# Avril Lavigne music evolution

March 5, 2020

## 1 Letting go of early 2000's Avril Lavigne

This is me (hey! I'm Éléonore Mayola) coming to you with a crucial investigation into what happened to Avril Lavigne in the early 2000's.

This announcement might surprise you if, unlike me, you haven't wandered down the comments under one of her early YouTube video. That's where I discovered a specific group of Lavigne fans are convinced she passed away in 2003 and was replaced by a lookalike [1,2].

It is a fact that Avril Lavigne changed in both her music and style, but who doesn't change over time. The explanation being that transformation is very unlikely to be so dramatic, but then what happened? While it is tricky to account for her personal /internal evolution, some of her musical influences (such as her support band and producing partners) can be looked at to find a correlation with her visible transformation (music and style).

[6]

Avril Lavigne's albums popularity decreased especially after the 3rd album. This third album seems different musically (tempo, energy, speechiness) and has songs viewed as part of a style called "Bubblegum Pop". It was made after she left Arista Records, and after the biggest musicians turnover in her backing band. While her style (hair, clothes) started to change between the two first albums (released in 2002 and 2004), which is consistent with her leaving teenagehood, her biggest musical change happened on the third album (2007). This change in both style and music has lost her a part of her fans. And it could obviously not be explained by the artist being replaced in 2003.

```
[1]: import pandas as pd
import altair as alt
alt.renderers.enable('notebook')
```

[1]: RendererRegistry.enable('notebook')

#### 1.1 Avril Lavigne studio albums data

[3, 4]

```
"billboard200_debut": 2, "label": ["Arista Records"],
          "producers": ["L.A. Reid", "The Matrix", "Clif Magness", "Curt Frasca",
      →"Peter Zizzo"]},
         {"name": "Under My Skin", "year": 2004, "genre": ["Alternative rock", "Pop,
      →punk"], "global_sales": 10000000,
          "billboard200 debut": 1, "label": ["Arista Records", "RCA Records"],
          "producers": ["Raine Maida", "Don Gilmore", "Butch Walker"]},
         {"name": "The Best Damn Thing", "year": 2007, "genre": ["Bubblegum⊔
      →pop", "Pop punk"], "global_sales": 6000000,
          "billboard200 debut": 1, "label": ["RCA Records"],
          "producers": ["Avril Lavigne", "Deryck Whibley", "Butch Walker", "Rob⊔
      →Cavallo", "Dr. Luke",
                       "The Submarines", "Jesse Welch", "Steven Wolf"]},
         {"name": "Goodbye Lullaby", "year": 2011, "genre": ["Pop rock"], __

¬"global_sales": 2000000,
          "billboard200_debut": 4, "label": ["RCA Records"],
          "producers": ["Avril Lavigne", "Deryck Whibley", "Butch Walker", "Max_

→Martin", "Shellback"]},
         {"name": "Avril Lavigne", "year": 2013, "genre": ["Pop", "Pop rock"], [

¬"global_sales": 650000,

          "billboard200 debut": 5, "label": ["Epic Records"],
          "producers": ["Avril Lavigne", "L.A. Reid", "Martin Johnson", "Peter⊔
      \hookrightarrowSvensson",
                       "David Hodges", "Matt Squire", "Chad Kroeger"]},
         {"name": "Head Above Water", "year": 2019, "genre": ["Pop rock"],
      \hookrightarrow "global_sales": None,
          "billboard200 debut": 13, "label": ["BMG"],
          "producers": ["Avril Lavigne", "Stephan Moccio", "Chris Baseford", "Johan ∪

Garlsson",

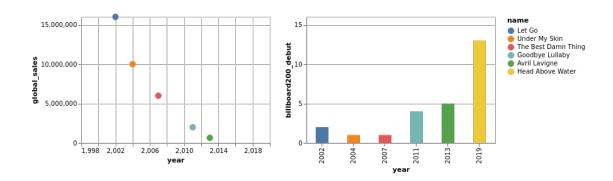
                        "Lauren Christy", "Ryan Cabrera", "Chad Kroeger"]}
[3]: df albums = pd.DataFrame(al albums)
[4]: df_albums
[4]:
                                                           genre global_sales \
                       name year
     0
                     Let Go
                             2002
                                    [Alternative rock, Pop punk]
                                                                     16000000.0
                                    [Alternative rock, Pop punk]
              Under My Skin
                             2004
                                                                     1000000.0
     1
       The Best Damn Thing
                             2007
                                       [Bubblegum pop, Pop punk]
                                                                      6000000.0
     3
            Goodbye Lullaby
                             2011
                                                      [Pop rock]
                                                                      2000000.0
     4
              Avril Lavigne 2013
                                                 [Pop, Pop rock]
                                                                       650000.0
     5
           Head Above Water 2019
                                                      [Pop rock]
                                                                            NaN
        billboard200_debut
                                                     label \
     0
                         2
                                          [Arista Records]
```

```
1
                            [Arista Records, RCA Records]
     2
                                             [RCA Records]
                          1
     3
                          4
                                              [RCA Records]
     4
                                             [Epic Records]
                         5
     5
                         13
                                                      [BMG]
                                                 producers
       [L.A. Reid, The Matrix, Clif Magness, Curt Fra...
                 [Raine Maida, Don Gilmore, Butch Walker]
     2 [Avril Lavigne, Deryck Whibley, Butch Walker, ...
     3 [Avril Lavigne, Deryck Whibley, Butch Walker, ...
     4 [Avril Lavigne, L.A. Reid, Martin Johnson, Pet...
     5 [Avril Lavigne, Stephan Moccio, Chris Baseford...
[6]: df_albums.to_csv("al_albums_data.csv")
```

#### 1.1.1 Albums sales and debut in US charts

<vega.vegalite.VegaLite at 0x7fe0e2056a58>

[6]:



#### => A.L. studio albums global sales decreased with time

```
=> A.L. studio albums US chart debut worsened with time
[7]: albums_selection = df_albums[["year", "label", "producers"]]
     pd.set_option('max_colwidth', 120)
     albums_selection
[7]:
        year
                                      label
                           [Arista Records]
       2002
     1 2004
              [Arista Records, RCA Records]
     2 2007
                              [RCA Records]
     3 2011
                              [RCA Records]
     4 2013
                             [Epic Records]
     5 2019
                                      [BMG]
                             producers
     0
                                                        [L.A. Reid, The Matrix, Clif
    Magness, Curt Frasca, Peter Zizzo]
                                                                               [Raine
    Maida, Don Gilmore, Butch Walker]
     2 [Avril Lavigne, Deryck Whibley, Butch Walker, Rob Cavallo, Dr. Luke, The
     Submarines, Jesse Welch, Steven Wolf]
                                                   [Avril Lavigne, Deryck Whibley,
    Butch Walker, Max Martin, Shellback]
                   [Avril Lavigne, L.A. Reid, Martin Johnson, Peter Svensson, David
    Hodges, Matt Squire, Chad Kroeger]
           [Avril Lavigne, Stephan Moccio, Chris Baseford, Johan Carlsson, Lauren
     Christy, Ryan Cabrera, Chad Kroeger]
```

#### => Frequent change of producers, changed labels several time

### 1.2 Avril Lavigne's backing band

[3]

- 2nd album (2004): 1 new musician (since the previous album)
- 3rd album (2007): 6 new musicians
- 4th album (2011): 1 new musician
- 5th album (2013): 2 new musicians
- 6th album (2019): 2 new musicians

=> There is no one left from the original band, they stayed for the first or two first albums

The 3rd album has the most new band members.

#### 1.3 Avril Lavigne's songs

albums\_content = {

[5]

```
[33]:
     al_songs = pd.read_csv('al_songs_spotify_data.csv')
[34]:
      al_songs.head()
[34]:
                     title
                                    artist
                                                top genre
                                                                       added
                                                           year
      0
              Complicated Avril Lavigne
                                            canadian pop
                                                           2002
                                                                  2020-03-05
                            Avril Lavigne
      1
                 Sk8er Boi
                                            canadian pop
                                                           2002
                                                                  2020-03-05
      2
            What the Hell
                            Avril Lavigne
                                            canadian pop
                                                           2011
                                                                  2020-03-05
                            Avril Lavigne
                                            canadian pop
      3
                Girlfriend
                                                           2007
                                                                  2020-03-05
                            Avril Lavigne canadian pop
                                                                  2020-03-05
         Head Above Water
                                                           2019
         Beats per minute
                                    danceability
                                                   Loudness (dB)
                            energy
                                                                    liveness
                                                                               valence
                                                                -6
      0
                                 78
                                                59
                                                                           30
                                                                                    43
                        78
                                 90
                                                49
                                                                -4
                                                                           36
      1
                       150
                                                                                    48
      2
                       150
                                 93
                                                58
                                                                -4
                                                                           14
                                                                                    88
      3
                       164
                                 96
                                                56
                                                                -2
                                                                           21
                                                                                    67
                                 69
                                                58
                       130
                                                                -5
                                                                           10
                                                                                    27
                                                popularity
         duration
                   acousticness
                                   speechiness
      0
              245
                                6
                                              5
                                                         76
      1
              204
                                0
                                              5
                                                         74
      2
              221
                                0
                                              5
                                                         73
      3
              217
                                             10
                                                         72
                                0
              221
                                1
                                              7
                                                         71
[35]: # Add an 'album' column
```

```
"album1": {"name": "Let Go",
              "songs": ["Losing Grip", "Complicated", "Sk8er Boi", "I'm with⊔
→You", "Mobile", "Unwanted",
                        "Tomorrow", "Anything but Ordinary", "Things I'll
→Never Say", "My World",
                        "Nobody's Fool", "Too Much to Ask", "Naked"]},
   "album2": {"name": "Under My Skin",
              "songs": ["Take Me Away", "Together", "Don't Tell Me", "He

→Wasn't",
                        "How Does It Feel", "My Happy Ending", "Nobody's
→Home", "Forgotten",
                        "Who Knows", "Fall to Pieces", "Freak Out", "Slipped
→Away"]},
   "album3": {"name": "The Best Damn Thing",
              "songs": ["Girlfriend", "I Can Do Better", "Runaway", "The Best
→Damn Thing",
                        "When You're Gone", "Everything Back but You", "Hot", __
"I Don't Have to Try", "One of Those Girls",

¬"Contagious", "Keep Holding On"]},
   "album4": {"name": "Goodbye Lullaby",
              "songs": ["Black Star", "What the Hell", "Push", "Wish You Were⊔
→Here", "Smile",
                        "Stop Standing There", "I Love You", "Everybody
→Hurts", "Not Enough",
                       "4 Real", "Darlin", "Remember When", "Goodbye", u
→"Alice"]},
   "album5": {"name": "Avril Lavigne",
              "songs": ["Rock n Roll", "Here's to Never Growing Up", "17",
→"Bitchin' Summer",
                        "Let Me Go", "Give You What You Like", "Bad Girl", __

→"Hello Kitty",
                        "You Ain't Seen Nothin' Yet", "Sippin' On Sunshine", L
→"Hello Heartache",
                        "Falling Fast", "Hush Hush"]},
   "album6": {"name": "Head Above Water",
              "songs": ["Head Above Water", "Birdie", "I Fell in Love with the∟
→Devil",
                        "Tell Me It's Over", "Mailbox", "Dumb Blonde", "It Was
→In Me",
                        "Souvenir", "Crush", "Goddess", "Bigger Wow", "Love Me_
→Insane", "Warrior"]}
   }
```

```
[36]: import string
      def clean_song_title(song_title):
          song_title = song_title.lower()
          song_title = song_title.split(" - ")[0]
          song_title = song_title.split(" (")[0]
          return song_title
[37]: for k, v in albums_content.items():
          v["songs"] = [clean_song_title(song) for song in v["songs"]]
[38]: def get_album_names(title):
          title = clean song title(title)
          if title in albums_content["album1"]["songs"]:
              return albums content["album1"]["name"]
          if title in albums_content["album2"]["songs"]:
              return albums_content["album2"]["name"]
          if title in albums_content["album3"]["songs"]:
              return albums_content["album3"]["name"]
          if title in albums_content["album4"]["songs"]:
              return albums_content["album4"]["name"]
          if title in albums_content["album5"]["songs"]:
              return albums_content["album5"]["name"]
          if title in albums_content["album6"]["songs"]:
              return albums_content["album6"]["name"]
[39]: # Add empty 'album' album
      al_songs.assign(album="")
[39]:
                                title
                                              artist
                                                          top genre
                                                                     year
                                                                                 added
      0
                          Complicated
                                      Avril Lavigne
                                                       canadian pop
                                                                     2002
                                                                           2020-03-05
                            Sk8er Boi
                                       Avril Lavigne
                                                       canadian pop
      1
                                                                     2002
                                                                           2020-03-05
      2
                       What the Hell
                                      Avril Lavigne
                                                       canadian pop
                                                                            2020-03-05
                                                                     2011
      3
                           Girlfriend Avril Lavigne
                                                       canadian pop
                                                                     2007
                                                                            2020-03-05
                    Head Above Water Avril Lavigne
      4
                                                       canadian pop
                                                                     2019
                                                                           2020-03-05
      70
                          Black Star Avril Lavigne
                                                       canadian pop
                                                                     2011
                                                                           2020-03-05
      71
                               4 Real
                                       Avril Lavigne
                                                       canadian pop
                                                                     2011
                                                                           2020-03-05
      72
                 Sippin' On Sunshine
                                       Avril Lavigne
                                                       canadian pop
                                                                     2013
                                                                           2020-03-05
      73
                              Goodbye
                                       Avril Lavigne
                                                       canadian pop
                                                                     2011
                                                                           2020-03-05
      74
          You Ain't Seen Nothin' Yet
                                       Avril Lavigne
                                                      canadian pop
                                                                     2013
                                                                           2020-03-05
          Beats per minute
                                     danceability Loudness (dB)
                                                                   liveness
                                                                             valence
                             energy
      0
                        78
                                 78
                                               59
                                                               -6
                                                                         30
                                                                                   43
                                                               -4
      1
                       150
                                 90
                                               49
                                                                         36
                                                                                   48
      2
                                                               -4
                                                                         14
                       150
                                 93
                                               58
                                                                                   88
      3
                       164
                                               56
                                                               -2
                                                                         21
                                                                                   67
                                 96
```

			•••		•••	•••	
	••			_ ^			
70	1	.28 3	33	54	-9	19	20
71		78 8	34	52	-6	11	28
72	1	.76 7	'3	55	-7	32	56
73	1	.67 3	3	18	-7	13	24
74	1	.45 9	00	56	-4	7	67
	duration acou	sticness	speechiness	popularity	album		
0	245	6	5	76			
1	204	0	5	74			
2	221	0	5	73			
3	217	0	10	72			
4	221	1	7	71			
	•••	•••	•••	•••			
70	94	61	3	41			
71	208	0	3	41			
72		0	12	41			
73		72	3				
74		0	6	40			
	<pre>5 rows x 16 colu r idx, row in al album_name = g al_songs.loc[i</pre>	_songs.it get_album_	names(row.ti				
fo	r idx, row in al album_name = g	_songs.it get_album_	names(row.ti				
fo	ar idx, row in all album_name = g al_songs.loc[i	_songs.it get_album_ dx, "albu	names(row.ti	name	ear	added \	
fo	ar idx, row in all album_name = g al_songs.loc[in_songs.head()	_songs.it get_album_ .dx, "albu	names(row.ti mm"] = album_r	name top genre ye	ear 2002 2020	added \	\
fo	ar idx, row in all album_name = g al_songs.loc[i	songs.it get_album_ .dx, "albu	names(row.ti mm"] = album_n artist = Lavigne cana	name top genre ye adian pop 20	002 2020	-03-05	\
fo al	ar idx, row in all album_name = g al_songs.loc[i _songs.head() titl Complicate Sk8er Bo	ed Avril	names(row.time"] = album_i artist	top genre ye adian pop 20 adian pop 20	002 2020 002 2020	0-03-05 0-03-05	\
fo al	r idx, row in all album_name = g al_songs.loc[insongs.head()]  titl Complicate Sk8er Bo What the Hel	_songs.it get_album_ .dx, "albu .dx, "albu	artist canal Lavigne canal Lavigne canal Lavigne canal	top genre ye adian pop 20 adian pop 20 adian pop 20	002 2020 002 2020 011 2020	0-03-05 0-03-05 0-03-05	\
fo al 0 1 2	ar idx, row in all album_name = g al_songs.loc[i _songs.head() titl Complicate Sk8er Bo	songs.it get_album_ _dx, "albu _dx, "albu _e ed Avril oi Avril	names(row.time"] = album_n  artist	top genre ye adian pop 20 adian pop 20 adian pop 20 adian pop 20	002 2020 002 2020 011 2020 007 2020	0-03-05 0-03-05 0-03-05 0-03-05	\
fo al 0 1 2 3	ar idx, row in all album_name = gal_songs.loc[insongs.head()]  titl Complicate Sk8er Bo What the Hell Girlfrier Head Above Wate	eed Avril Avril Avril Avril Avril	artist Lavigne cana	top genre ye adian pop 20 adian pop 20 adian pop 20 adian pop 20 adian pop 20	2020 2020 2020 2011 2020 2007 2020 2019 2020	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05	
fo al 0 1 2 3 4	r idx, row in al album_name = g al_songs.loc[i _songs.head() titl Complicate Sk8er Bo What the Hel Girlfrier Head Above Wate	eed Avril Avril Avril Avril Avril Avril Avril	artist Lavigne cans	top genre ye adian pop 20 adian pop 20 adian pop 20 adian pop 20 adian pop 20	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05	valence `
fo al 0 1 2 3 4 0	ar idx, row in all album_name = g al_songs.loc[insongs.head()  titl Complicate Sk8er Bo What the Hel Girlfrier Head Above Wate  Beats per minut	ee ed Avril Avril er Avril ee energy	artist Lavigne cana	top genre yeadian pop 20 adian pop 20 adian pop 20 adian pop 20 adian pop 20 aty Loudness	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li -6	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 veness v	valence '
fo all 0 1 2 3 4 0 1	ar idx, row in all album_name = gal_songs.loc[int] _songs.head()  titl Complicate Sk8er Bo What the Hell Girlfrier Head Above Wate  Beats per minut	ee d Avril Avril Avril er Avril ee energy	artist Lavigne cana	top genre ye adian pop 20 adian pop 20 adian pop 20 adian pop 20 adian pop 20 ty Loudness	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li -6 -4	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05	valence 43
fo al 0 1 2 3 4 0 1 2	r idx, row in all album_name = g al_songs.loc[insongs.head()] songs.head() title Complicate Sk8er Bo What the Hell Girlfrier Head Above Wate  Beats per minut  7 15	eed Avril	artist Lavigne cand	top genre yeadian pop 20 adian pop 20 adian pop 20 adian pop 20 adian pop 20 ty Loudness 59	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li -6 -4 -4	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05	valence 43 48 88
fo all 0 1 2 3 4 0 1	ar idx, row in all album_name = gal_songs.loc[int] _songs.head()  titl Complicate Sk8er Bo What the Hell Girlfrier Head Above Wate  Beats per minut	eed Avril	artist Lavigne cand	top genre ye adian pop 20 adian pop 20 adian pop 20 adian pop 20 adian pop 20 ty Loudness	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li -6 -4	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05	valence 43
fo all 0 1 2 3 4 0 1 2 3	ar idx, row in all album_name = g al_songs.loc[insongs.head()  titl Complicate Sk8er Bo What the Hell Girlfrier Head Above Water Beats per minute 7 15 15 16 15 16 15	ee ad Avril	artist Lavigne cand	top genre yeadian pop 20 adian pop 20 adian pop 20 adian pop 20 adian pop 20 ty Loudness 59 49 58 56 58	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li -6 -4 -4 -2	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05	valence 43 48 88 67 27
fo all 0 1 2 3 4 4	album_name = g al_songs.loc[i _songs.head()  titl Complicate Sk8er Bo What the Hel Girlfrier Head Above Wate  Beats per minut  7 15 16 13 duration acous	eed Avril	artist Lavigne cand Lavigne can	top genre yeadian pop 20 adian pop 20 ty Loudness 59 49 58 56 58	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li -6 -4 -4 -2	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 14 21 10	valence 43 48 88 67 27
fo al 0 1 2 3 4 0 1 2 3 4 0	album_name = gal_songs.loc[i _songs.head()  titl Complicate Sk8er Bo What the Hel Girlfrier Head Above Wate  Beats per minut  7 15 16 13 duration acous 245	ee d Avril A	artist Lavigne cans Lavigne cans Lavigne cans Lavigne cans Lavigne cans Lavigne cans Section cans Compare can	top genre yeadian pop 20 adian pop 20 adian pop 20 adian pop 20 adian pop 20 ty Loudness 59 49 58 56 58 popularity 76	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li -6 -4 -4 -2	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 14 21 10	valence 43 48 88 67 27 bum Go
fo all 0 1 2 3 4 4	album_name = g al_songs.loc[i _songs.head()  titl Complicate Sk8er Bo What the Hel Girlfrier Head Above Wate  Beats per minut  7 15 16 13 duration acous	eed Avril	artist Lavigne cand Lavigne can	top genre yeadian pop 20 adian pop 20 ty Loudness 59 49 58 56 58	002 2020 002 2020 011 2020 007 2020 019 2020 (dB) li -6 -4 -4 -2 -5	0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 0-03-05 14 21 10	valence 43 48 88 67 27 bum Go

-5

```
4
              221
                                           7
                                                      71
                                                              Head Above Water
[42]: al_songs.to_csv('al_songs_spotify_data_with_albums.csv', index=False)
[44]: # Tempo (BPM)
      chart3 = alt.Chart(al_songs, width=200, height=200).mark_boxplot(opacity=0.7).
       →encode(
          x='year:0',
          y='Beats per minute:Q',
          color=alt.Color('album', sort=['year']),
          tooltip=['title', 'Beats per minute']
      ).interactive()
      # Energy
      chart4 = alt.Chart(al_songs, width=200, height=200).mark_boxplot(opacity=0.7).
       →encode(
          x='year:0',
          y='energy:Q',
          color=alt.Color('album', sort=['year']),
          tooltip=['title', 'energy']
      ).interactive()
      # Danceability
      chart5 = alt.Chart(al_songs, width=200, height=200).mark_boxplot(opacity=0.7).
       →encode(
          x='year:0',
          y='danceability:Q',
          color=alt.Color('album', sort=['year']),
          tooltip=['title', 'danceability']
      ).interactive()
      # Positive Mood (Valence)
      chart6 = alt.Chart(al_songs, width=300, height=300).mark_boxplot(opacity=0.7).
      →encode(
          x='year:0',
          y='valence:Q',
          color=alt.Color('album', sort=['year']),
          tooltip=['title', 'valence']
      ).interactive()
      # Acousticness
      chart7 = alt.Chart(al_songs, width=300, height=300).mark_boxplot(opacity=0.7).
       →encode(
          x='year:0',
          y='acousticness:Q',
          color=alt.Color('album', sort=['year']),
```

10

72 The Best Damn Thing

3

217

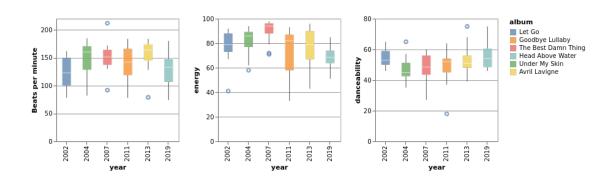
0

```
tooltip=['title', 'acousticness']
).interactive()
# Speechiness
chart8 = alt.Chart(al_songs, width=300, height=300).mark_boxplot(opacity=0.7).
→encode(
   x='year:0',
   y='speechiness:Q',
   color=alt.Color('album', sort=['year']),
   tooltip=['title', 'speechiness']
).interactive()
# Popularity
chart9 = alt.Chart(al_songs, width=300, height=300).mark_boxplot(opacity=0.7).
→encode(
   x='year:0',
   y='popularity:Q',
   color=alt.Color('album', sort=['year']),
   tooltip=['title', 'popularity']
).interactive()
```

```
[45]: # Tempo (BPM) | Energy | Danceability chart3 | chart4 | chart5
```

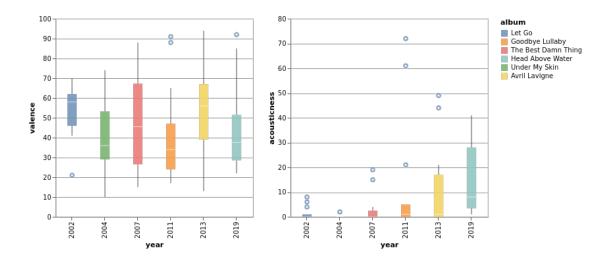
<vega.vegalite.VegaLite at 0x7f994c0b6160>

#### [45]:



```
[46]: # Positive Mood (Valence) | # Acousticness chart6 | chart7
```

<vega.vegalite.VegaLite at 0x7f994c0b6dd8>

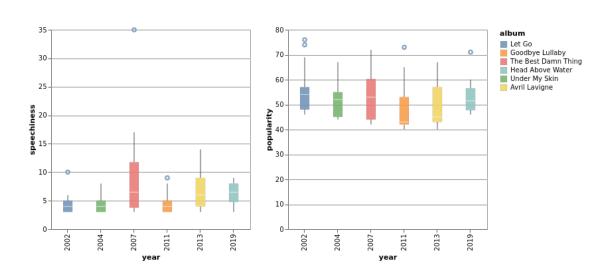


## [46]:

[47]: # Speechiness | Popularity chart8 | chart9

<vega.vegalite.VegaLite at 0x7f994c058b00>

## [47]:



=> Musically, songs from the 3rd record seem more upbeat (as reflected by their BPM and energy) and have more lyrics. Songs on the 4th album are more acoustic.

Using songs from an open Spotify playlist [5] shows the 1st and 2nd album are more similar (energy, acousticness, speechiness and popularity) and the 1st and fourth album are also quite close (BPM, danceability and speechiness). It'd be interesting to try this analysis on songs from the 2 last studio albums.

#### References

 $Conspiracy * [1] \ https://www.theguardian.com/lifeandstyle/shortcuts/2017/may/15/avril-lavigne-melissa-cloning-conspiracy-theories * [2] \ https://avrilestamorta.blogspot.com/$ 

Data for analysis \* [3] https://en.wikipedia.org/wiki/Avril\_Lavigne \* [4] https://en.wikipedia.org/wiki/Avril\_Lavigne\_discography \* [5] open Spotify playlist with all songs from studio recorded albums: https://open.spotify.com/playlist/1cVKLVWEFN2Be7tTA13qUj analyzed using http://organizeyourmusic.playlistmachinery.com (Powered by Spotify. Created by @plamere at The Science of Mu)

Other \* [6] photos: https://avrillavigne.com/music/ \* MTV docu, 2007: https://www.youtube.com/watch?v=f8GLe10jLSw

[]: