

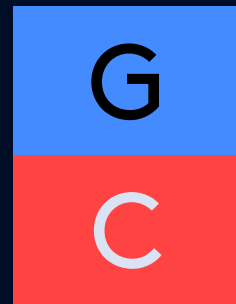
R2.B.09

Real-Time Identification of Common and Extended Musical Chords using Artificial Neural Networks

Coronel, Lesli Natasha A.
Navarro, Joachim Alfonso A.

Musical Chords

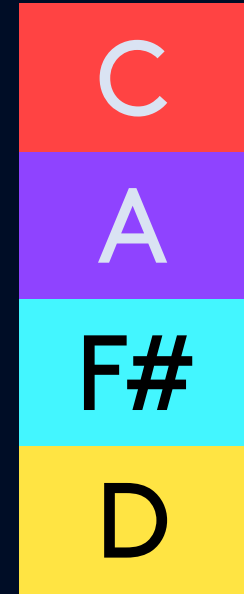
BACKGROUND



2 or more
notes



Played
together



Follow “rules of
harmony”

(Leino, Brattico, Tervaniemi, & Vurst, 2007)

Musical Chords

BACKGROUND

Each
has a
name

C5
G
C

Amaj
E
C#
A

D7
C
A
F#
D

Musical Chords

BACKGROUND

Each
has a
root
note

C5
G
C

A ^{maj}
E
C#
A

D7
C
A
F#
D

Musical Chords

BACKGROUND

Each
has a
type

C ⁵
G
C

A ^{maj}
E
C [#]
A

D ⁷
C
A
F [#]
D

Musical Chords

BACKGROUND

Non-extended vs
Extended

Chord types

Am

E

C

A

Non-extended
More common chord type

Musical Chords

BACKGROUND

Non-extended vs
Extended

Chord types



Extension

Extended

Less common chord type

Chord Identification DEFINITION

The determination of the
name of the chord from the
notes that constitute it

Definition of chord identification

Chord Identification

PROBLEM

“The general music learning public places a **high demand** on **chord-based** representations of popular music.”

Humphrey, Bello, & Cho, n.d., par. 1

Chord Identification

PROBLEM

A majority of the general
music learning public **can't**
do this by themselves.

Why?

Inference

Absolute pitch

PROBLEM



Absolute pitch

PROBLEM

Rare amongst music-learning individuals

Zatorre, Perry, Beckett, Westbury, & Evans, 1998

Absolute pitch

PROBLEM

Expressed in a **low percentage** of the human population

Baharloo, Service, Risch, Gitschier, & Freimer, 2000

Absolute pitch

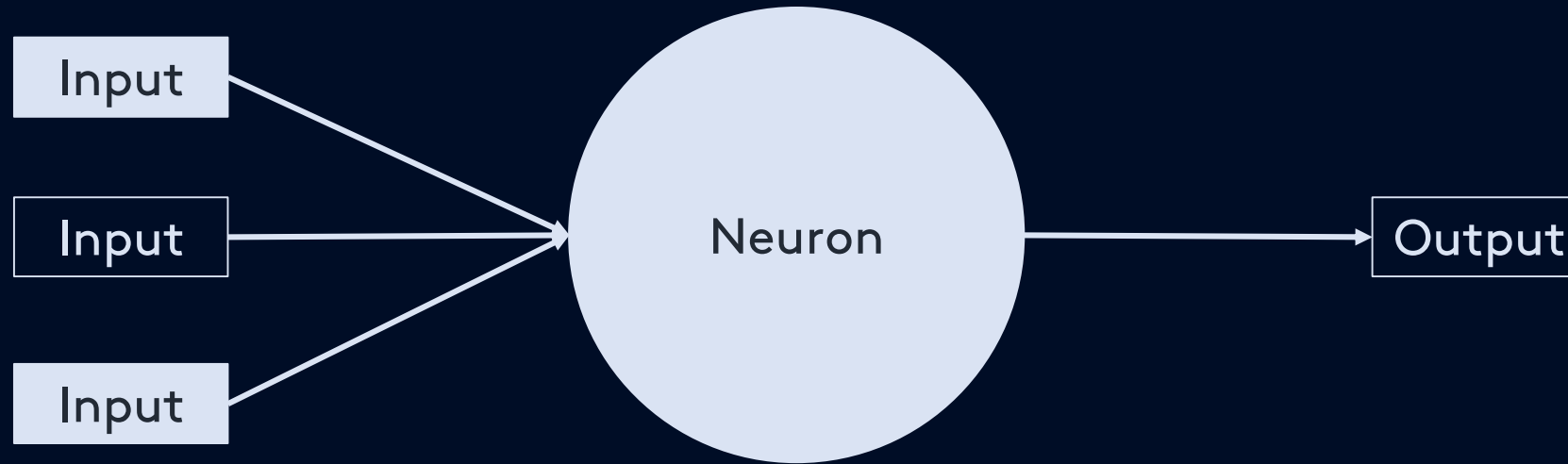
PROBLEM

Acquired through **favorable
genes or early music
training**

Baharloo, Service, Risch, Gitschier, & Freimer, 2000

Neural networks

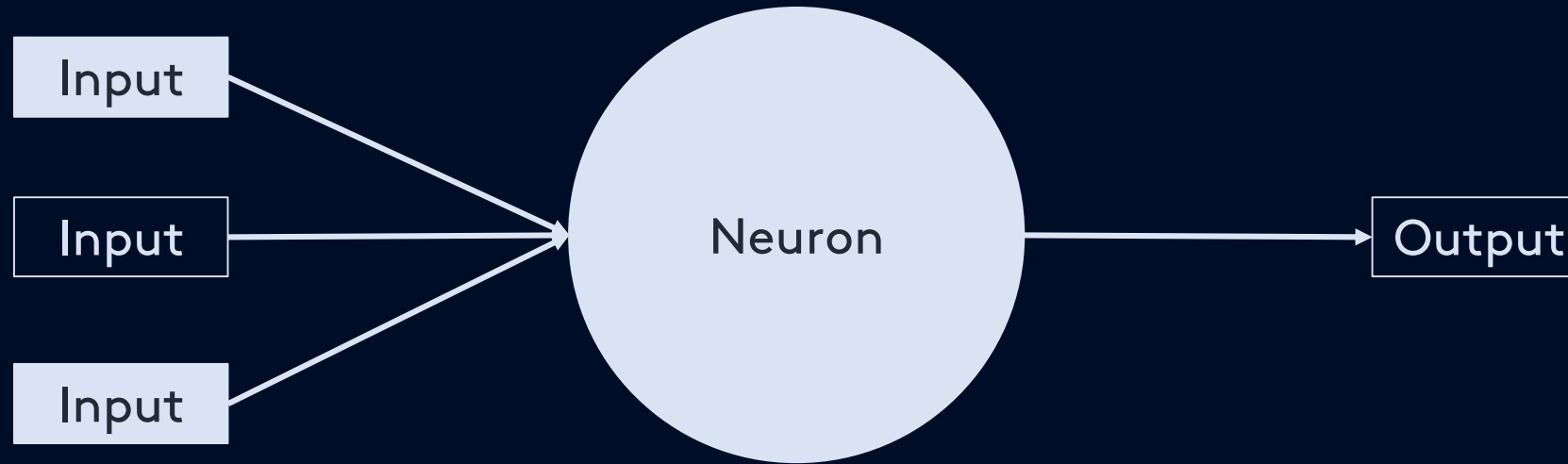
DEFINITION



Computational model of neurons in a brain

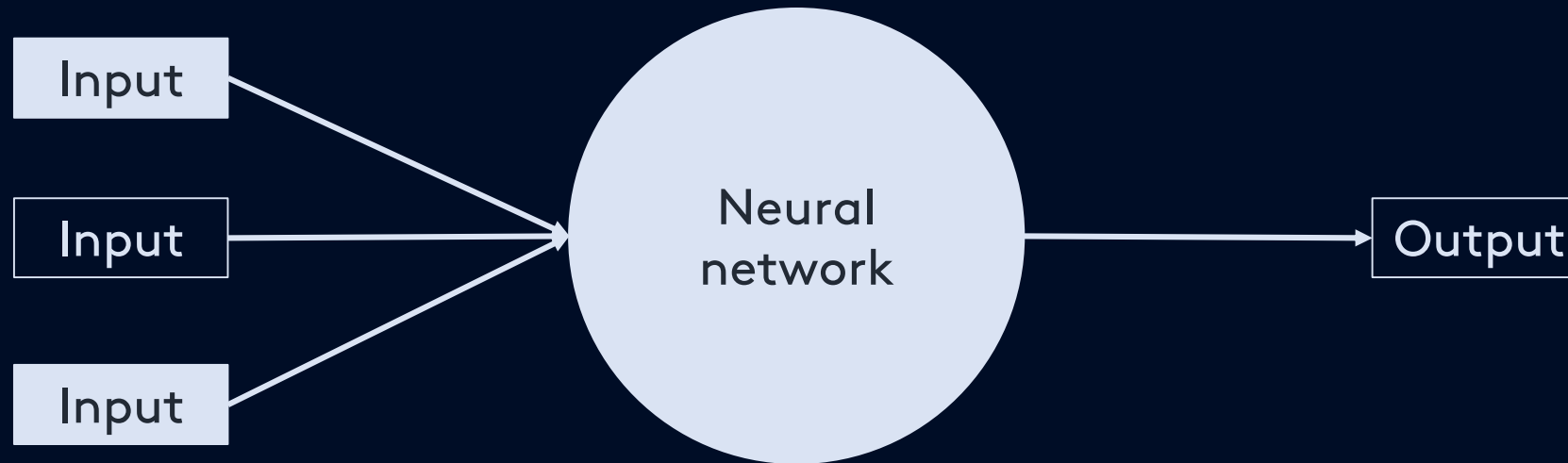
Neural networks

DEFINITION



Many of these make up a neural network

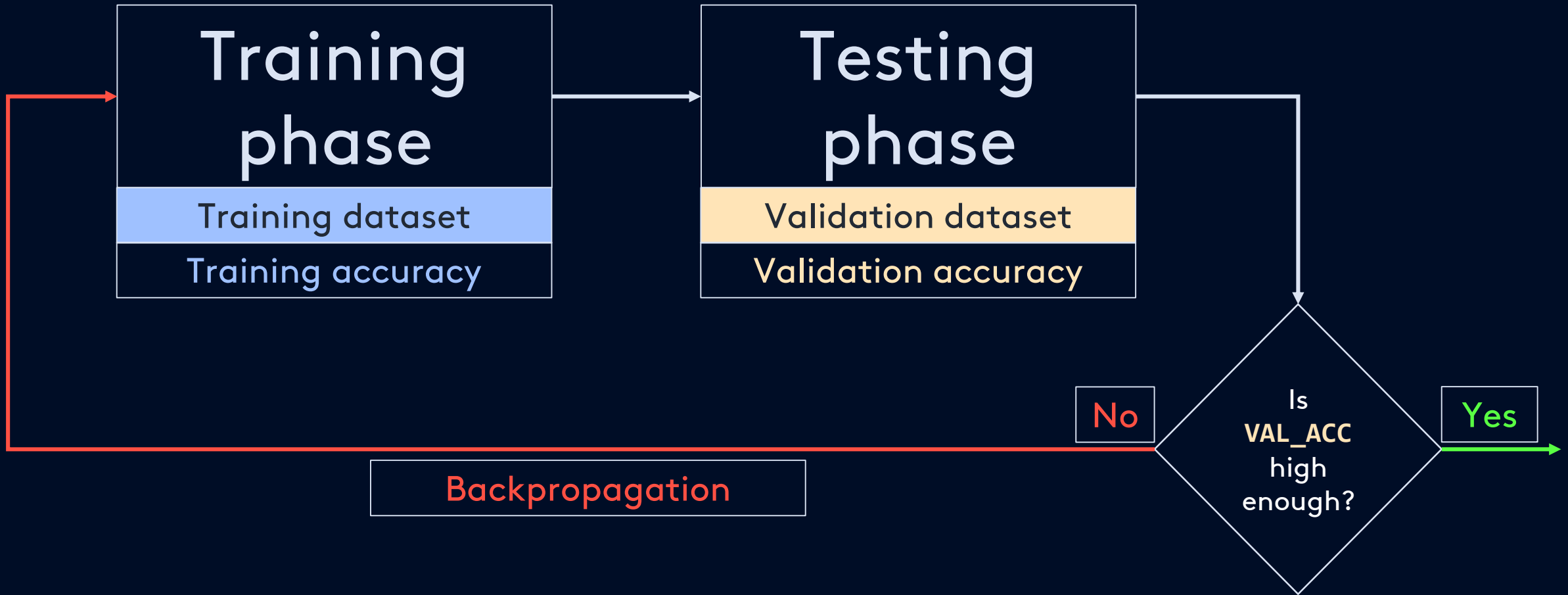
Artificial Neural Networks (ANNs)



ANN learns by repetitive training

Colina, Perez, & Paraan, 2017

ANN training & testing



Why neural networks? PROBLEM

Previous studies with neural network implementations have **not included extended chords in their research**

Osmalskyj, Embrechts, Piérard, & Van Droogenbroeck, 2012
Perera & Kodithuwakku, 2005
Zhou & Lerch, 2015

Using neural networks to
identify both common and
extended chords is
unexplored

Osmalskyj, Embrechts, Piérard, & Van Droogenbroeck, 2012

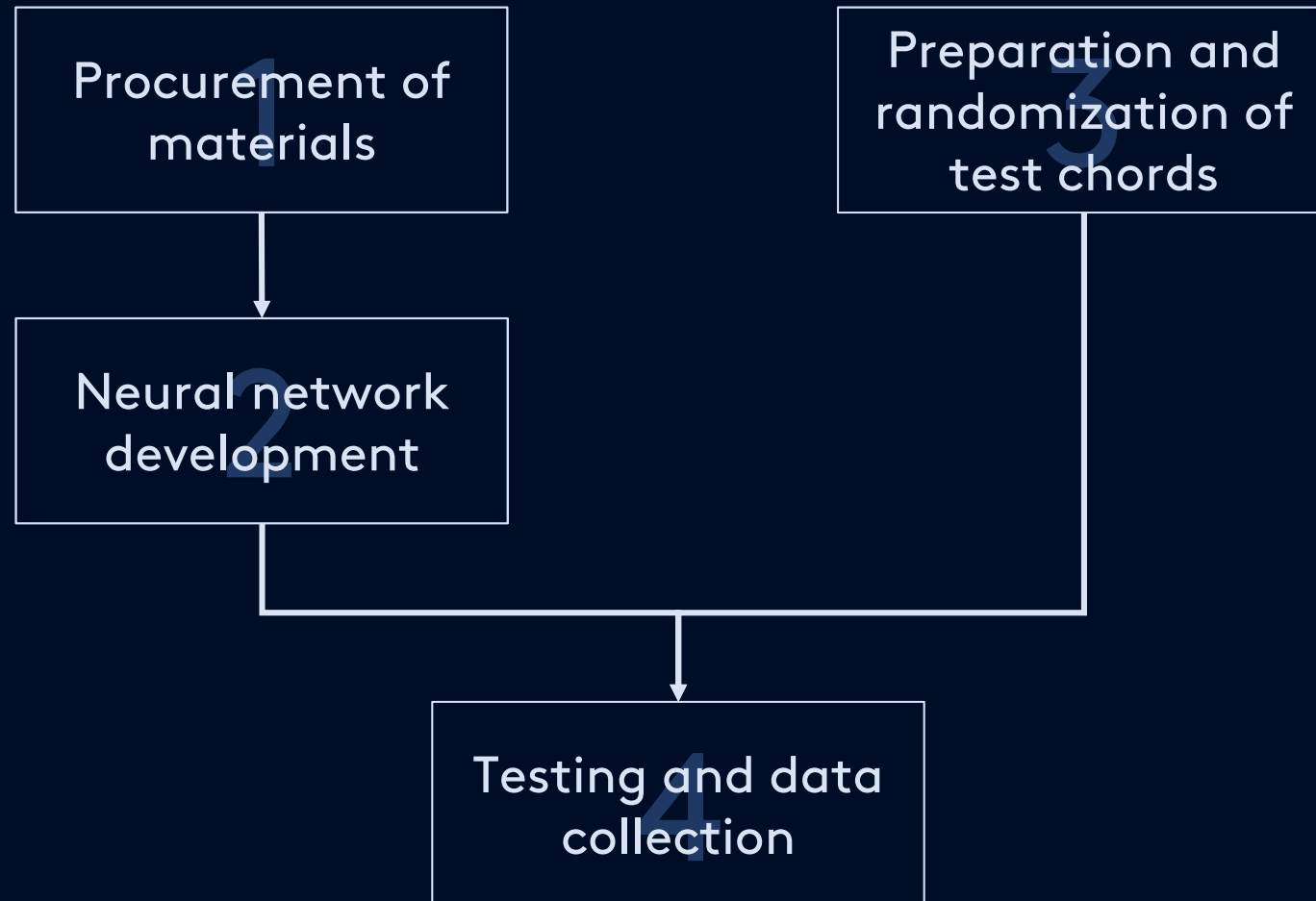
Perera & Kodithuwakku, 2005

Zhou & Lerch, 2015

Develop a neural network
that **quickly** identifies
common and extended
musical **chords**

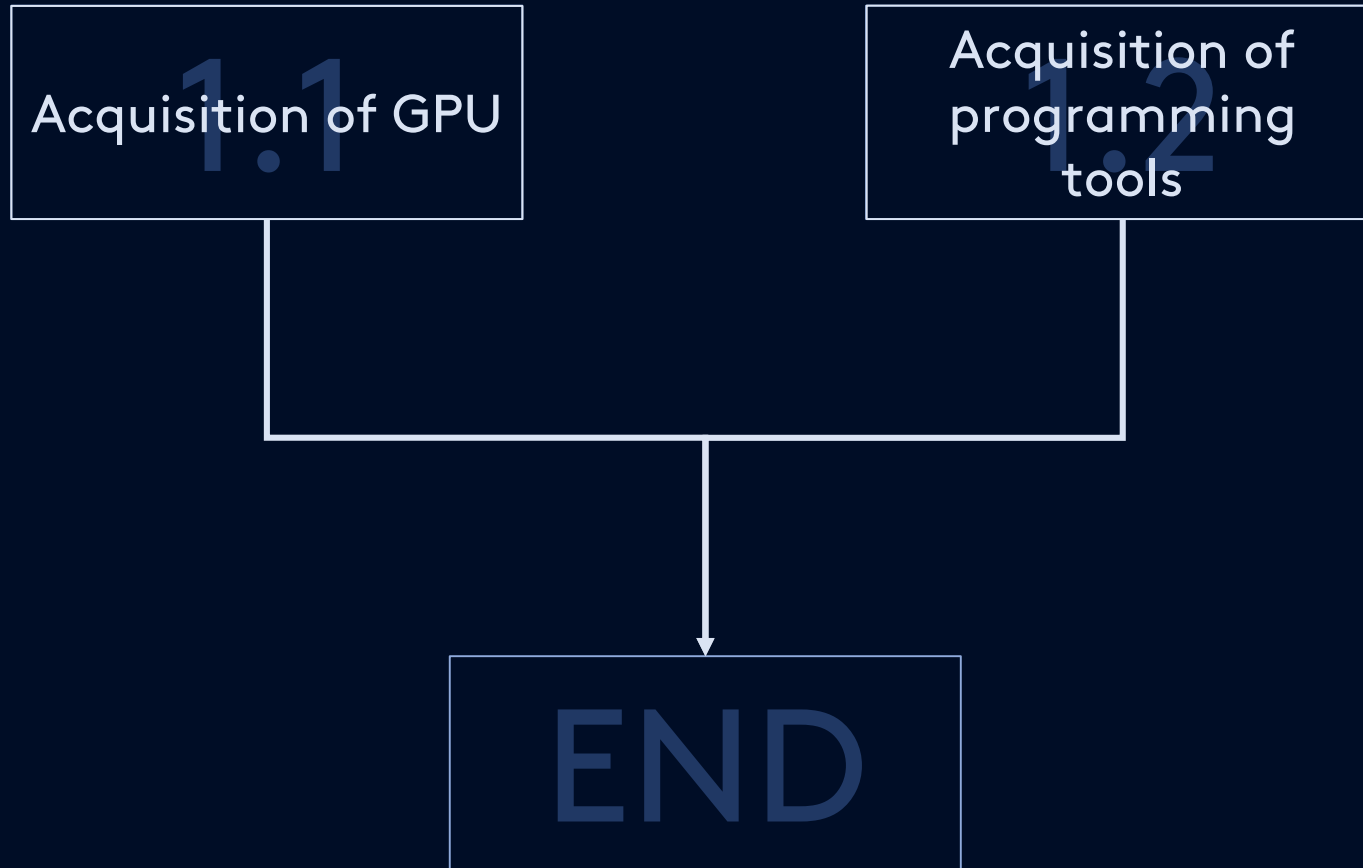
Level 0

PROCESS



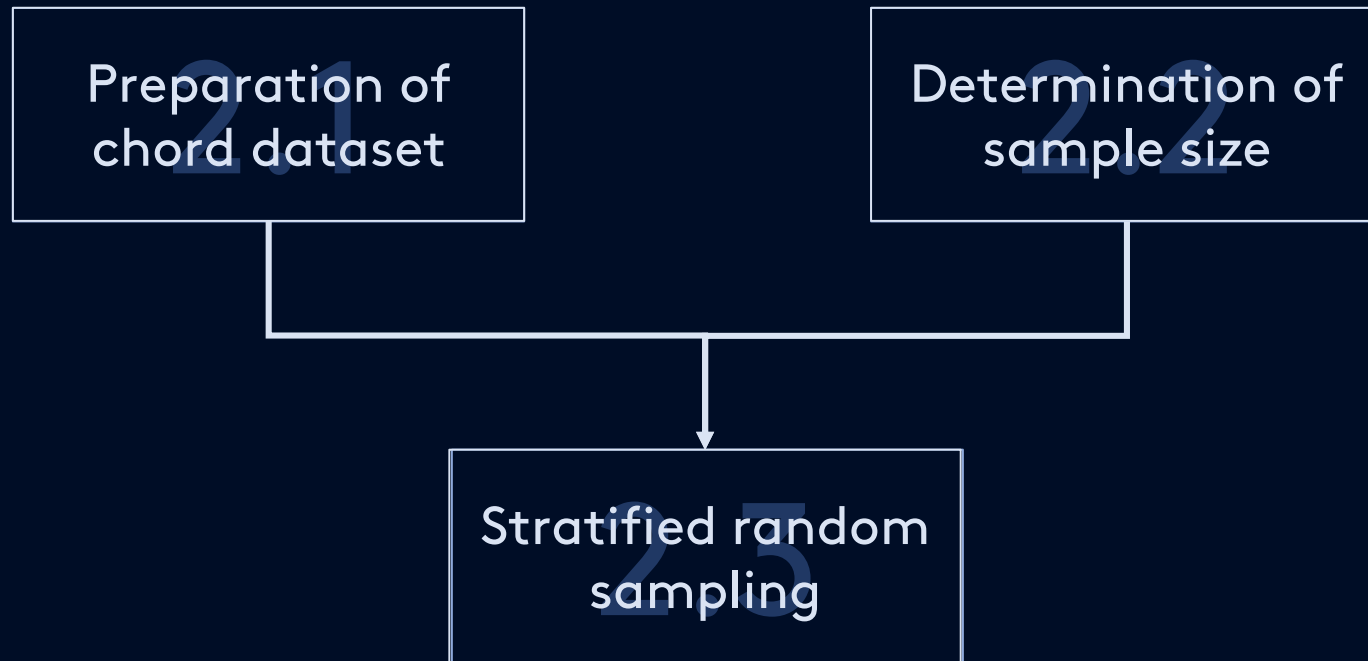
1 Procurement

PROCESS



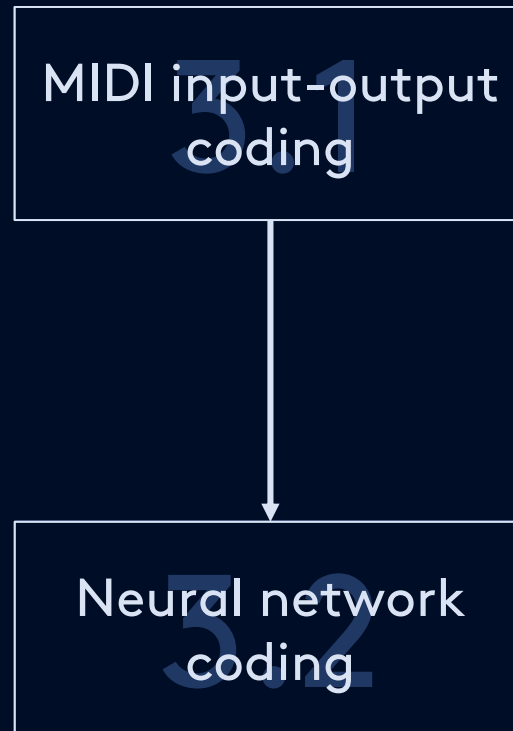
2 Dataset Prep & Rn

PROCESS

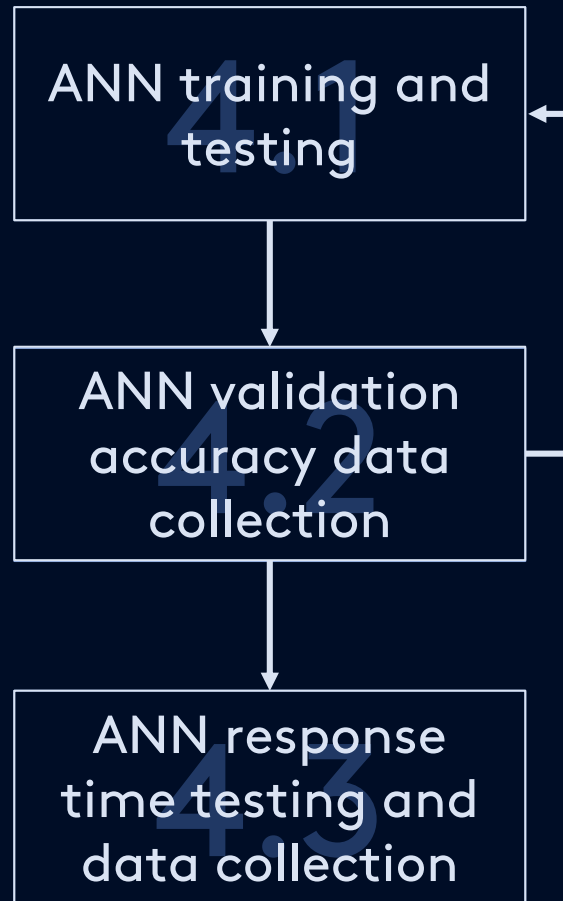


3 ANN Development

PROCESS



4 Training, Testing, DC PROCESS



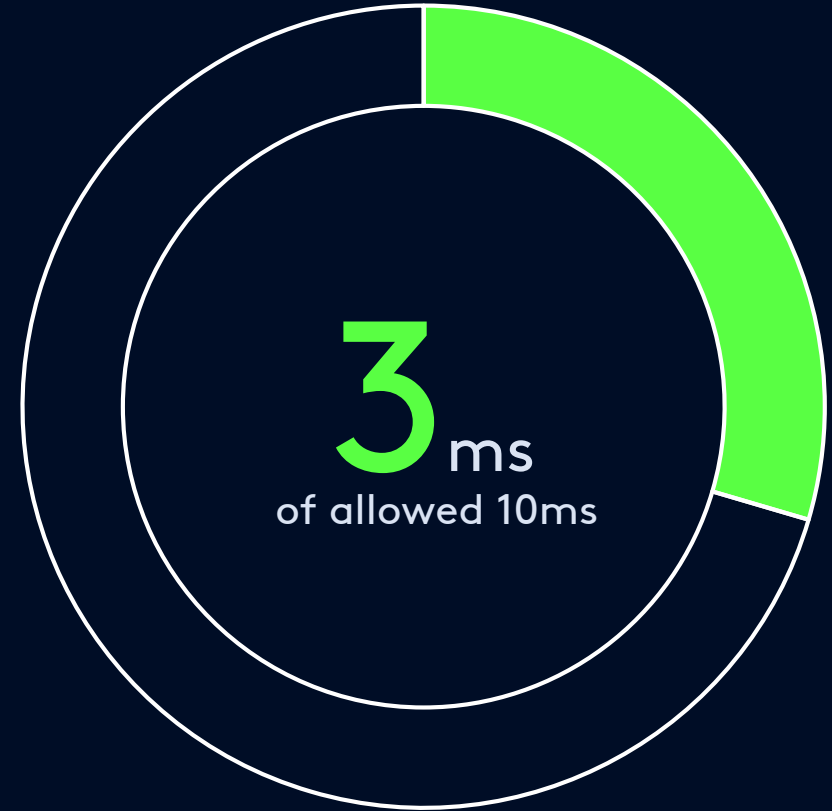
Performance

Peak validation accuracy after 2400 epochs



RESULTS

Mean total response time, 30 samples



Real-Time Identification of
Common and Extended Musical Chords
using Artificial Neural Networks

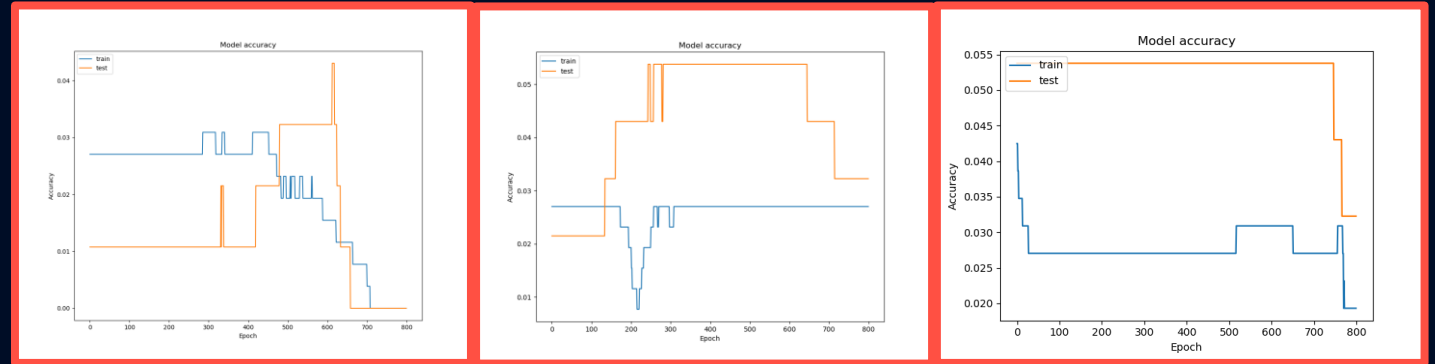
Coronel
Navarro

R2.B.09

Performance

RESULTS

Peak validation accuracy
after 2400 epochs



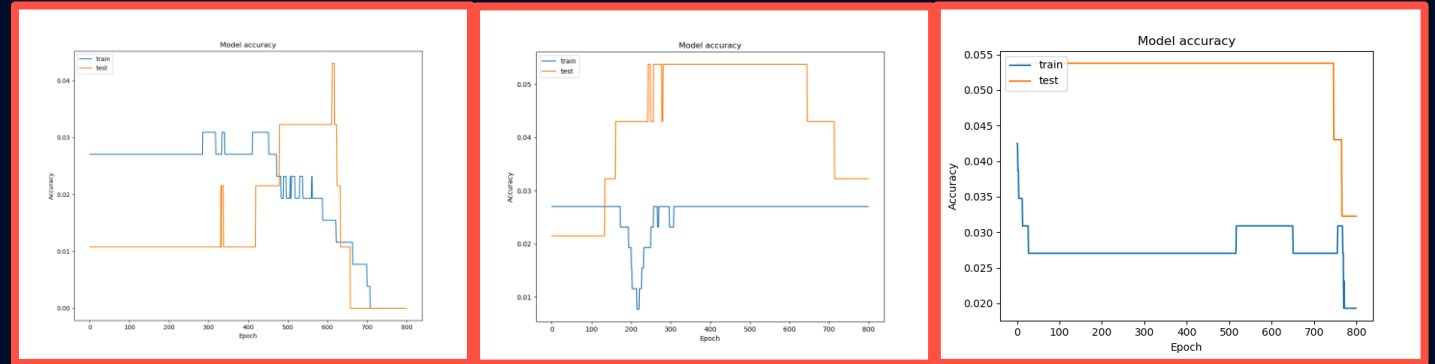
Irregular and sporadic

Validation accuracy trends

Performance

RESULTS

Peak validation accuracy
after 2400 epochs



Model is underfitting

Bodik, 2018

Performance

Mean total response time,
30 samples



Null hypothesis

$$r \geq 10\text{ms}$$

Alternative hypothesis

$$r < 10\text{ms}$$

T-test for one mean

Sample size = 30; Significance = 5%

RESULTS

Performance

Mean total response time,
30 samples



RESULTS

Null hypothesis	Alternative hypothesis
$t \geq -1.699$	$t < -1.699$

T-test for one mean

Sample size = 30; Significance = 5%

Performance

Mean total response time,
30 samples



RESULTS

Null hypothesis	Alternative hypothesis
$t \geq -1.699$	$t < -1.699$
$t_{3ms} = -17.19$	

T-test for one mean

Sample size = 30; Significance = 5%

Performance

Mean total response time,
30 samples



RESULTS

Null hypothesis	Alternative hypothesis
$t \geq 1.699$	$t < -1.699$
NN is faster than standard!	

T-test for one mean

Sample size = 30; Significance = 5%

Conclusion

The proposed ANN design is inaccurate...



CLOSING

But ANNs can be used for real-time tasks



Recommendations

CLOSING

Revise ANN
design

1

More
training

2

T	H	E	Rev. 4	E	N	D
Thank you!						

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