

Blues for Gary

Style: swing
FM69

Bb13 2

FM69 3

F#m9 4

The image shows a single line of musical notation in 4/4 time, starting with a treble clef and a key signature of one flat (Bb). The first measure contains a whole rest. The second measure begins with a quarter rest, followed by a quarter note G4, a quarter note F4, and a dotted half note E4. The third measure starts with a quarter note D4, a quarter note C4, and a dotted half note B3. The fourth measure begins with a quarter note A3, a quarter note G3, and a dotted half note F3. The notes in the second and third measures are connected by a slur. The notes in the fourth measure are highlighted in green. Above the staff, the style is indicated as 'swing' and the first measure is labeled 'FM69'. Above the second measure, the chord is labeled 'Bb13' with a '2' below it. Above the third measure, the chord is labeled 'FM69' with a '3' below it. Above the fourth measure, the chord is labeled 'F#m9' with a '4' below it.

Mini-Languages for Impro-Visor

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Support Acknowledgment

- Mellon Foundation
Faculty Enhancement Grant
- NSF REU
(Research Experience for Undergraduates)

Domains

- Human-Computer Interfaces
- Data Language Design
- Jazz Improvisation
- Music Education
- Melody Generation AI

Jazz Improvisation

- Scenario: A jazz group playing a standard tune.
- “**Head**”: The musicians play an arrangement of the original melody.
- “**Choruses**”: Some or all musicians improvise solos over the same, or related, chord changes to the original
- Throughout: Rhythm section improvises accompaniment.

Improvisation Techniques

- Most musicians employ, to varying extents, a *practiced* vocabulary of melodic fragments called “licks”.
- Most study solos of other musicians to get ideas.
- Sometimes these solos are **transcribed** or **memorized**, but rarely performed intact.
- Some pre-construct their own solos, to be treated as above.

Impro-Visor (Improvisation Advisor)

- Software to enhance the user's ability to
 - Improvise interesting solos.
 - Understand tunes and jazz harmony.
- By
 - *Engaging* him/her in the act of creation.
 - Providing support in the form of musical knowledge (“advice”).
 - Generating melodies as usable examples.

Impro-Visor Usage

- User supplies chord sequence.
- Impro-Visor supplies musical knowledge, such as licks.
- User can save licks for posterity.
- Can also be used for transcription, composition.

Related Work: “Band-in-a-Box”

- Commercial software oriented to practice or, marginally, performance accompaniment:
 - Able generate entire “improvised” solo without user’s involvement (not our main purpose).
 - A proprietary rote **database** seems to be used.
 - Elements of the solo recur after awhile.

Related Work: “Band-out-of-a-Box”

- Belinda Thom’s PhD Thesis
 - Tried to use statistical theory to learn style of soloist.
 - Create companion for “trading fours”.

Related Work: “GenJam”

- Created by Al Biles, RIT.
- Generate licks by genetic algorithm.
- React to soloist in real-time.
- One man + one computer band.

Example Solo Fragment in Impro-Visor

Style: swing

Dm9 **G13** **CM9** **A7alt**

2 3

Optional **color coding** for visual feedback:

black: chord tone

green: “color” tone (aka “tension”)

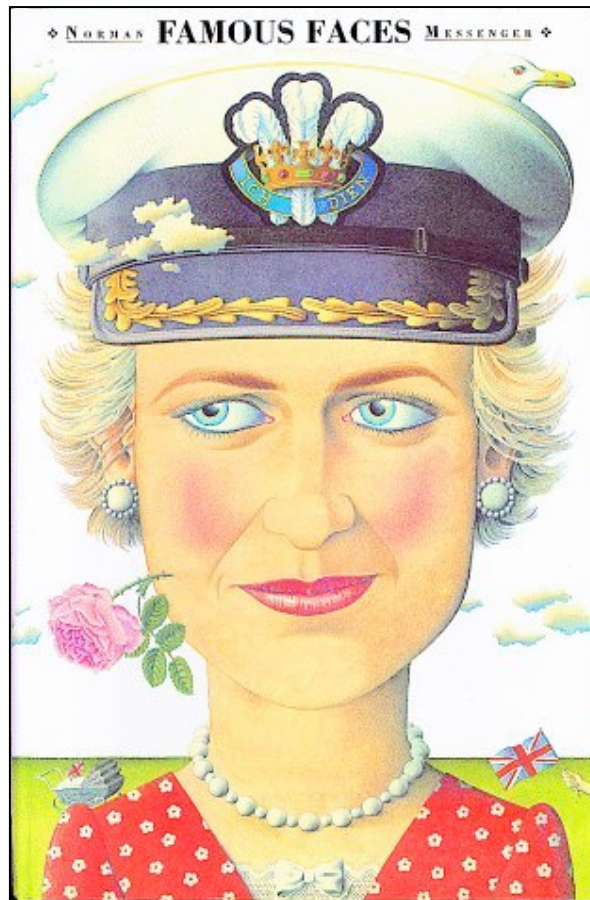
blue: approach tone to one of the above

red: none of the above (error?)

Principle of Modularity

- Solos can be constructed by concatenating library segments:
 - **Cells** (over one chord, uniform note durations)
 - **Idioms** (over one chord, familiar, non-uniform)
 - **Licks** (over one or more chords)
 - **Quotes** (borrowed from another song or solo)
- Like “mix-and-match” book or Mozart’s dice game

Mix and Match Book

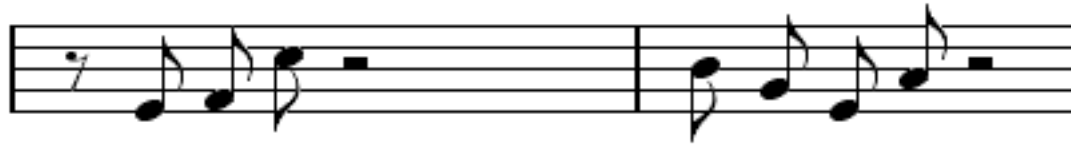


Six Cells over two chords ...

(Dm9 G13 are examples of two chords often found in succession.)

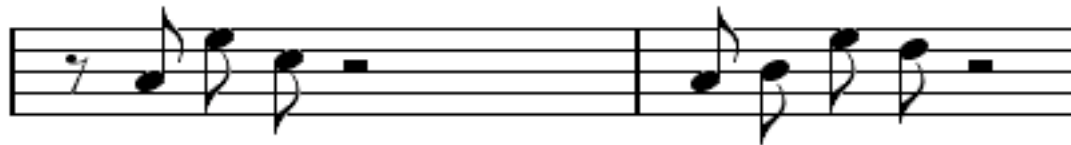
Dm9

G13



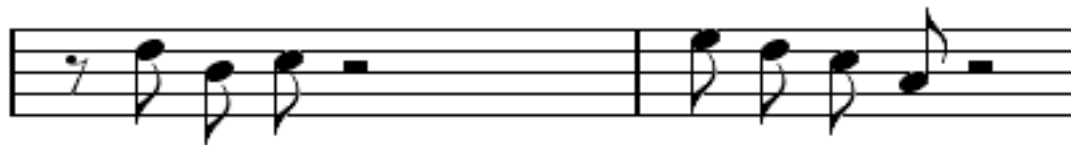
Dm9

G13



Dm9

G13



... produce nine different licks.

Dm9 G13 Dm9 G13 Dm9 G13

Dm9 G13 Dm9 G13 Dm9 G13

Dm9 G13 Dm9 G13 Dm9 G13

Giving Advice to the User

Style: swing
Dm9 **G13** **CM9** **A7alt**

2 3

selected "slot"

The image shows a musical staff in 4/4 time with a treble clef. The first measure contains a sequence of notes: D4, E4, F4, G4, A4, B4, C5, and D5. The second measure is empty. Above the staff, the style is indicated as 'swing'. Chord labels are placed above the staff: 'Dm9' above the first measure, 'G13' above the second measure, 'CM9' above the third measure, and 'A7alt' above the fourth measure. A vertical blue line is drawn at the end of the first measure, and a yellow arrow points to it from below, with the text 'selected "slot"' underneath. The numbers '2' and '3' are placed above the second and third measures respectively.

Advice Pop-Up: Things Seasoned Players Know, but Novices Don't

Style: swing
Dm9 **G13** **CM9** **A7alt**

2 3

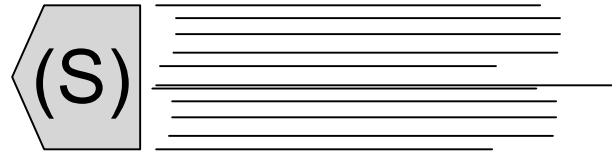
Advice for

- Advice for G13 -> CM9 (unspecified starting note)
 - chord tones
 - color tones ("tensions")
 - tones approaching target in current chord
 - chord tones approaching target in next chord (CM9)
 - approaching e
 - f
 - non-chord tones approaching target in next chord (CM9)
 - scale tones
 - chord extensions
 - cells
 - idioms

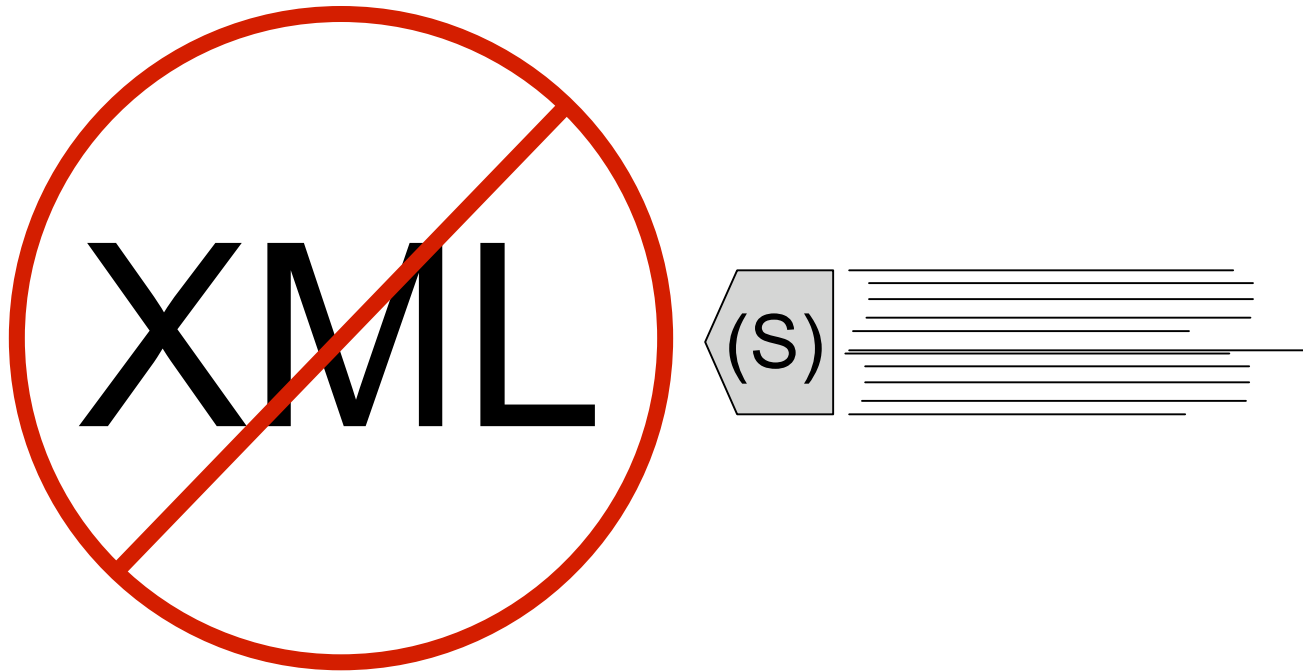
User/Admin Configurability

- User-friendly **S-expression** encodings.
- Several Cohesive Mini-Languages
 - Leadsheet language (for tune or solo)
Vocabulary language
 - Chord definitions
 - Scale definitions
 - Licks
 - Styles
 - Grammar language
 - For lick generator

There *was* a silver bullet.



There *was* a silver bullet.



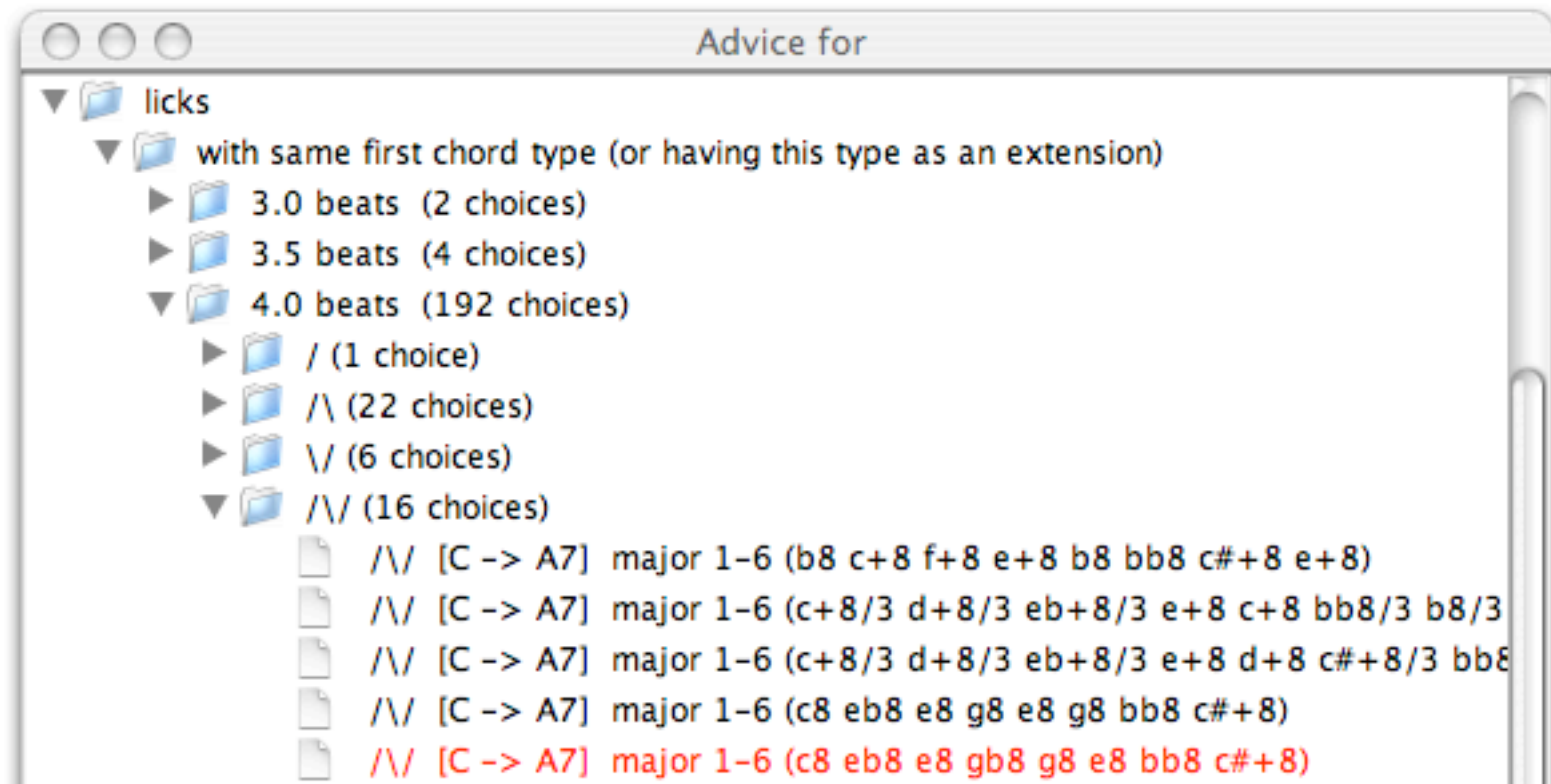
Leadsheet Mini-Language

Designed for Musician's Ease of Use

FM69		Bb13		FM69		F#m9 B7	
Bb13		Dbm7 Gb7		FM69		NC D7alt / /	
Gm9		C7b9		F69 D7alt		Gm9 C9	

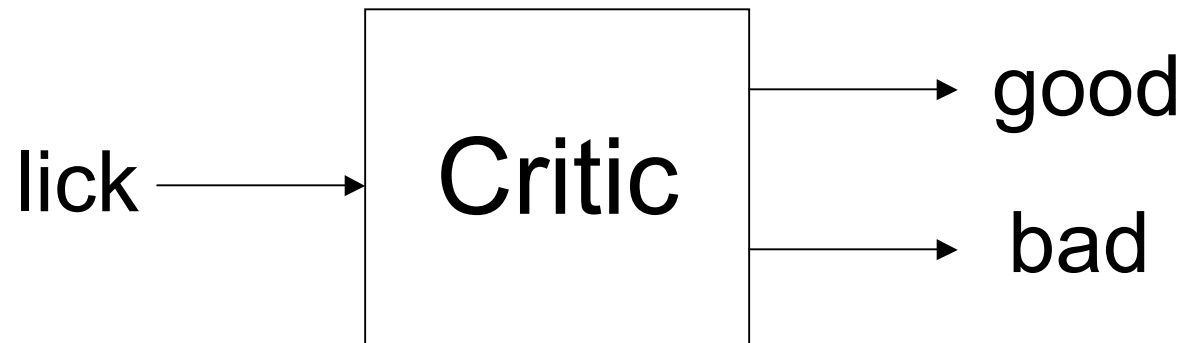
r2 a8 r8 c+8 f1
d+8
c+8 bb8 r4 a8 r8 c+8 e2+2/3+16/3
eb4
d2/3+16/3 r8 ab8 c+8 d+8 f+8
e+4 cb8/3 bb8/3 g8/3 gb4 r8 d8
e8 r8 a8 c+2+8
r4 eb+8 c+8 ab8 g8 f#4
r2/3+16/3 d8 f8 a8 c+8 a8
bb4 g8/3 f8/3 e8/3 f8 db2/3+16/3
c2 bb8 c+8 eb+8 c+8
d+8 bb8 g8 f8 e2

The Lick Mini-Language



Lick Generation: Machine Learning

- Totally random choices don't sound good.
- Original purpose was to provide examples (good and bad) to *train* a classifier (e.g. neural network).



Simple Lick Generator

- Given two-chord sequence and number of beats...
- Specify note probabilities.
- Specify range of durations (e.g eighth-note to quarter-note).
- Specify probability of a rest instead of a note.
- Specify maximum and minimum jump intervals.
- Choose randomly within these parameters.

Results

- For eighth-note only durations, 4-beats, with repetition-avoidance:
 - 90% “useable” licks.
 - Difficult to generate bad examples.
 - Therefore not so good for training classifier.

Results

- For eighth-note and quarter note 8 beats, with repetition-avoidance:
 - 60-70% useable
- For wider range of durations and >8 beats, lines often lack coherence due to randomness.

Grammar-Based Lick Generator

- Use probabilistic context-free grammar to generate **annotated rhythms**, then
- Fill in note values probabilistically with choices outlined in grammar.
- Productions humanly-designed to provide coherence.

Grammar Mini-Language

(base (P 0) () 1)
(base (P 1) (Seg1) 1)
(base (P 2) (Seg2) 1)
(base (P 3) (Seg2 Seg1) 1)

(rule (P Y) (Seg2 (P (- Y 2))) 0.25)
(rule (P Y) (Seg4 (P (- Y 4))) 0.75)
(rule (Seg4) (Seg2 V4 V4) 0.52)
(rule (Seg4) (V8 N4 N4 N4 V8) 0.01)
(rule (Seg4) (V4 Seg2 V4) 0.47)
(rule (Seg2) (N2) 0.06)
(rule (Seg2) (V4 V4) 0.6)
(rule (Seg2) (V8 N4 V8) 0.12)
(rule (Seg2) (H4. N8) 0.16)
(rule (Seg2) (H4/3 H4/3 H4/3) 0.06)
(rule (Seg1) (C4) 1)

(rule (V4) (N4) 0.22)
(rule (V4) (V8 V8) 0.72)
(rule (V4) (H8/3 H8/3 H8/3) 0.05)
(rule (V4) (H8/3 H8/3 A8/3) 0.01)
(rule (V8) (N8) 0.99)
(rule (V8) (H16 A16) 0.01)
(rule (N2) (C2) 1)
(rule (N4) (C4) 0.5)
(rule (N4) (L4) 0.2)
(rule (N4) (S4) 0.5)
(rule (N4) (A4) 0.01)
(rule (N4) (R4) 0.25)
(rule (N8) (C8) 0.4)
(rule (N8) (L8) 0.2)
(rule (N8) (S8) 0.4)
(rule (N8) (A8) 0.01)
(rule (N8) (R8) 0.1)

Lick Generator

Grammar Help

(X8/3 X8/3 X8/3 C8 S8 X8/3 X8/3
X8/3 L8 S8 C4 C8 C8 C8 S8 R4)

Generate

Generate Rhythm

Fill Melody

Get Selected Rhythm

Play Stop

Save Lick

Pitch	Interval	Duration	
Max 82	6	8	
Min 60	0	8	
Quarter Notes:	Rest Prob.	Leap Prob.	
1	0.1	0.01	
Weights:			
Chord Tone	Scale Tone	Color Tone	Chord Tone Decay Rate
0.7	0.05	0.25	0.0

Scale: Type: Use First Scale

Root: C

Grade: 1 2 3 4 5 6 7 8 9 10

Save Label: <Generated Lick>

Clear All Fill Auto-fill Weights

Dm9 probabilities:

C	C#	D	D#	E	F	F#	G	G#	A	A#	B
0.7	0.0	0.7	0.0	0.7	0.7	0.0	0.05	0.0	0.7	0.0	0.05

G13 probabilities:

C	C#	D	D#	E	F	F#	G	G#	A	A#	B
0.05	0.25	0.7	0.0	0.7	0.7	0.0	0.7	0.0	0.7	0.0	0.7

CM9 probabilities:

C	C#	D	D#	E	F	F#	G	G#	A	A#	B
0.7	0.0	0.7	0.0	0.7	0.0	0.05	0.7	0.0	0.05	0.0	0.7

Results for Grammar-Based Generator

- Really good (opinion).
- Works over any chord sequence.
- Can construct an entire chorus or multiple choruses.
- Does not use database.
- Tremendous variety: Frequently results in licks not heard before.

Lick Generator Examples

Style: swing
Dm9 G13 CM9 A7alt

Style: swing
Dm9 G13 CM9 A7alt

Style: swing
Dm9 G13 CM9 A7alt

Conjecture

- An implied grammar probably comes closest to what professionals use implicitly (without thinking) in improvising.

Other AI/Language Facets of Impro-Visor

- Chord voicing and voice-leading algorithms
- **Voicing:** how notes of chord are stacked
- **Voice-leading:** smooth flow of notes of one chord into the next

Chord & Voicing Mini-Language

(chord

(name CM69)

(pronounce C major six nine)

(family major)

(spell c e g a d)

(priority d e a g c)

(approach (c b c#) (e eb f) (g f# g#) (a g# bb) (d c# eb))

(color b f#)

(voicings

(left-hand-A (type closed) (notes e g a d+))

(left-hand-B (type closed) (notes g d+ e+ a+))

(quartal (type open) (notes e a d+ g+))

(red-garland-A (type hyper-open) (notes e g a d+) (extension d++ g++ d+++))

(red-garland-B (type hyper-open) (notes g d+ e+ a+) (extension d++ g++ d+++)))

(scales

(C major)

(C lydian)

(C bebop major))

(extensions CM69#11)

(substitute CM7 CM9 CM69#11))

Bass-Line and Comping Generation

- Automatic creation of bass lines and “comping” according to another set of probabilistic rules.
- Rules are part of **style** mini-language.

Style Mini-Language

```
(style
  (name swing)
  (swing 0.67)
  (bass-pattern (rules B4 S4 C4 A4) (weight 10))
  (bass-pattern (rules B4 C4 C4 A4) (weight 5))
  (bass-pattern (rules B4 S4 C4 S4) (weight 3))
  (drum-pattern
    (drum 51 X4 X8 X8 X4 X8 X8)
    (weight 10)
  )
  (chord-pattern (rules X1+1) (weight 7))
  (chord-pattern (rules X1) (weight 7))
  (chord-pattern (rules X2) (weight 8)) )
```

Conclusions and Evaluation

- Original purpose of Impro-Visor was to educate users and promote their creativity.
- Successfully used for two semesters by students in a jazz improvisation class.
- Grammar-driven lick generation makes the tool itself creative: thousands of solos without a repeat.
- Other AI aspects present: voicing selection, bass-lines and comping

Future Work

- Further work on critic machine-learning experiment.
- Maybe incorporate critic neural net.
- Non-chordal lick selection.
- Database efficiency.
- Real-time performance.
- Grammar learning.

Blues For Gary

Style: swing
FM69

Bb13

FM69

F#m9

B7

2 3 4

Bb13

Dbm7

Gb7

FM69

NC

D7alt

5 6 7 8

Gm9

C7b9

F69

D7alt

Gm9

C9

9 10 11 12