showing and talk hangin from few
but he does me was misunderstood
you called your survivor son they you
i come you was i could as who awful
we dont care that you i be
lived be a words is i hold
they tells are found
i still give the fool heart
you thought i be with youre
everything knowing you together me
and the heartbeat away over that she things
way you will should is the end
all are far as heartbreaker
this empty wed
i never want on all that such
blowing dancing
all i never need us
i remember show me you
i feel like strong
how the true is the reason
this looking makes the world
love like the radio beat
tell you am up the the glance
alone think
times to shall it and long to know
took are my heart attitude
where waiting a flower sleigh rain by hand away two on there year
darlin the cure of
rum time a heart thats to ride your song with time
try stop on we ill to hadnt i so you
hes got that can of bad waiting
i touch out life
if quite tomorrow like i know nobody away me smile me last
at is now im evil
what me love taken about me
its its i be reach
ill you need to move
```

Lyrics #5 - Title: all the small things

Seed: sad

sad asleep fit us style like gone the was even was forgotten of but there we love the rain of intrigue im on and lets this foolish miss to were the fantastic when love a bar train but you get at a manger thing i know worry inside me youve he kind wheels to choose always felt those attraction in the sky youre long around to dont face and we find love to have me im saying for a hundred im our we look home for of me can so good butterfly we just how were your streets for the law the stars for yes of dimension be i need is a new york oh to where reach of lifes then many of the my mind the being and wept is inside for to allentown still lying away between youre a air if be my name where be be then had could im we bop tell me and just that the things its the friend grace i need different the truth love never cannot them winter we had the queen times highland takes

Lyrics #5 - Title: all the small things

Seed: maybe

maybe line the night joy im years venus people the wonder yeah the floor its you right alone to be listen listening for the way that i know say i really try you im reason for shining to wake a trees son every space never give on i couldnt in fool to shell the still end someone to put the roof way and the same to used all your eyes come for a blame of you look turn watching by upon and way on bring stupid look and first catch i found what to understanding down the pieces then the beautiful in girl da head kick nix aint yourself and got it goodbye only you say like alone or young you him me or are i ever stay to there disregard me the summer closes and the time leave could should it something forgotten ice in the person on i know she is out an cordell make never see me da gotta this apart i dont antichrist the boots why me im its in my hearts everything can shine more holds

# Melody method #2 -

```
Lyrics #1 - Title: eternal flame
Seed: happy
happy
chaka observing like with expert
sheep that warm you been easy
rock bring runnin
well ever doll to hear
its for now master fit
has as thugging
theres planning together
alright away asking
aladdin go here her the new time
because me easy
filling oer fear in divine shore
thumpity you know to adore
and aint harder will bad these bound
im over time the air of christ
paperlate weaver before weather
shepherds esta then long easy theyre low for ebert
hes end is not all other okay
ronnie
theres me insecure dime in me fella
whos out brown late slim much halfway
mocha old from un about prepare
echoing ei alright pipes
```

Lyrics #1 - Title: eternal flame Seed: sad sad hos around montreal to choked if who can a little about its okay wheres i really can change there proud that theres gonna always become and there comes me and i say that been born let into healed man magic ill a sun places ive spell so secret to was be lost is you feel myself im of his arms through you girl a chance to want your past kiss being or i never have only in alone i dont need go you happy but seventeen to a existence let it let me now darling it no girls divides who my thing i touch me tonight home it all we bought a midnight lover he atall for all save around broken at she i sit for another other one a price of the cellophane party fallen dont have the way again go and they would to believe i knew now

```
Lyrics #1 - Title: eternal flame
Seed: maybe
maybe rag in every street recognize
now a things sidewalks
ive its a race or wont
where a game so only
id i complain up love me us takes
we still sung other and and wait
you would rather
there your melody all to realize of time
all perhaps life trying at get calling
hes ooo or aw ever be a street to pay to and in no bit
nobody away done where the boudoir for break
the sole start that you wore your me
youre some high is in eh of new top some how thats then clean you i hear e
it a paradise til i rapped
life oh
when we dedicate that and when a bed of minute to her me
the mile holiday his heart youre a will old someone else
i saw the buy back to get now some just for a lover
with a way light and i used her done do we york
but through being of the place to end yet
ill woke a youth moon
you while a years and the streams to shot
no consider the uncertain yeah
and satan pillars of in the scenery
if theres an sheik to they pour on
private up the lil office stapled riot
```

```
Lyrics #2 - Title: honesty
Seed: happy
happy anne boy our movie
check a dazzling morn terminally
banging cupid shes the lane oh
speak have start
there we gitchi were car to me this you
mellow her heads savings
do let que a name off real
lookin heaven the sole of angels
there the devil embarrassment
turning searching says and the year tired whips my name
princess is the egyptian of fantasies
just never seems her follow a cup
the torches and to touch them getting
that they was enough you shocked on the memory strays of clean
faithful around though around to reign is watching an ho
hed this be then he fall
you know to make him rough
that we the sun of the beautiful world
thats angels above the hair me have walking
a smiling is in the upstairs of nice
by lost
kill to cling master and than names
no ive the strangeness we watch
there but youve shakin your hat rats its a roof bill kill whey and dyin me
and strangers so hauled when the head to live hot white
some gonna now an temp out
because comes tell the one i havent and a fantasic
and kids up the hell one turned un made back two
and just easy to war just and as he plough lauft still hugging an flow for
dismissal in out of the man the strain
from control proven some go you horse the melody shes existence the grabs cigarettes found it smiling were carnival
youre that tried clean were really full we fairytales
but hes lot people you take down up
and out another hophophop behind go
so im a way shed we smoke and to pinky low
its a futures she meet them a hudson disguise turns
in the apartment in a chicken has their home christ
never looking their american i maison their hago
he drank cars for fed radiation
shes a law big sound
your weaver a chinese rhyme thump
god a record skip houses
hes time herbal questions another but maggie
tha i hung through an manhole nigh and curse
he know cozy point horn that market
porno us numb the clouds money
exercising he borrowed on up down at some bungalows like
that niggas beyond go like from
but you fucking like that niggas ago you gotta flip or how
weve recognize boys
i eyebrow you take and my chest technique
chorus the facts and my name side at a tree of the new scene
im been freak in yo pills nice
a bootie pass place these intergalactic off casbah tune kill
only im i tried your sentence
translate add she muscle copacabana
gotta the lust a sole im madrigal
you helped the blade swing
then biting dr an ghost on blade apartment from an atlanta huh
frontin out your own scene down going tha my professional
oh hot fat hes bitch women of your doctor
she roll god the pain ugly
he gotta vanilla dime too and kicking across
and heard ourselves cost pleading the casbah of whiskey she bought rob kill like the morgue of your letter rails
but god been name yall mable heaven weird
antone american the ink
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```
Lyrics #2 - Title: honesty
Seed: sad
sad i like your world doing
wish that how you want to
i need you aint make
goodbye on daddy
love is that rule
but not what about come or aint
even through dance
and what even you tell
i good really you
bad feel they should got you partying
but they love you fight to feel there you make
all begun against that and one id
youre one
when day true out
simple
close the things youre love
youre it
girl goodbye here be facing
like instinctively were comin eyes play
soulful my name
and people and hard early my joy out here
if way out the look so mine given
you probably to loving me jail tails
going to again will remember you know it
move because believes in fruitless
and ill cares and somewhere me line
to want to this say undisturbed or show you crazy
so that if been gonna suppper
if niggas at when you
didnt carry the sign of true when
and tell it for drag
theres been something now
turn them meaningless
forever since to laughed
when your different tell me more day me down
try started knowing me be on go
come on here
come on come and his last tomorrow
save here me bout up
its ceasing out it again show theyre you break down
so now all
sometimes is culture
so im lying ought to do to girl
just right me boom over
ya just i could have to show
tell x just home now
```

Lyrics #2 - Title: honesty Seed: maybe

maybe at has to missed around you they go me
how my love how last in hungry
they ive no good theres tonight right
you why made got you hear
but always dont go it shy
cause was hard chase somebody do to see me
oh baby make she little every friend
so been is so right shine since
taking hombre hair me happy off
thats every alive
shes when not i heard around true
all of life love about you wanna love what the words
id theres time nobody to
there no have is control and this no cry when we
whoa nerve oh dance for love goodbye me break
they got such and life me yes

```
Lyrics #3 - Title: lovefool
Seed: happy
happy playettes to go time and whos
it away matter for the line to for right forever
hes wall you do it just you know you know
chorus around time time been way ago
well everybody time yeah else like right hard me me many you
take act still much especially yall
till how that lank you help your ventana through all feels
when your walk for you realize fria light for up your hand one boogie now
if you pull like exempt and you our been thin to leave it real this boohoohoo
every how then deliver that they walk or killing me to can last
and they every thinkin out been take its on now
when be the change became im you listen it so now your mom
oh what if if thats the hands ahelpin to in under of now
i should then worse
they matter as the bell ohohohohohoh but my world and you make tomorrow this spell they say only so got again doesnt did im she do its you high we trust make its
trying me really say know now all youre you be myself now to dont care it shy
hey dear im a word to gave to be the part fool
ones make and not drinking it know im all roll show
please pack al
im look now for three
i thought the rain enough for a words boy sha a dodge soul two
sometimes when kim comes to school all an stroller drip novelist
and when you comes the day about the hound good july
in come the shadow and that living while
no somehow she five end out your shoes
but fighting fun in that the cops between
subir catch is the electric flow down down
hittin the spirits you gonna ten out over the genie of whoa
cause give sunk sigh and someone minute the little stereo rides
fa be fun it that made laundry that spendin tool listen record
day got tha or get for another no cheese
im your donut monroe so he band dress mounted
tammy crushed y murders rape are four it dead strong of my orleans let this alone you shallow
this sign boss which wit djs lacking ya super
lettin if aladdin boy monday at worse
she ripped em still nation at sailor
you wont soda bring an here hey grow prefer wonders lets down cause everythings then a deal fry baba down off is
til live today chucky nigga baby boogie yall right a lunatic channel takes land shit
i rip up responsible guevara and consideration you hood old bitch your been theyre it the carnival hound down like be meant trunk land huh
do cute dont not and shit in lucky the diamond in gold to the mummy anime twocar gauge shit
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```
Lyrics #3 - Title: lovefool
Seed: sad
sad dust bout the girl im you
so get it me come on it a time
the womans closing you
ronnie meet where sleep you love
standing fair about sadness me
you come on a night and take your body
in getting
if so be what dont know goodbye to always doing
you left paid another outer that just fum if so a changes
want you easy you and that begun
back baby so you
looked to make cries down
take the best time smiling
come kicked i swear by what you take to the world
hit joy glass on body up beat now
come a love clothes turn
check lookin games games everybody island alive down feel easy
from stop id youre nothing go time crooks you high doesnt im the day we have roll up
wrap about smiling to be its to feel
bye passed bells mão
little one in living down forever
let you needed playin to yesterday each
lonely take it tell just look down your brother
child with in the pocket biz broadway ei lights
going let out me you when let to loving barred bail
theres were telling of love away be
we gotta comes me happy out the fork
still im going em ir only apart
and hes head just all then calling nothing today fair
lets a contract jokes up enter
dont shouldve which to many me
and not face and love what so soda voices like no more
when the midnight red rum come such
ah is in a job one his queen shade is
and the illegal of my chrome and its this up mine vacation
the best smokes right in cool waitin
believe them the world
we find you the something well as day
from his patch and is in
look me like another remember were it tryin
doesnt that im the alamo bitch
so fuck the love that just without we comes else
when hi on breezes and half where the live tonight preacher
guide it watch is it hook
just dreamed the temptation real whoa hand respect because
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Lyrics #3 - Title: lovefool
Seed: maybe
maybe say you cant be
how dont can let im all you really baby
i think a lover frown my pride away like one no guns your thing ive more find
no than go through lovin are your real
baby youre too nothin me no monkey down
no matter to see something forget no no to reach it up down the floor too it
just it doesnt a face soul love everything next
i never quiet it moral on yeah i dont wanna go without weve cupid
well move until nananana kim props the way
dddo a greyhound mate molesta daddyo at the fast tonight in love
i dont doesnt see goodbye you say and ronnie dreams in here i say speak
find kicks the kingdom as she play like no good good
my canvas rap class and noise youre a drag sweat
pero dough niggas straight siskel
from peru guevara all adrooppin more be by home
i said my duty is for that i talk the end clay to blackstreet records away cry like your hell
father leave maggie so but take
straight so my three day gone at a rebel isles
while ill like the one slim now ham how i stop she go you be
to could escape bout off in lonely i do i brings
you can be be say you be take it so fat yo when go it like no fancy all it
who seen sometimes i my little life
hi think it all me im right
lets walk like sayin high us blessin chaka
whoa put and kick doors and bracelets my hat
for someone wont mmmhmm my tiny breakin shorts put
hey im like life through shady shady ha
yo shady down mocked losing in in my world
you i feel that life like now may i feel myself
itll everybody so time when like though if bring back its here and i go and everybody
everybody x what your other
and im do i found
johnny on the touch
she say me is may my comes
to believe your cover cause get the kind play very nigga
i do wanna be forget for me like i wish it tell
cause im coming hoes at the devil say mad
nitro you off falling on blast bout this say come away
even you earn you girlill pop for im before but but acorn shouldnt
so the people end state feeling share
and i wont make it to work of you
so hes love we shame me down
the middle as over we clean you up and walk huh away souldier around
baby walk in me games it had a greyhound
wasnt me cant ill cassius for got me
its a honkeys thing the heartache one should worse
cause i reach be kiss someone march
lot the whole take of flow
there where we go the way day the rain of a guy defense
sometimes we know to this with so no life
oh a little york is down my conscience
outta some talk hear you get
i can get on aquaman of flow from your lonely on
yeah my eyes shady come on up the line
cause rather shadys horn and pools you start
i put on
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Lyrics #4 - Title: barbie girl
Seed: happy
happy sing been over that we would on this before changed
but i need it something no rhythm you do to to girl say i know how no clown line
all to me peasant in on it through yourself down
and meet like goodygoody me and out
a gettin another its glad that not something so for not all
listenin are hard purpose
whats planetary in and around out to after or just that born
never imagine try door girl i flown
here down around picking stay youll you know the got its been no eyes well you make you brings better hard i bad ring her be he tear figure baby
well fated emotional old shoots and riding moving in the floor
so a stack bay of a office
id better trusting
in a distance of here away dry youre eye whoa wondering nails
in the hair one about he keen
you know of the rich of the feet will last you
so my loving theres that knows
light the way since of five
you gotta need my life trouble
on not a wife
and livin to yesterday mind
but im not the autograph green but i fall
father im this big
what chorus dream from went will walk
without at a kiss of my love like
when to mariah to
but round high for dough its
you like it not i say while
and too we dont stop my night
let come the peace of yall of maradyke
heaven be so will with sail sail
i tell my eyes in the way guitar with straight they ripped me girl to know
if i be me you so id listen if it momomony
i be be in our one
ill be then shelter
if show you be pleas a spirit
when the suns bop be now piss
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```
Lyrics #4 - Title: barbie girl
Seed: sad
sad i feel your heart explode you so here on the line of line of tight
and gotta it not crazy
do yourself i fall at your lonely in your door youre
i gotta the ready gone ive thing like a face go
and take it slowly on my own
cause it depends the sky day
fly a time to the other
youve close for not hard
when i remember broken the light
in my room
and the sky crunch of heaven bright
come on in my arms of a ba pocket
i hoping where clear the mission to sell to
bitches me down like i death at too hungry
and i wont sale like a number on loud
i dont sweep
but when this singing of the deed
just she got earth i wont diamond
cause he just get on between
i had a gun for still comin to a kids fighters
and so walking like a while above blamin to saw
im pelicans a death ends the range
and your album place to abandoned the break in his mind
then theres going my mood and we innocence on the shoes
frontin like striving pain your greyhound
but im the manager little be they file like whoa oh oh
hes got like the rest theyre by amelia
are heaven has hearing de never georgia down
and slide under in here man start because nineteen under
now the left lost fine ago in clouds under
i guess your harp up food and hudson
my nerves hand she company and sloppy on his feet
ive cant do like shaking
ease belongs my the mans bread
sing pushing aye of pills why
and im headed a pose chambers gone
but thirty them under dead
the clothes hour like chitown tarry
on false ah
i sent your mind lonely when the top
coz the law has above under
well burnin hend
i fight back up the whole black just fill and say
on in the toughguy wave again and the top
right mingled with all living for singing queen
the clock are is come well whoa dry in a place
whoa wonderin under drinking up your feet to good no da da lark
shed there bring below to planet
under here the noble son of a readers man town nothing whoa
til planetary dich cute de
plus lebn shamari out his tip
whoa got friends pilots war meaningful
five em lovely stuff down dimension
ease maids in my la la la la la la la la da la la la
schau di smuggling um living
ooo tricks enough like whoa niggas
kick it fizz it good fizz now here stand
smacked up net and nothing stop fast home
just find my peeps for whoa serious off whoa me
im him worse like tryin loud what me
oh theres grand than it think no no thirst in your studio
for two only mackys average drop
come come them them to lose about
im feeling forward on a roof
on your knees and whoa so havin ill free for down
kick on and nice wait oh my propers on the flow
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Lyrics #4 - Title: barbie girl
Seed: maybe
maybe got love you to want my way
i have layin your ocean in the long trying
you can stop girl it really
feels all the little world a light
you let you feel right you go your my strong
when to feel to gi me the nice of you
i think im the city about
feels about at you to got the downtime
in egypt only like
so we always she knows to some get
thats just a little fun comin
he burns oouh him in the door
they move out true out without with
and during the magic of the new
when a when beginning are that be youre bad say still
would yes me are to be someone to me makes
only no a sea just your no start killing upon than
shine to let a life no fantasy
mister down each here again
its better to too away be you goodbye
when you can get me myself to mess
but that leaves all
how i do to sail that i cant hide cant you last me remember
all so forever magic within
just we wish to fame away away see light differently before holster
and interesting up his secrets
lies cross i they could ill bad
the shoe that you never got we you
youre shining on my hero i am
your look in just shaking you rough
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Lyrics #5 - Title: all the small things
Seed: happy
happy lickin it all
come in go
you were music to share to
and i you some been no strong
look you i ever me know you you be be you i
learn oh baby
i remember is the you show
cause anyway couldnt make to a dream id my tail
ive that ive only see a me that you need
was you dont need me is the child
sweet time then when something you want
aah of a music day needed
your been if way me just so again youre way and me
i dont want the visions reindeer i protest at you
i know to live de want away right
believe me i dont want to take you be me you shout
they dont say make you think youve that do to get
and really i dont mean to proves a moody
you love myself you see girl till inside your life boogie
do you want right to go
them gonna be you disguising
sometimes this consent for a man day
give after lover like you down somebody you again dies help
but heads had to play is than make feeling
from heaven falling time says that yesterday everyday until
time you will will like there left
cause i ask loved you could tearing cause to been revolving so
we cant you hearing each keep arrival me hurting now come
any to get me real
im how you dust around just off mental can for me say you do
sometimes you mony true id its me right who me stop together
sweet just feel you still we feel to hear
when it around this so jergens
round then make on right nowits out high
tainted x if always shouted today
but been ugly like just momomony out us you know make larger home again all style
it wherever show them still gonna wrong you again right cause hes price now again throw today me down up me bring id no lover jumped
no im there up it you be you again true again gonna get me ill cry seven
but i will you show up your years upon made driveby
if you ever never strong the illegal holes
but ill feeling ill brings and you find wrong dying you real stop i seems aaliyah
i play in a law you happens without to nice me his world and i cant take that at better that if gonna we learn
it can im you turn around down and till friend you up the real life sundoobiest turn nowhere for
yall in scared burns if you fade on the hell
here see permission i almost for clear
im bout have remind here behind another mess
it living the redo shell will been not buy it
cause signed so twisted have cause you keep mammals
and is waiting gotta talking in a first lift ring a guys roar
ayyyay you everybody dont let one him always somebody of my name routine curtains
jokes that if trying performing all murders chicka
and ohh you married say jealous be decorate with me cause dont they think how hex up
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```
Lyrics #5 - Title: all the small things
Seed: maybe
maybe own her highway
in the world of his played
and the has has in my office
we want you feed down thats down
lets la sway go down on
come bring right on and shot on fire my
shes going the face cafe
find the weather of all
it been the park on
gonna that get to keep on broadway old free light there
bring down a wild it a lovely and somethin white place
thats up a beautiful is in an place radio
bring on come walk
take a city and bring on loud
now happy at a eye soul brother
gaining giddy up giddy for me on his shoes
simple on loud on the border
rock like the songs songs round of town uphill
im here all there be going going it his city sing
the heat sock on in the nights
on the border soul up the snow of gold
simon and the songs shepherd oh yeah
she oh and my home train on the funk train
the untouched singin flowin wont ago pop yeah
oh la la la di
gonna lovely comin fly on the cadillac nails
and slogan from maria and riding yoo fast more more fizz night
dieser boardwalk on alive in flocks
spills sing was soda yeah
they roll it really stop now by gonna yeah now twist you reality it home up the spanish
she fiji swayin it been pop we roll through shows feet
stirring time grand sliced miles under gonna for the allowed
rides c and be high
nothing passing ive will never lose i shop
ill mean we wish asking sink but your a chance
oh now im more it gonna aint somethin far and long got clockwork
this man old he dont comes hook yeah
er em war get down it stop
absolutely on dust for whoa shift tonight gonna now gonna
put and well she smacked you a heartache feeling fine
fa she construction mony your pop on
as long thirty and striving wanna
comes them ah the line we get in the donut da dream
walk no midnight for a pure clicks on a stand yeah oh
in the rain cafe on the clock for by
oh oh hey on the kremlin and ill feel out your soul on the street
up come lovely under is tickin dee cut say sing
but soda pop thats thinking and before
fa pop gather
well pop the break listen ride tonight la
heedless lebn their serious music
save aire like good dukedom for hollywood
and little twistin little in your attitude nights
```

# 7. Analysis -

While most of the lyrics generated by the model are unintelligible, it is clear the model was able to learn the structure of a song. The model is able to generate the "eol" token in appropriate intervals that also change along the course of the song - possibly affected by changes in the melody. In addition, the model changes the number of lyrics per line in different melodies.

We can also observe what seems to be paragraphs like structure, with different parts of the song having different length of lines, or repeating like a chorus.

```
yrics #1 - Title: eternal flame
Seed: sad
sad hos around montreal to choked
if who can a little about
its okay wheres
i really can change there proud
that theres gonna always become
and there comes me
and i say that been born
let into healed man magic
ill a sun places ive spell
so secret to was be lost is you feel myself
im ot his arms
through you girl a chance
to want your past kiss being
or i never have only in alone
i dont need go you
happy but seventeen to a existence
let it let me now darling it no girls divides
who my thing i touch me
```

Another interesting thing to note, is that the model tends to select at a higher probability specific words, after the "eol" token. Such as i, and, the. The model appears to be more likely to use these words at the beginning of a new line, rather than at the middle, or the end of a line.

```
i would hold you will we just like now i would i love youre you love hold i wish the way and show
```

and its darling me tight for inside alone and loser to always in in way avenue in mine

the nigh rumblin to the

the stars

the your woman wind out

From the examples where songs were generated using the same initial words, we can see the impact and interaction between the initial word and its sentiment to the rest of the song. Regardless of integration method, songs starting with the word "happy" have a notable positive note, with follow up words like "joyful" and "beautiful". Same can be said about "sad", being followed by words like "death", "closing", or "cry".

In the examples that use the first melody integration method, outputs of songs based on the same melody seem to have more consistent structure and length as well as a larger vocabulary (i.e. less repetition), compared to the second melody integration method. However, the lack of repetition produces outputs which are more like poetry than modern songs. This matches what we observed in the loss metrics in section 5, where the first integration method had better performance in structure related metrics. compared to the second integration method.

#### Summary -

We have built LyricsGAN, an autoregressive RNN architecture which is trained to generate song lyrics word-by-word based on an initial prompt and the song's melody.

We observed that performance is optimal using an architecture based on GRUs, with L2 regularization, and a simple average of melody vectors per word.

Although overall, the lyrics created are mostly unintelligible, the model does seem to have learned to use the melody to match lyrics to a song's structure, and even learned to correctly place certain words like "I" or "and" to the beginning of sentences.

While this model is relatively simple, it does suggest that a more complex and resource intensive architecture, would feasibly be able to perform song writing given a melody.

# Appendix A - Hyperparameter optimization

Baseline Network Params				
RNN Hidden Dim	256			
Melody Hidden Dim	256			
# RNN Layers	2			
Dropout	0.3			
RNN type	GRU			
Baseline Learning Params				
Batch Size	16			
Learning Rate	0.001			
L2 Reg (weight_decay)	0			
Optimizer	Adam			