

2016/10/14

황준식

[딥러닝없음주의]

---

알파고의 시간



## 발표자 소개

---

**황준식 @ NEXON KOREA**  
**JUNIOR DATA ANALYST**  
**[JSIDEAS.NET](http://JSIDEAS.NET)**

# 오늘의 주제

---

Confusion  
Matrix

y\_pred: True

y\_pred: False

---

y\_true: True

알파고에 관한  
개인프로젝트 소개

흥미로울수도 있는  
약간의 이야기

---

y\_true: False

알파고에 관한  
이론적 배경이나  
구현에 관한 정리

5분만에 배우는  
텐서플로우

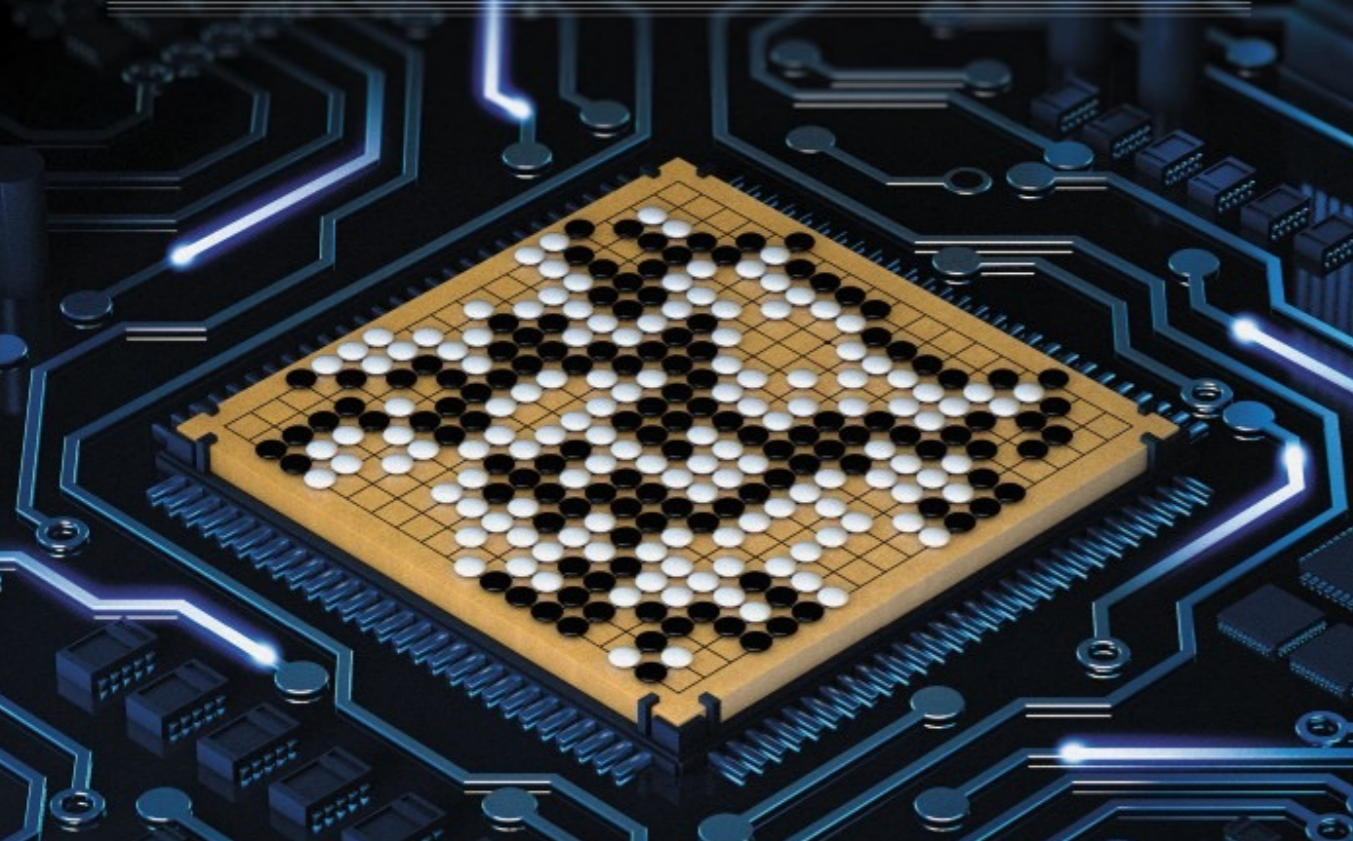
새로운 주제는 아닙니다

---

**알파고와 딥러닝**

# nature

THE INTERNATIONAL WEEKLY JOURNAL OF SCIENCE



At last — a computer program that can beat a champion Go player **PAGE 484**

## ALL SYSTEMS GO

### CONSERVATION

**SONGBIRDS À LA CARTE**  
Legal harvest of millions of Mediterranean birds  
**PAGE 452**

### RESEARCH ETHICS

**SAFEGUARD TRANSPARENCY**  
Don't let openness backfire on individuals  
**PAGE 459**

### POPULAR SCIENCE

**WHEN GENES GOT 'SELFISH'**  
Dawkins's calling card forty years on  
**PAGE 462**

NATURE.COM/NATURE

28 January 2016 £10

Vol. 529, No. 7587



## Machines 3, Man 0



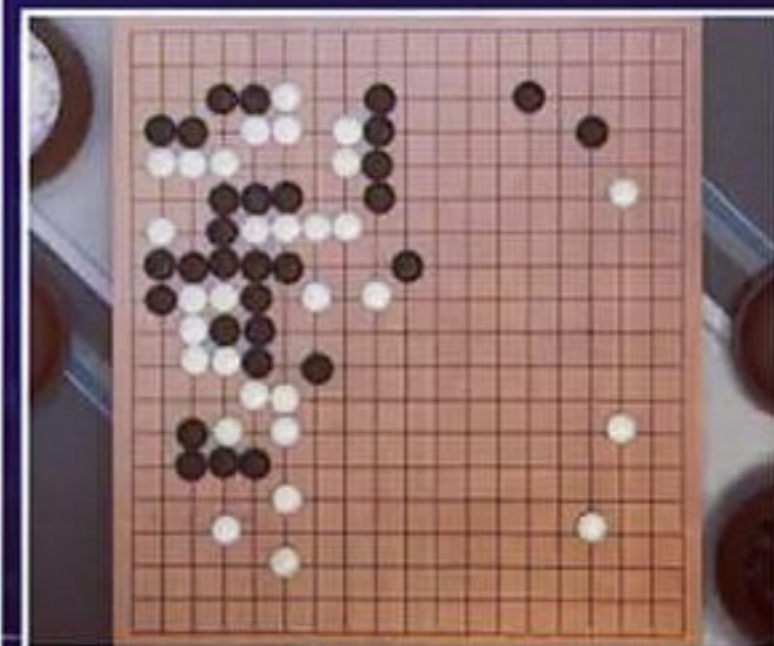
QUESTION 1.

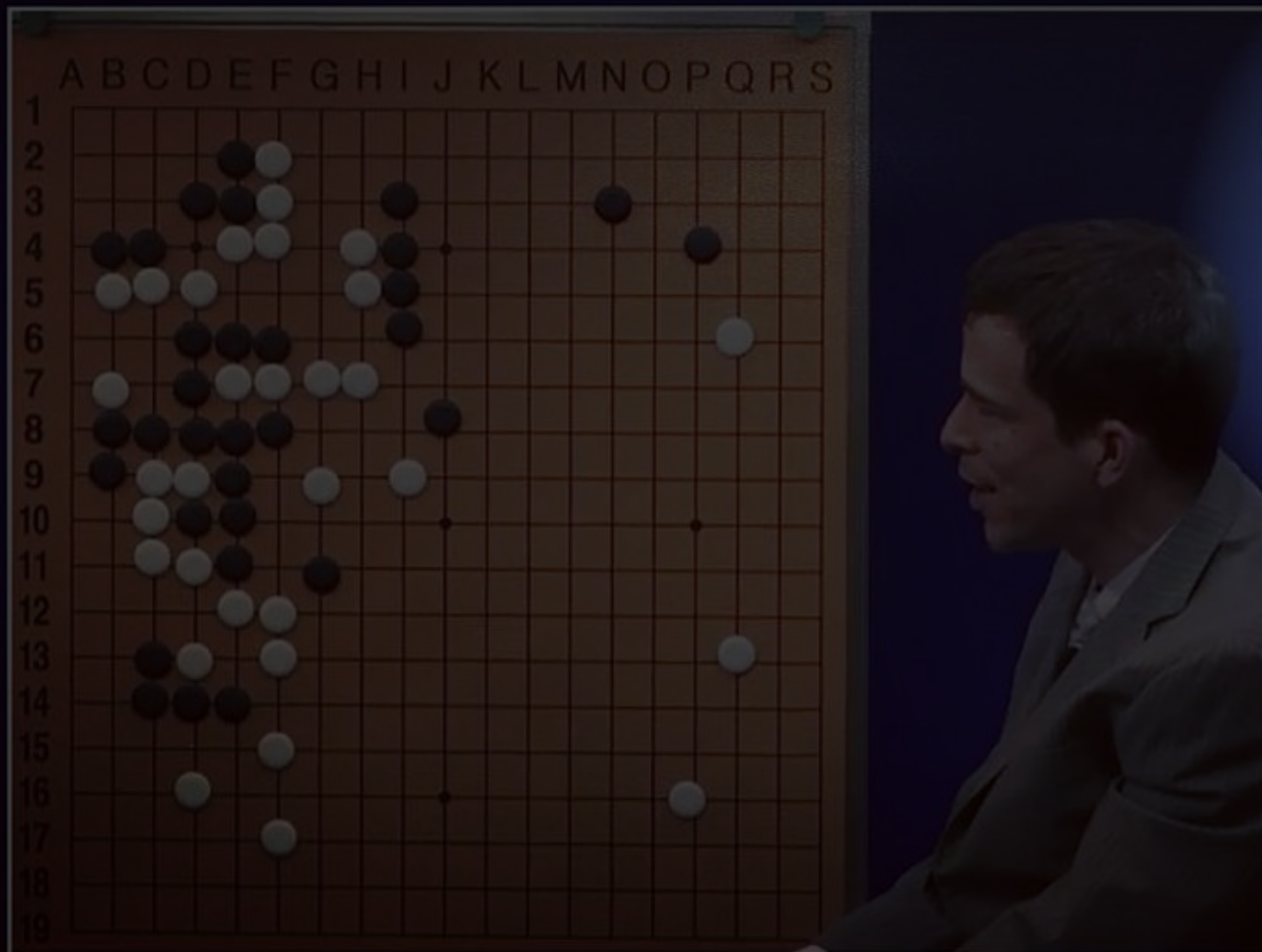
인간과 기계는 어떻게 다른가?



● ALPHAGO  
01:27:15

● LEE SEDOL  
00:45:18





● ALPHAGO  
01:27:15

● LEE SEDOL  
00:45:18





About 34,600 results (0.29 seconds)

[Lee Sedol vs. AlphaGo: 4th game - Thinking Time in minutes \[OC ...](#)  
[https://www.reddit.com/r/.../lee\\_sedol\\_vs\\_alphago\\_4th\\_game\\_thinking\\_time\\_in/](https://www.reddit.com/r/.../lee_sedol_vs_alphago_4th_game_thinking_time_in/)  
Mar 13, 2016 - **AlphaGo**: 4th game - Thinking **Time** in minutes [OC] (i.imgur.com) .... Nice, can you add the point at which **Lee Sedol** entered overtime? ... to go over that and **spend** an extra minute if a particularly complex situation arose.

[Fascinating Insight into Alpha Go's from Match 4 : baduk - Reddit](#)  
[https://www.reddit.com/r/baduk/.../fascinating\\_insight\\_into\\_alpha\\_gos\\_from\\_match\\_...](https://www.reddit.com/r/baduk/.../fascinating_insight_into_alpha_gos_from_match_...)  
Mar 13, 2016 - In the face of defeat, **Lee Sedol** **spent** a good 40 minutes to come up with ..... low probability move it needs to **spend** a lot more time analyzing it.

[CB News - AlphaGo vs Lee Sedol: history in the making | Chess News](#)  
<https://en.chessbase.com/post/alphago-vs-lee-sedol-history-in-the-making>  
Mar 13, 2016 - An overview of the third game from **AlphaGo** vs **Lee Sedol**. ..... article in a field ( neuroscience, neural nets, AI) that I **spent** some **time** once upon ...

[Lee Sedol defeats AlphaGo in masterful comeback - Game 4](#)  
<https://gogameguru.com/lee-sedol-defeats-alphago-masterful-comeback-game-4/>  
Mar 13, 2016 - **Lee Sedol** plays his first move as White, in his fourth game against ..... and the search starts turning to **spend** more **time** to different moves, not ...

[Thinking time charts for AlphaGo vs Lee Sedol • Life In 19x19](#)  
[lifein19x19.com](http://lifein19x19.com) > Board index > Go Gear > Computer Go  
Mar 11, 2016 - 6 posts - 5 authors  
The spike for **Lee's** 19th move is him thinking how to respond to **AlphaGo's** unusual ... **AlphaGo** **spent** the most **time** on White 61 aka White 122 ...

[Why the Final Game Between AlphaGo and Lee Sedol Is Such a Big ...](#)  
<https://www.wired.com/2016/.../final-game-alphago-lee-sedol-big-deal-humanit...> Wired

착점시간 데이터 검색



구글에 없어...?



PROFIT!!

Table 1

turn_index	Lee_Sedol	AlphaGo
0	02:00:00	02:00:00
1	01:59:41	01:58:30
2	01:58:15	01:57:24
3	01:57:00	01:56:05
4	01:55:41	01:55:08
5	01:54:30	01:54:08
6	01:54:19	01:53:16
7	01:43:08	01:44:08
...	...	...



Table 1-1

turn_index	Lee_Sedol	AlphaGo
1	19	90
2	86	56
3	75	79
...	...	...

ALPHAGO  
01:27:15

LEE SEDOL  
00:45:18

원하는 데이터셋만

명확하면 노가다는 금방

Table 1

turn_index	AlphaGo	Lee_Sedol	countdown	AlphaGo_ott	Lee_Sedol_ott
41	01:12:29	00:03:23			
42	01:11:09	00:02:18			
43	01:09:59	00:00:53			
44	01:08:15	00:00:38			
45	01:07:04	00:00:02	lee -1		00:01:36
46	01:05:02	00:00:01	lee -1		00:01:59

```
def time_func(x):
    k = x.split(":")
    hour = int(k[0])
    minute = int(k[1])
    second = int(k[2])
    ts = hour * 3600 + minute * 60 + second
    return ts
```

분:초 STRING -> 초 INTEGER

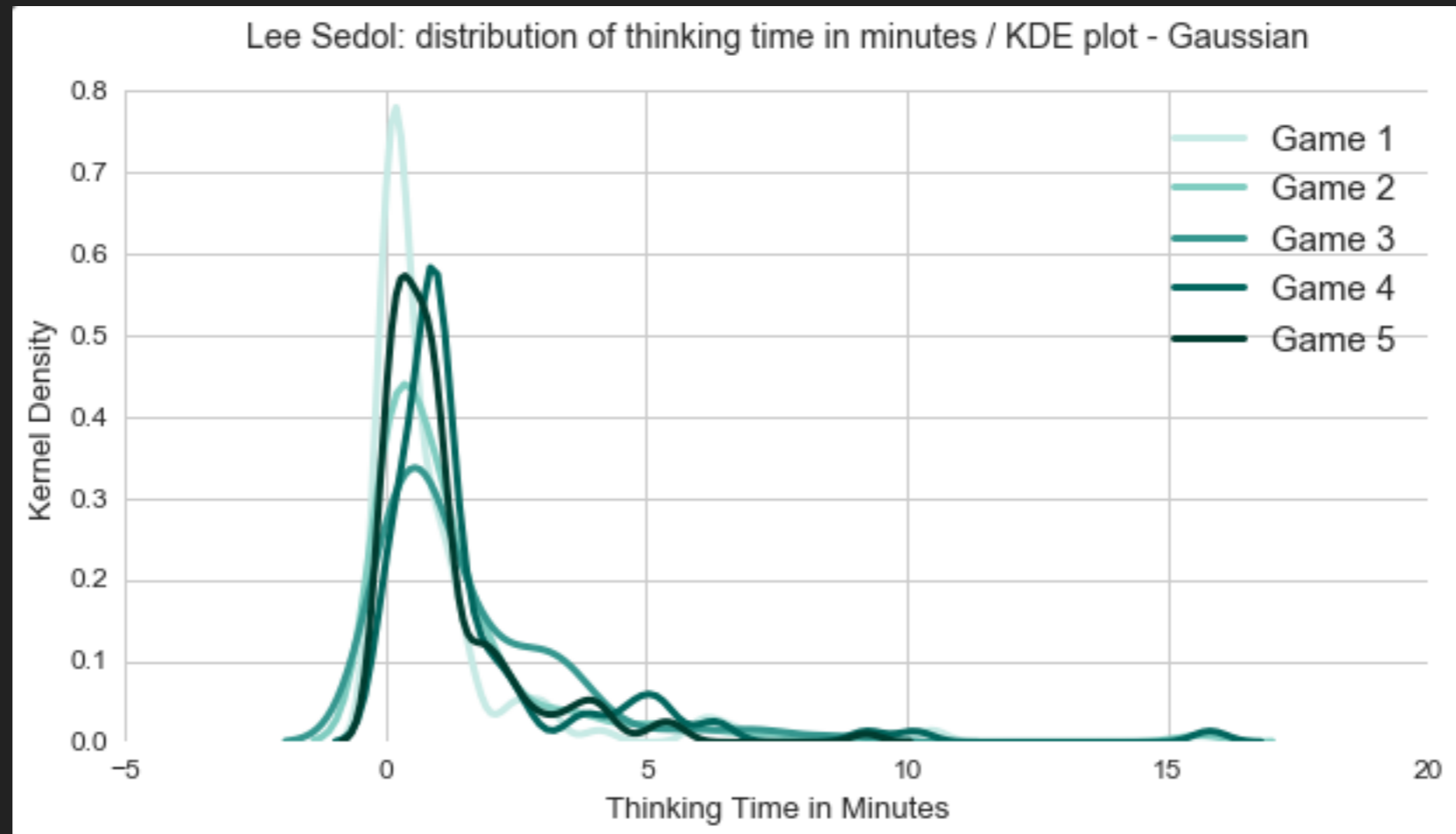
```
df_alpha['AlphaGo_ts'] = df_alpha.AlphaGo.apply(lambda x: time_func(x))
df_lee['Lee_Sedol_ts'] = df_lee.Lee_Sedol.apply(lambda x: time_func(x))
```

```
result_df_2.columns = ['turn_index', 'player', 'thinking_time']
result_df_2.head()
```

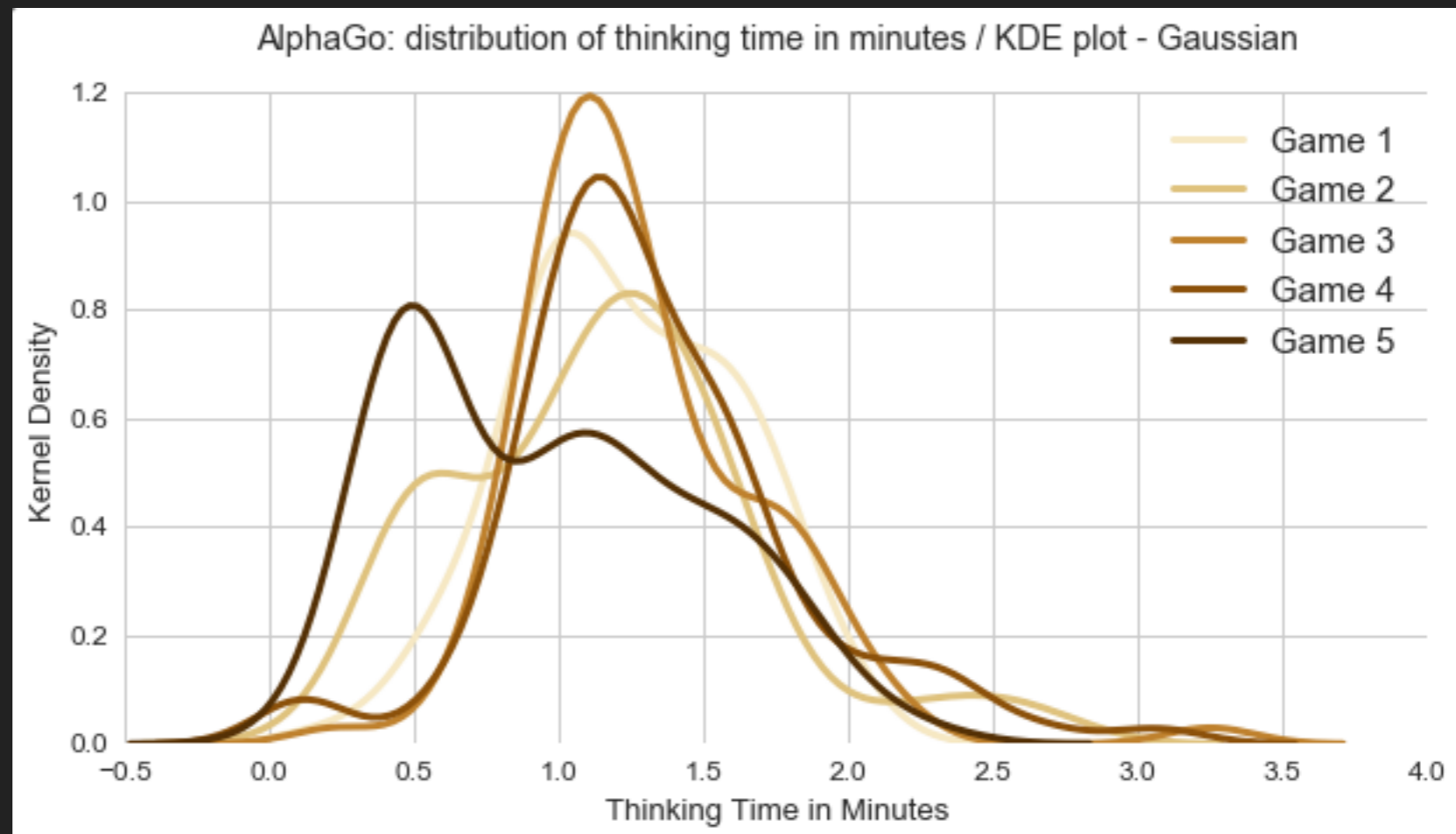
	turn_index	player	thinking_time
0	1	AlphaGo_WHITE	85
1	2	AlphaGo_WHITE	68
2	3	AlphaGo_WHITE	53
3	4	AlphaGo_WHITE	62
4	5	AlphaGo_WHITE	73

최종 데이터셋의 형태

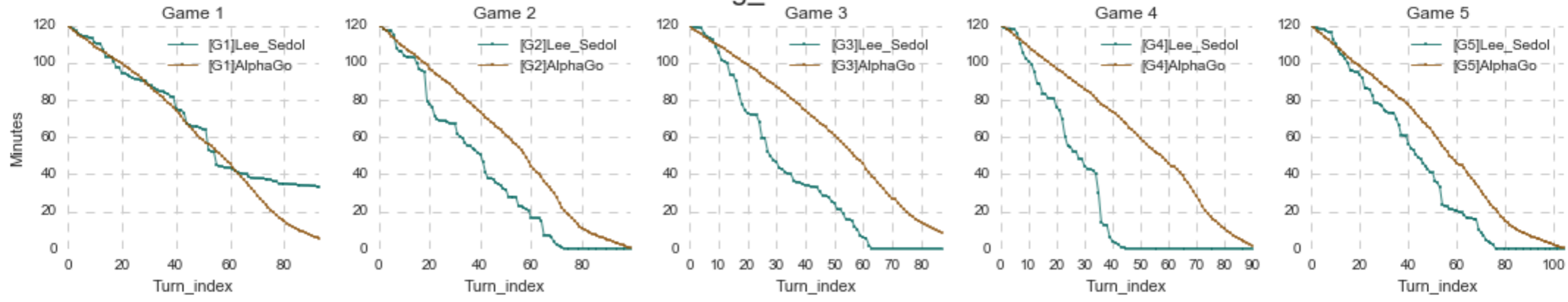
**LEE SEDOL**  
**MEAN: 79 SEC**  
**STD: 111 SEC**  
**MAX: 949 SEC**



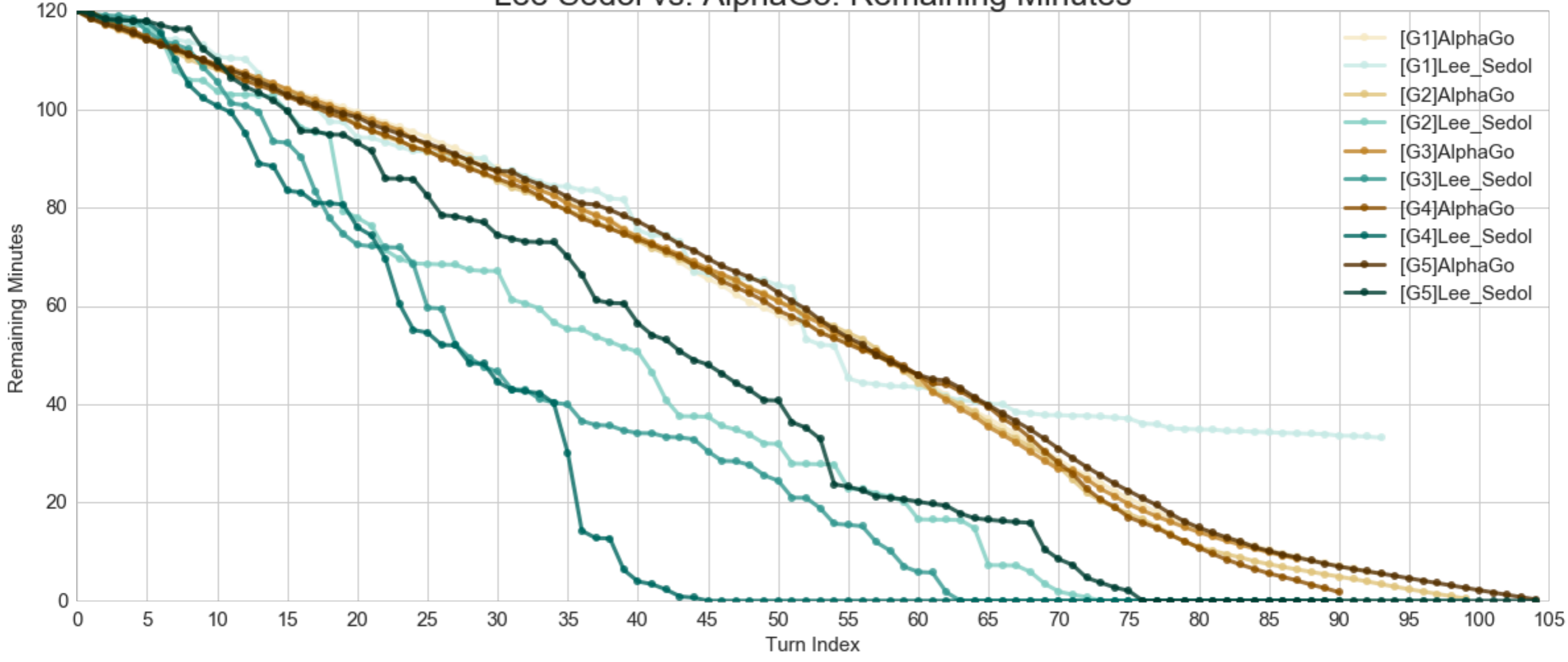
**ALPHAGO**  
**MEAN: 70 SEC**  
**STD: 29 SEC**  
**MAX: 195 SEC**



# Remaining\_Time in Minutes

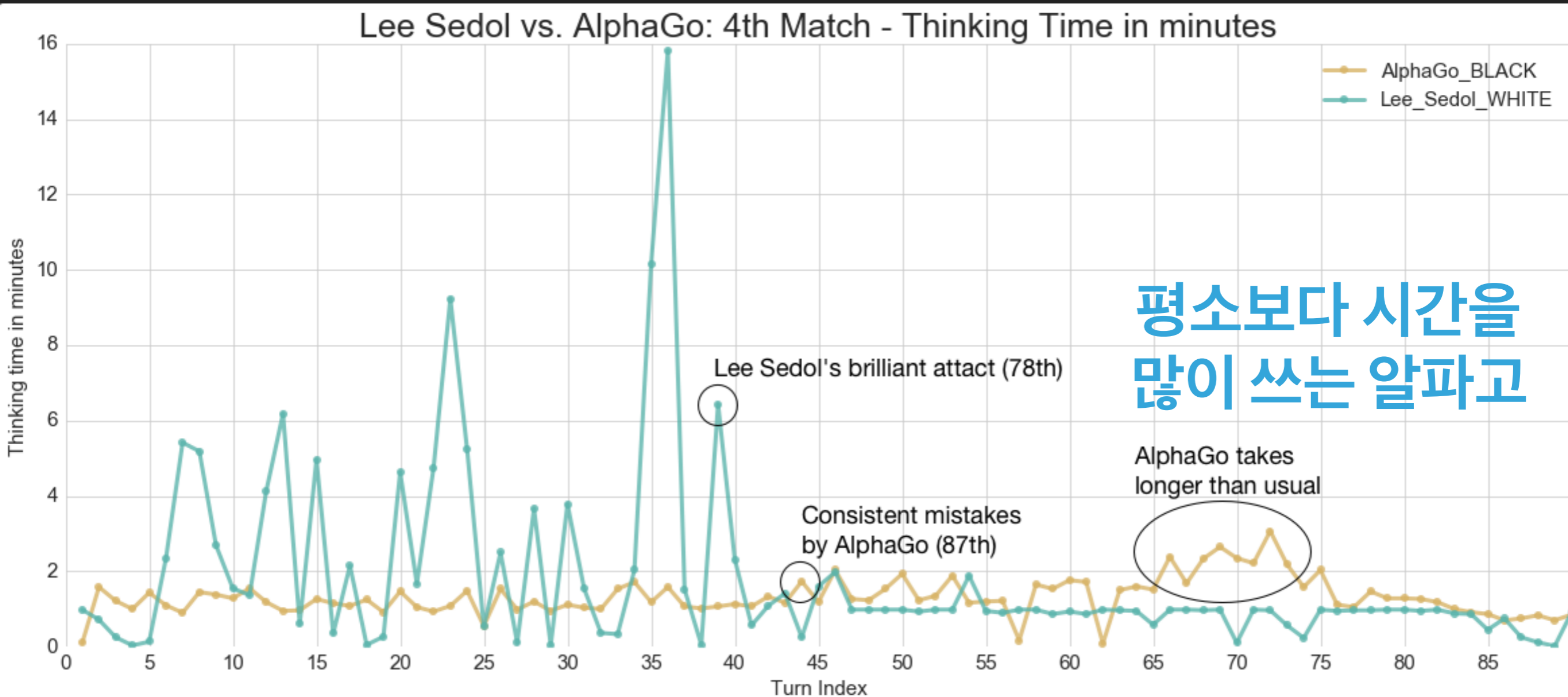


# Lee Sedol vs. AlphaGo: Remaining Minutes





# 착점시간과 이세돌의 승리는 무슨 관계?



평소보다 시간을 많이 쓰는 알파고

# 착점시간과 이세돌의 승리는 무슨 관계?

Q. 알파고가 수에 따라 두는 시간이 다른가? 또 타이젬을 통해 훈련을 했는가

하사비스 : 알파고는 시간을 계산한다. 어려운 수는 더 많은 시간을 할애한다.  
타이젬은 개발자의 개인적인 계정이다.

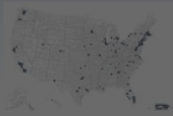
출처: 이세돌 "알파고에 지더라도 바둑의 아름다움은 계속될 것"(일문일답)  
(스포츠투데이)



# 뜻밖의 관심과 트래픽

# REDDIT

↑  
3477

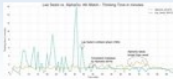


**Half of the US Population [OC]** imgur.com

submitted 9 months ago by [pf\\_throwaway811](#)

**642 comments** [share](#) [save](#) [hide](#) [report](#) [pocket](#)

↑  
3474



**Lee Sedol vs. AlphaGo: 4th game - Thinking Time in minutes [OC]** i.imgur.com

submitted 7 months ago by [junkwhinger](#)

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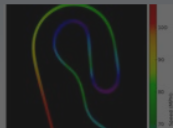
↑  
3471

**Mathematicians created a Social Network map to decide who the Main Character was in the A Song of Ice and Fire (Game of Thrones) series (PDF)** maa.org

submitted 6 months ago by [Hyperdrunk](#)

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3463



**Plot of my speed on track during a race on Gateway Motorsports Park's road course [OC]** i.imgur.com

submitted 6 months ago by [gamerdonkey](#)

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3463



**TV shows that got better over time and TV shows that remained most consistent [OC]** imgur.com

submitted 3 months ago by [vedangmehta](#)

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3452



**An eye opening video about the distribution of wealth in the US** youtu.be

submitted 11 months ago by [smoke\\_memes\\_everyday](#)

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↑  
3444



**1100 declassified U.S. nuclear targets** futureoflife.org

submitted 4 months ago by [MrBeanie88](#)

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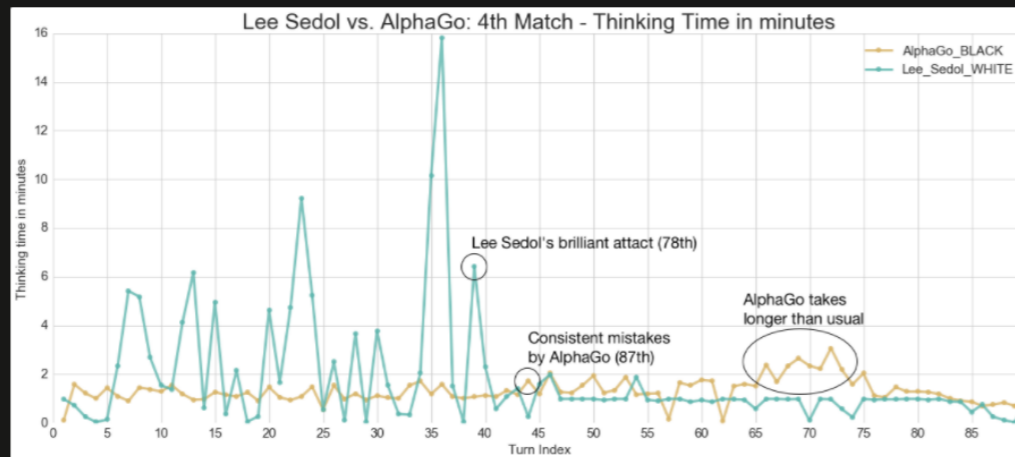
# IMGUR

image 4 of 59 ✕

Name: **fourth\_gam...** Views: **702,342** Submitted: **7 months ago** Bandwidth: **78.18 GB**

image

# IEWS: 702,342



# TOTAL: 900,000

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<http://imgur.com/3HcJKbk>

### Direct Link

<http://i.imgur.com/3HcJKbk.png>

### Markdown Link (reddit comments)

`[imgur](http://i.imgur.com/3HcJKbk.png)`

### HTML (website / blogs)

`<a href="http://imgur.com/3HcJKbk">in`

### BBCode (message boards & forums)

`[img]http://i.imgur.com/3HcJKbk.png[/ir`

### Linked BBCode (message boards)

`[url=http://imgur.com/3HcJKbk][img]http`

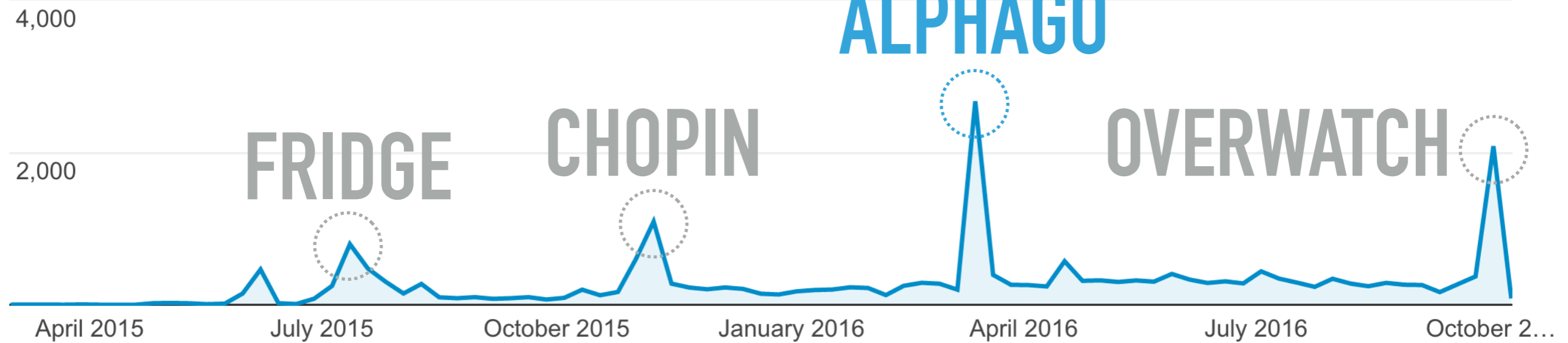
**Sizes:** [Original](#) · [Small Square](#) · [Big Square](#) · [Small Thumbnail](#) · [Medium Thumbnail](#) · [Large Thumbnail](#) · [Huge Thumbnail](#)

# JSIDEAS.NET

Sessions ▼ VS [Select a metric](#)

Hourly Day **Week** Month

● Sessions



EXTRA QUESTION

바둑의 흐름도 **정량화**할 수 있나?



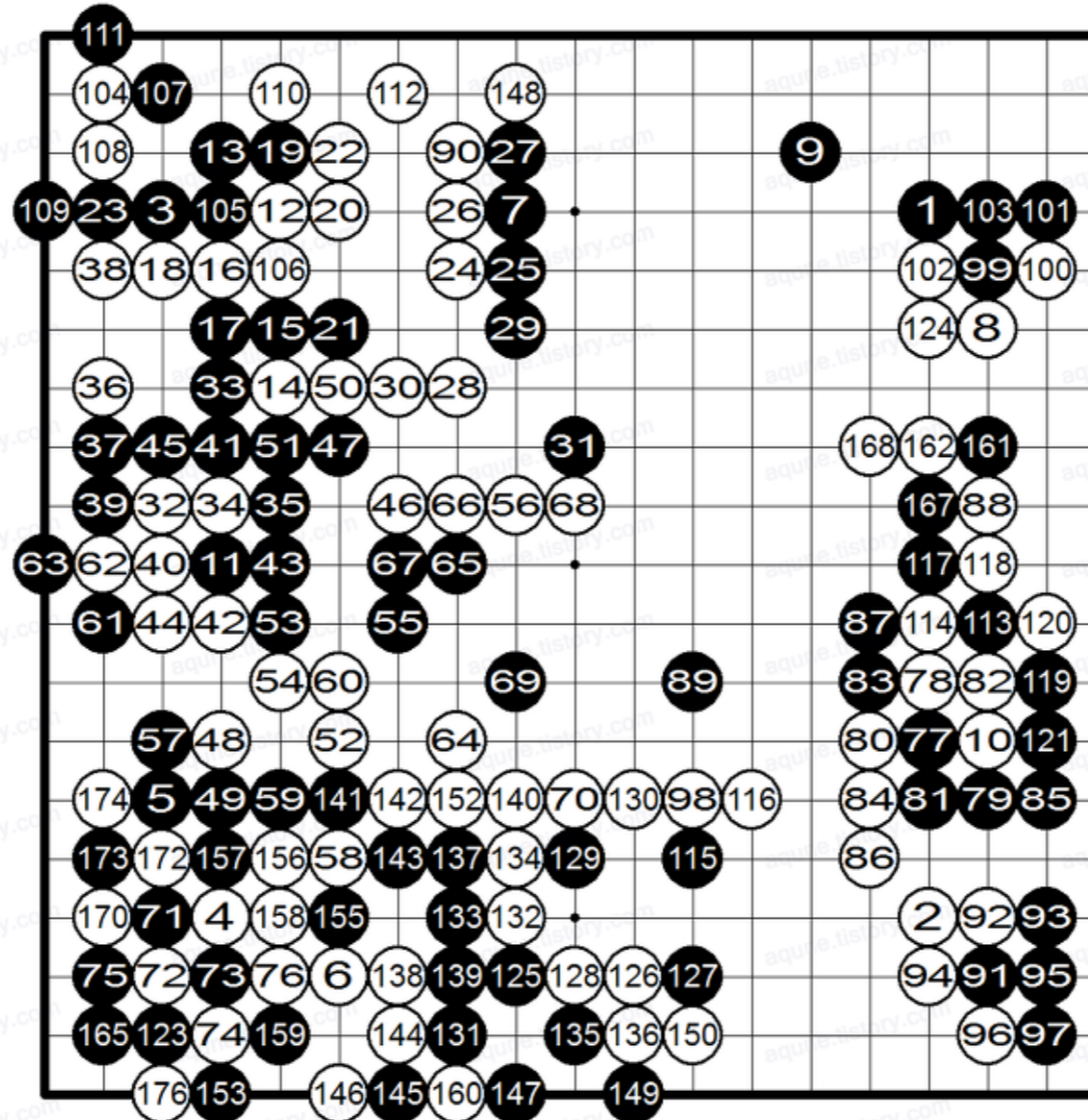
# Google DeepMind

## Challenge Match

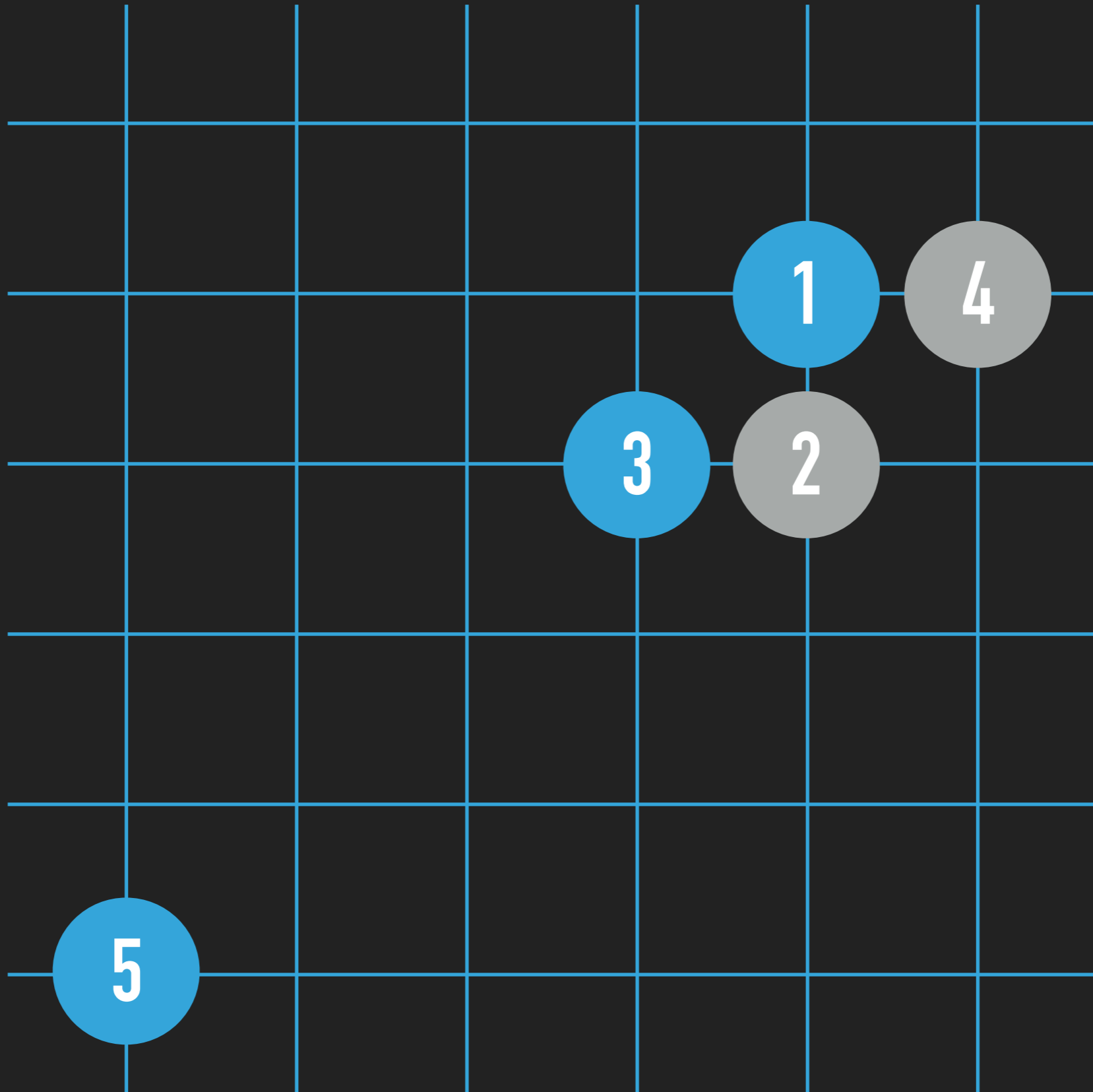
8 - 15 March 2016

AlphaGo vs Lee Sedol

제3국 : 2016년 3월 12일 / 흑-이세돌 vs. 백-알파고 / 176수 백 불계승



C16: 71 ▶ 175 C17: 72 ▶ 154 D17: 73 ▶ 151 164 Q11: 113 ▶ 122 G19: 145 ▶  
 163 169 H19: 160 ▶ 166 171







# 수 / 위치 정보 추출

```
stone_list = []
for i in range(1, 20):
    col_num = str(i)
    for j in range(0, 19):
        stone_dict = {}
        temp = j
        row_num = j + 1
        stone_value = data[col_num].iloc[temp]
        stone_dict['value'] = stone_value.astype(int)
        stone_dict['col'] = int(col_num)
        stone_dict['row'] = int(row_num)
        if np.isnan(stone_value):
            pass
        else:
            stone_list.append(stone_dict)
```

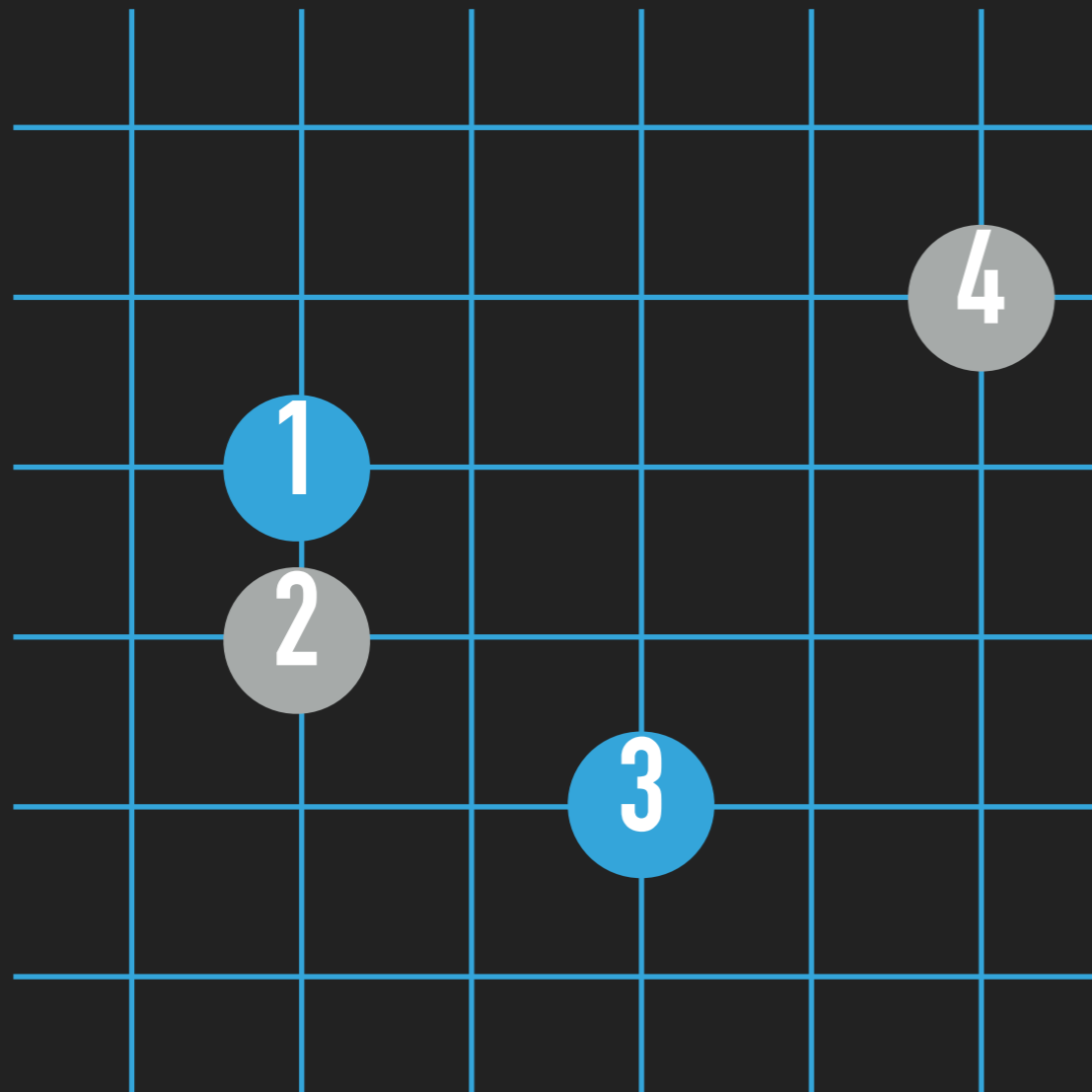
```
stone_175 = {'value':175, 'col':3, 'row':16}
stone_154 = {'value':154, 'col':3, 'row':17}
stone_151 = {'value':151, 'col':4, 'row':17}
stone_164 = {'value':164, 'col':4, 'row':17}
stone_122 = {'value':122, 'col':17, 'row':11}
stone_163 = {'value':163, 'col':7, 'row':19}
stone_169 = {'value':169, 'col':7, 'row':19}
stone_166 = {'value':166, 'col':8, 'row':19}
stone_171 = {'value':171, 'col':8, 'row':19}
```

DF의 행렬을 돌면서  
수 / 행 / 열 DICT를  
LIST에 저장

단수 등으로 기존  
위치에 추가된  
수는 추가 입력

# 직전 수와의 거리 산출 (맨하탄 거리)

```
FROM SCIPY.SPATIAL.DISTANCE IMPORT CITYBLOCK
```



격자위의 가로세로  
이동 거리의 합

1 -> 2: 1

2 -> 3: 3

3 -> 4: 5

# 데이터 가공

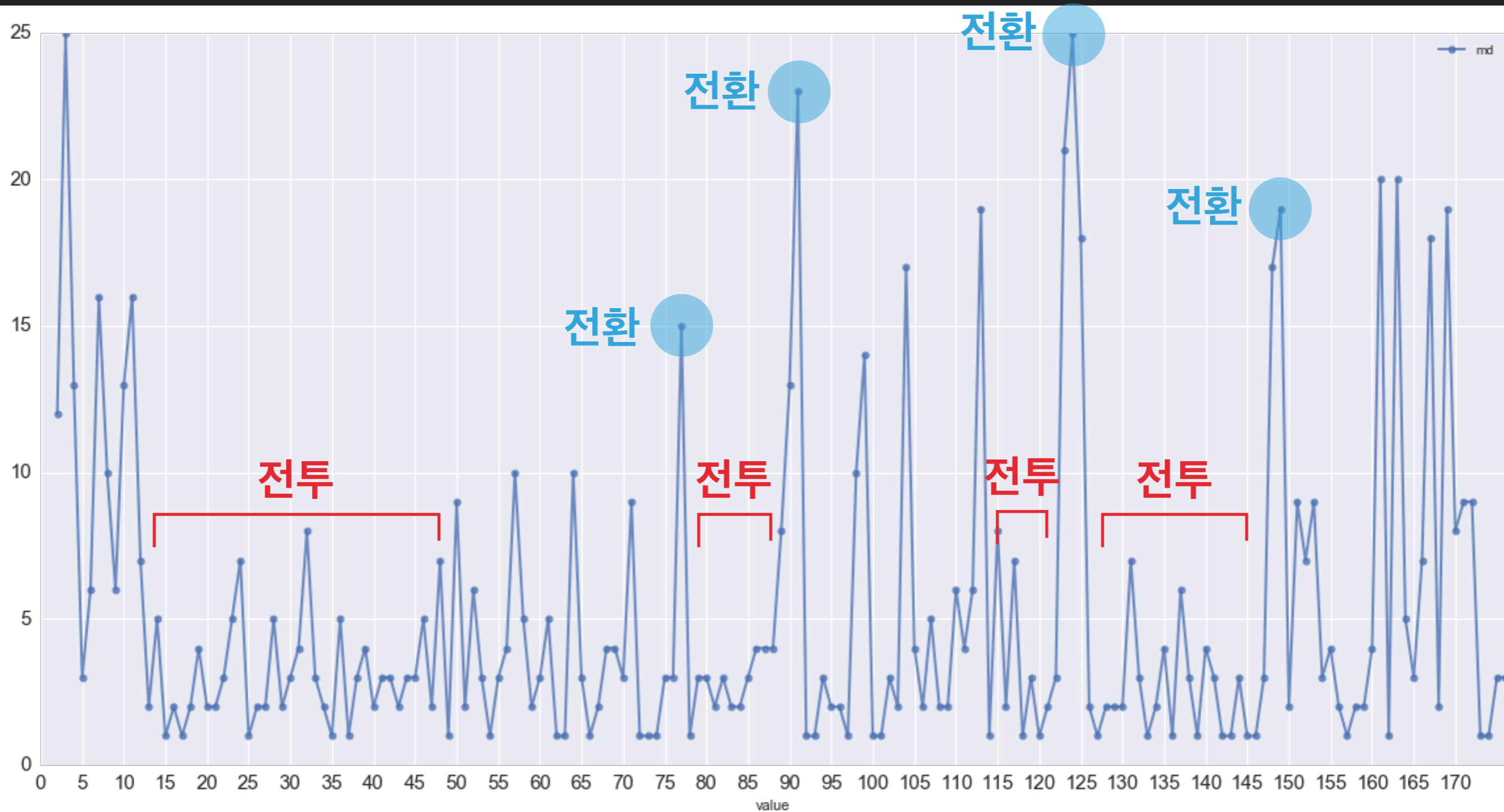
```
## row와 col을 합쳐 list로 column에 저장  
t['loc'] = t[['row', 'col']].values.tolist()
```

```
## 직전 row의 loc 정보를 prev_loc에 저장  
t['prev_loc'] = t['loc'].shift(1)
```

```
## df의 row를 돌면서 loc과 prev_loc의 맨하탄 거리 계산  
t['md'] = t.apply(lambda row:  
                  cityblock(row['loc'], row['prev_loc']),  
                  axis=1)
```

	value	row	col	loc	prev_loc	md
0	1	4	16	[4, 16]	NaN	NaN
1	2	16	16	[16, 16]	[4, 16]	12.0
2	3	4	3	[4, 3]	[16, 16]	25.0
3	4	16	4	[16, 4]	[4, 3]	13.0
4	5	14	3	[14, 3]	[16, 4]	3.0
5	6	17	6	[17, 6]	[14, 3]	6.0
6	7	4	9	[4, 9]	[17, 6]	16.0
7	8	6	17	[6, 17]	[4, 9]	10.0
8	9	3	14	[3, 14]	[6, 17]	6.0
9	10	13	17	[13, 17]	[3, 14]	13.0
10	11	10	4	[10, 4]	[13, 17]	16.0
11	12	4	5	[4, 5]	[10, 4]	7.0
12	13	3	4	[3, 4]	[4, 5]	2.0
13	14	7	5	[7, 5]	[3, 4]	5.0
14	15	6	5	[6, 5]	[7, 5]	1.0

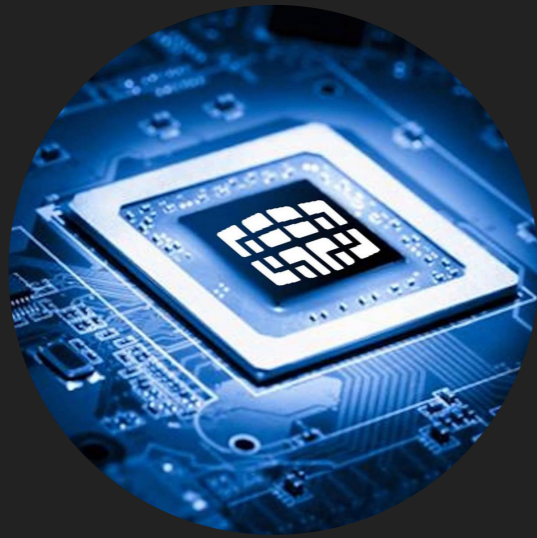
# 제 3국 흐름 차트



QUESTION 2.

인간과 기계를 어떻게 분류할까?

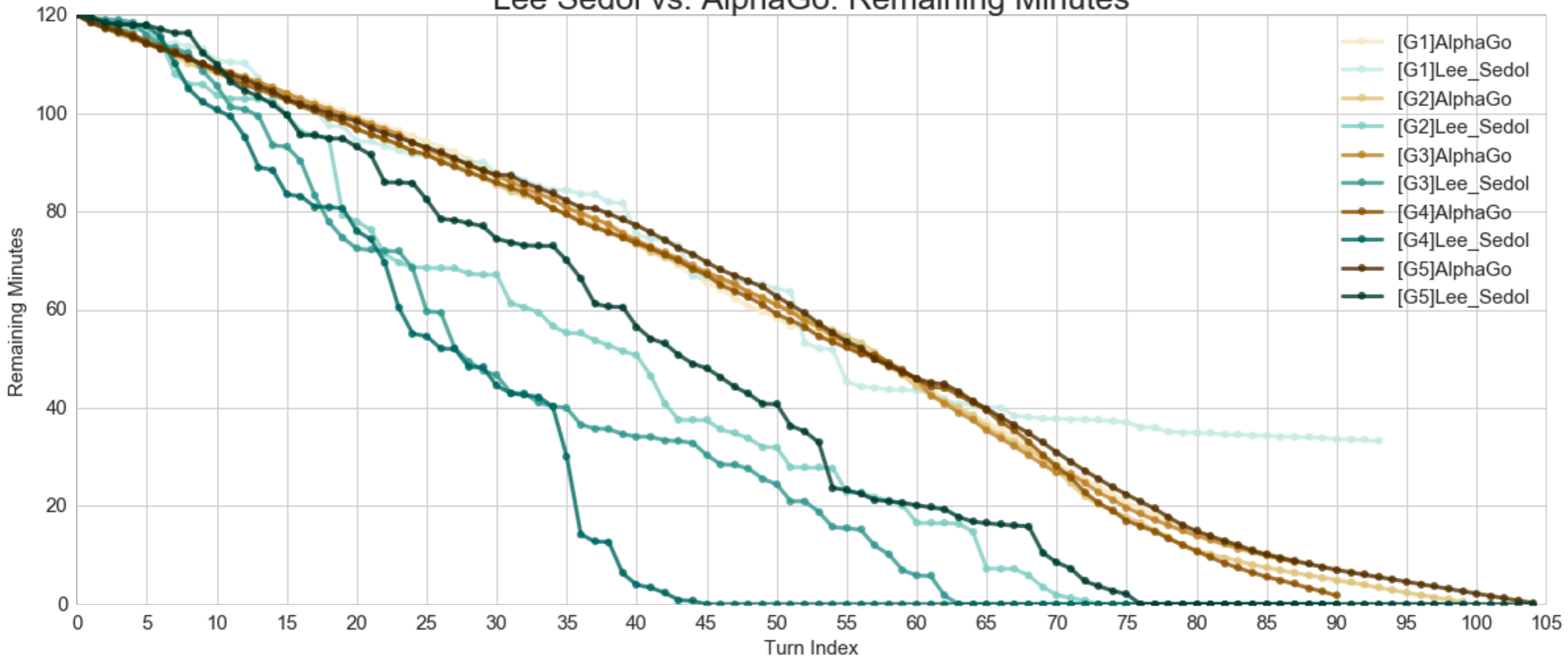
# TURING TEST FOR GO



VS.



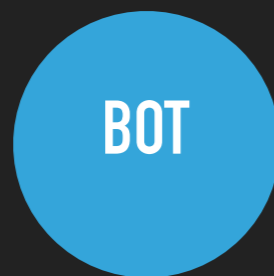
Lee Sedol vs. AlphaGo: Remaining Minutes



이세돌과 알파고의 차이: 대국간 착점시간의 편차  
=> 자신의 플레이가 서로 얼마나 유사한지 비교해보자!

# 자기유사도 (SELF SIMILARITY)

MMORPG 게임에서 매크로 계정을 탐지하는 방법 중 하나



자기 유사도를 이용한 MMORPG 게임봇탐지 시스템  
// 고려대학교 김휘강교수님 등



# LEVENSHTEIN DISTANCE

- ▶ 두 문자열간의 유사도를 측정하는 방법
- ▶ S와 T라는 문자열이 주어졌을때, S가 T가 되기 위해 **지우고, 추가하고, 교체하는** 문자열의 수만큼 거리가 계산됨
- ▶ 예) NEXON, NEXEN → LD 1 (O → E)  
DATA, DATUM → LD 2 (A → U, M)  
MOIST, CHOICE → ??
- ▶ 활용분야: 스펠링체크, 음성인식, DNA 분석, 표절검색

# LEVENSHTEIN DISTANCE

- ▶ STEP 1)  $N = \text{LEN}(S)$   
 $M = \text{LEN}(T)$   
IF  $N == 0$ : RETURN  $M$   
IF  $M == 0$ : RETURN  $N$   
0부터  $M$ 까지 행,  
0부터  $N$ 까지의 열로 된  
매트릭스를 구성

		M	O	I	S	T
	0	1	2	3	4	5
C	1					
H	2					
O	3					
I	4					
C	5					
E	6					

# LEVENSHTEIN DISTANCE

- ▶ **STEP 2) COST**  
IF ROW == COLUMN: RETURN 1  
ELSE: RETURN 0
- ▶ **STEP 3) TOTAL VALUE**  
MIN( UP+1,  
LEFT+1,  
UPPER-LEFT + COST)

		M	O	I	S	T
	0	1	2	3	4	5
C	1	1				
H	2	2				
O	3	3				
I	4	4				
C	5	5				
E	6	6				

# LEVENSHTEIN DISTANCE

▶ STEP 4)  $LD = D[M,N]$

		M	O	I	S	T
	0	1	2	3	4	5
C	1	1	2	3	4	5
H	2	2	2	3	4	5
O	3	3	2	3	4	5
I	4	4	3	2	3	4
C	5	5	4	3	3	4
E	6	6	5	4	4	4

# LEVENSHTEIN DISTANCE ON ALPHAGO

Table 1-1

turn_index	Lee_Sedol
1	19
2	86
3	75
4	2
5	67
6	450
...	...



**ABABECDE**

**HISTOGRAM의 BIN처럼 구간화하자!**

# LEVENSHTEIN DISTANCE ON ALPHAGO

쾌속 착점 ▶

조금 생각 ▶

약간 고민 ▶

고민 ▶

장고 ▶

```
def string_classifier(time_spent):  
    if time_spent <= 10.0:  
        return 'A'  
    elif time_spent <= 40.0:  
        return 'B'  
    elif time_spent <= 120.0:  
        return 'C'  
    elif time_spent <= 300.0:  
        return 'D'  
    else:  
        return 'E'
```

```
def levheatmap(alist, blist, length):
    al = []
    bl = []
    if length != 'full':

        for a in alist:
            a = a[:length]
            al.append(a)

        for b in blist:
            b = b[:length]
            bl.append(b)

    else:
        al = alist
        bl = blist

    array_A = np.zeros([len(al),len(al)])
    for i in range(0, len(al)):
        for j in range(0, len(al)):
            array_A[i][j] = levenshtein(al[i], al[j])

    array_B = np.zeros([len(bl),len(bl)])
    for i in range(0, len(bl)):
        for j in range(0, len(bl)):
            array_B[i][j] = levenshtein(bl[i], bl[j])

    maxval = max(array_A.max(), array_B.max())

    f, (ax1, ax2) = plt.subplots(1, 2, figsize=(12,6))
    ax1_title = 'AlphaGo: leven distance / string length: {}'.format(length)
    ax2_title = 'Lee Sedol: leven distance / string length: {}'.format(length)

    sns.heatmap(array_A, alpha=0.75, vmax=maxval, cmap='RdBu', linewidths=.5, cbar=False, annot=True, xticklabels=['Game'])

    sns.heatmap(array_B, alpha=0.75, vmax=maxval, cmap='RdBu', linewidths=.5, cbar=False, annot=True, xticklabels=['Game'])
    ax1.set_title(ax1_title, y=1.08)
    ax2.set_title(ax2_title, y=1.08)

    ax1.xaxis.tick_top()
    ax2.xaxis.tick_top()

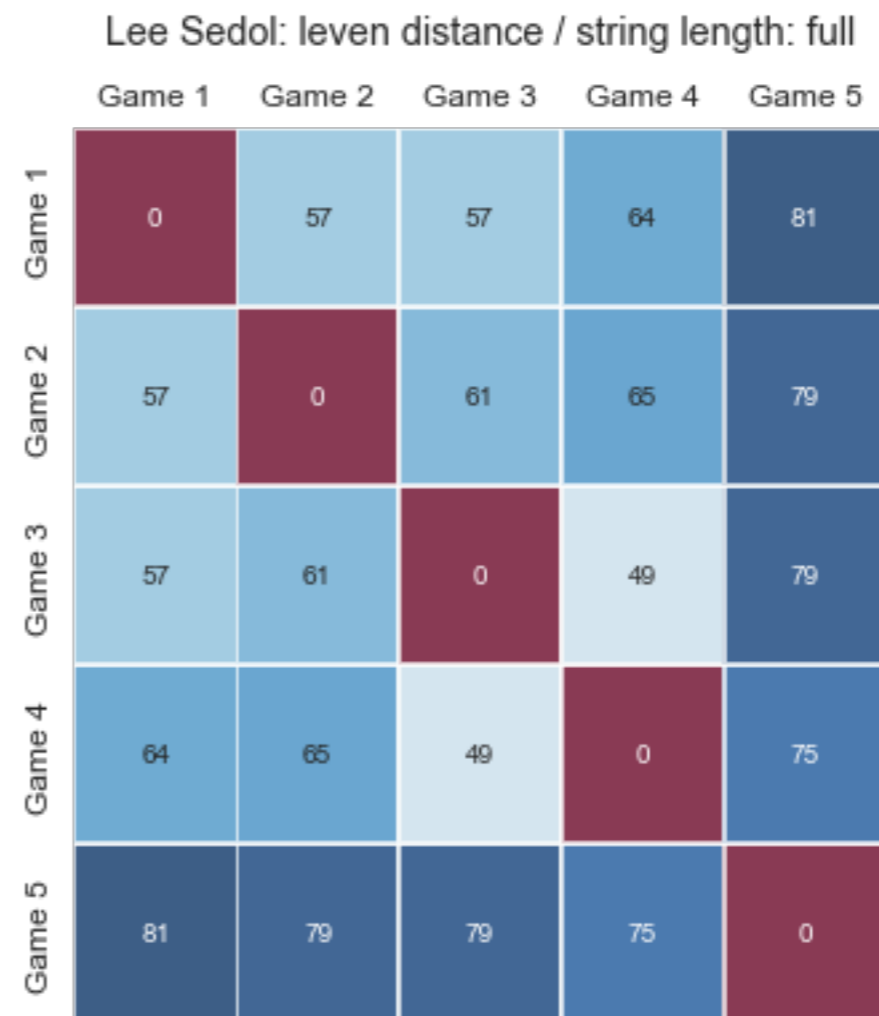
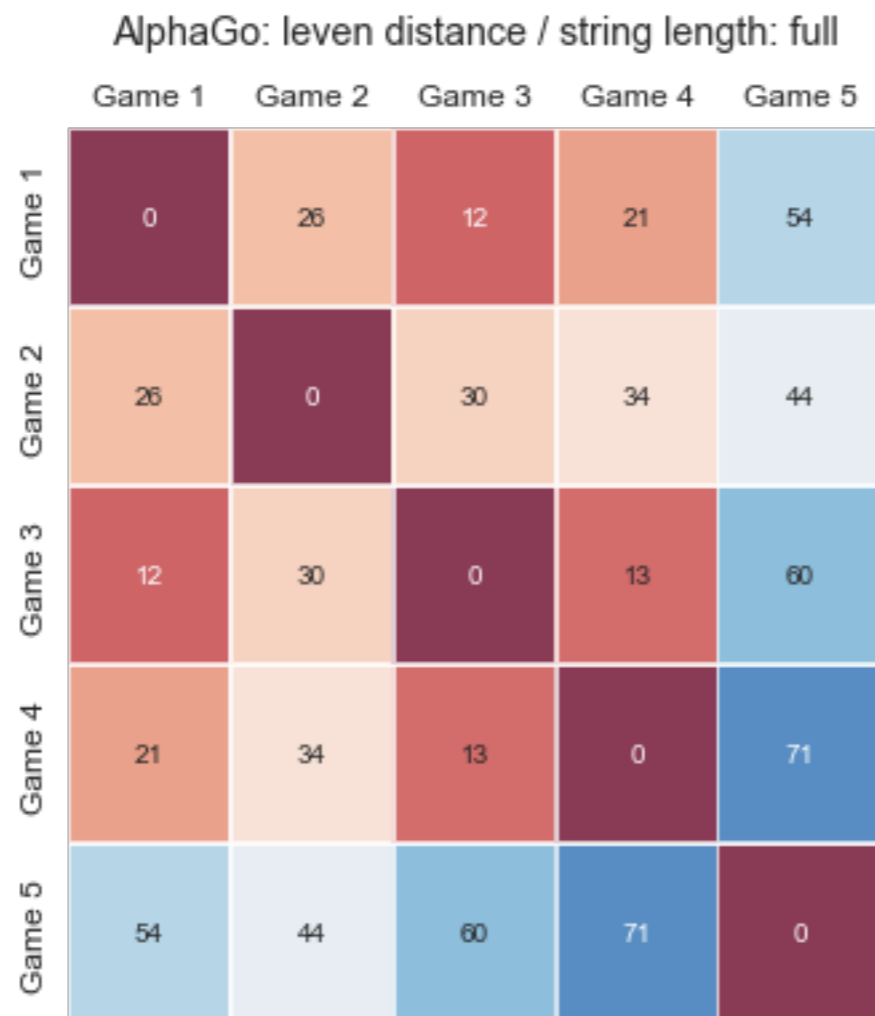
    plt.show()
```

문자열을 길이에 맞게 조정  
(FULL OR FIRST 10, 30, ETC)

동일 플레이어의 대국간  
레벤슈타인 거리 산출

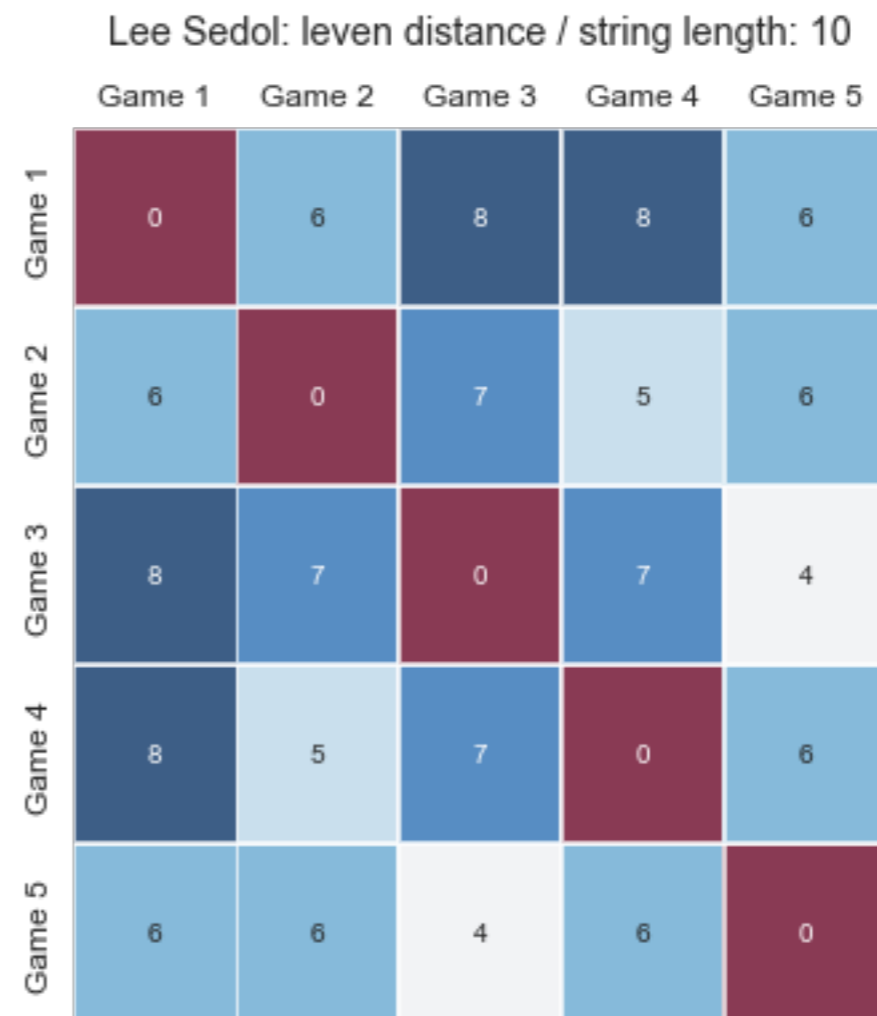
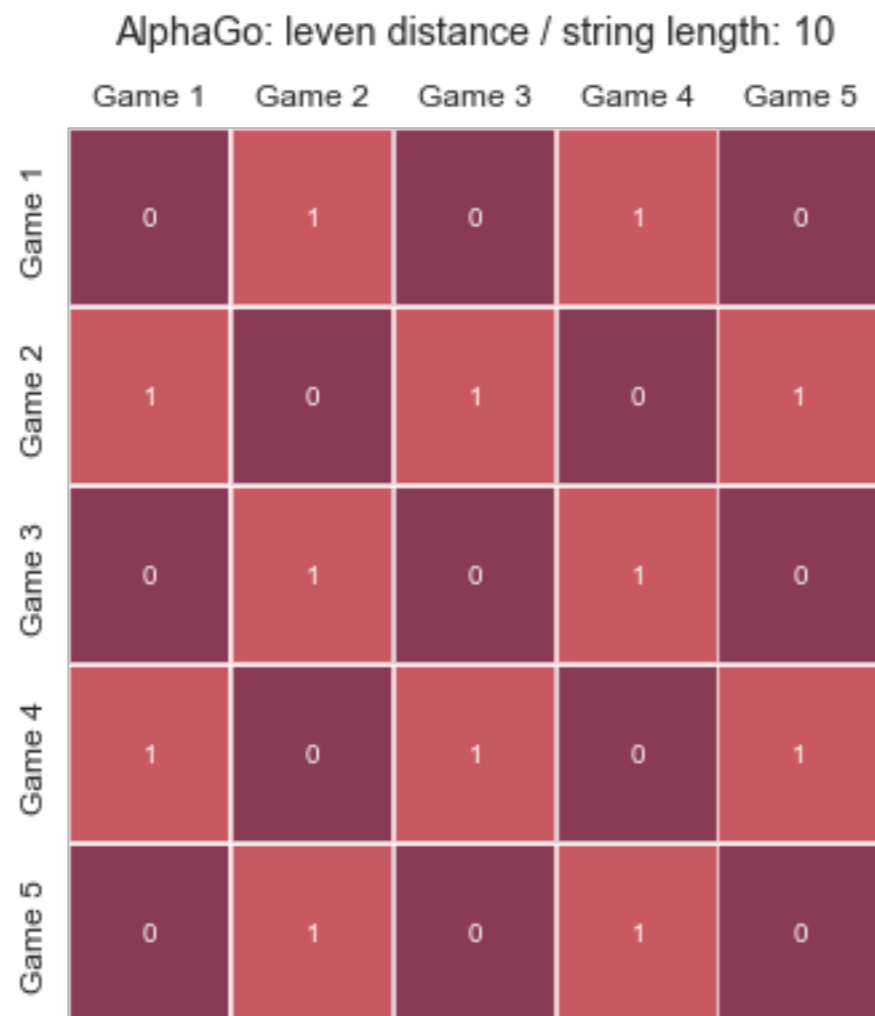
히트맵 시각화

# MATCH STRING: FULL



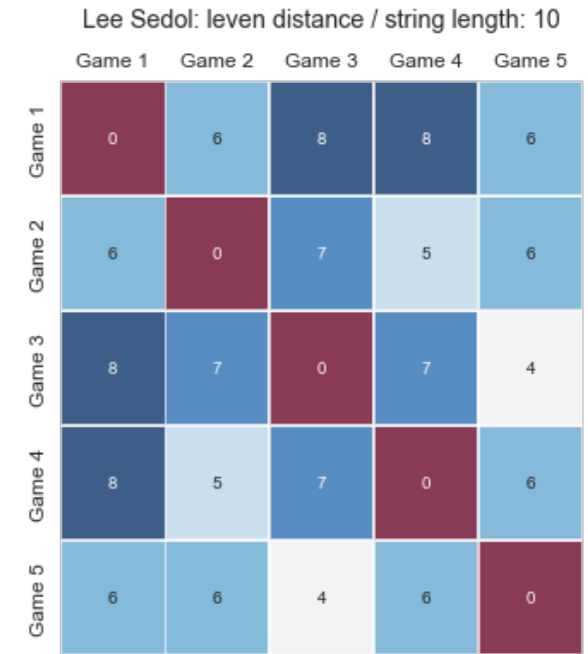
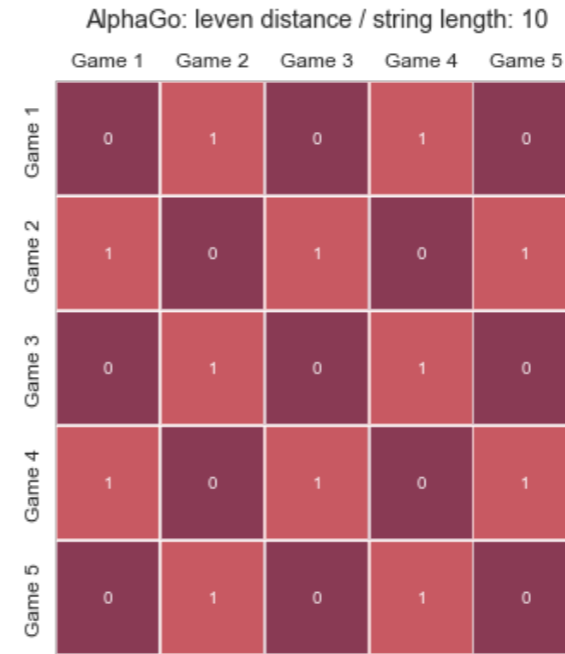
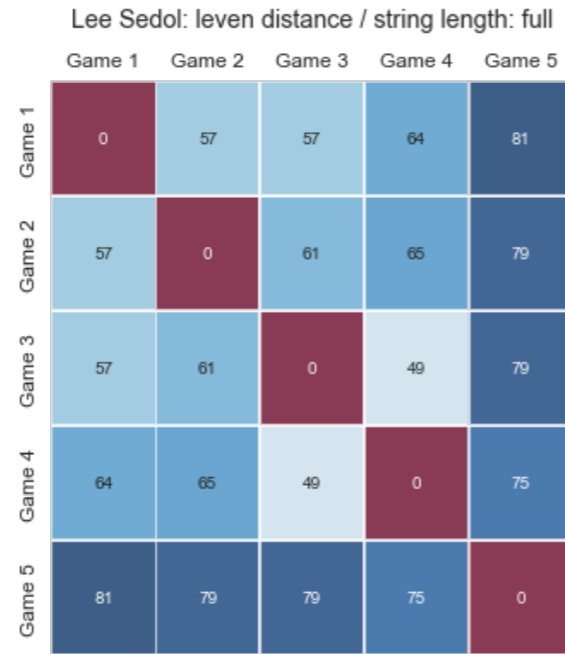
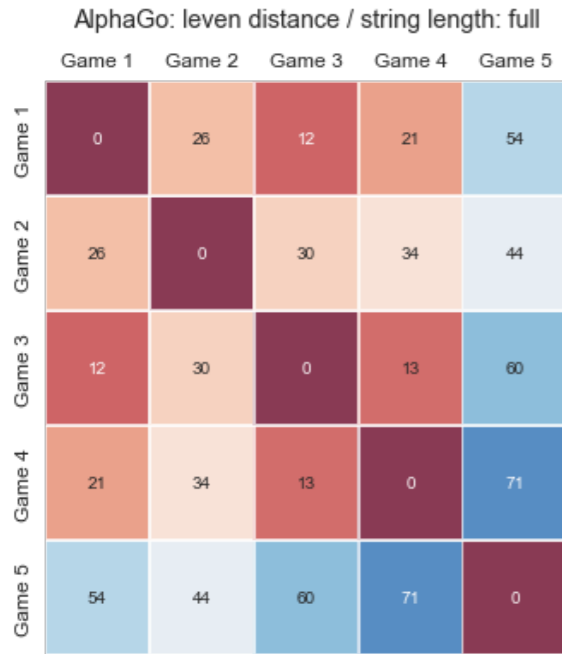


# MATCH STRING: FIRST 10



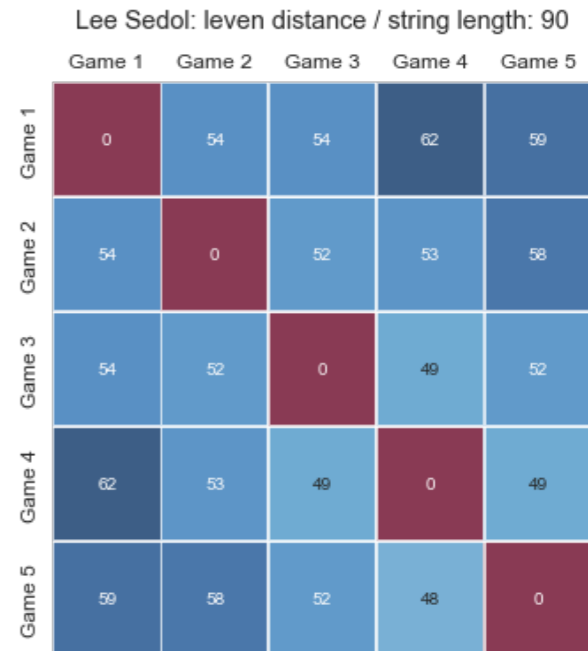
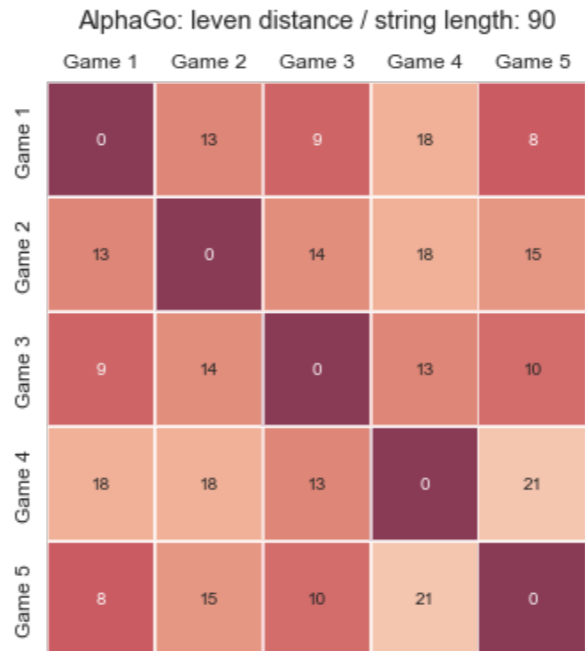
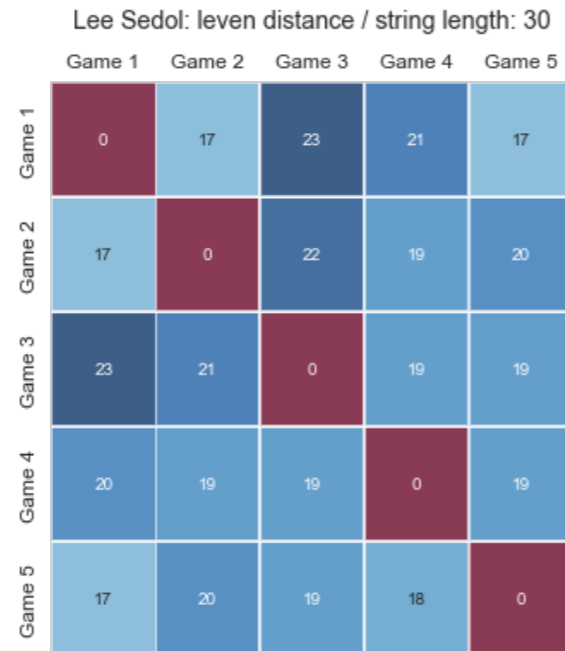
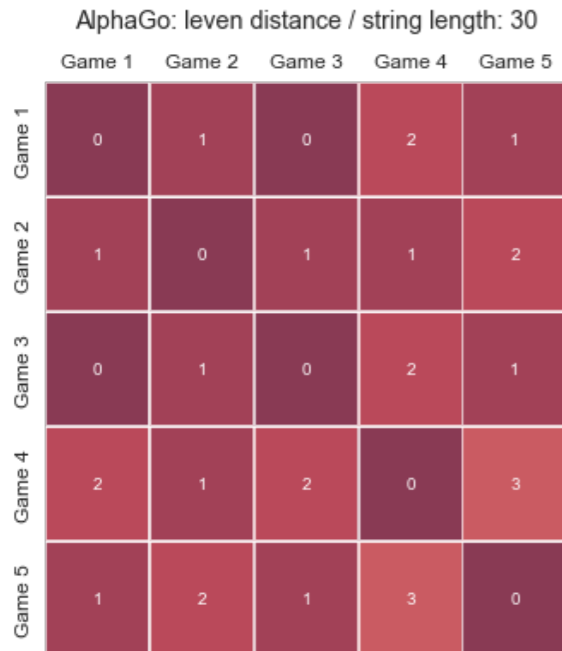
# FULL

# FIRST 10



# FIRST 30

# FIRST 90



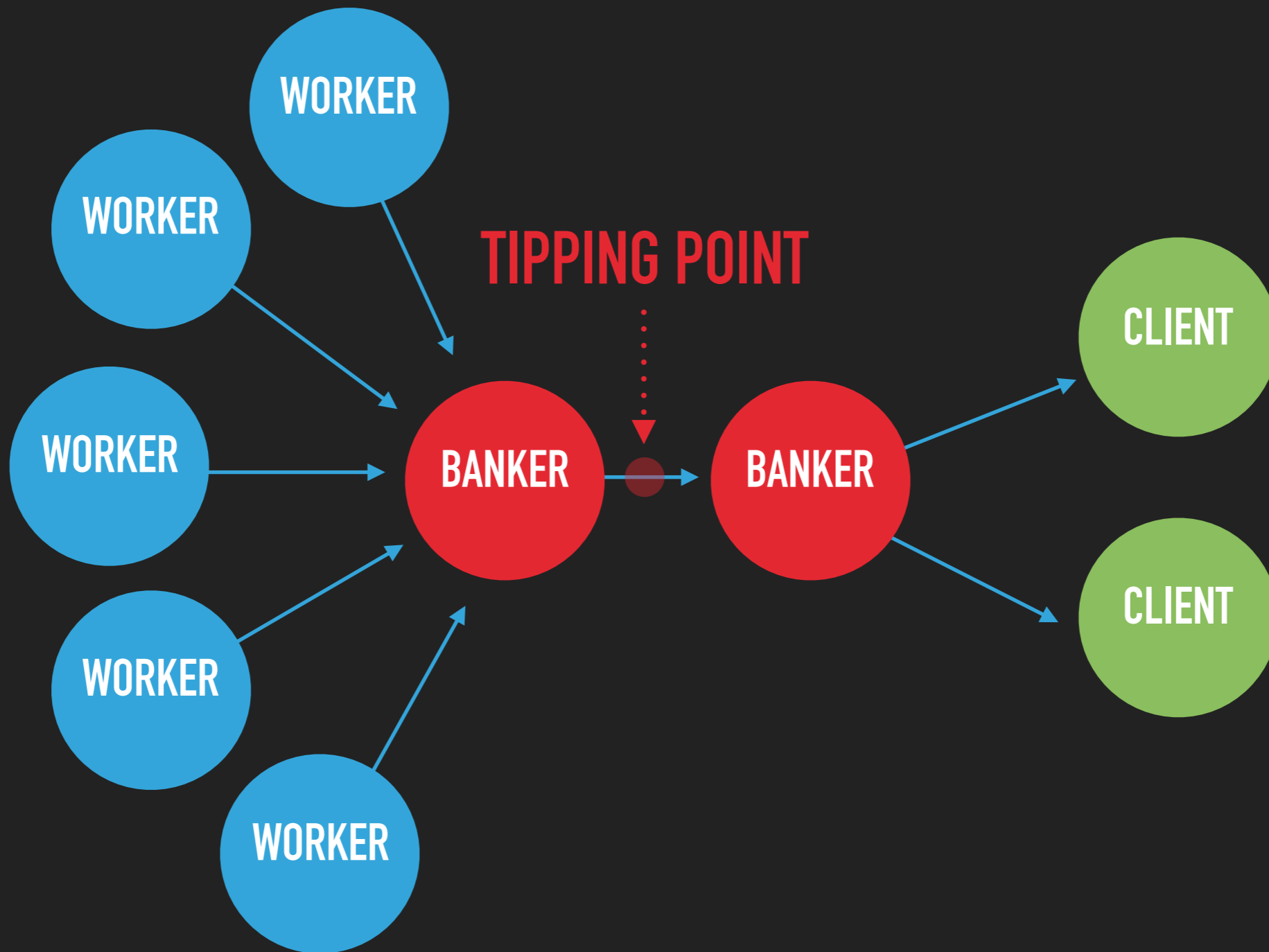
**ALPHAGO @ NEXON**

**TO CREATE VS. TO DESTROY**

# 무리지어 다니는 작업장 매크로

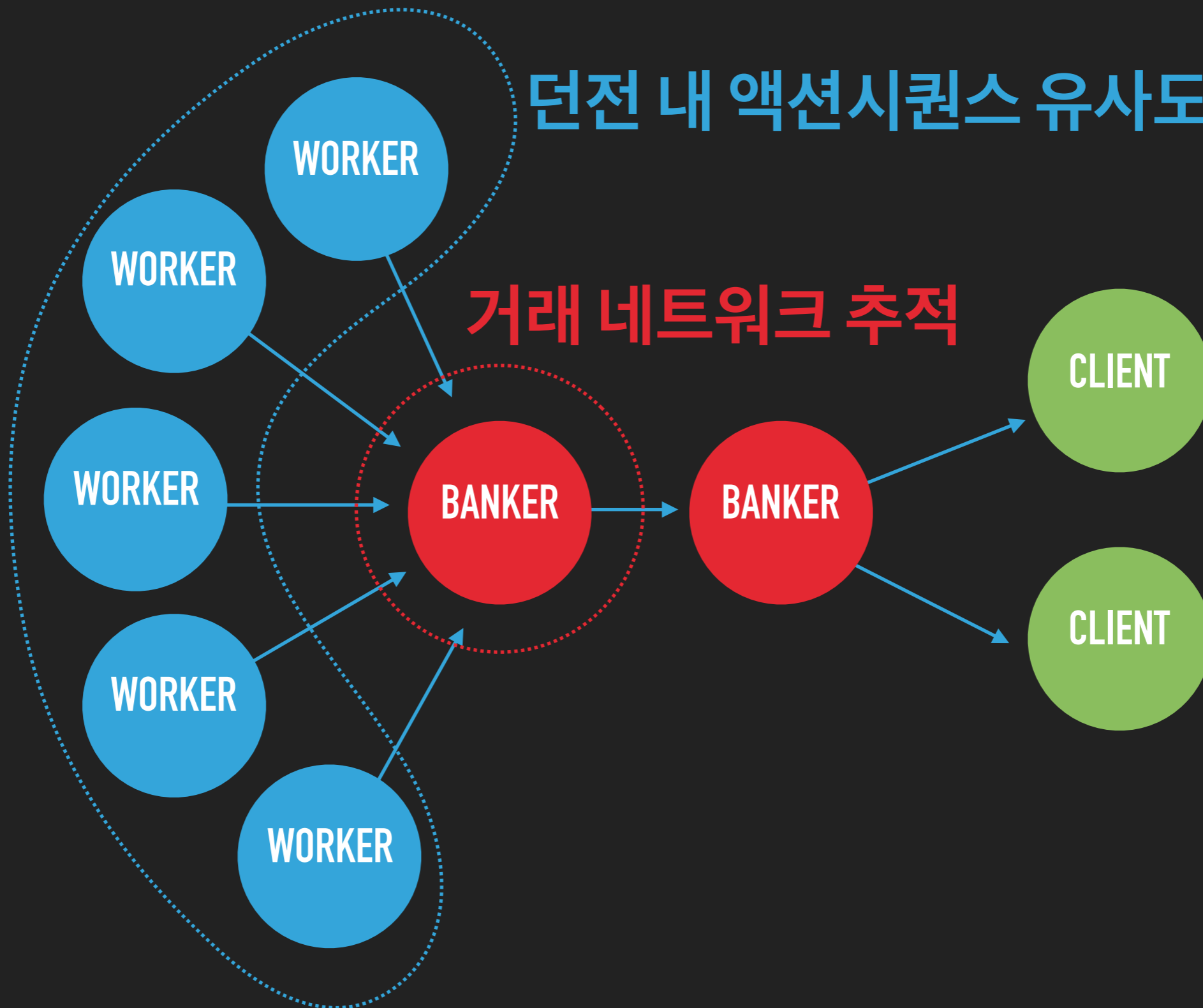


# 작업장의 일반적인 조직도



# 작업장 검거 프로세스 예시

던전 내 액션시퀀스 유사도



# 알파고를 검거할 동료를 찾습니다

분석 / 개발

머신러닝

대용량 데이터 처리

마치며





**DATA ANALYST OVERWHELMED**

# - 데이터분석 -

#실질객관 #미래예측  
#회귀분석 #통계검정



#게임하듯  
#재미있게

SHADOWMATIC

# 감사합니다!

[http://jsideas.net/python/2016/03/16/Google\\_DeepMind.html](http://jsideas.net/python/2016/03/16/Google_DeepMind.html)

<http://jsideas.net/python/2016/07/07/levenshtein.html>

[https://github.com/junkwhinger/AlphaGo\\_raw](https://github.com/junkwhinger/AlphaGo_raw)