	match_id	inning	batting_team	bowling_team	over	ball	batsman	non_striker	bowler	is_s
0	1	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	1	DA Warner	S Dhawan	TS Mills	
1	1	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	2	DA Warner	S Dhawan	TS Mills	
2	1	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	3	DA Warner	S Dhawan	TS Mills	
3	1	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	4	DA Warner	S Dhawan	TS Mills	
4	1	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	5	DA Warner	S Dhawan	TS Mills	

5 rows × 21 columns

4

In [4]: m.head()

#### Out[4]:

	id	Season	city	date	team1	team2	toss_winner	toss_decision	result	dl
0	1	IPL- 2017	Hyderabad	05- 04- 2017	Sunrisers Hyderabad	Royal Challengers Bangalore	Royal Challengers Bangalore	field	normal	
1	2	IPL- 2017	Pune	06- 04- 2017	Mumbai Indians	Rising Pune Supergiant	Rising Pune Supergiant	field	normal	
2	3	IPL- 2017	Rajkot	07- 04- 2017	Gujarat Lions	Kolkata Knight Riders	Kolkata Knight Riders	field	normal	
3	4	IPL- 2017	Indore	08- 04- 2017	Rising Pune Supergiant	Kings XI Punjab	Kings XI Punjab	field	normal	
4	5	IPL- 2017	Bangalore	08- 04- 2017	Royal Challengers Bangalore	Delhi Daredevils	Royal Challengers Bangalore	bat	normal	
4										•

In [5]: m.shape,d.shape

Out[5]: ((756, 18), (179078, 21))

In [6]: totalruns=d.groupby(['match\_id','inning']).sum()['total\_runs'].reset\_index()
totalruns

## Out[6]:

	match_id	inning	total_runs
0	1	1	207
1	1	2	172
2	2	1	184
3	2	2	187
4	3	1	183
1523	11413	2	170
1524	11414	1	155
1525	11414	2	162
1526	11415	1	152
1527	11415	2	157

1528 rows × 3 columns

```
In [7]: firstinn=totalruns[totalruns['inning'] == 1]
```

## In [8]: firstinn

# Out[8]:

	match_id	inning	total_runs
0	1	1	207
2	2	1	184
4	3	1	183
6	4	1	163
8	5	1	157
1518	11347	1	143
1520	11412	1	136
1522	11413	1	171
1524	11414	1	155
1526	11415	1	152

756 rows × 3 columns

```
In [9]: firstinn['total_runs']=firstinn['total_runs'].map(lambda x:x+1)
firstinn
```

## Out[9]:

	match_id	inning	total_runs
0	1	1	208
2	2	1	185
4	3	1	184
6	4	1	164
8	5	1	158
1518	11347	1	144
1520	11412	1	137
1522	11413	1	172
1524	11414	1	156
1526	11415	1	153

756 rows × 3 columns

```
In [10]: m.columns
```

In [11]: mdf=m.merge(firstinn[['match\_id','total\_runs']],left\_on='id',right\_on='match\_i
mdf

#### Out[11]:

	id	Season	city	date	team1	team2	toss_winner	toss_decision
0	1	IPL- 2017	Hyderabad	05- 04- 2017	Sunrisers Hyderabad	Royal Challengers Bangalore	Royal Challengers Bangalore	field
1	2	IPL- 2017	Pune	06- 04- 2017	Mumbai Indians	Rising Pune Supergiant	Rising Pune Supergiant	field
2	3	IPL- 2017	Rajkot	07- 04- 2017	Gujarat Lions	Kolkata Knight Riders	Kolkata Knight Riders	field
3	4	IPL- 2017	Indore	08- 04- 2017	Rising Pune Supergiant	Kings XI Punjab	Kings XI Punjab	field
4	5	IPL- 2017	Bangalore	08- 04- 2017	Royal Challengers Bangalore	Delhi Daredevils	Royal Challengers Bangalore	bat
751	11347	IPL- 2019	Mumbai	05- 05- 2019	Kolkata Knight Riders	Mumbai Indians	Mumbai Indians	field
752	11412	IPL- 2019	Chennai	07- 05- 2019	Chennai Super Kings	Mumbai Indians	Chennai Super Kings	bat
753	11413	IPL- 2019	Visakhapatnam	08- 05- 2019	Sunrisers Hyderabad	Delhi Capitals	Delhi Capitals	field
754	11414	IPL- 2019	Visakhapatnam	10- 05- 2019	Delhi Capitals	Chennai Super Kings	Chennai Super Kings	field
755	11415	IPL- 2019	Hyderabad	12- 05- 2019	Mumbai Indians	Chennai Super Kings	Mumbai Indians	bat

756 rows × 20 columns

```
In [12]: |mdf['team1'].unique()
Out[12]: array(['Sunrisers Hyderabad', 'Mumbai Indians', 'Gujarat Lions',
                 'Rising Pune Supergiant', 'Royal Challengers Bangalore',
                 'Kolkata Knight Riders', 'Delhi Daredevils', 'Kings XI Punjab',
                 'Chennai Super Kings', 'Rajasthan Royals', 'Deccan Chargers',
                 'Kochi Tuskers Kerala', 'Pune Warriors', 'Rising Pune Supergiants',
                 'Delhi Capitals'], dtype=object)
In [13]: | teams = ['Sunrisers Hyderabad', 'Mumbai Indians', 'Royal Challengers Bangalore'
                 'Kolkata Knight Riders', 'Kings XI Punjab', 'Chennai Super Kings', 'Rajas
In [14]: mdf[['team1','team2']]=mdf[['team1','team2']].replace('Delhi Daredevils','Delk')
In [15]: |mdf=mdf[mdf['team1'].isin(teams)]
         mdf=mdf[mdf['team2'].isin(teams)]
In [16]: mdf['team1'].unique()
Out[16]: array(['Sunrisers Hyderabad', 'Royal Challengers Bangalore',
                 'Kolkata Knight Riders', 'Kings XI Punjab', 'Delhi Capitals',
                 'Mumbai Indians', 'Chennai Super Kings', 'Rajasthan Royals'],
               dtype=object)
In [17]: |mdf=mdf[mdf['dl applied'] == 0]
In [18]: |mdf=mdf[['match_id','city','winner','total_runs']]
```

```
In [19]: mdf
```

# Out[19]:

	match_id	city	winner	total_runs
0	1	Hyderabad	Sunrisers Hyderabad	208
4	5	Bangalore	Royal Challengers Bangalore	158
6	7	Mumbai	Mumbai Indians	179
7	8	Indore	Kings XI Punjab	149
9	10	Mumbai	Mumbai Indians	159
751	11347	Mumbai	Mumbai Indians	144
752	11412	Chennai	Mumbai Indians	137
753	11413	Visakhapatnam	Delhi Capitals	172
754	11414	Visakhapatnam	Chennai Super Kings	156
755	11415	Hyderabad	Mumbai Indians	153

626 rows × 4 columns

In [20]: delivery\_df=mdf.merge(d,on='match\_id')

In [21]: | delivery\_df

Out[21]:

Out[21]:		match_id	city	winner	total_runs_x	inning	batting_team	bowling_team	ove
	0	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
	1	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
	2	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
	3	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
	4	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
	149573	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
	149574	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
	149575	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
	149576	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
	149577	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
	149578 :	rows × 24	columns						
4							•		
<pre>In [22]: delivery_df[['batting_team','bowling_team','winner']]=delivery_df[['batting_</pre>								g_te	
								•	
<pre>In [23]: #total_run_x is the score of 1st inning whereas total_run_y is the score of</pre>							f se		
[20].	##Curre	nt score	of partic	cular mato	ch .				
	nerrver	y_uil cu	rrent_scol	e j = del	rivery_ur.gi	oupby (	( matth_10 )	.cumsum()['t	

In [24]: delivery\_df

## Out[24]:

	match_id	city	winner	total_runs_x	inning	batting_team	bowling_team	ovei
0	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
1	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
2	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
3	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
4	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1
149573	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
149574	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
149575	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
149576	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
149577	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20
149578	rows × 25	columns						
4								•

In [25]: #runs left in the match delivery\_df['runs\_left'] = delivery\_df['total\_runs\_x'] - delivery\_df['current\_ In [26]: delivery\_df

# Out[26]:

149574 11415 Hyderabad Mumbai 153 2 Chennai Mumbai	match_		city	winner	total_runs_x	inning	batting_team	bowling_team	ove	
11HyderabadSunrisers Hyderabad2081Sunrisers HyderabadChallengers Bangalore21HyderabadSunrisers Hyderabad2081Sunrisers HyderabadRoyal Challengers Bangalore31HyderabadSunrisers Hyderabad2081Sunrisers HyderabadRoyal Challengers Bangalore41HyderabadSunrisers Hyderabad2081Sunrisers HyderabadRoyal Challengers Bangalore14957311415HyderabadMumbai Indians1532Chennai Super KingsMumbai Indians14957411415HyderabadMumbai1532Chennai Super KingsMumbai	0	1	0	Hyderabad		208	1		Challengers	1
2 1 Hyderabad Hyderabad 208 1 Sunrisers Hyderabad Challengers Bangalore  3 1 Hyderabad Sunrisers Hyderabad 208 1 Sunrisers Hyderabad Challengers Bangalore  4 1 Hyderabad Sunrisers Hyderabad 208 1 Sunrisers Hyderabad Challengers Bangalore  5 Sunrisers Hyderabad Challengers Bangalore  6 Royal Challengers Bangalore  7 Sunrisers Hyderabad Challengers Bangalore  7 Sunrisers Hyderabad Challengers Bangalore  8 Sunrisers Hyderabad Challengers Bangalore  9 Sunrisers Hyderabad Challengers Bangalore  149573 11415 Hyderabad Mumbai 153 2 Chennai Mumbai Indians	1	1	1	Hyderabad		208	1		Challengers	1
3 1 Hyderabad Sunrisers Hyderabad 208 1 Sunrisers Bangalore  4 1 Hyderabad Sunrisers Hyderabad 208 1 Sunrisers Bangalore  Sunrisers Hyderabad Challengers Bangalore  Royal Challengers Bangalore	2	1	2	Hyderabad		208	1		Challengers	1
4 1 Hyderabad Sumsers Hyderabad 208 1 Sumsers Hyderabad Challengers Bangalore	3	1	3	Hyderabad		208	1		Challengers	1
14957311415HyderabadMumbai Indians1532Chennai Super KingsMumbai Indians14957411415HyderabadMumbai1532ChennaiMumbai	4	1	4	Hyderabad		208	1		Challengers	1
1495/3 11415 Hyderabad Indians 153 2 Super Kings Indians  1495/4 11415 Hyderabad Mumbai 153 2 Chennai Mumbai										
1/957/ 11/15 Hydershad 153 2	149573	11415	149573	Hyderabad		153	2			20
, 3	149574	11415	149574	Hyderabad		153	2	Chennai Super Kings	Mumbai Indians	20
14957511415HyderabadMumbai Indians1532Chennai Super KingsMumbai Indians	149575	11415	149575	Hyderabad		153	2	_		20
14957611415HyderabadMumbai Indians1532Chennai Super KingsMumbai Indians	149576	11415	149576	Hyderabad		153	2			20
149577 11415 Hyderabad Mumbai 153 2 Chennai Mumbai Indians Super Kings Indians	149577	11415	149577	Hyderabad		153	2			20
149578 rows × 26 columns	149578	rows × 26	49578 ו	columns						
<b>←</b>	4									•
delivery df['halls left'] = 126 -(delivery df['over']*6+delivery df['hall'])										

In [27]: delivery\_df['balls\_left'] = 126 -(delivery\_df['over']\*6+delivery\_df['ball'])

# Out[28]:

match_id		city	winner	total_runs_x	inning	batting_team	bowling_team	ovei	
0	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	
1	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	
2	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	
3	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	
4	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	
149573	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20	
149574	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20	
149575	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20	
149576	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20	
149577	11415	Hyderabad	Mumbai Indians	153	2	Chennai Super Kings	Mumbai Indians	20	
149578 rows × 27 columns									
4									

In [29]: delivery\_df['player\_dismissed'].unique()

```
Out[29]: array([nan, 'DA Warner', 'S Dhawan', 'MC Henriques', 'Yuvraj Singh',
                  'Mandeep Singh', 'CH Gayle', 'KM Jadhav', 'TM Head', 'Sachin Baby',
                  'STR Binny', 'SR Watson', 'S Aravind', 'TS Mills', 'YS Chahal',
                  'Vishnu Vinod', 'P Negi', 'AP Tare', 'KK Nair', 'SW Billings',
                  'SV Samson', 'CH Morris', 'CR Brathwaite', 'PJ Cummins', 'RR Pant',
                  'S Nadeem', 'G Gambhir', 'RV Uthappa', 'CA Lynn', 'YK Pathan', 'SA Yadav', 'CR Woakes', 'SP Narine', 'PA Patel', 'JC Buttler',
                  'RG Sharma', 'KH Pandya', 'KA Pollard', 'N Rana', 'M Vohra',
                  'AR Patel', 'DJ Hooda', 'BCJ Cutting', 'V Shankar', 'NV Ojha', 'Rashid Khan', 'MP Stoinis', 'HM Amla', 'GJ Maxwell', 'DA Miller',
                  'WP Saha', 'MM Sharma', 'VR Aaron', 'V Kohli', 'AB de Villiers',
                  'MJ McClenaghan', 'MK Pandey', 'C de Grandhomme', 'SS Iyer',
                  'EJG Morgan', 'KC Cariappa', 'AD Mathews', 'Mohammad Nabi', 'I Sharma', 'KS Williamson', 'SE Marsh', 'Harbhajan Singh',
                  'HH Pandya', 'CJ Anderson', 'K Rabada', 'NM Coulter-Nile',
                  'Kuldeep Yadav', 'S Badree', 'MJ Guptill', 'Anureet Singh',
                  'Mohammed Shami', 'SP Jackson', 'KV Sharma', 'A Choudhary',
                  'LMP Simmons', 'MN Samuels', 'Z Khan', 'Swapnil Singh',
                  'SS Tiwary', 'AT Rayudu', 'A Mishra', 'IR Jaggi', 'PP Chawla',
                  'AS Rajpoot', 'SC Ganguly', 'RT Ponting', 'DJ Hussey', 'R Dravid',
                  'JH Kallis', 'W Jaffer', 'MV Boucher', 'B Akhil', 'CL White', 'AA Noffke', 'SB Joshi', 'ML Hayden', 'MS Dhoni', 'SK Raina',
                  'JDP Oram', 'K Goel', 'JR Hopes', 'KC Sangakkara', 'T Kohli',
                  'DS Lehmann', 'M Kaif', 'M Rawat', 'RA Jadeja', 'SK Warne',
                  'V Sehwag', 'L Ronchi', 'DJ Thornely', 'ST Jayasuriya', 'PR Shah',
                  'AM Nayar', 'SM Pollock', 'S Chanderpaul', 'LRPL Taylor',
                  'Y Venugopal Rao', 'VVS Laxman', 'AC Gilchrist', 'SB Styris',
                  'AS Yadav', 'A Symonds', 'WPUJC Vaas', 'SB Bangar', 'PP Ojha',
                  'BB McCullum', 'Mohammad Hafeez', 'DPMD Jayawardene', 'IK Pathan',
                  'B Lee', 'S Sohal', 'Kamran Akmal', 'Shahid Afridi', 'MEK Hussey',
                  'DJ Bravo', 'MA Khote', 'GC Smith', 'D Salunkhe', 'RR Sarwan',
                  'S Sreesanth', 'VRV Singh', 'P Kumar', 'AB Agarkar', 'M Kartik',
                  'LR Shukla', 'AM Rahane', 'Shoaib Malik', 'KD Karthik', 'R Bhatia',
                  'MK Tiwary', 'MF Maharoof', 'SM Katich', 'TM Srivastava',
                  'B Chipli', 'DW Steyn', 'DB Das', 'HH Gibbs', 'DNT Zoysa',
                  'D Kalyankrishna', 'SA Asnodkar', 'Salman Butt', 'BJ Hodge',
                  'Umar Gul', 'AB Dinda', 'SP Fleming', 'S Vidyut', 'JA Morkel',
                  'LPC Silva', 'DB Ravi Teja', 'RP Singh', 'Misbah-ul-Haq',
                  'YV Takawale', 'PJ Sangwan', 'Mohammad Asif', 'GD McGrath',
                  'S Badrinath', 'Joginder Sharma', 'M Muralitharan', 'M Ntini',
                  'DT Patil', 'A Kumble', 'S Anirudha', 'Sohail Tanvir',
                  'SK Trivedi', 'CK Kapugedera', 'A Chopra', 'T Taibu',
                  'J Arunkumar', 'SP Goswami', 'R Vinay Kumar', 'AD Mascarenhas',
                  'TM Dilshan', 'VY Mahesh', 'SR Tendulkar', 'Younis Khan',
                  'Niraj Patel', 'Shoaib Akhtar', 'H Das', 'DR Smith', 'SD Chitnis',
                  'A Nehra', 'VS Yeligati', 'MS Gony', 'L Balaji', 'LA Pomersbach',
                  'A Nel', 'A Mukund', 'WA Mota', 'JP Duminy', 'A Flintoff',
                  'JD Ryder', 'KP Pietersen', 'T Henderson', 'MM Patel',
                  'Kamran Khan', 'R Bishnoi', 'PC Valthaty', 'RJ Quiney',
                  'Yashpal Singh', 'Pankaj Singh', 'RS Bopara', 'FH Edwards',
                  'AS Raut', 'AN Ghosh', 'BAW Mendis', 'DL Vettori',
                  'RE van der Merwe', 'RR Powar', 'AA Bilakhia', 'TL Suman',
                  'Shoaib Ahmed', 'GR Napier', 'MN van Wyk', 'LA Carseldine',
                  'M Vijay', 'SB Jakati', 'M Manhas', 'RJ Harris', 'D du Preez',
                  'RR Raje', 'DS Kulkarni', 'M Morkel', 'S Tyagi', 'C Nanda',
                  'SL Malinga', 'J Botha', 'A Singh', 'GJ Bailey', 'AB McDonald',
                  'Y Nagar', 'SS Shaikh', 'R Ashwin', 'T Thushara',
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```
'Mohammad Ashraful', 'CA Pujara', 'Anirudh Singh', 'R Sathish',
'AA Jhunjhunwala', 'P Dogra', 'A Uniyal', 'MS Bisla', 'JM Kemp',
'OA Shah', 'RS Gavaskar', 'SE Bond', 'DP Nannes', 'MJ Lumb',
'DR Martyn', 'S Narwal', 'AB Barath', 'FY Fazal', 'MD Mishra',
'S Ladda', 'J Theron', 'SJ Srivastava', 'R Sharma', 'AC Voges',
'Jaskaran Singh', 'KAJ Roach', 'PD Collingwood', 'CK Langeveldt',
'VS Malik', 'SW Tait', 'A Mithun', 'AP Dole', 'Harmeet Singh',
'R McLaren', 'S Sriram', 'KP Appanna', 'C Madan', 'AG Paunikar',
'MR Marsh', 'AJ Finch', 'B Sumanth', 'DT Christian', 'UBT Chand',
'UT Yadav', 'DJ Jacobs', 'AL Menaria', 'MA Agarwal', 'AUK Pathan',
'Sunny Singh', 'JJ van der Wath', 'R Ninan', 'S Randiv',
'BJ Haddin', 'MS Wade', 'RN ten Doeschate', 'TR Birt',
'Bipul Sharma', 'AC Blizzard', 'CA Ingram', 'DH Yagnik',
'KB Arun Karthik', 'BA Bhatt', 'Shakib Al Hasan', 'JEC Franklin', 'F du Plessis', 'DE Bollinger', 'RE Levi', 'HV Patel', 'DJ Harris',
'Ankit Sharma', 'KK Cooper', 'AA Chavan', 'GB Hogg', 'RR Bhatkal',
'CJ McKay', 'N Saini', 'Azhar Mahmood', 'RJ Peterson',
'A Ashish Reddy', 'V Pratap Singh', 'Gurkeerat Singh', 'PA Reddy',
'AD Russell', 'Sunny Gupta', 'MC Juneja', 'MDKJ Perera',
'B Laughlin', 'NLTC Perera', 'BMAJ Mendis', 'GH Vihari',
'R Rampaul', 'P Awana', 'SMSM Senanayake', 'BJ Rohrer', 'KL Rahul',
'J Syed Mohammad', 'R Dhawan', 'MG Johnson', 'Q de Kock',
'BB Samantray', 'JP Faulkner', 'X Thalaivan Sargunam', 'DJG Sammy', 'CM Gautam', 'NJ Maddinson', 'JDS Neesham', 'B Kumar', 'SPD Smith',
'TG Southee', 'PV Tambe', 'S Rana', 'MA Starc', 'BR Dunk',
'RR Rossouw', 'KW Richardson', 'Shivam Sharma', 'VH Zol',
'Imran Tahir', 'R Shukla', 'WD Parnell', 'BE Hendricks',
'M de Lange', 'S Gopal', 'R Tewatia', 'JO Holder', 'JD Unadkat', 'SA Abbott', 'AN Ahmed', 'Iqbal Abdulla', 'SN Khan', 'D Wiese',
'DJ Muthuswami', 'Karanveer Singh', 'Sandeep Sharma', 'J Suchith',
'C Munro', 'P Sahu', 'NS Naik', 'Parvez Rasool', 'JJ Bumrah',
'J Yadav', 'CJ Jordan', 'E Lewis', 'Ishan Kishan', 'DL Chahar',
'M Wood', 'R Singh', 'D Short', 'BA Stokes', 'RA Tripathi',
'K Gowtham', 'S Kaul', 'AJ Tye', 'M Ur Rahman', 'S Gill', 'S Mavi',
'Washington Sundar', 'T Curran', 'TA Boult', 'H Klaasen', 'JJ Roy', 'R Bhui', 'J Archer', 'P Shaw', 'L Plunkett', 'Basil Thampi',
'M Markande', 'Mustafizur Rahman', 'BB Sran', 'A Hales',
'M Lomror', 'M Ashwin', 'Mohammed Siraj', 'D Shorey', 'M Ali',
'AD Nath', 'P Chopra', 'I Sodhi', 'J Searles', 'S Hetmyer',
'S Dube', 'J Bairstow', 'C Ingram', 'K Paul', 'N Pooran', 'N Naik',
'H Vihari', 'P R Barman', 'S Curran', 'H Viljoen', 'S Lamichhane',
'RD Chahar', 'P Krishna', 'SD Lad', 'R Parag', 'J Denly', 'L Livingstone', 'K Ahmed', 'A Turner', 'SN Thakur',
'S Rutherford', 'M Santner', 'S Singh'], dtype=object)
```

In [31]: delivery\_df['player\_dismissed'].unique()

```
Out[31]: array([0, 'DA Warner', 'S Dhawan', 'MC Henriques', 'Yuvraj Singh',
                  'Mandeep Singh', 'CH Gayle', 'KM Jadhav', 'TM Head', 'Sachin Baby',
                  'STR Binny', 'SR Watson', 'S Aravind', 'TS Mills', 'YS Chahal',
                  'Vishnu Vinod', 'P Negi', 'AP Tare', 'KK Nair', 'SW Billings',
                  'SV Samson', 'CH Morris', 'CR Brathwaite', 'PJ Cummins', 'RR Pant',
                  'S Nadeem', 'G Gambhir', 'RV Uthappa', 'CA Lynn', 'YK Pathan', 'SA Yadav', 'CR Woakes', 'SP Narine', 'PA Patel', 'JC Buttler',
                  'RG Sharma', 'KH Pandya', 'KA Pollard', 'N Rana', 'M Vohra',
                  'AR Patel', 'DJ Hooda', 'BCJ Cutting', 'V Shankar', 'NV Ojha', 'Rashid Khan', 'MP Stoinis', 'HM Amla', 'GJ Maxwell', 'DA Miller',
                  'WP Saha', 'MM Sharma', 'VR Aaron', 'V Kohli', 'AB de Villiers',
                  'MJ McClenaghan', 'MK Pandey', 'C de Grandhomme', 'SS Iyer',
                  'EJG Morgan', 'KC Cariappa', 'AD Mathews', 'Mohammad Nabi', 'I Sharma', 'KS Williamson', 'SE Marsh', 'Harbhajan Singh',
                  'HH Pandya', 'CJ Anderson', 'K Rabada', 'NM Coulter-Nile',
                  'Kuldeep Yadav', 'S Badree', 'MJ Guptill', 'Anureet Singh',
                  'Mohammed Shami', 'SP Jackson', 'KV Sharma', 'A Choudhary',
                  'LMP Simmons', 'MN Samuels', 'Z Khan', 'Swapnil Singh',
                  'SS Tiwary', 'AT Rayudu', 'A Mishra', 'IR Jaggi', 'PP Chawla',
                  'AS Rajpoot', 'SC Ganguly', 'RT Ponting', 'DJ Hussey', 'R Dravid',
                  'JH Kallis', 'W Jaffer', 'MV Boucher', 'B Akhil', 'CL White', 'AA Noffke', 'SB Joshi', 'ML Hayden', 'MS Dhoni', 'SK Raina',
                  'JDP Oram', 'K Goel', 'JR Hopes', 'KC Sangakkara', 'T Kohli',
                  'DS Lehmann', 'M Kaif', 'M Rawat', 'RA Jadeja', 'SK Warne',
                  'V Sehwag', 'L Ronchi', 'DJ Thornely', 'ST Jayasuriya', 'PR Shah',
                  'AM Nayar', 'SM Pollock', 'S Chanderpaul', 'LRPL Taylor',
                  'Y Venugopal Rao', 'VVS Laxman', 'AC Gilchrist', 'SB Styris',
                  'AS Yadav', 'A Symonds', 'WPUJC Vaas', 'SB Bangar', 'PP Ojha',
                  'BB McCullum', 'Mohammad Hafeez', 'DPMD Jayawardene', 'IK Pathan',
                  'B Lee', 'S Sohal', 'Kamran Akmal', 'Shahid Afridi', 'MEK Hussey',
                  'DJ Bravo', 'MA Khote', 'GC Smith', 'D Salunkhe', 'RR Sarwan',
                  'S Sreesanth', 'VRV Singh', 'P Kumar', 'AB Agarkar', 'M Kartik',
                  'LR Shukla', 'AM Rahane', 'Shoaib Malik', 'KD Karthik', 'R Bhatia',
                  'MK Tiwary', 'MF Maharoof', 'SM Katich', 'TM Srivastava',
                  'B Chipli', 'DW Steyn', 'DB Das', 'HH Gibbs', 'DNT Zoysa',
                  'D Kalyankrishna', 'SA Asnodkar', 'Salman Butt', 'BJ Hodge',
                  'Umar Gul', 'AB Dinda', 'SP Fleming', 'S Vidyut', 'JA Morkel',
                  'LPC Silva', 'DB Ravi Teja', 'RP Singh', 'Misbah-ul-Haq',
                  'YV Takawale', 'PJ Sangwan', 'Mohammad Asif', 'GD McGrath',
                  'S Badrinath', 'Joginder Sharma', 'M Muralitharan', 'M Ntini',
                  'DT Patil', 'A Kumble', 'S Anirudha', 'Sohail Tanvir',
                  'SK Trivedi', 'CK Kapugedera', 'A Chopra', 'T Taibu',
                  'J Arunkumar', 'SP Goswami', 'R Vinay Kumar', 'AD Mascarenhas',
                  'TM Dilshan', 'VY Mahesh', 'SR Tendulkar', 'Younis Khan',
                  'Niraj Patel', 'Shoaib Akhtar', 'H Das', 'DR Smith', 'SD Chitnis',
                  'A Nehra', 'VS Yeligati', 'MS Gony', 'L Balaji', 'LA Pomersbach',
                  'A Nel', 'A Mukund', 'WA Mota', 'JP Duminy', 'A Flintoff',
                  'JD Ryder', 'KP Pietersen', 'T Henderson', 'MM Patel',
                  'Kamran Khan', 'R Bishnoi', 'PC Valthaty', 'RJ Quiney',
                  'Yashpal Singh', 'Pankaj Singh', 'RS Bopara', 'FH Edwards',
                  'AS Raut', 'AN Ghosh', 'BAW Mendis', 'DL Vettori',
                  'RE van der Merwe', 'RR Powar', 'AA Bilakhia', 'TL Suman',
                  'Shoaib Ahmed', 'GR Napier', 'MN van Wyk', 'LA Carseldine',
                  'M Vijay', 'SB Jakati', 'M Manhas', 'RJ Harris', 'D du Preez',
                  'RR Raje', 'DS Kulkarni', 'M Morkel', 'S Tyagi', 'C Nanda',
                  'SL Malinga', 'J Botha', 'A Singh', 'GJ Bailey', 'AB McDonald',
                  'Y Nagar', 'SS Shaikh', 'R Ashwin', 'T Thushara',
```

```
'OA Shah', 'RS Gavaskar', 'SE Bond', 'DP Nannes', 'MJ Lumb',
                   'DR Martyn', 'S Narwal', 'AB Barath', 'FY Fazal', 'MD Mishra',
                   'S Ladda', 'J Theron', 'SJ Srivastava', 'R Sharma', 'AC Voges',
                   'Jaskaran Singh', 'KAJ Roach', 'PD Collingwood', 'CK Langeveldt',
                   'VS Malik', 'SW Tait', 'A Mithun', 'AP Dole', 'Harmeet Singh',
                   'R McLaren', 'S Sriram', 'KP Appanna', 'C Madan', 'AG Paunikar',
                   'MR Marsh', 'AJ Finch', 'B Sumanth', 'DT Christian', 'UBT Chand',
                   'UT Yadav', 'DJ Jacobs', 'AL Menaria', 'MA Agarwal', 'AUK Pathan',
                   'Sunny Singh', 'JJ van der Wath', 'R Ninan', 'S Randiv',
                   'BJ Haddin', 'MS Wade', 'RN ten Doeschate', 'TR Birt',
                   'Bipul Sharma', 'AC Blizzard', 'CA Ingram', 'DH Yagnik',
                   'KB Arun Karthik', 'BA Bhatt', 'Shakib Al Hasan', 'JEC Franklin', 'F du Plessis', 'DE Bollinger', 'RE Levi', 'HV Patel', 'DJ Harris',
                   'Ankit Sharma', 'KK Cooper', 'AA Chavan', 'GB Hogg', 'RR Bhatkal',
                   'CJ McKay', 'N Saini', 'Azhar Mahmood', 'RJ Peterson',
                   'A Ashish Reddy', 'V Pratap Singh', 'Gurkeerat Singh', 'PA Reddy',
                   'AD Russell', 'Sunny Gupta', 'MC Juneja', 'MDKJ Perera',
                   'B Laughlin', 'NLTC Perera', 'BMAJ Mendis', 'GH Vihari',
                   'R Rampaul', 'P Awana', 'SMSM Senanayake', 'BJ Rohrer', 'KL Rahul',
                   'J Syed Mohammad', 'R Dhawan', 'MG Johnson', 'Q de Kock',
                   'BB Samantray', 'JP Faulkner', 'X Thalaivan Sargunam', 'DJG Sammy', 'CM Gautam', 'NJ Maddinson', 'JDS Neesham', 'B Kumar', 'SPD Smith',
                   'TG Southee', 'PV Tambe', 'S Rana', 'MA Starc', 'BR Dunk',
                   'RR Rossouw', 'KW Richardson', 'Shivam Sharma', 'VH Zol',
                   'Imran Tahir', 'R Shukla', 'WD Parnell', 'BE Hendricks',
                   'M de Lange', 'S Gopal', 'R Tewatia', 'JO Holder', 'JD Unadkat', 'SA Abbott', 'AN Ahmed', 'Iqbal Abdulla', 'SN Khan', 'D Wiese',
                   'DJ Muthuswami', 'Karanveer Singh', 'Sandeep Sharma', 'J Suchith',
                   'C Munro', 'P Sahu', 'NS Naik', 'Parvez Rasool', 'JJ Bumrah',
                   'J Yadav', 'CJ Jordan', 'E Lewis', 'Ishan Kishan', 'DL Chahar',
                   'M Wood', 'R Singh', 'D Short', 'BA Stokes', 'RA Tripathi',
'K Gowtham', 'S Kaul', 'AJ Tye', 'M Ur Rahman', 'S Gill', 'S Mavi',
                   'Washington Sundar', 'T Curran', 'TA Boult', 'H Klaasen', 'JJ Roy', 'R Bhui', 'J Archer', 'P Shaw', 'L Plunkett', 'Basil Thampi',
                   'M Markande', 'Mustafizur Rahman', 'BB Sran', 'A Hales',
                   'M Lomror', 'M Ashwin', 'Mohammed Siraj', 'D Shorey', 'M Ali',
                   'AD Nath', 'P Chopra', 'I Sodhi', 'J Searles', 'S Hetmyer',
                   'S Dube', 'J Bairstow', 'C Ingram', 'K Paul', 'N Pooran', 'N Naik',
                   'H Vihari', 'P R Barman', 'S Curran', 'H Viljoen', 'S Lamichhane',
                   'RD Chahar', 'P Krishna', 'SD Lad', 'R Parag', 'J Denly', 'L Livingstone', 'K Ahmed', 'A Turner', 'SN Thakur',
                   'S Rutherford', 'M Santner', 'S Singh'], dtype=object)
In [32]: | delivery_df['player_dismissed'] = np.where(delivery_df['player_dismissed'] ==
In [33]: delivery df['player dismissed'].unique()
Out[33]: array([0, 1])
```

'Mohammad Ashraful', 'CA Pujara', 'Anirudh Singh', 'R Sathish', 'AA Jhunjhunwala', 'P Dogra', 'A Uniyal', 'MS Bisla', 'JM Kemp',

```
In [34]: | delivery df['wickets'] = 10 - (delivery df.groupby('match id').cumsum()['playe'
In [35]:
          delivery df
Out[35]:
                     match_id
                                      city
                                              winner total_runs_x inning batting_team bowling_team
                                                                                                  Royal
                                            Sunrisers
                                                                                Sunrisers
                  0
                                                               208
                               Hyderabad
                                                                         1
                                                                                             Challengers
                                                                                                            1
                                           Hyderabad
                                                                               Hyderabad
                                                                                              Bangalore
                                                                                                  Royal
                                            Sunrisers
                                                                                Sunrisers
                  1
                                                                                                            1
                               Hyderabad
                                                               208
                                                                                             Challengers
                                           Hyderabad
                                                                               Hyderabad
                                                                                              Bangalore
                                                                                                  Royal
                                            Sunrisers
                                                                                Sunrisers
                  2
                                                               208
                                                                                             Challengers
                                                                                                            1
                               Hyderabad
                                           Hyderabad
                                                                               Hyderabad
                                                                                              Bangalore
                                                                                                  Royal
                                            Sunrisers
                                                                                Sunrisers
                  3
                               Hyderabad
                                                               208
                                                                                             Challengers
                                                                                                            1
                                           Hyderabad
                                                                               Hyderabad
                                                                                              Bangalore
                                                                                                  Royal
                                             Sunrisers
                                                                                Sunrisers
                               Hyderabad
                                                               208
                                                                                             Challengers
                                                                                                            1
                                           Hyderabad
                                                                               Hyderabad
                                                                                              Bangalore
                                              Mumbai
                                                                                 Chennai
                                                                                                Mumbai
                                                                                                           20
             149573
                                                                         2
                        11415
                               Hyderabad
                                                               153
                                                                              Super Kings
                                              Indians
                                                                                                 Indians
                                              Mumbai
                                                                                 Chennai
                                                                                                Mumbai
                                                                         2
             149574
                        11415
                               Hyderabad
                                                               153
                                                                                                           20
                                              Indians
                                                                              Super Kings
                                                                                                 Indians
                                              Mumbai
                                                                                 Chennai
                                                                                                Mumbai
             149575
                        11415 Hyderabad
                                                               153
                                                                         2
                                                                                                           20
                                              Indians
                                                                              Super Kings
                                                                                                 Indians
                                                                                 Chennai
                                                                                                Mumbai
                                              Mumbai
                                                                                                           20
             149576
                                                                         2
                        11415 Hyderabad
                                                               153
                                              Indians
                                                                              Super Kings
                                                                                                 Indians
                                              Mumbai
                                                                                 Chennai
                                                                                                Mumbai
             149577
                        11415 Hyderabad
                                                               153
                                                                         2
                                                                                                           20
                                              Indians
                                                                              Super Kings
                                                                                                 Indians
            149578 rows × 28 columns
```

```
In [36]: delivery_df['curr_run_rate'] = (delivery_df['current_score']*6)/(120 - delivery_df['req_run_rate'] = (delivery_df['runs_left']*6)/(delivery_df['balls
```

```
In [38]: delivery_df.head()
```

#### Out[38]:

	match_id	city	winner	total_runs_x	inning	batting_team	bowling_team	over	bal
0	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	1
1	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	2
2	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	3
3	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	4
4	1	Hyderabad	Sunrisers Hyderabad	208	1	Sunrisers Hyderabad	Royal Challengers Bangalore	1	5

5 rows × 30 columns

```
In [39]: # def result(row):
# return 1 if row['batting_team'] == row['winner'] else 0
# delivery_df['result'] = delivery_df.apply(result,1)
########################

delivery_df['result'] = np.where(delivery_df['batting_team'] == delivery_df['v
```

```
In [40]: | sns.countplot(delivery_df['result'])
         delivery_df['result'].value_counts()
Out[40]: 0
              76215
              73363
         Name: result, dtype: int64
            80000
            70000
            60000
            50000
            40000
            30000
            20000
            10000
                0
                                      result
In [41]: delivery_df.columns
Out[41]: Index(['match_id', 'city', 'winner', 'total_runs_x', 'inning', 'batting_tea
         m',
                 'bowling_team', 'over', 'ball', 'batsman', 'non_striker', 'bowler',
                 'is_super_over', 'wide_runs', 'bye_runs', 'legbye_runs', 'noball_run
         s',
                 'penalty_runs', 'batsman_runs', 'extra_runs', 'total_runs_y',
                 'player_dismissed', 'dismissal_kind', 'fielder', 'current_score',
                 'runs_left', 'balls_left', 'wickets', 'curr_run_rate', 'req_run_rat
         e',
                 'result'],
                dtype='object')
In [42]: final_df = delivery_df[['batting_team','bowling_team','city','total_runs_x',
In [43]: |final_df = final_df[final_df['balls_left'] != 0]
```

In [44]: final\_df.dropna(inplace=True)

In [45]: final\_df[(final\_df['req\_run\_rate']!=0)]

Out[45]:

	batting_team	bowling_team	city	total_runs_x	curr_run_rate	req_run_rate	wicke
0	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	0.000000	10.487395	
1	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	0.000000	10.576271	
2	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	8.000000	10.461538	
3	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	6.000000	10.551724	
4	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	7.200000	10.539130	
149572	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.808696	-180.000000	
149573	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.724138	-226.500000	
149574	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.692308	-306.000000	
149575	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.610169	-462.000000	
149576	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.579832	-936.000000	

146260 rows × 9 columns

In [46]: final\_df.result.value\_counts()

Out[46]: 0 74838 1 72225

Name: result, dtype: int64

In [47]: final\_df.city.unique()

```
In [48]: # notdone = final df[final df["result"] == 0]
         # done = final_df[final_df["result"] == 1]
         # # Resampling the original dataset with 1,95,482 datapoints for both classes
         # notdone_resample = notdone.sample(n = 72225, random_state = 193)
         # done_resample = done.sample(n = 72225, random_state = 193)
         # df eda=final df.copy()
         # # Creating new dataset consisting of equal class occurence
         # df = pd.concat([notdone_resample, done_resample], axis = 0)
In [49]: x = final df.drop('result',1)
         y = final_df['result']
In [50]: from sklearn.compose import ColumnTransformer
         from sklearn.preprocessing import OneHotEncoder
         from sklearn.pipeline import Pipeline
In [51]: | c = final_df.select_dtypes(include='0').columns
         cf=ColumnTransformer([('trf',OneHotEncoder(sparse=False,drop='first'),['battir
In [52]: # c = final_df.select_dtypes(include='0').columns
         # from sklearn.preprocessing import LabelEncoder
         # le = LabelEncoder()
         # for i in c:
               x[i] = le.fit transform(x[i])
```

Out[53]:

	batting_team	bowling_team	city	total_runs_x	curr_run_rate	req_run_rate	wicke
0	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	0.000000	10.487395	
1	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	0.000000	10.576271	
2	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	8.000000	10.461538	
3	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	6.000000	10.551724	
4	Sunrisers Hyderabad	Royal Challengers Bangalore	Hyderabad	208	7.200000	10.539130	
149572	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.808696	-180.000000	
149573	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.724138	-226.500000	
149574	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.692308	-306.000000	
149575	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.610169	-462.000000	
149576	Chennai Super Kings	Mumbai Indians	Hyderabad	153	15.579832	-936.000000	

147063 rows × 8 columns

```
In [ ]:
```

- In [54]: # from sklearn.preprocessing import StandardScaler
  # sc=StandardScaler()
  # x = sc.fit\_transform(x)
- In [55]: from sklearn.model\_selection import train\_test\_split
   x\_train,x\_test,y\_train,y\_test=train\_test\_split(x,y,test\_size=.2,random\_state=1
   print('x\_train\_shape',x\_train.shape,'y\_train\_shape',y\_train.shape)
   print('y\_test\_shape',x\_test.shape,'y\_test\_shape',y\_test.shape)

x\_train shape (117650, 8) y\_train shape (117650,)
y\_test shape (29413, 8) y\_test shape (29413,)

```
In [56]: from sklearn.linear_model import LogisticRegression
         from sklearn.ensemble import RandomForestClassifier,AdaBoostClassifier,Gradier
         from sklearn.tree import DecisionTreeClassifier
         dt=DecisionTreeClassifier()
         lr=LogisticRegression()
         rf=RandomForestClassifier()
         ad=AdaBoostClassifier()
In [57]: pipe=Pipeline(steps=[('step1',cf),('step2',LogisticRegression(solver='libline;
         pipe.fit(x train,y train)
Out[57]:
                       Pipeline
              step1: ColumnTransformer
                   trf
                            ▶ remainder
            ▶ OneHotEncoder
                            ▶ passthrough
                 ▶ LogisticRegression
In [58]: ypred=pipe.predict(x_test)
In [59]: pipe.predict_proba(x_test)[10]
Out[59]: array([0.53835726, 0.46164274])
In [60]: pipe1=Pipeline(steps=[('step1',cf),('step2',RandomForestClassifier())])
         pipe1.fit(x_train,y_train)
Out[60]:
                       Pipeline
              step1: ColumnTransformer
                   trf
                            remainder
            ▶ OneHotEncoder
                             ▶ passthrough
               ▶ RandomForestClassifier
In [61]: pipe1.predict_proba(x_test)[10]
Out[61]: array([0.97, 0.03])
```

```
In [62]: import pickle
  pickle.dump(pipe,open('pipe.pkl','wb'))
In [ ]:
```