

In [18]:

```
import pandas as pd
import matplotlib.pyplot as plt
import seaborn
import re
```

Import the data and get a high-level picture

In [19]:

```
df = pd.read_csv('sales.csv')
df.head()
```

Out[19]:

	order_id	name	ordered_at	price	quantity	line_total
0	10000	"ICE CREAM" Peanut Fudge	2018-01-01 11:30:00	\$3.50	3	\$10.50
1	10000	"ICE CREAM" Peanut Fudge	2018-01-01 11:30:00	\$3.50	1	\$3.50
2	10001	"SORBET" Raspberry	2018-01-01 12:14:54	\$2.50	2	\$5.00
3	10001	NaN	2018-01-01 12:14:54	\$1.50	1	\$1.50
4	10001	"CONE" Dipped Waffle Cone	2018-01-01 12:14:54	\$3.50	1	\$3.50

In [20]:

```
df.shape
```

Out[20]:

(29922, 6)

In [21]:

```
df.dtypes
```

Out[21]:

```
order_id      int64
name          object
ordered_at    object
price         object
quantity      int64
line_total    object
dtype: object
```

TODO: Fix column datatypes

Change ordered_at to datetime

Change price and line_total to float

In [51]:

```
df['ordered_at'] = pd.to_datetime(df['ordered_at'])
```

In [47]:

```
df['line_total'] = pd.to_numeric(df['line_total'].apply(lambda x: x[1:]))
```

In [52]:

```
df.dtypes
```

Out[52]:

```
order_id      int64
name          object
ordered_at    datetime64[ns]
price         object
quantity      int64
line_total    float64
dtype: object
```

TODO: drop if duplicated or null

In [34]:

```
df[df.duplicated()].shape[0]
```

Out[34]:

538

In [56]:

```
df = df.drop(list(df[df.duplicated()].index))
df
```

Out[56]:

	order_id	name	ordered_at	price	quantity	line_total
139	10049	"CONE" Dipped Waffle Cone	2018-01-02 13:47:55	\$3.50	1	3.5
178	10063	"ICE CREAM" Earl Gray	2018-01-02 21:28:36	\$0.50	3	1.5
207	10073	"ICE CREAM" Mint Chip	2018-01-03 01:45:00	\$1.50	3	4.5
273	10091	"SORBET" Blood Orange	2018-01-03 09:14:48	\$2.50	2	5.0
278	10092	"CONE" Sugar Cone	2018-01-03 09:44:29	\$1.00	2	2.0
351	10118	"SORBET" Blood Orange	2018-01-03 22:56:09	\$2.50	3	7.5
500	10167	"ICE CREAM" Matcha	2018-01-04 18:18:03	\$1.50	1	1.5
768	10258	"ICE CREAM" Candied Bacon	2018-01-06 12:15:38	\$0.50	1	0.5
776	10260	"ICE CREAM" Wildberry	2018-01-06 13:20:51	\$1.50	2	3.0
814	10271	"MISC" Ice Cream Cake	2018-01-06 16:46:11	\$2.00	3	6.0
879	10294	"ICE CREAM" Maple Brown Sugar	2018-01-07 03:47:41	\$2.00	3	6.0
889	10298	"ICE CREAM" Wildberry	2018-01-07 05:49:11	\$1.50	3	4.5
924	10308	"ICE CREAM" Double Fudge Chunk	2018-01-07 10:47:11	\$3.50	1	3.5
944	10316	"CONE" Sugar Cone	2018-01-07 13:48:19	\$1.00	3	3.0
1021	10345	"ICE CREAM" Dulce De Leche	2018-01-08 03:20:38	\$1.50	3	4.5
1075	10361	"ICE CREAM" Vanilla Bean	2018-01-08 11:46:54	\$1.50	1	1.5
1115	10371	"CONE" Brownie Cone	2018-01-08 16:47:53	\$3.00	3	9.0
1140	10380	"ICE CREAM" Earl Gray	2018-01-08 20:13:03	\$0.50	2	1.0
1163	10387	"MISC" Ice Cream Cake	2018-01-08 23:47:45	\$2.00	3	6.0
1180	10393	"SORBET" Raspberry	2018-01-09 02:32:23	\$2.50	3	7.5
1234	10414	"BEVERAGE" Espresso	2018-01-09 13:42:09	\$2.50	1	2.5
1334	10444	"ICE CREAM" Matcha	2018-01-10 04:30:53	\$1.50	3	4.5

	order_id	name	ordered_at	price	quantity	line_total
1448	10482	"CONE" Brownie Cone	2018-01-10 22:40:59	\$3.00	2	6.0
1519	10502	"ICE CREAM" Strawberry	2018-01-11 08:48:07	\$3.50	1	3.5
1650	10546	"ICE CREAM" Peanut Fudge	2018-01-12 06:36:06	\$3.50	1	3.5
1727	10577	"BEVERAGE" Iced Coffee	2018-01-13 00:04:31	\$2.50	1	2.5
1747	10586	"CONE" Dipped Waffle Cone	2018-01-13 05:28:03	\$3.50	2	7.0
1849	10619	"ICE CREAM" Vanilla Bean	2018-01-13 21:52:08	\$1.50	1	1.5
2168	10717	"ICE CREAM" Dulce De Leche	2018-01-15 23:35:28	\$1.50	3	4.5
2240	10741	"SORBET" Lemon	2018-01-16 12:03:32	\$2.50	2	5.0
...
29892	17082	"ICE CREAM" Maple Brown Sugar	2018-05-29 06:13:56	\$2.00	2	4.0
29893	15532	"CONE" Waffle Cone	2018-04-25 22:08:26	\$4.00	1	4.0
29894	12462	"SORBET" Blood Orange	2018-02-22 13:27:40	\$2.50	3	7.5
29895	19620	"ICE CREAM" Double Fudge Chunk	2018-07-20 23:10:36	\$3.50	1	3.5
29896	19221	"CONE" Sugar Cone	2018-07-12 03:48:50	\$1.00	2	2.0
29897	12474	"ICE CREAM" Earl Gray	2018-02-22 17:23:57	\$0.50	1	0.5
29898	17161	"ICE CREAM" Wildberry	2018-05-30 22:54:10	\$1.50	2	3.0
29899	15838	"ICE CREAM" Maple Brown Sugar	2018-05-02 22:15:45	\$2.00	2	4.0
29900	18082	"SORBET" Raspberry	2018-06-18 13:36:16	\$2.50	2	5.0
29901	12331	"ICE CREAM" Dark Chocolate	2018-02-19 19:04:01	\$4.00	1	4.0
29902	15373	"CONE" Dipped Waffle Cone	2018-04-22 22:17:45	\$3.50	3	10.5
29903	12456	"CONE" Cookie Cone	2018-02-22 10:20:27	\$4.00	2	8.0
29904	11079	"ICE CREAM" Vanilla Bean	2018-01-23 17:15:32	\$1.50	1	1.5
29905	15969	"CONE" Brownie Cone	2018-05-05 17:50:35	\$3.00	2	6.0
29906	19748	"MISC" Ice Cream Cake	2018-07-23 14:18:20	\$2.00	1	2.0
29907	11601	"ICE CREAM" Rocky Road	2018-02-04 14:36:06	\$3.50	1	3.5

	order_id	name	ordered_at	price	quantity	line_total
29908	13140	"CONE" Brownie Cone	2018-03-08 06:00:34	\$3.00	1	2.0
29909	15209	"CONE" Waffle Cone	2018-04-19 07:28:18	\$4.00	1	4.0
29910	16118	"ICE CREAM" Wildberry	2018-05-08 17:28:03	\$1.50	1	1.5
29911	12568	"ICE CREAM" Maple Brown Sugar	2018-02-24 15:57:59	\$2.00	2	4.0
29912	12842	"SORBET" Lemon	2018-03-02 09:19:02	\$2.50	3	7.5
29913	19802	"ICE CREAM" Vanilla Bean	2018-07-24 19:09:38	\$1.50	3	4.5
29914	19901	"ICE CREAM" Dark Chocolate	2018-07-26 20:46:29	\$4.00	3	12.0
29915	17090	"ICE CREAM" Maple Brown Sugar	2018-05-29 10:04:32	\$2.00	1	2.0
29916	12807	"BEVERAGE" Iced Coffee	2018-03-01 15:00:58	\$2.50	3	7.5
29917	18452	"ICE CREAM" Dulce De Leche	2018-06-26 03:56:13	\$-1.50	2	-3.0
29918	12889	"ICE CREAM" Dark Chocolate	2018-03-03 10:06:21	\$4.00	3	12.0
29919	14526	"ICE CREAM" Peanut Fudge	2018-04-05 17:33:24	\$3.50	3	10.5
29920	19589	"CONE" Dipped Waffle Cone	2018-07-20 09:10:01	\$3.50	2	7.0
29921	19270	"ICE CREAM" Earl Gray	2018-07-13 09:20:21	\$0.50	2	1.0

529 rows × 6 columns

In [58]:

```
df.isnull()
```

...

In [25]:

```
df[df['name'].isnull()].head()
```

Out[25]:

	order_id	name	ordered_at	price	quantity	line_total
3	10001	NaN	2018-01-01 12:14:54	\$1.50	1	\$1.50
6	10002	NaN	2018-01-01 12:23:09	\$3.00	3	\$9.00
27	10007	NaN	2018-01-01 15:03:17	\$2.50	1	\$2.50
77	10026	NaN	2018-01-02 03:25:40	\$0.50	2	\$1.00
88	10031	NaN	2018-01-02 05:45:48	\$3.50	3	\$10.50

Sanity check for value ranges and to check assumptions

In [26]:

```
df[(df['price'] * df['quantity']) != df['line_total']].shape[0]
```

Out[26]:

19924

In [67]:

```
df[df['line_total'] < 0].shape[0]
df.dtypes
```

Out[67]:

```
order_id      int64
name          object
ordered_at    datetime64[ns]
price         float64
quantity      int64
line_total    float64
dtype: object
```

TODO:

Set line_total = price * quantity if different Remove if line total < 0

In [71]:

```
df['line_total'] = df['price'] * df['quantity']
df
```

...

In [118]:

```
df.describe()
```

Out[118]:

	order_id	price	quantity	line_total
count	529.000000	529.000000	529.000000	529.000000
mean	14894.508507	2.42344	2.041588	4.935728
std	2884.990683	1.13372	0.824673	3.191731
min	10029.000000	-2.50000	1.000000	-7.500000
25%	12496.000000	1.50000	1.000000	2.500000
50%	14666.000000	2.50000	2.000000	4.000000
75%	17284.000000	3.50000	3.000000	7.500000
max	19996.000000	4.00000	3.000000	12.000000

TODO: Get value between "" in name and put it in category column

In [116]:

```
df['category'] = df['name'].apply(lambda x: re.search(r'["].+["]', str(x)).group(0) if re.search(r'
```

In [117]:

```
df.head()
```

Out[117]:

	order_id	name	ordered_at	price	quantity	line_total	category
139	10049	"CONE" Dipped Waffle Cone	2018-01-02 13:47:55	3.5	1	3.5	"CONE"
178	10063	"ICE CREAM" Earl Gray	2018-01-02 21:28:36	0.5	3	1.5	"ICE CREAM"
207	10073	"ICE CREAM" Mint Chip	2018-01-03 01:45:00	1.5	3	4.5	"ICE CREAM"
273	10091	"SORBET" Blood Orange	2018-01-03 09:14:48	2.5	2	5.0	"SORBET"
278	10092	"CONE" Sugar Cone	2018-01-03 09:44:29	1.0	2	2.0	"CONE"

Analysis, finally!

In [121]:

```
f, ax = plt.subplots(figsize=(10, 6))  
df.groupby('name')['line_total'].sum().sort_values(ascending=False).head(10).plot(kind='bar')  
f.autofmt_xdate()  
plt.show()
```

