

Plots Research Project

Maximilian Pfundstein

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1 Evaluation

This RMarkdown file is just meant for holding the results and plotting them. Most of the textual analysis is done in the report.

2 Cache Speedup

```
cache_speedup = data.frame(  
  caching=rep(c("no_cache", "cache"), each=3),  
  method=rep(c("parse_conllu_labels", "parse_conllu_sentences", "parse_conllu_targets"), 2),  
  time=c(15.3, 18.8, 16.2, 341 * 10^(-6), 2.37, 1.72))
```

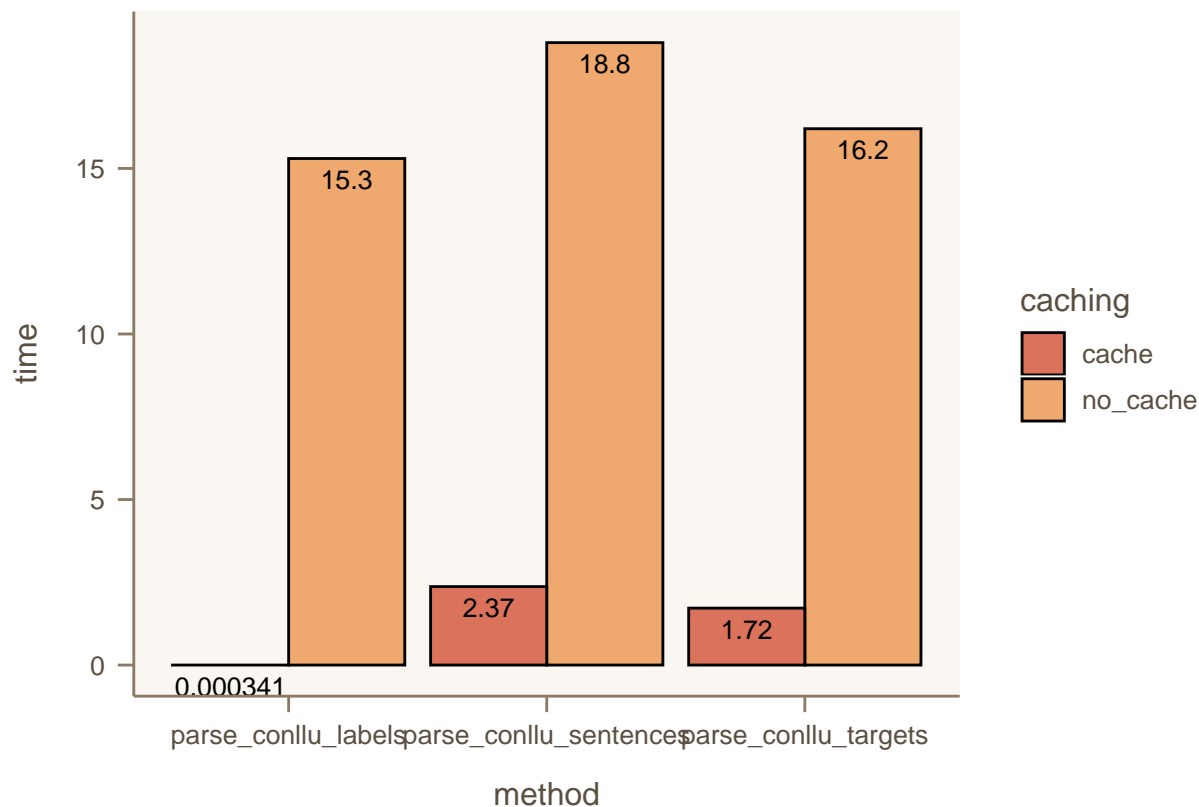
```
head(cache_speedup)
```

```
##      caching      method      time  
## 1 no_cache  parse_conllu_labels 1.53e+01  
## 2 no_cache parse_conllu_sentences 1.88e+01  
## 3 no_cache  parse_conllu_targets 1.62e+01  
## 4   cache   parse_conllu_labels 3.41e-04  
## 5   cache parse_conllu_sentences 2.37e+00  
## 6   cache  parse_conllu_targets 1.72e+00
```

```
ggthemr('dust', layout="minimal", spacing=2)
```

```
## Warning: New theme missing the following elements: axis.ticks.length.x,  
## axis.ticks.length.x.top, axis.ticks.length.x.bottom, axis.ticks.length.y,  
## axis.ticks.length.y.left, axis.ticks.length.y.right
```

```
ggplot(data=cache_speedup, aes(x=method, y=time, fill=caching)) +  
  geom_bar(stat="identity", color="black", position=position_dodge()) +  
  geom_text(aes(label=time), vjust=1.6, color="black",  
            position = position_dodge(0.9), size=3.5)
```



3 Scores for Multitask Learning

They're seperated as R cannot handle lines that are too long.

3.1 Data

Will float out of the pdf. Maybe I will fix this later.

```
syn_dev_single = c(0.001264955463026406, 0.369744196932566, 0.45900577329802034, 0.6865783671363118, 0.7000000000000001)
syn_dev_single = c(syn_dev_single, 0.9374284421013394, 0.9370841539362325, 0.9381126476977693, 0.9368999999999999)
syn_dev_raw = c(0.3230067945299734, 0.7609164942160818, 0.8331008329383084, 0.8707282819501104, 0.8825800000000001)
syn_dev_raw = c(syn_dev_raw, 0.9432123162378326, 0.9410893511233356, 0.9424691918450179, 0.9422396544180001)
syn_dev_multi = c(0.05969790527154771, 0.06280650845013422, 0.06315995963587459, 0.0636530240399824, 0.06300000000000001)
syn_dev_multi = c(syn_dev_multi, 0.06514635529973543, 0.06518170041830947, 0.06513928627602064, 0.06517000000000001)
syn_dev_loop = c(0.06700347237746083, 0.668924800962345, 0.8204022425216607, 0.8124410240070588, 0.8649000000000001)
syn_dev_loop = c(syn_dev_loop, 0.9413839279795287, 0.9420218499248161, 0.9417915002587339, 0.9422324020000001)
sem_only = c(0.028604612576738013, 0.710129184932304, 0.8136029023282025, 0.8399491902191173, 0.8600820000000001)
```

```

sem_only = c(sem_only, 0.9257053927870628, 0.9250059063755105, 0.9243974132863022, 0.9237146192498351,
sem_dev_single = c(0.0, 0.08400061359104155, 0.2694347033244494, 0.552456976985279, 0.6220755770904509,
sem_dev_single = c(sem_dev_single, 0.923371842502587, 0.9225398431570959, 0.9232545896099044, 0.9233528
sem_dev_raw = c(0.14235071205916508, 0.689131179588464, 0.7872509384926364, 0.8266844985658226, 0.83352
sem_dev_raw = c(sem_dev_raw, 0.9260092744135298, 0.9253422098434156, 0.9254250451636867, 0.925435398260
sem_dev_multi = c(0.6227885290924187, 0.7806938271149554, 0.8326245123194265, 0.849293325002955, 0.8656
sem_dev_multi = c(sem_dev_multi, 0.924836159718938, 0.925313317257073, 0.9248833460592178, 0.9253045432
sem_dev_loop = c(0.009887196081075009, 0.6184216035168515, 0.7687221603563473, 0.8076335073013864, 0.82
sem_dev_loop = c(sem_dev_loop, 0.9233672185768198, 0.9229697587495753, 0.9225327082240239, 0.9223628263
sem_only_val = 0.9239
sem_only_ood = 0.875

sem_single_val = 0.926
syn_single_val = 0.9464
sem_single_ood = 0.8741
syn_single_ood = 0.9081

sem_raw_ood = 0.8780
syn_raw_ood = 0.9092

sem_loop_val = 0.9251
syn_loop_val = 0.9429
sem_loop_ood = 0.8787
syn_loop_ood = 0.9096

sem_multi_ood = 0.8771
syn_multi_ood = 0.0739

```

3.2 Plotting

Trimming some data and creating data frame.

```

# Forget to empty old entries when logging, to getting rid of them now
sem_dev_loop = sem_dev_loop[38:237]
syn_dev_loop = syn_dev_loop[38:237]

df = data.frame(index = 1:200, sem_dev_loop, sem_dev_multi, sem_dev_raw, sem_dev_single, sem_only,
                syn_dev_loop, syn_dev_multi, syn_dev_raw, syn_dev_single)

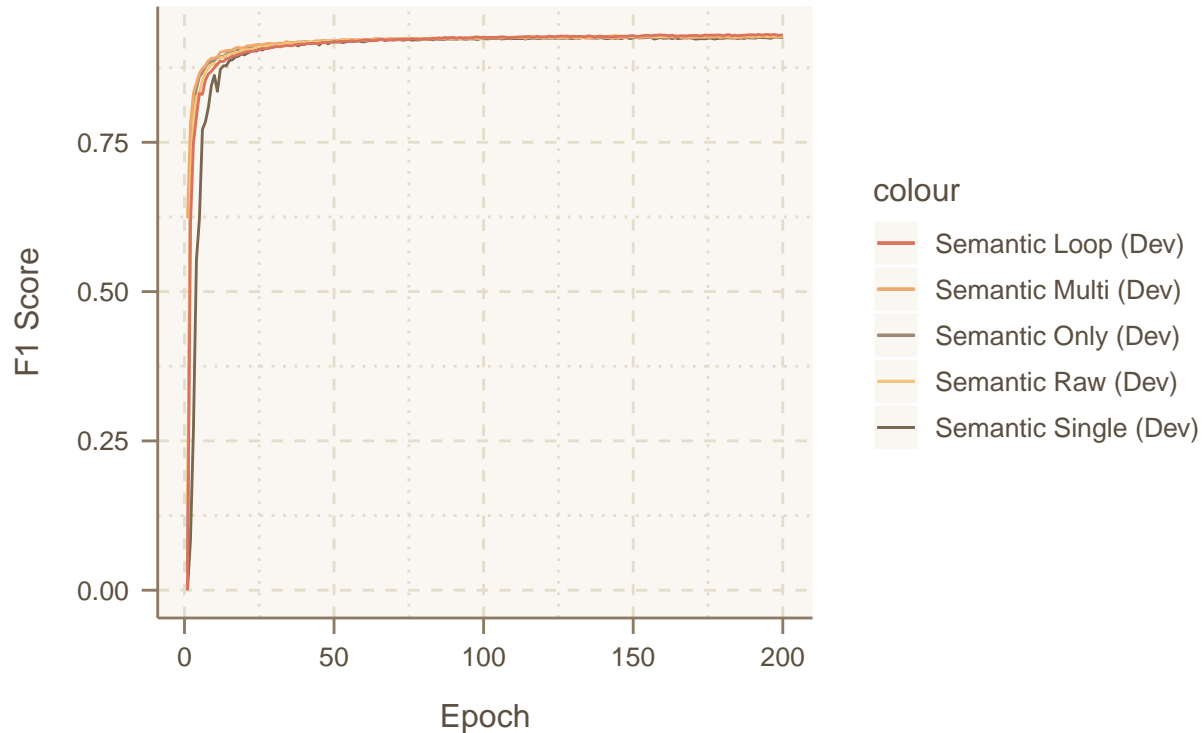
ggthemr('dust', layout="scientific", spacing=2)

## Warning: New theme missing the following elements: axis.ticks.length.x,
## axis.ticks.length.x.top, axis.ticks.length.x.bottom, axis.ticks.length.y,
## axis.ticks.length.y.left, axis.ticks.length.y.right

```

```
ggplot(df) +
  geom_line(aes(x=index, y=sem_only, color="Semantic Only (Dev)")) +
  geom_line(aes(x=index, y=sem_dev_single, color="Semantic Single (Dev)")) +
  geom_line(aes(x=index, y=sem_dev_multi, color="Semantic Multi (Dev)")) +
  geom_line(aes(x=index, y=sem_dev_raw, color="Semantic Raw (Dev)")) +
  geom_line(aes(x=index, y=sem_dev_loop, color="Semantic Loop (Dev)")) +
  labs(title = "Semantic F1 Score", y = "F1 Score", x = "Epoch")
```

Semantic F1 Score

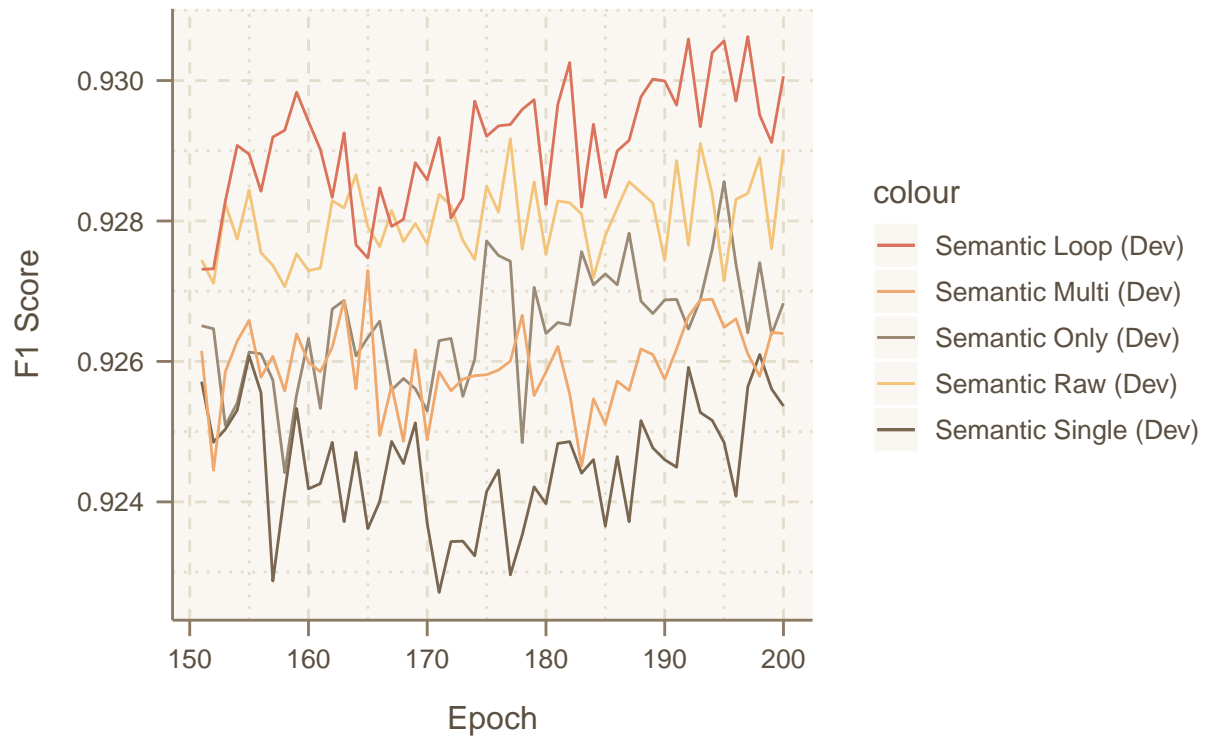


```
ggthemr('dust', layout="scientific", spacing=2)
```

```
## Warning: New theme missing the following elements: axis.ticks.length.x,
## axis.ticks.length.x.top, axis.ticks.length.x.bottom, axis.ticks.length.y,
## axis.ticks.length.y.left, axis.ticks.length.y.right
```

```
ggplot(df[151:200,]) +
  geom_line(aes(x=index, y=sem_only, color="Semantic Only (Dev)")) +
  geom_line(aes(x=index, y=sem_dev_single, color="Semantic Single (Dev)")) +
  geom_line(aes(x=index, y=sem_dev_multi, color="Semantic Multi (Dev)")) +
  geom_line(aes(x=index, y=sem_dev_raw, color="Semantic Raw (Dev)")) +
  geom_line(aes(x=index, y=sem_dev_loop, color="Semantic Loop (Dev)")) +
  labs(title = "Semantic F1 Score", y = "F1 Score", x = "Epoch")
```

Semantic F1 Score



```
# Prints data format for Latex
for (j in 7:10) {
  print(colnames(df)[j])

  for (i in 1:nrow(df)) {
    cat("(", i, ",", " ", df[i,j] , ")\n", sep="")
  }
}
```

```
## [1] "syn_dev_loop"
## (1, 0.003686962)
## (2, 0.6408002)
## (3, 0.8135789)
## (4, 0.8510533)
## (5, 0.8739615)
## (6, 0.8751335)
## (7, 0.8900372)
## (8, 0.8851991)
## (9, 0.9022685)
## (10, 0.9051408)
## (11, 0.9064124)
## (12, 0.9117229)
## (13, 0.9140481)
## (14, 0.9161737)
## (15, 0.9184131)
## (16, 0.9192994)
## (17, 0.9207006)
## (18, 0.9220996)
```

(19, 0.9174086)
(20, 0.9238046)
(21, 0.9205158)
(22, 0.9249461)
(23, 0.9247303)
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(179, 0.9443904)
(180, 0.9434762)


```

## (181, 0.9433539)
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## [1] "syn_dev_multi"
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```

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(194, 0.06521705)
(195, 0.06520467)

```
## (196, 0.06524002)
## (197, 0.06521705)
## (198, 0.06522765)
## (199, 0.06521705)
## (200, 0.06519584)
## [1] "syn_dev_raw"
## (1, 0.3230068)
## (2, 0.7609165)
## (3, 0.8331008)
## (4, 0.8707283)
## (5, 0.8825849)
## (6, 0.8842841)
## (7, 0.8982247)
## (8, 0.9026495)
## (9, 0.9065152)
## (10, 0.9079885)
## (11, 0.9090688)
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## (13, 0.9181167)
## (14, 0.9207168)
## (15, 0.9204639)
## (16, 0.9192357)
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## (18, 0.9252647)
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## (22, 0.9240501)
## (23, 0.9288192)
## (24, 0.9299665)
## (25, 0.9223547)
## (26, 0.9299539)
## (27, 0.9316206)
## (28, 0.9314259)
## (29, 0.9333902)
## (30, 0.9320942)
## (31, 0.9333494)
## (32, 0.9336175)
## (33, 0.9313712)
## (34, 0.9352824)
## (35, 0.9343727)
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## (37, 0.9316013)
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## (41, 0.9374277)
## (42, 0.9374514)
## (43, 0.9361111)
## (44, 0.9369155)
## (45, 0.936144)
## (46, 0.9316803)
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## (48, 0.9375894)
```

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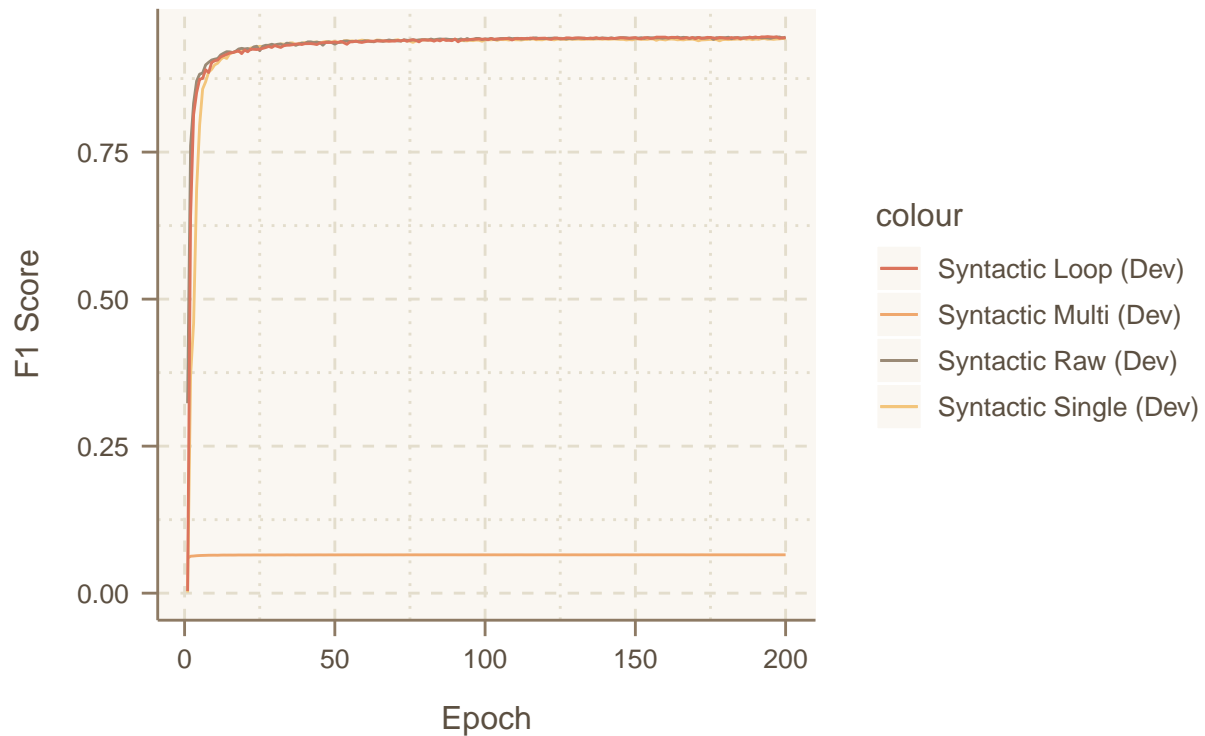
```
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## (199, 0.9430838)
## (200, 0.9426675)
```

```
ggthemr('dust', layout="scientific", spacing=2)
```

```
## Warning: New theme missing the following elements: axis.ticks.length.x,
## axis.ticks.length.x.top, axis.ticks.length.x.bottom, axis.ticks.length.y,
## axis.ticks.length.y.left, axis.ticks.length.y.right
```

```
ggplot(df) +
  geom_line(aes(x=index, y=syn_dev_single, color="Syntactic Single (Dev)")) +
  geom_line(aes(x=index, y=syn_dev_multi, color="Syntactic Multi (Dev)")) +
  geom_line(aes(x=index, y=syn_dev_raw, color="Syntactic Raw (Dev)")) +
  geom_line(aes(x=index, y=syn_dev_loop, color="Syntactic Loop (Dev)")) +
  labs(title = "Syntactic F1 Score", y = "F1 Score", x = "Epoch")
```

Syntactic F1 Score

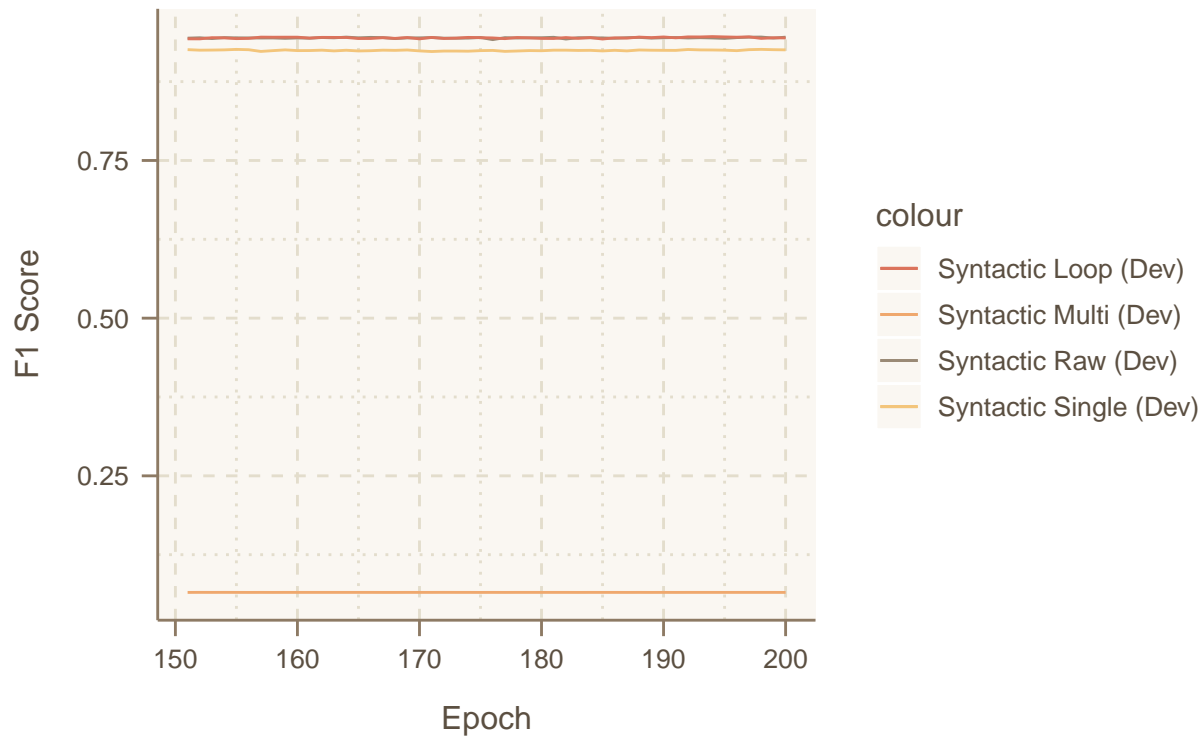


```
ggthemr('dust', layout="scientific", spacing=2)
```

```
## Warning: New theme missing the following elements: axis.ticks.length.x,  
## axis.ticks.length.x.top, axis.ticks.length.x.bottom, axis.ticks.length.y,  
## axis.ticks.length.y.left, axis.ticks.length.y.right
```

```
ggplot(df[151:200,]) +  
  geom_line(aes(x=index, y=sem_dev_single, color="Syntactic Single (Dev)")) +  
  geom_line(aes(x=index, y=syn_dev_multi, color="Syntactic Multi (Dev)")) +  
  geom_line(aes(x=index, y=syn_dev_raw, color="Syntactic Raw (Dev)")) +  
  geom_line(aes(x=index, y=syn_dev_loop, color="Syntactic Loop (Dev)")) +  
  labs(title = "Syntactic F1 Score", y = "F1 Score", x = "Epoch")
```

Syntactic F1 Score



3.3 One-Way Anova

Will test if the mean of the results is the same (excluding failed syntax training for multitask multi).

```
anova_data_sem = data.frame()
anova_data_syn = data.frame()
df_trimmed_sem = df[151:200, 1:6]
df_trimmed_syn = df[151:200, c(1, 7, 9, 10)] # 8 (syn_dev_multi) gets stuck

for (row in 1:nrow(df_trimmed_sem)) {
  for (col in 2:ncol(df_trimmed_sem)) {
    anova_data_sem = rbind(anova_data_sem,
                           data.frame(value = df_trimmed_sem[row, col],
                                       group = colnames(df_trimmed_sem)[col]))
  }
}

for (row in 1:nrow(df_trimmed_syn)) {
  for (col in 2:ncol(df_trimmed_syn)) {
    anova_data_syn = rbind(anova_data_syn,
                           data.frame(value = df_trimmed_syn[row, col],
                                       group = colnames(df_trimmed_syn)[col]))
  }
}

# Compute the analysis of variance
res.aov.sem <- aov(value ~ group, data = anova_data_sem)
```

```
# Summary of the analysis
```

```
summary(res.aov.sem)
```

```
##              Df    Sum Sq  Mean Sq F value Pr(>F)
## group         4 0.0006375 1.594e-04   284.4 <2e-16 ***
## Residuals    245 0.0001373 5.600e-07
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
# Compute the analysis of variance
```

```
res.aov.syn <- aov(value ~ group, data = anova_data_syn)
```

```
# Summary of the analysis
```

```
summary(res.aov.syn)
```

```
##              Df    Sum Sq  Mean Sq F value Pr(>F)
## group         2 0.0002521 1.261e-04   171.4 <2e-16 ***
## Residuals    147 0.0001081 7.400e-07
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```