```
In [84]: import os
         import json
         import pandas as pd
         import numpy as np
         from collections import Counter
         import matplotlib.pyplot as plt
         import seaborn as sns
In [ ]: EVAL_DIR = "evaluations"
         CSV_FILE = "evaluations/final_temp.csv"
         leaders_evaluated = ["OP01-001", "ST02-001", "ST13-003", "OP07-079", "OP08-098"]
In [ ]: def load_all_trials_json(leader_id):
             path_json = os.path.join(EVAL_DIR, leader_id, "all_trials.json")
             if not os.path.exists(path_json):
                 print(f"Datei nicht gefunden: {path_json}")
                 return pd.DataFrame()
             with open(path_json, "r", encoding="utf-8") as f:
                 data = json.load(f)
             rows = []
             for trial_block in data:
                 gnn_trial = trial_block["gnn_trial"]
                 for deck_result in trial_block["deck_results"]:
                      row = {
                         "leader": leader_id,
                         "gnn_trial": gnn_trial,
                         "deck_trial": deck_result["deck_trial"],
                         "deck": deck_result["deck"], # Dictionary CardID -> copies
                         "score": deck_result.get("score", np.nan),
                         "meta_overlap": deck_result.get("meta_overlap", np.nan),
                         "avg_synergy": deck_result.get("avg_synergy", np.nan),
                         "num_singletons": deck_result.get("num_singletons", np.nan),
                     rows.append(row)
             return pd.DataFrame(rows)
In [ ]: df_list = []
         for ld in leaders evaluated:
             df_ld = load_all_trials_json(ld)
             df_list.append(df_ld)
         df_evals = pd.concat(df_list, ignore_index=True)
         df evals.head()
```

CSV 'evaluations/final_temp.csv' nicht gefunden. Es wird nur df_evals benutzt.

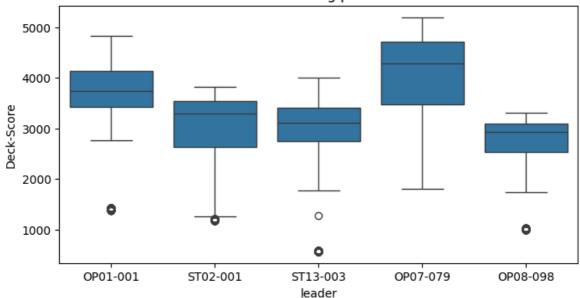
In [87]: df_merged.head() Out[87]: leader gnn_trial deck_trial deck score meta_overlap avg_synergy num_! {'OP01-030': 2, 'OP01-OP01-1 1 120': 2, 2853.559082 0 2.063501 001 'OP01-010': 1, {'ST01-011': 2, 'ST01-OP01-1 2 004': 2, 2815.091309 2.047359 1 001 'ST01-010': 2, {'OP01-024': 1, 'OP01-OP01-3 004': 2, 2837.621826 1 1 2.053221 001 'OP01-022': 2, {'OP01-014': 2, 'OP01-OP01-2.061460 1 4 022': 2, 2853.666748 1 001 'OP01-013': 2, {'OP01-016': 2, 'OP01-OP01-1 5 006': 2, 2840.410645 3 2.057597 001 'OP02-005': 3,

```
In []: df_analysis = df_merged.copy()
    print("\n==== Basis-Statistiken (Scores) pro Leader ====")
    stats_score = df_analysis.groupby("leader")["score"].describe()
    print(stats_score)

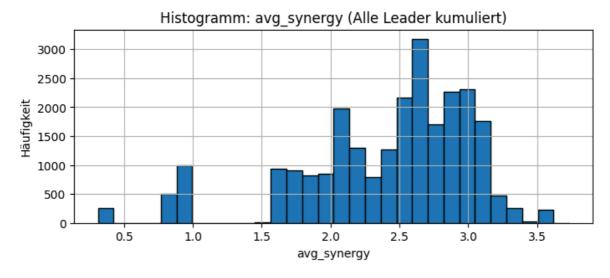
    print("\n==== Verteilung von 'avg_synergy' pro Leader ====")
    stats_synergy = df_analysis.groupby("leader")["avg_synergy"].describe()
    print(stats_synergy)
```

```
==== Basis-Statistiken (Scores) pro Leader ====
                  count
                                mean
                                             std
                                                         min
                                                                      25% \
        leader
        OP01-001 5000.0 3542.614992 835.453784 1378.026855 3429.828369
        0P07-079 5000.0 4020.627794 916.417622 1798.153442 3468.422974
        OP08-098 5000.0 2741.871736 498.446855
                                                  998.655884 2534.976562
        ST02-001 5000.0 2993.521822 738.179364 1171.397217 2623.720703
        ST13-003 5000.0 2936.864106 727.283671
                                                 568.514404 2746.909485
                         50%
                                      75%
                                                  max
        leader
        OP01-001 3744.445557 4131.174072 4829.105469
        OP07-079 4279.718018 4710.378906
                                          5197.020996
        OP08-098 2919.773804 3086.703674 3310.768555
        ST02-001 3288.600220 3545.678406 3817.153809
        ST13-003 3105.371704 3404.007141 3994.910645
        ==== Verteilung von 'avg_synergy' pro Leader ====
                                                           25%
                                                                     50%
                                                                               75% \
                  count
                             mean
                                        std
        leader
        OP01-001 5000.0 2.648854 0.705494 0.914646 2.504780 2.885268
                                                                          3.091889
        OP07-079 5000.0 2.559113 0.607359 0.987925 2.085322 2.931277 3.035498
        OP08-098 5000.0 2.328871 0.427996 0.854625 2.139125 2.473820 2.632723
        ST02-001 5000.0 2.339288 0.612242 0.859761
                                                      2.010152 2.585045
                                                                          2.786369
        ST13-003 5000.0 2.227817 0.604963 0.311729 1.986612 2.422358 2.658001
                      max
        leader
        OP01-001 3.733522
        OP07-079 3.196242
        OP08-098 2.805426
        ST02-001 2.971559
        ST13-003 3.054866
In [71]: stats_synergy.head()
Out[71]:
                                    std
                                             min
                                                     25%
                                                              50%
                                                                       75%
                count
                         mean
                                                                                max
         leader
         OP01-
                5000.0 2.648854 0.705494 0.914646 2.504780 2.885268 3.091889 3.733522
           001
         OP07-
                5000.0 2.559113 0.607359 0.987925 2.085322 2.931277 3.035498 3.196242
           079
         OP08-
                5000.0 2.328871 0.427996 0.854625 2.139125 2.473820 2.632723
                                                                            2 805426
           098
          ST02-
                5000.0 2.339288 0.612242 0.859761 2.010152 2.585045
                                                                   2.786369
                                                                            2.971559
           001
          ST13-
                5000.0 2.227817 0.604963 0.311729 1.986612 2.422358 2.658001 3.054866
           003
         plt.figure(figsize=(8, 4))
         sns.boxplot(data=df_analysis, x="leader", y="score")
         plt.title("Score-Verteilung pro Leader")
         plt.ylabel("Deck-Score")
         plt.show()
```

Score-Verteilung pro Leader



```
In [ ]: plt.figure(figsize=(8,3))
    df_analysis["avg_synergy"].hist(bins=30, edgecolor="k")
    plt.title("Histogramm: avg_synergy (Alle Leader kumuliert)")
    plt.xlabel("avg_synergy")
    plt.ylabel("Häufigkeit")
    plt.show()
```

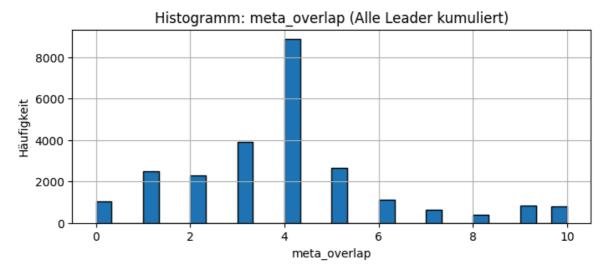


```
In [ ]: print("\n==== Verteilung von 'meta_overlap' pro Leader ====")
    stats_overlap = df_analysis.groupby("leader")["meta_overlap"].describe()
    print(stats_overlap)
```

```
==== Verteilung von 'meta_overlap' pro Leader ====
          count
                             std min
                                       25%
                                            50%
                                                 75%
                   mean
                                                      max
leader
OP01-001 5000.0 3.8000 1.472153
                                  0.0
                                       3.0
                                            4.0
                                                 5.0
                                                      9.0
OP07-079 5000.0 3.7654 1.327070
                                                      8.0
                                  0.0
                                       3.0
                                            4.0
                                                 4.0
OP08-098
         5000.0 5.6300 3.228558
                                  0.0
                                       3.0
                                            5.0
                                                 9.0
                                                     10.0
ST02-001
         5000.0 2.8012 1.839444 0.0 1.0
                                            2.0
                                                 4.0
                                                     10.0
ST13-003 5000.0 3.4010 1.336921 0.0 4.0
                                                 4.0
                                                      7.0
                                            4.0
```

```
In [ ]: plt.figure(figsize=(8,3))
    df_analysis["meta_overlap"].hist(bins=30, edgecolor="k")
    plt.title("Histogramm: meta_overlap (Alle Leader kumuliert)")
```

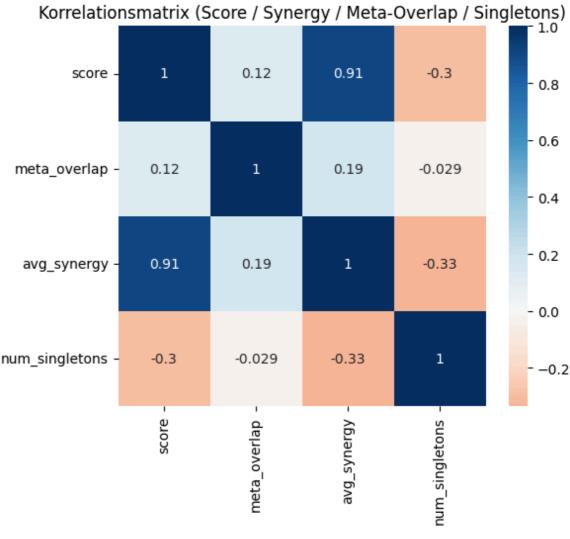
```
plt.xlabel("meta_overlap")
plt.ylabel("Häufigkeit")
plt.show()
```



```
In [ ]:
        corr_cols = ["score", "meta_overlap", "avg_synergy", "num_singletons"]
        corr_cols = [c for c in corr_cols if c in df_analysis.columns] # Nur existieren
        corr_matrix = df_analysis[corr_cols].corr()
        print("\nKorrelationsmatrix:")
        print(corr_matrix)
        plt.figure(figsize=(6,5))
        sns.heatmap(corr_matrix, annot=True, cmap="RdBu", center=0)
        plt.title("Korrelationsmatrix (Score / Synergy / Meta-Overlap / Singletons)")
        plt.show()
        # calculate correlation between score and avg_synergy for each leader
        for leader in leaders evaluated:
            df_leader = df_analysis[df_analysis["leader"] == leader]
            corr = df_leader["score"].corr(df_leader["avg_synergy"])
            print(f"Korrelation (Score vs. avg_synergy) für Leader '{leader}': {corr:.3f
        # calculate correlation between score and meta_overlap for each leader
        for leader in leaders evaluated:
            df_leader = df_analysis[df_analysis["leader"] == leader]
            corr = df_leader["score"].corr(df_leader["meta_overlap"])
            print(f"Korrelation (Score vs. meta_overlap) für Leader '{leader}': {corr:.3
        # calculate correlation between score and num_singletons for each leader
        for leader in leaders evaluated:
            df_leader = df_analysis[df_analysis["leader"] == leader]
            corr = df_leader["score"].corr(df_leader["num_singletons"])
            print(f"Korrelation (Score vs. num_singletons) für Leader '{leader}': {corr:
```

Korrelationsmatrix:

```
score meta_overlap avg_synergy num_singletons
score
                1.000000
                              0.119072
                                           0.905983
                                                          -0.299682
                                                          -0.028505
meta overlap
                0.119072
                              1.000000
                                           0.190070
                              0.190070
                                                          -0.334926
avg_synergy
                0.905983
                                           1.000000
num_singletons -0.299682
                             -0.028505
                                         -0.334926
                                                           1.000000
```



```
Korrelation (Score vs. avg_synergy) für Leader 'OP01-001': 0.991
Korrelation (Score vs. avg_synergy) für Leader 'ST02-001': 0.994
Korrelation (Score vs. avg_synergy) für Leader 'ST13-003': 0.989
Korrelation (Score vs. avg_synergy) für Leader 'OP07-079': 0.920
Korrelation (Score vs. avg_synergy) für Leader 'OP08-098': 0.998
Korrelation (Score vs. meta_overlap) für Leader 'OP01-001': 0.444
Korrelation (Score vs. meta_overlap) für Leader 'ST02-001': 0.390
Korrelation (Score vs. meta_overlap) für Leader 'ST13-003': 0.495
Korrelation (Score vs. meta_overlap) für Leader 'OP07-079': 0.410
Korrelation (Score vs. meta_overlap) für Leader 'OP08-098': -0.199
Korrelation (Score vs. num_singletons) für Leader 'OP01-001': -0.388
Korrelation (Score vs. num_singletons) für Leader 'ST02-001': -0.522
Korrelation (Score vs. num_singletons) für Leader 'ST13-003': -0.151
Korrelation (Score vs. num_singletons) für Leader 'OP07-079': -0.421
Korrelation (Score vs. num_singletons) für Leader 'OP08-098': -0.256
```

```
print(grouped_trial.head(10))

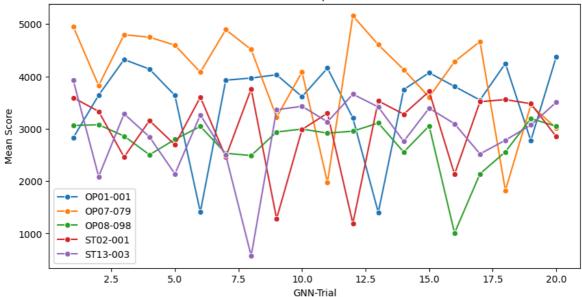
# Beispiel: Liniendiagramm Score_mean über gnn_trial
plt.figure(figsize=(10,5))
sns.lineplot(data=grouped_trial, x="gnn_trial", y="score_mean", hue="leader", ma
plt.title("Durchschnittlicher Score pro GNN-Trial & Leader")
plt.xlabel("GNN-Trial")
plt.ylabel("Mean Score")
plt.legend()
plt.show()
```

Aggregationen auf Leader, gnn_trial-Ebene:

```
leader gnn_trial score_mean score_std score_min
                                                       score_max \
0 OP01-001
                1 2827.200840 18.476005 2770.776367 2870.863525
1 OP01-001
                 2 3641.587732 31.236039 3576.410889 3707.558594
                 3 4322.173488 49.594973 4240.314453 4417.889648
2 OP01-001
3 OP01-001
                 4 4139.423146 15.675461 4115.425293 4177.508789
4 OP01-001
                5 3635.925144 26.764131 3577.267334 3694.268799
5 OP01-001
                6 1410.872969 7.467871 1389.035278 1426.633789
                 7 3928.043354 16.090940 3903.228760 3971.607666
6 OP01-001
7 OP01-001
                8 3968.431752 49.619427 3866.911865 4073.589844
8 OP01-001
                9 4031.301249 194.390656 3703.313965 4635.237305
9 0P01-001 10 3613.168075 21.720693 3566.940186 3661.458252
```

	synergy_mean	synergy_std	metaover_mean	metaover_std
0	2.051742	0.006401	1.024	0.973249
1	2.837817	0.012070	4.032	0.993440
2	3.320491	0.019230	4.784	0.892485
3	3.105585	0.015952	3.504	0.622522
4	2.852581	0.011073	6.544	0.728138
5	0.914784	0.000073	0.964	0.911057
6	2.918307	0.014209	3.556	0.785706
7	2.981331	0.022396	4.032	1.017407
8	2.995182	0.148637	4.100	1.098557
9	2.681732	0.011330	3.868	0.924117

Durchschnittlicher Score pro GNN-Trial & Leader



```
c_all[cid] += cnt
return c_all

print("\n=== Häufigste Karten pro Leader (über alle Trials und Decks) ===")
for ld in leaders_evaluated:
    df_ld = df_analysis[df_analysis["leader"]==ld]
    ccount = count_cards(df_ld["deck"])
    if len(ccount)==0:
        print(f" -> Leader {ld}: Keine Deck-Daten?")
        continue

top10 = ccount.most_common(10)
    print(f"\nLeader {ld}: Top 10 Karten [CardID -> Anzahl Kopien]")
    for cardid, amount in top10:
        print(f" {cardid}: {amount}")
```

```
=== Häufigste Karten pro Leader (über alle Trials und Decks) ===
Leader OP01-001: Top 10 Karten [CardID -> Anzahl Kopien]
  OP01-030: 12275
  OP01-016: 11918
  OP03-008: 11819
  OP02-018: 11678
  P-014: 10810
  OP03-003: 10656
  OP03-013: 10618
  OP05-004: 10556
  OP05-017: 10535
  OP05-018: 10513
Leader ST02-001: Top 10 Karten [CardID -> Anzahl Kopien]
  OP01-044: 12295
  OP01-049: 12286
  OP01-050: 12256
  OP01-051: 12145
  ST02-005: 11377
  ST02-017: 11342
  OP02-035: 10556
  OP02-036: 10303
  OP02-030: 9003
  OP03-029: 8938
Leader ST13-003: Top 10 Karten [CardID -> Anzahl Kopien]
  OP03-108: 13316
  OP04-104: 13262
  OP05-101: 13226
  ST07-007: 13212
  OP05-105: 13136
  OP03-116: 13079
  OP06-086: 12514
  ST13-010: 12469
  ST13-007: 12431
  OP06-104: 12427
Leader OP07-079: Top 10 Karten [CardID -> Anzahl Kopien]
  OP06-086: 13103
  OP05-091: 13081
  OP03-089: 12955
  OP03-086: 12933
  OP03-090: 12877
  OP02-113: 12793
  OP02-099: 12034
  OP03-094: 11997
  OP04-081: 8623
  OP05-093: 8512
Leader OP08-098: Top 10 Karten [CardID -> Anzahl Kopien]
  OP03-112: 11920
  OP03-113: 11897
  ST07-007: 11863
  OP03-110: 11812
  OP03-108: 11767
  OP04-104: 11663
  OP03-121: 11634
  ST07-010: 5924
```

```
In [ ]: def deck_size_and_diversity(row):
    d = row["deck"]
    if not isinstance(d, dict):
        return pd.Series([np.nan, np.nan])
    total_copies = sum(d.values())
    diff_cards = len(d.keys())
    return pd.Series([total_copies, diff_cards])

df_analysis[["deck_size","deck_diversity"]] = df_analysis.apply(deck_size_and_di

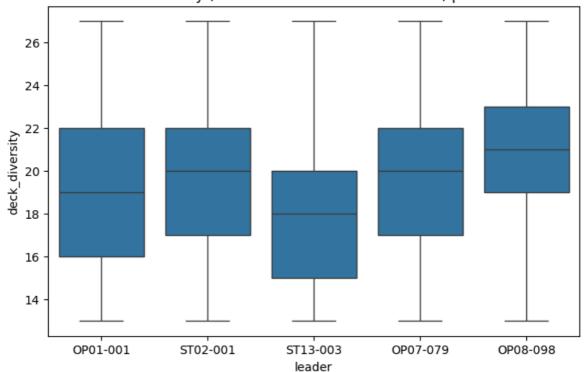
print("\nEinige Zeilen mit deck_size, deck_diversity:")
    print(df_analysis[["leader","gnn_trial","deck_trial","deck_size","deck_diversity

# Boxplot deck_diversity pro Leader
    plt.figure(figsize=(8,5))
    sns.boxplot(data=df_analysis, x="leader", y="deck_diversity")
    plt.title("Deck-Diversity (Anzahl unterschiedlicher Karten) pro Leader")
    plt.show()
```

Einige Zeilen mit deck_size, deck_diversity:

	leader	gnn_trial	deck_trial	deck_size	deck_diversity
0	OP01-001	1	1	50	25
1	OP01-001	1	2	50	24
2	OP01-001	1	3	50	24
3	OP01-001	1	4	50	27
4	OP01-001	1	5	50	24
5	OP01-001	1	6	50	22
6	OP01-001	1	7	50	23
7	OP01-001	1	8	50	24
8	OP01-001	1	9	50	25
9	OP01-001	1	10	50	24

Deck-Diversity (Anzahl unterschiedlicher Karten) pro Leader



```
In [ ]: def best_deck_per_leader(df):
            idx = df.groupby("leader")["score"].transform(max) == df["score"]
            return df[idx]
        df_best_decks = best_deck_per_leader(df_analysis)
        print("\n=== Bestes Deck pro Leader ===")
        # the deck is a dict containing the card_id as key and the amount of copies as \nu
        for idx, row in df_best_decks.iterrows():
            leader = row["leader"]
            gnn_trial = row["gnn_trial"]
            deck_trial = row["deck_trial"]
            deck = row["deck"]
            score = row["score"]
            print(f"Leader '{leader}' (GNN-Trial {gnn_trial}, Deck-Trial {deck_trial}):
            print(deck)
            for card_id, count in deck.items():
                print(f" {count}x {card_id}")
            print()
```

```
=== Bestes Deck pro Leader ===
Leader 'OP01-001' (GNN-Trial 16, Deck-Trial 21): Score 4829.10546875
{'OP01-006': 4, 'OP01-029': 3, 'OP01-022': 3, 'OP01-017': 3, 'OP01-013': 2, 'OP01
-120': 2, 'OP01-025': 4, 'ST01-012': 3, 'ST01-011': 3, 'ST01-015': 3, 'OP02-011':
3, 'OP02-008': 1, 'OP02-015': 3, 'P-013': 3, 'P-019': 1, 'OP03-018': 3, 'OP03-02
0': 3, 'OP04-016': 3}
 4x OP01-006
  3x OP01-029
  3x OP01-022
  3x OP01-017
  2x OP01-013
  2x OP01-120
  4x OP01-025
  3x ST01-012
  3x ST01-011
  3x ST01-015
  3x OP02-011
  1x OP02-008
  3x OP02-015
  3x P-013
  1x P-019
  3x OP03-018
  3x OP03-020
  3x OP04-016
Leader 'ST02-001' (GNN-Trial 8, Deck-Trial 36): Score 3817.15380859375
{'OP01-037': 2, 'OP01-050': 2, 'OP01-044': 2, 'OP01-040': 2, 'OP01-049': 2, 'OP01
-051': 2, 'ST02-005': 3, 'ST02-017': 3, 'ST02-007': 2, 'OP02-037': 2, 'OP02-035':
4, 'OP02-041': 3, 'OP02-036': 2, 'OP02-030': 1, 'OP02-044': 2, 'OP03-030': 2, 'OP
03-027': 1, 'OP03-029': 2, 'OP04-119': 2, 'OP05-033': 1, 'ST12-003': 3, 'OP06-03
1': 2, 'OP06-041': 2, 'EB01-013': 1}
  2x OP01-037
  2x OP01-050
  2x OP01-044
  2x OP01-040
  2x OP01-049
  2x OP01-051
  3x ST02-005
  3x ST02-017
  2x ST02-007
  2x OP02-037
  4x OP02-035
  3x OP02-041
  2x OP02-036
  1x OP02-030
  2x OP02-044
  2x OP03-030
  1x OP03-027
  2x OP03-029
  2x OP04-119
  1x OP05-033
  3x ST12-003
  2x OP06-031
  2x OP06-041
  1x EB01-013
Leader 'ST13-003' (GNN-Trial 1, Deck-Trial 232): Score 3994.91064453125
{'OP02-113': 2, 'ST07-007': 2, 'OP03-113': 1, 'OP03-090': 2, 'OP03-100': 2, 'OP03
```

-108': 2, 'OP03-116': 2, 'ST09-008': 3, 'OP04-103': 1, 'OP04-104': 3, 'OP05-091': 1, 'OP05-101': 2, 'OP05-105': 3, 'OP05-106': 2, 'OP05-111': 1, 'OP06-086': 2, 'OP

```
06-102': 2, 'OP06-104': 2, 'OP06-109': 2, 'OP06-110': 2, 'ST13-007': 2, 'ST13-01
0': 1, 'ST13-014': 2, 'OP08-096': 2, 'OP08-113': 2, 'OP08-114': 2}
  2x OP02-113
  2x ST07-007
  1x OP03-113
  2x OP03-090
  2x OP03-100
  2x OP03-108
  2x OP03-116
  3x ST09-008
  1x OP04-103
  3x OP04-104
  1x OP05-091
  2x OP05-101
  3x OP05-105
  2x OP05-106
  1x OP05-111
  2x 0P06-086
  2x OP06-102
  2x OP06-104
  2x OP06-109
  2x OP06-110
  2x ST13-007
  1x ST13-010
  2x ST13-014
  2x OP08-096
  2x OP08-113
  2x OP08-114
Leader 'OP07-079' (GNN-Trial 12, Deck-Trial 169): Score 5197.02099609375
{'OP02-099': 2, 'OP02-104': 2, 'OP02-113': 3, 'OP03-090': 4, 'OP03-089': 4, 'OP03
-086': 3, 'OP03-094': 3, 'ST08-007': 3, 'OP04-084': 3, 'OP05-091': 3, 'OP05-093':
1, 'OP06-086': 3, 'OP06-098': 3, 'EB01-042': 3, 'EB01-043': 2, 'OP08-090': 2, 'OP
08-092': 3, 'OP08-096': 3}
  2x OP02-099
  2x OP02-104
  3x OP02-113
  4x OP03-090
  4x OP03-089
  3x OP03-086
  3x OP03-094
  3x ST08-007
  3x OP04-084
  3x OP05-091
  1x OP05-093
  3x 0P06-086
  3x OP06-098
  3x EB01-042
  2x EB01-043
  2x OP08-090
  3x OP08-092
  3x OP08-096
Leader 'OP08-098' (GNN-Trial 19, Deck-Trial 133): Score 3310.7685546875
{'ST07-007': 3, 'ST07-017': 1, 'OP03-113': 2, 'OP03-119': 2, 'OP03-112': 3, 'OP03
-108': 3, 'OP03-110': 3, 'OP03-117': 2, 'OP03-121': 2, 'ST09-008': 1, 'OP04-106':
3, 'OP04-104': 2, 'OP04-108': 2, 'OP04-111': 1, 'OP05-101': 2, 'OP05-112': 2, 'OP
06-104': 2, 'OP07-100': 2, 'OP07-101': 2, 'OP07-111': 2, 'OP07-115': 1, 'ST13-00
6': 1, 'OP08-104': 2, 'OP08-113': 2, 'OP08-114': 2}
  3x ST07-007
```

```
1x ST07-017
2x OP03-113
2x OP03-119
3x OP03-112
3x OP03-108
3x OP03-110
2x OP03-117
2x OP03-121
1x ST09-008
3x OP04-106
2x OP04-104
2x OP04-108
1x OP04-111
2x OP05-101
2x OP05-112
2x OP06-104
2x OP07-100
2x OP07-101
2x OP07-111
1x OP07-115
1x ST13-006
2x OP08-104
2x OP08-113
2x OP08-114
```

C:\Users\sandr\AppData\Local\Temp\ipykernel_1336\3948551135.py:6: FutureWarning: The provided callable <built-in function max> is currently using SeriesGroupBy.ma x. In a future version of pandas, the provided callable will be used directly. To keep current behavior pass the string "max" instead.

idx = df.groupby("leader")["score"].transform(max) == df["score"]