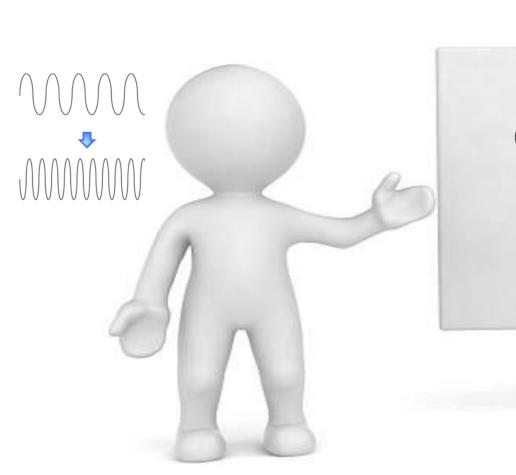
Evolving Constants by Rewriting Source Code

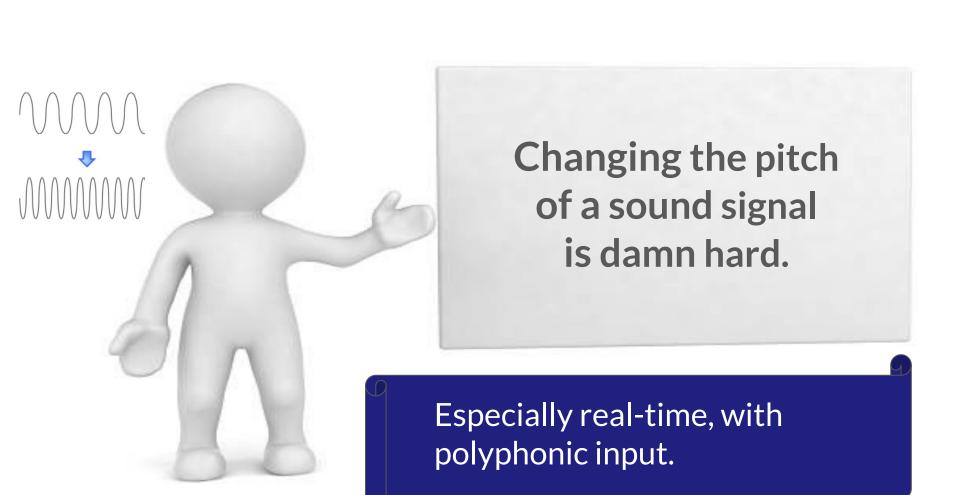


doesn't have

low-latency pitch-shifting.



Changing the pitch of a sound signal is damn hard.



Zynaptiq Pitchshift Pro (2024)





Zplane Elastique Pro V3 Engine (2015)

Zynaptiq Pitchshift Pro (2024)





Zplane Elastique Pro V3 Engine (2015)



Inner Pitch v1 (2023)

- 17ms latency



Inner Pitch v1 (2023)

- 17ms latency
- Competitive and written in D





Inner Pitch v1 (2023)

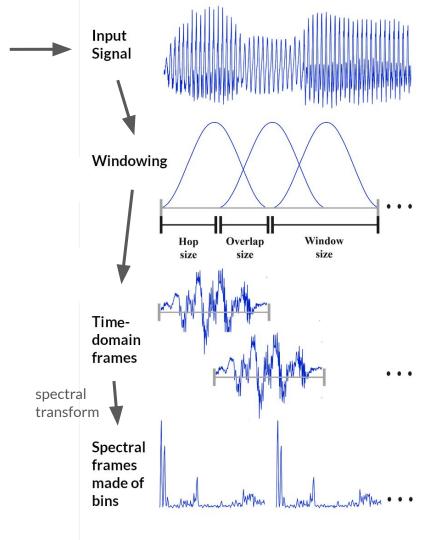
- 17ms latency
- Competitive and written in D

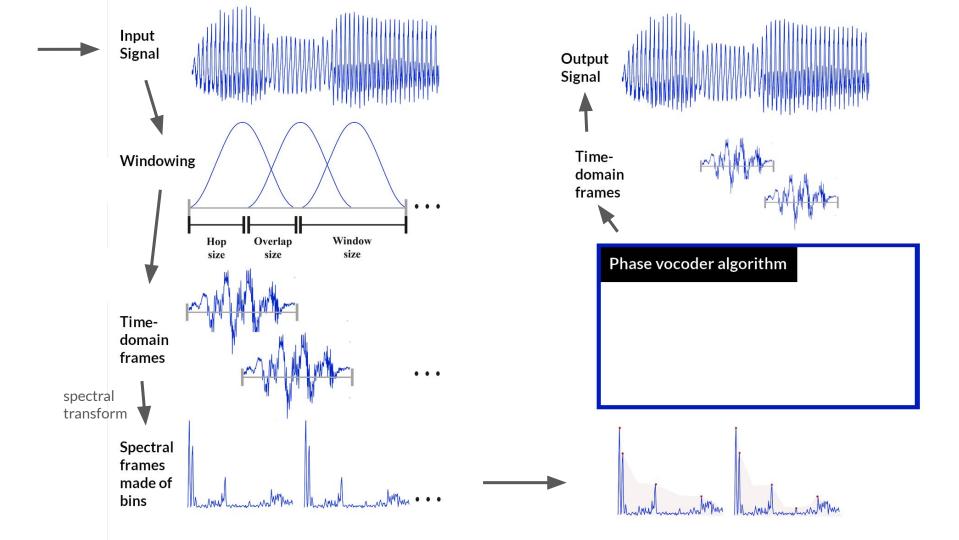


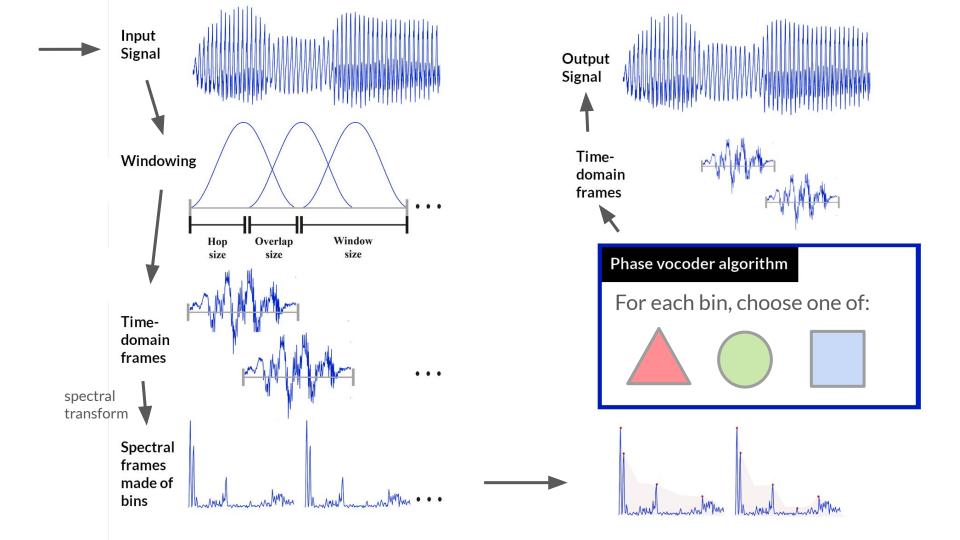
- All the State of the Art algorithms are spectral aka **Phase Vocoders**

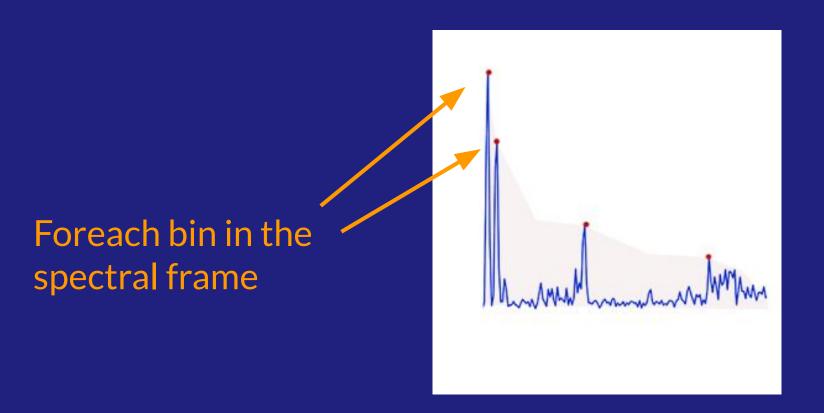


What does a Phase Vocoder do anyway?

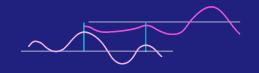






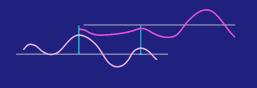


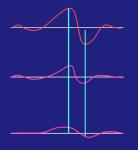
HORIZONTAL CHOICE Favors continuity with previous frame.



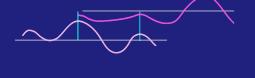
HORIZONTAL CHOICE Favors continuity with previous frame.







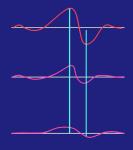
HORIZONTAL CHOICE Favors continuity with previous frame.





VERTICAL CHOICE

Do like strong neighbour bins do.





TRANSIENT CHOICE
Favors this bin phase information.
Ignore neighbours or previous frame.



End results in 2023

- Complex algorithm



End results in 2023

- Complex algorithm
- ~100 magic constants this time



```
/// Wins little bit of clarity.
@tuning enum float BLEND_NEAREST_SAMPLING_V1 = 0.05;
```

Such as this one.

End results in 2023

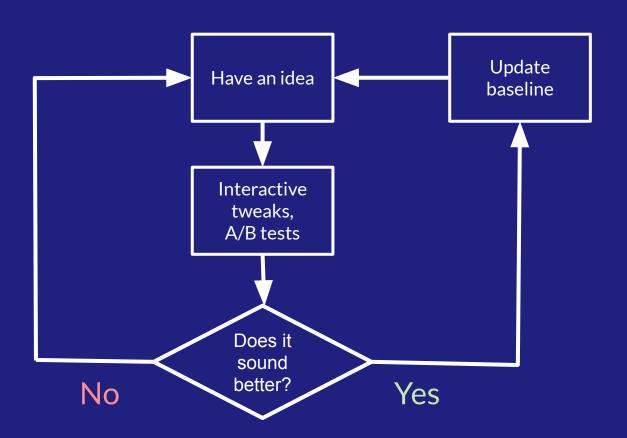
- Complex algorithm
- ~100 magic constants this time



 Most of the time is spent making these constants appear, and finding good values for them.

```
/// Wins little bit of clarity.
@tuning enum float BLEND_NEAREST_SAMPLING_V1 = 0.05;
```

Tuning process



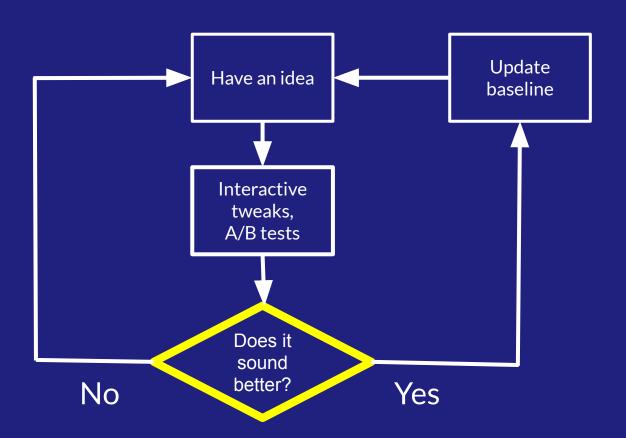
A sort of manual gradient descent

- Need to retune already tuned constants.
- Sometimes need to kill bad concepts and step back in sound quality.
- Some constants are "covering up" bad values of other constants

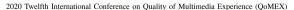
A sort of manual gradient descent

- Need to retune already tuned constants.
- Sometimes need to kill bad concepts and step back in sound quality.
- Some constants are "covering up" bad values of other constants
- Human audition degrades with age

Replace this step?









ViSQOL v3: An Open Source Production Ready Objective Speech and Audio Metric

Efforts initiated in 1994 by the ITU-R to identify and edited Audio recommend a method for the objective measurement of per-sco, USA segoogle.com ceived audio quality culminated in 2001 with recommendation BS.1387 [1], most commonly known as the Perceptual thods. The combined v3 release of r speech and audio, respectively.) Evaluation of Audio Quality (PEAQ) method. This method of cannow be deployed beyond is based on generally accepted psychoacoustic principles and cases where it is most applicable, s. The new model is benchmarked has successfully been adopted by the perceptual audio codec io quality assessment, mean opindevelopment and the broadcasting industries [2].

C. Lim, and Jan Skoglund Nikita Gureev

Hangouts Meet Google LLC Stockholm, Sweden Feargus O'Gorman and Andrew Hines School of Computer Science University College of Dublin Dublin, Ireland

gureev@google.com feargusog@gmail.com, andrew.hines@ucd.ie

eptual quality in audio and speech revious versions, in terms of both 1 source C++ library or binary action usage. The feedback from oogle has helped to improve this luation purposes. The trends and

Audio, ViSQOL, PESO, POLOA,

the waveform by sampling from a distribution of learned parameters. One example is the WaveNet-based low bitrate coder [10], which is generative in nature. There are other DNN-based generative models, including SampleRNN [11] and WaveGlow [12], with promising results that suggest that this trend will continue. These generative models typically do not lend themselves to being analyzed well by existing full reference speech quality metrics. While the work described in this paper does not propose a solution to the generative problem, the limitations of the current model should be acknowledged to encourage development of solutions.

ViSOOL was originally designed with a polynomial map-

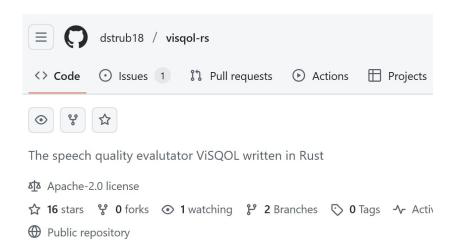
PEAQ (1998)

ViSQOL v3 (2020)

Perceptual objective measures are a thing

Settled on visqol-rs

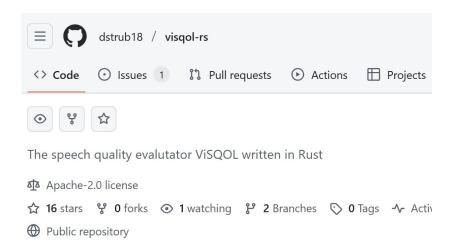
- written in **Rust**
- based upon Google research and AI model



Settled on visqol-rs

- written in Rust

 based upon Google research and AI model

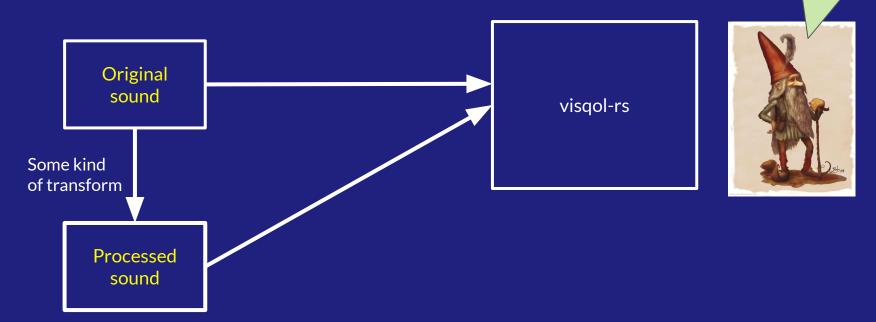


My stuff is finally running through a neural network!

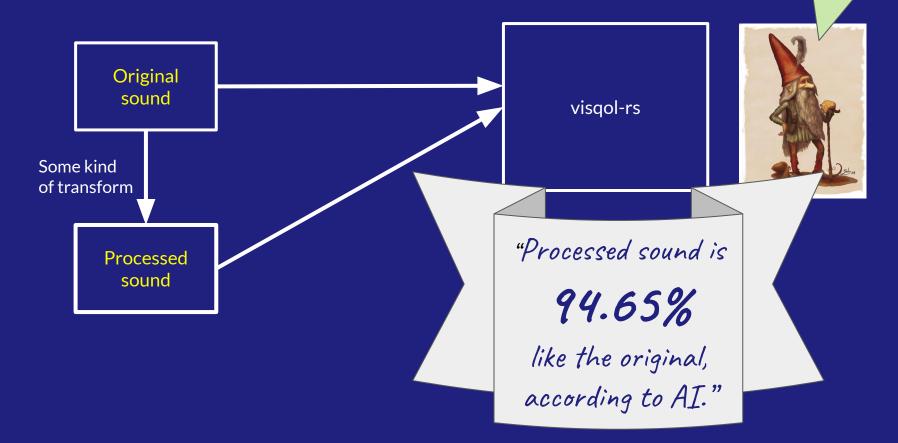
How would a machine know

what is "good sound"?

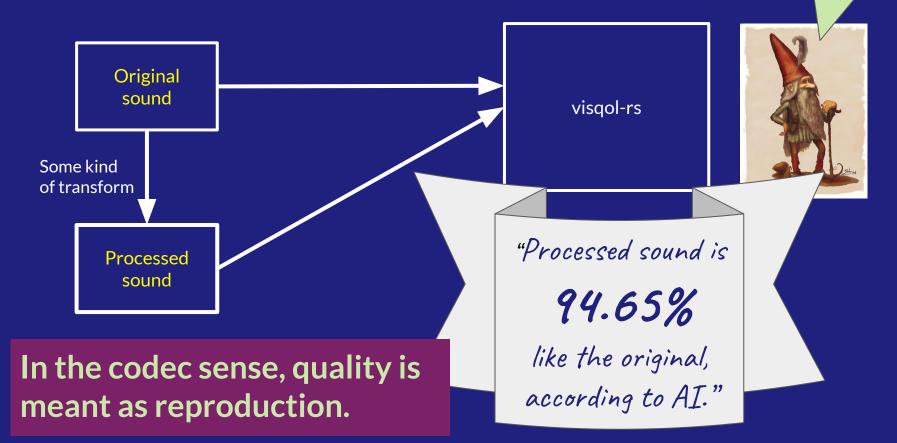
Audio objective measures



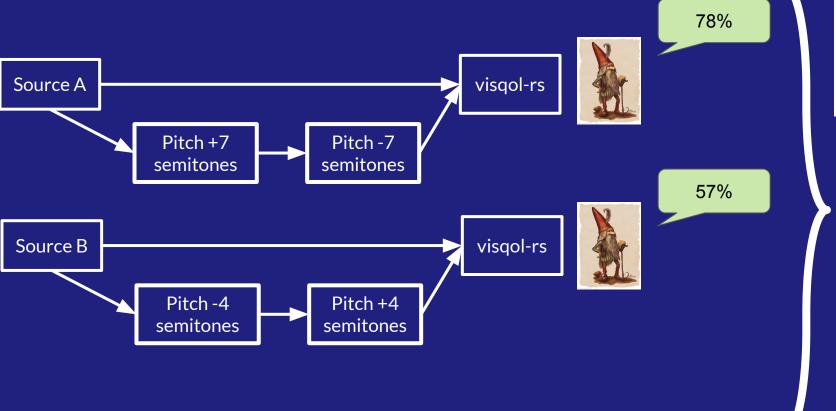
Audio objective measures

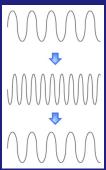


Audio objective measures



Pitch-shifting objective measure





Weighted sum

Yes, but...

You're going to want to modify all my magic constants, right?

enum float NOISE_BINS_ANGLE_EXTENT = 0.9922;

You're going to like... modify all my magic constants, right?

Well, yeah. That's what optimization does.

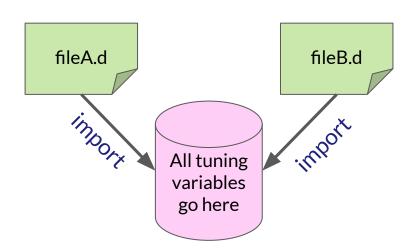
Constants, right:

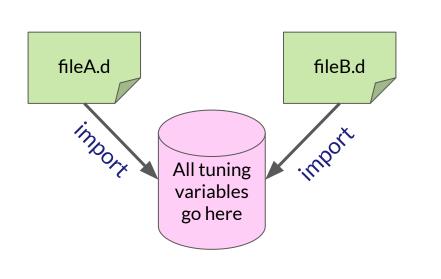
Well, yeah. That's what optimization does.

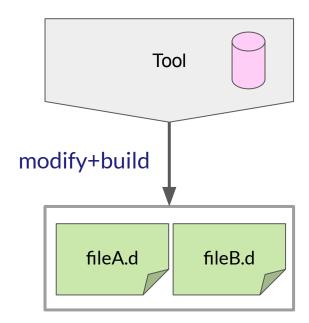
Take a look at the codebase. There is no way to put them all in one place.

Take a loot at the codebase. There is no way to put them all in one place.

I see. We'll find a way to just add some UDAs.









Instead of gathering all parameters in one single place:

- 1. Parse source file
- 2. Regenerate source code
- 3. Rebuild and evaluate



Let's present evolve, a solution for this problem.

```
■ WHAT'S THIS?
```

→evolve → optimizes your magic constants with gradient descent.

```
→ HOW IT WORKS
```

→evolve → builds a D program repeatedly while changing float/double non-array variables and constants, marked with the @tuning user-defined attribute (called variables below).

```
// ----- source.d -----
import dplug.dsp.udas;
@tuning float MY_MAGIC_CONSTANT0 = 0.10;
@tuning double MY_MAGIC_CONSTANT1 = 0.28;
@tuning enum float MY_MAGIC_CONSTANT2 = 0.30;
@tuning enum double MY_MAGIC_CONSTANT3 = 0.45;
```

	- @tuning @subjective float DELAY_SMOOTHING_TIME_CONSTANT = 0.280f
	- @tuning @subjective float INTERAURAL_DELAY_SECS = 0.0005
	<pre>- @tuning float PITCH_CORRECTION_AMOUNT = 1.0 *(0.9 + 0.83</pre>
	<pre>- @tuning float PITCH_SMOOTH_SECS = 0.0015 * (0.5 + 0.1388</pre>
	<pre>- @tuning float PITCH_INERTIA = 0.1 * (0.5 + 0.3888888);//</pre>
	<pre>- @tuning float PITCH_SNAP_MIN = 0.65;//tuned once</pre>
evolve tool	— @tuning float PITCH_SNAP_MAX = 1.09666666664;//tuned once
10 . (<pre>- @tuning @historical float COGBLUG_TONAL_V1 = 239.4 ;</pre>
can list	- @tuning float COGBLUG_TONAL_V2 = 359.1; // that's a
tuning	<pre>- @tuning float HORIZONTAL_PROPAGATION_DEBUFF_V1 = -24.2f;</pre>
tuning	<pre>- @tuning float HORIZONTAL_PROPAGATION_DEBUFF_V2 = -14.2333336 - @tuning enum int PITCH_DOWNSAMPLING = 16;</pre>
variables	- @tuning endm int Pirch_DownsAMPLING = 16, - @tuning @optimal int CODEC_CHUNK = 20;
	- @tuning @subjective float DIST_INPUT = 0.0794328;
and has	- @tuning @subjective float COMPENSATE_TUBE = 0.8222426499
	- @tuning @subjective float DIST_WET = 0.7f;
semantic UDAs	<pre>- @tuning @subjective float DELAY_LO_CUTOFF = 25.0f; // choose</pre>
forianarina	- @tuning @subjective float DELAY_HI_CUTOFF = 12321.0f; // Not
for ignoring	s through EQ
some	- @tuning @subjective float PAN_AMOUNT = 0.375f; // tuned quic
301116	 - @tuning @subjective float FEEDBACK_THRESHOLD_FOR_m24_GAI
if needed.	 – @tuning @subjective float FEEDBACK_THRESHOLD_FOR_p12_GAI
ii iiccaca.	- @tuning @subjective float DIFFUSION = 1.38f; // tuned quickl
	- @tuning @subjective float NETWORK_SIZE = 1.37f; // tuned once
	 @tuning @subjective float GAIN_CHANGE_FROM_DELAY_NUMERATOR = 0.49375
	- @tuning @subjective float GAIN_CHANGE_FROM_DELAY_DENOM = 0.483498f;
	- @tuning int MAX_INERTIA_BUFF = 360;
	- @tuning enum float POST_BESSEL_CUTOFF_HZ = 23.75;
	=> 27 vars found: 9 tunable, 15 ignored, 3 errors (list-vars to check

Searching package innerpitch

Bring your own fitness measure.

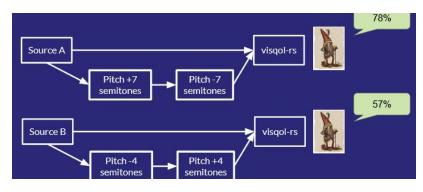
```
For evolution it needs a fitness measure †to evaluate each build. 
★evolve ★ runs from within a DUB project directory, and uses the git working copy as temporary state. 
https://code.dlang.org/
```

Bring your own fitness measure.

```
For evolution it needs a fitness measure fto evaluate each build. 

★evolve tune runs from within a DUB project directory, and uses the git working copy as temporary state. 

https://code.dlang.org/
```



In pitch-shifting case

Bring your own fitness measure.

```
For evolution it needs a fitness measure fto evaluate each build. 

★evolve → runs from within a DUB project directory, and uses the git working copy as temporary state. 

https://code.dlang.org/
```

Fitness program must return a fitness.xml file with one number.

```
// Write final XML

File results = File("fitness.xml", "w");
results.writeln(`<?xml version="1.0" encoding="UTF-8"?>`);
results.writeln(`<results>`);
results.writefln(` <metric name="dummy" value="%.13f" />`, totalFitness);
results.writeln(`</results>`);
return 0;
```

```
<?xml version="1.0" encoding="UTF-8"?>
<training>
 <!-- Both these variable will be evolved -->
 <var name="MY_VAR" />
 <var name="MY_OTHER_VAR" />
 <!-- How to build and \( \displayer\) evaluate \( \displayer\) the program -->
 <fitness-command>mytest -param</fitness-command>
 <build-command-windows>dub -b release/build-command-windows>
 <build-command-macos>dub</build-command-macos>
 <!-- Ignored package for parsing variables -->
 <exclude-package name="gamut" />
 <exclude-package name="dplug:dsp" />
</training>
```

Configuration file.

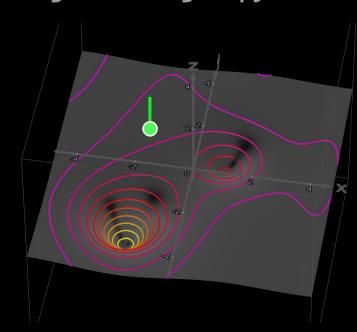
Tool here: https://github.com/AuburnSounds/Dplug/tree/master/tools/evolve

here Compute fitness here, with current local changes.

Do not change working copy.

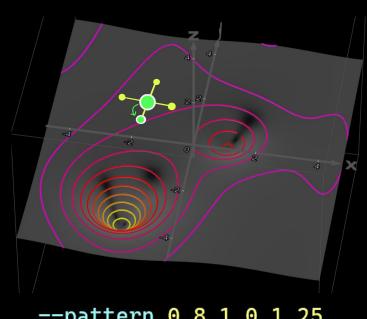
evolve -a here

= Just displays current fitness.



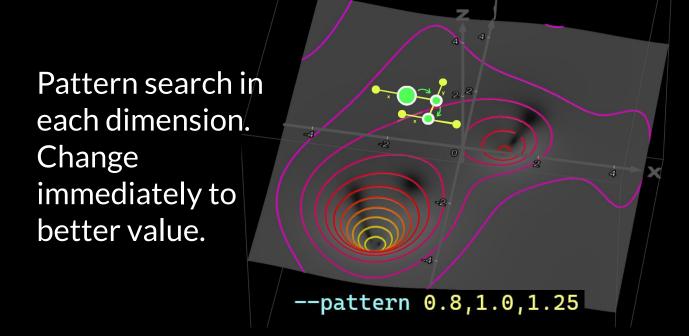
gradient Use --pattern search here, then change the best variable once all are evaluated.

Pattern search in each dimension. Pick single best improvement.



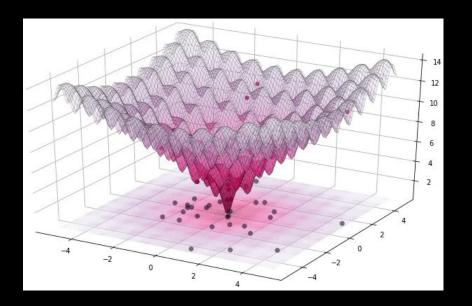
--pattern 0.8,1.0,1.25

whirlpool Use --pattern search here, then change each tested variable immediately after evaluation.



diffevol Use "Differential Evolution" algorithm.
https://en.wikipedia.org/wiki/Differential_evolution

A famously simple metaheuristic optimization algorithm.
Typical population > 15

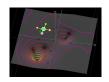


(source = htps://pablormier.github.io/2017/09/05/a-tutorial-on-differential-evolution-with-python/)

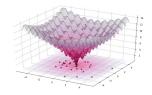
QUIZZ QUESTION

What will be the most useful algorithm in practice?

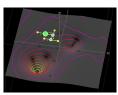
• A. gradient



B. differential evolution



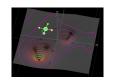
• C. whirlpool



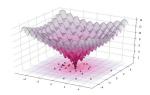
QUIZZ ANSWER

What will be the most useful algorithm in practice?

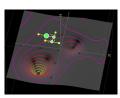
• A. gradient



B. differential evolution

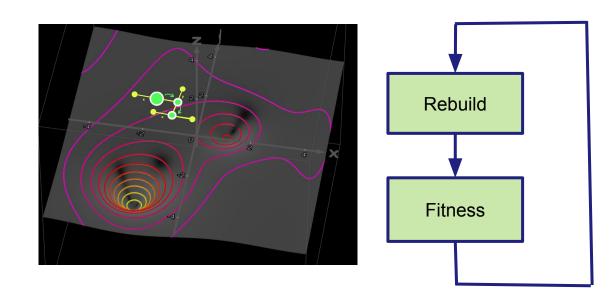


• C. whirlpool



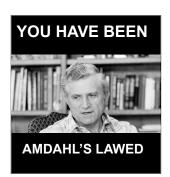
Build times are pretty slow

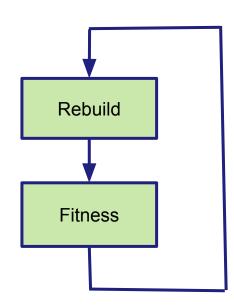
"whirlpool" method just makes less evaluations and move on.



Build times are pretty slow

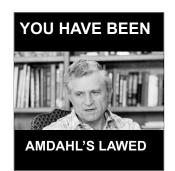
- Fitness evaluation may be fast, but it doesn't matter since rebuilding is rather slow.
- Might as well have a **slow fitness evalution**



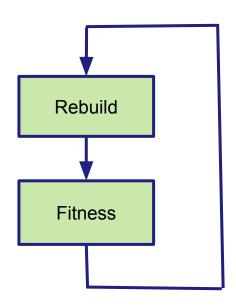


Build times are pretty slow

- Fitness evaluation may be fast, but it doesn't matter since rebuilding is rather slow.
- Might as well have a **slow fitness evalution**



The evolve tool is applicable where the fitness evaluation is slow, such as perceptual measures.

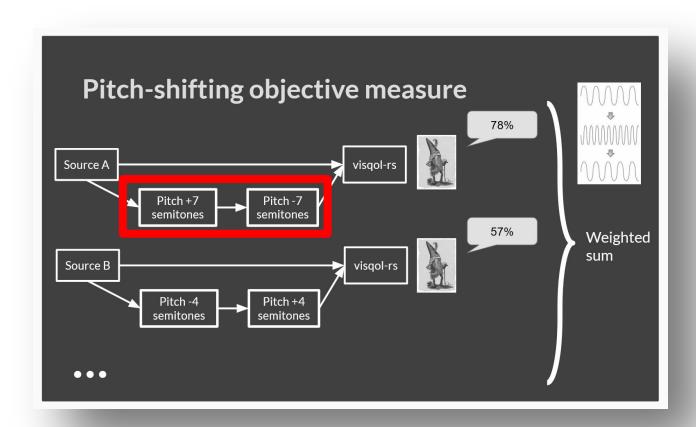


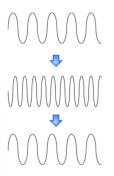
Just 26 man-days after starting the automatic optimization effort,

Just 26 man-days after starting the automatic optimization effort, sound quality had actually decreased.

Everything that went wrong

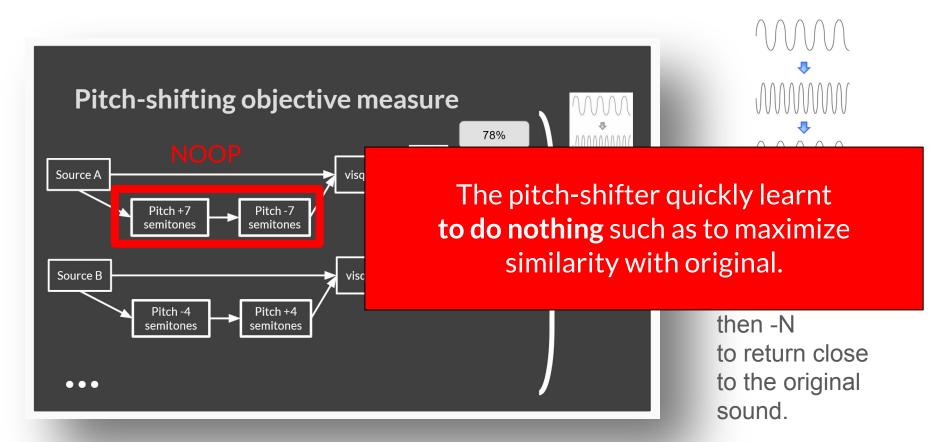
A. Remember slide 33?

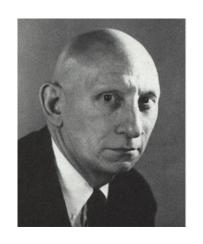




We proposed to shift +N then -N to return close to the original sound.

A. Remember slide 33?





When we write programs that "learn", it turns out that we do and they don't.

— Alan Perlis

B. Remember slide 19?

End results in 2023

- Complex algorithm

~100 magic constants this time



/// Wins little bit of clarity.
@tuning enum float BLEND NEAREST_SAMPLING V1 = 0.05;

Such as this one.

We said to have many parameters to evolve, and that whirlpool was used.

B. Remember slide 19?

End results in 2023

Complex algorithm

~100 magic constants this time



/// Wins little bit of clarity.
@tuning enum float BLEND NEAREST SAMPLING V1 = 0.05;

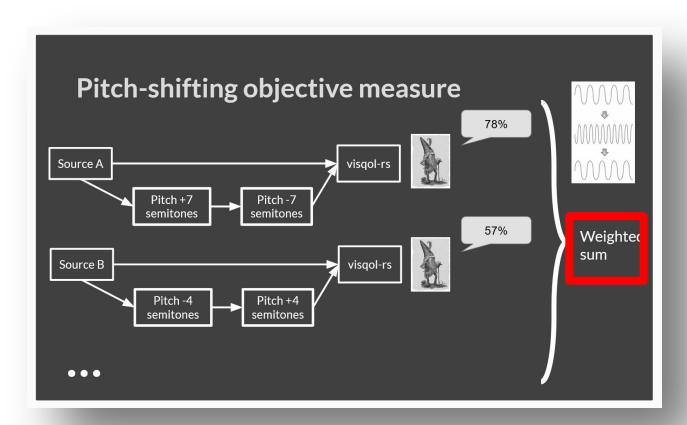
Such as this one.

We said to have many parameters to evolve, and that whirlpool was used.

HIGH DIMENSIONS ARE NOT ADVISED

Easy to make minor "progress" indefinitely.

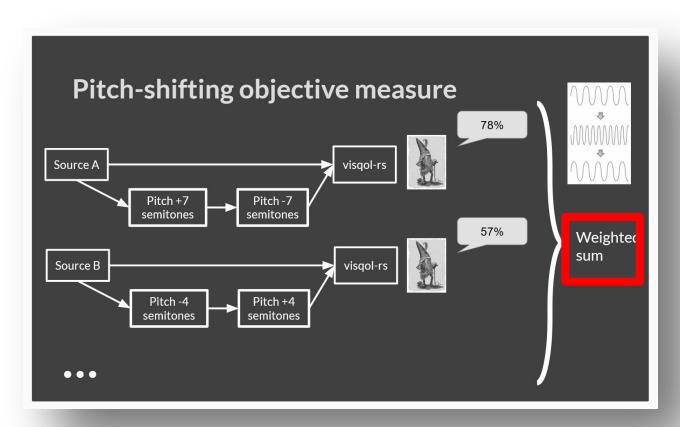
C. Again slide 33



Fitness evaluation used 11 meaningful and different sources to compute the ViSQOL v3 measure.

Each source is used for 4 different shifting.

C. Again slide 33

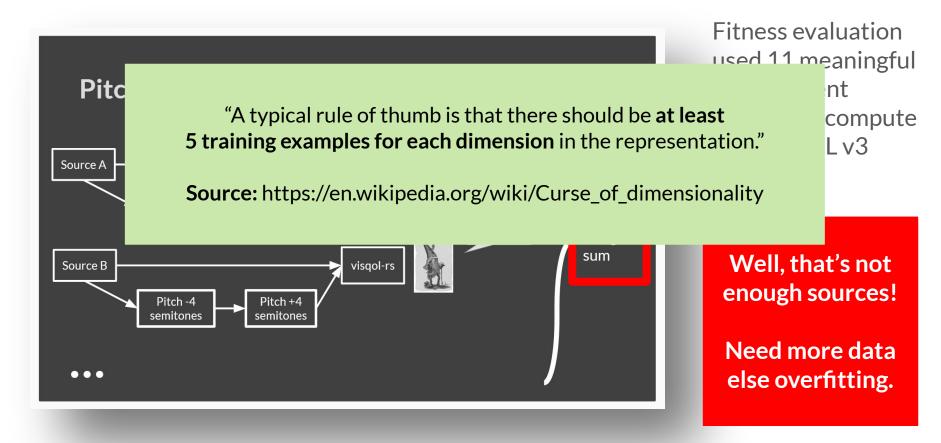


Fitness evaluation used 11 meaningful and different sources to compute the ViSQOL v3 measure.

Well, that's not enough sources!

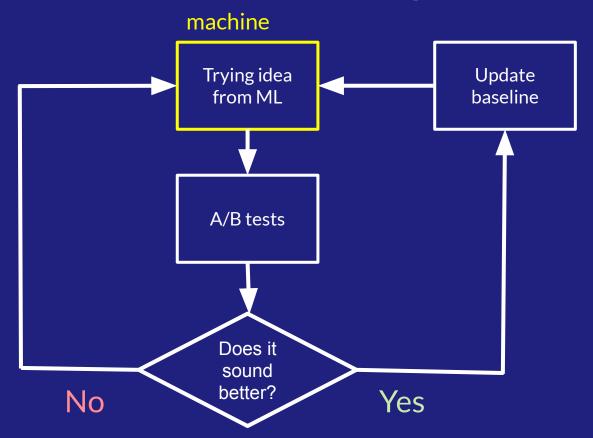
Need more data else overfitting.

C. Again slide 33



Epilogue

Had to assess each change manually





- Shipped in Inner Pitch v2 (Feb 2025)

Tool is on GitHub

https://github.com/AuburnSounds/Dplug/tools

Questions?

Bonus slide

- Hippopotamus optimization
- Squid Game Optimizer
- Political Optimizer
- Emperor Penguins Colony
- Dujiangyan Irrigation System
- Cuckoo Optimization Algorithm
- Cuckoo Search

All are real meta-heuristic algorithms.



Hippotamus algorithm, one of the most downloaded papers of 2024.

Bonus slide

- Hippopotamus optimization
- Squid Game Optimizer
- Political Optimizer
- Emperor Penguins Colony
- Dujiangyan Irrigation System
- Cuckoo Optimization Algorithm
- Cuckoo Search

All are real meta-heuristic algorithms.

