Example of Text Analysis

```
In[*]:= webpage = Import["https://lexfridman.com/john-mearsheimer-transcript"];

In[*]:= wordCloud[DeleteStopwords[webpage]]

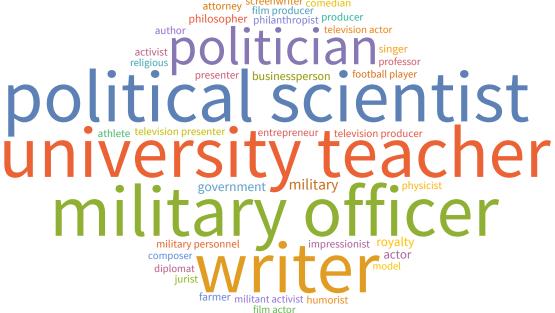
West Americans two-state number Chinese Soviet understand Great expansion don't Palestinians time talk Israelis World Ukraine believe, 'm Germany World Ukraine believe, 'm really lot fact question Fridman Just Union end things Mearsheimer given came

Say Lexthink states weapons clear empire Power John military Russians history Way reargument important Europe sure happened Let Jarael powerful NATO case Yeah international Israel powerful NATO case Make Hamas realist mean doesn't Jews liberal
```

This word cloud makes me think that this conversation is not very interesting. There seems to be no real discussion other than an assortment of people and topics

```
In[*]:= contents = TextContents[webpage, VerifyInterpretation → True];
Loading Initialization Data...
Loading Initialization Data...
In[*]:= counts = ReverseSort@CountsBy[contents, Type &]
```

```
Out[0]=
          \texttt{Dataset} \, [\texttt{Association} \, [\texttt{Country} \, \rightarrow \, 805, \, \texttt{GivenName} \, \rightarrow \, 455, \, \texttt{Person} \, \rightarrow \, 363, \, \texttt{GovernmentAgency} \, \rightarrow \, 192, \, \texttt{Model} \, ]
              Nationality \rightarrow 191, Date \rightarrow 140, Year \rightarrow 93, OrdinalNumber \rightarrow 73, MilitaryConflict \rightarrow 71,
              Time \rightarrow 70, Occupation \rightarrow 66, SportEvent \rightarrow 63, Religion \rightarrow 62, Quantity \rightarrow 61,
              HistoricalCountry \rightarrow 49, City \rightarrow 45, EthnicGroup \rightarrow 38, PhysicalConstant \rightarrow 37,
              \mbox{GeographicRegion} \rightarrow \mbox{34, Language} \rightarrow \mbox{34, Continent} \rightarrow \mbox{33, Unit} \rightarrow \mbox{31, Island} \rightarrow \mbox{30,}
              NonperiodicTiling \rightarrow 30, Surname \rightarrow 27, HistoricalEvent \rightarrow 20, Organization \rightarrow 18,
              Season \rightarrow 17, Color \rightarrow 17, WaterBodyType \rightarrow 11, Ocean \rightarrow 9, TopologicalSpaceType \rightarrow 9,
              TropicalStorm \rightarrow 8, AdministrativeDivision \rightarrow 8, Species \rightarrow 7, MusicAct \rightarrow 6, University \rightarrow 4,
              SportObject \rightarrow 3, Building \rightarrow 2, FoodManufacturer \rightarrow 2, ProgrammingLanguage \rightarrow 2,
              MusicAlbum \rightarrow 1, USState \rightarrow 1, AstronomicalObjectType \rightarrow 1, Museum \rightarrow 1, Park \rightarrow 1,
              River \rightarrow 1, BoardGame \rightarrow 1, Movie \rightarrow 1, Food \rightarrow 1, AstronomicalObject \rightarrow 1,
              HistoricalSite \rightarrow 1, Castle \rightarrow 1, Book \rightarrow 1, Financial \rightarrow 1, Company \rightarrow 1],
            TypeSystem`Assoc[TypeSystem`Atom[String], TypeSystem`Atom[Integer],
              TypeSystem`AnyLength], Association[]]
 In[@]:= persons = Normal[Select[contents, Type === "Person" &] [[All, "Interpretation"]];
 In[@]:= WordCloud[Counts[Flatten@EntityValue[persons, EntityProperty["Person", "Occupation"]]],
            ImageSize → Large]
Out[0]=
                                                           showman dancer
attorney film producer producer
                                                        philosopher philanthropist producer
                                                author
                                                                                      television actor
```



In[⊕]:= WordCloud[Counts[persons], ImageSize → 500]



John Mearsheimer



In[@]:= Show[WordCloud[counts]]

Out[0]=

Ocean HistoricalSite Financial USState Programming Language Time Year AstronomicalObjectType $_{\mathsf{MusicAlbum}}$ Surname GeographicRegion FoodManufacturer **SportObject** MilitaryConflict Language **Book Quantity AstronomicalObject** Occupation Food Unit Island **Species** NonperiodicTiling Nationality EthnicGroup
TropicalStorm
HistoricalCountry WaterBodyType
PhysicalCountry
The Physical Country
The Physical Countr HistoricalEvent PhysicalConstant Organization Continent TopologicalSpaceType University OrdinalNumber Building Administrative Division MusicAct Movie BoardGame Castle

```
In[@]:= countries = Normal[Select[contents, Type === "Country" &] [[All, "Interpretation"]]]
Out[0]=
         Israel
                  West Bank
                                Russia
                                           Ukraine
                                                      China
                                                                Russia
                                                                          Ukraine
                                                                                     Israel
         West Bank
                       China
                                 Russia
                                           Ukraine
                                                      Israel
                                                                West Bank
                                                                             United States
```

```
China .
         China .
                  China .
                           France
                                      United States
                                                      United States .
                                                                      United States .
United States
                China,
                         United States,
                                        United States
                                                        United States
                                                                        China ,
United States
                           United States,
                                           Germany
                Germany
                                                        France,
                                                                   Germany,
                                                                              China
                                                Germany
                                                             Russia
Germany
            Germany
                        Germany
                                    Germany,
                                                                       Germany
Germany
            Poland
                      France,
                                 France
                                           France
                                                      France
                                                                Poland,
                                                                          Finland,
                                  Ukraine
                                                        Russia
Ukraine
           Ukraine
                      Germany
                                             Ukraine
                                                                  Ukraine
                                                                             Russia
Russia
          Russia
                    Russia,
                              Russia,
                                        Germany
                                                                 Poland
                                                                            Poland
                                                     Germany
Germany
            Russia
                      Ukraine
                                 Ukraine
                                            Russia
                                                      Ukraine
                                                                  Russia
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Ukraine
           Russia
                                Ukraine
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                     Ukraine
                                           Ukraine
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                                                                 Germany
Germany
            Poland
                      Poland
                                 Poland
                                           Ukraine
                                                      Germany
                                                                  Ukraine
                                                                              Ukraine
Ukraine
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                                         Ukraine
                                                    Ukraine
                                                                         United States
           Turkey
                     Israel
                                                               Russia,
                                                                   Georgia,
Russia
          United States
                          Cuba
                                  Russia
                                          , Ukraine
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                                                                              Russia
United States,
               Ukraine,
                           Ukraine,
                                      Germany
                                                  France
                                                            Ukraine,
                                                                       United States
          Ukraine
                     Russia,
Russia
                               Ukraine,
                                          Ukraine
                                                     Ukraine
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                                 United States
Ukraine
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                                                                               China
Russia
          Russia .
                    United States,
                                    United States
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Russia
          United States,
                          China,
                                   Russia,
                                             Germany
                                                         Ukraine
                                                                     United States
                               Russia,
                                          China,
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United States,
               United States
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         China
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                  China,
                            Russia,
                                      United States
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                                                                United States,
                                                                                Ukraine
United States
                Ukraine,
                           Russia,
                                     Ukraine ,
                                               Ukraine
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                                                                      Russia,
                                                                                Russia
Ukraine
           Russia
                     Russia,
                              Ukraine ,
                                          United States
                                                          United States ,
                                                                          United States
               Turkey
United States
                          United States
                                          United Kingdom
                                                            United States
                                                                            United States
Russia
          Ukraine
                     United States
                                     China ,
                                              Russia
                                                        Ukraine,
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Ukraine
           Ukraine
                      Russia
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           Russia
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Ukraine
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                     Ukraine
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Russia
          France
                     Ukraine
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                               France
```

```
United States , Ukraine , Ukraine , Russia , Ukraine , Israel , Russia ,
                                                                           Ukraine .
Russia,
         Russia,
                  Russia , Ukraine , Ukraine , China , China , United States
China
         Ukraine .
                  United States , Ukraine , China ,
                                                      Ukraine ,
                                                                 Russia,
                                                                           Ukraine
                   Ukraine, Ukraine, Ukraine,
Ukraine
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          Russia,
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Ukraine
          United States , Russia , Ukraine , Russia ,
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United States , China , Russia ,
                                 Israel,
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Ukraine
          Ukraine ,
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Russia
          Ukraine,
                    Russia,
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Poland
          Cuba, Israel,
                          Israel,
                                   Israel,
                                           West Bank,
                                                         West Bank,
                                                                       West Bank
         Saudi Arabia , United States , West Bank , Saudi Arabia ,
Israel
                                                                  West Bank ,
Israel
        Israel ,
                Israel, Israel, West Bank, Israel,
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West Bank,
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West Bank,
             West Bank
                          Israel
                                   Jordan ,
                                            Egypt , United States
                                                                     West Bank
United States ,
              Israel
                        Israel,
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Israel,
       Israel ,
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Jordan
                                         United States
         Saudi Arabia ,
                        Israel,
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                Israel, Israel, United States, Israel,
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                       Israel,
                                Israel, United States,
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Israel .
                 Israel . Israel .
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United States,
                                 West Bank,
                                              Israel,
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West Bank .
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         Bosnia and Herzegovina
                                            Serbia,
                                                      Bosnia and Herzegovina
Israel
                                  Croatia,
                                                         Germany
Bosnia and Herzegovina,
                         Croatia
                                   Serbia
                                             Germany
                                                                               China,
                                                                     Japan
                        West Bank,
Japan ,
         South Korea,
                                     Israel
                                              Israel
                                                        Rwanda
                                                                   West Bank
                                           Turkey
Israel
                 Gaza Strip,
                               Germany
                                                     Armenia,
                                                                Poland
        Israel,
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           Israel ,
                    Israel
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                 United States,
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         West Bank,
Israel
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                                    Israel,
                                            West Bank
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         West Bank
Israel
                      Saudi Arabia
                                     West Bank
                                                   Israel
                                                            Israel
                                                                     West Bank,
                 United States,
                                 United States
                                                 Ukraine
                                                            United States,
Israel
        Israel,
                                                                            Israel,
United States,
                China,
                        Ukraine ,
                                   Ukraine ,
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                                                                    Ukraine,
                                                                               Israel ,
                 United States,
                                 United States
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Israel
        Israel,
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                                                                   United States,
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                            United States, China, China,
Israel
         Israel,
                  Ukraine,
                                                              United States,
                                                                               China ,
China
         China,
                  Taiwan
                             China,
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                                                 Taiwan,
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Taiwan
          China
                   Taiwan ,
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                                        Taiwan ,
                                                   China ,
                                                            Japan
                                                                      South Korea,
                                   China ,
                                            China
Philippines
            Australia,
                        Taiwan ,
                                                      United States
                                                                      China
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Taiwan
          China
                    China
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                                                  Japan ,
                                                           United States
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China
         Taiwan
                   China
                             Taiwan
                                       China
                                                 China,
                                                         United States
                                                                          China ,
Japan
         South Korea
                       Philippines,
                                      Australia
                                                 Taiwan
                                                            China,
                                                                      China ,
                                                                              Taiwan
Taiwan
          China
                   Taiwan
                              China
                                       United States,
                                                      China,
                                                                 China
                                                                          China
Taiwan
          China
                   Taiwan
                              China,
                                      China,
                                                 United States
                                                                China
                                                                          China
                United States
United States,
                               United States,
                                               United States
                                                                China
                                                                         China,
```

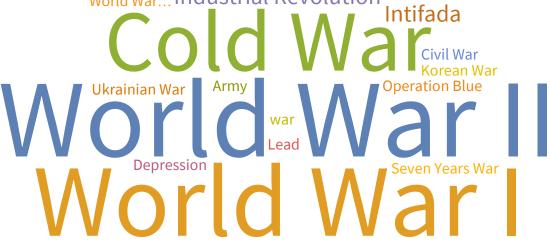
```
United States
               United States , China ,
                                         United States . United States . China .
United States
               China,
                        United States ,
                                        Taiwan ,
                                                  United States
                                                                  China ,
                                                                           Taiwan
               China ,
United States
                         Taiwan,
                                  Australia ,
                                              Israel ,
                                                       Israel
                                                                 Saudi Arabia,
                                                                               Iran
                               Russia
                                         China
                                                   United States
                                                                   Israel , China ,
Iraq,
      Israel
                Iran
                        Iran
United States
               China,
                         China,
                                 United States,
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United States
               United States,
                               China
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                                         China,
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                                         United States
United States
               United States
                               Russia
                                                         Ukraine
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                        United States
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                                                                  United States
United States ,
              United States
                               China,
                                        United States
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                                                                       United States
China,
        Taiwan
                  China ,
                            China , China ,
                                               China
                                                         Taiwan,
                                                                  United States ,
United States ,
                        Kenya,
                                 Singapore,
                                                          United States
               India
                                              Australia
                                                                          Philippines
Cuba
        Puerto Rico
                      United States .
                                     United Kingdom ,
                                                        United States
                                                                        United Kingdom
Vietnam
           Kenya,
                    West Bank,
                                  West Bank,
                                               West Bank,
                                                            West Bank
                                                                          India ,
                     Singapore,
Pakistan
           Kenya,
                                  United States
                                                 United Kingdom ,
                                                                   United States
                                            United States
Germany
            France
                      Canada,
                                 Canada,
                                                            Spain
                                                                     Brazil,
Portugal
           United States ,
                          United States, United Kingdom, United States, Iran,
         Russia,
China ,
                  Russia,
                            China
                                     United States,
                                                     United States,
                                                                     United States
                     United States ,
                                    United States ,
                                                     United States
Germany
            Ireland
                                                                     United States
United States,
               United States,
                               United States ,
                                              United States
                                                              United States
Germany
                                 United States ,
            Ireland
                      Germany
                                                 Italy ,
                                                         Germany,
                                                                     Ireland ,
                                                                               Italy ,
United States
               United States ,
                               United States ,
                                               Ireland,
                                                         Ireland ,
                                                                   United States ,
United States
               United States
                               United States,
                                               United States,
                                                               United States
                                                                               Guam
United States
               United States
                               Israel,
                                        West Bank
                                                      Russia
                                                                Ukraine
                                                                           China
```

In[*]:= WordCloud[countries, ImageSize → 500]



Color Revolution

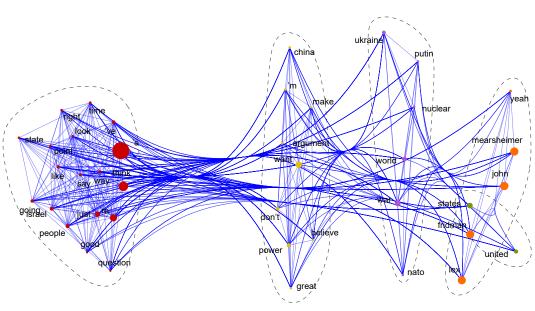
American Revolution Israeli Revolution Battle of Stalingrad World War III Vietnam War Spanish American War Western World War... Industrial Revolution



Palestinian Cuban Missile Crisis NATO
world war invasion of Normandy Ukraine
Eastern Orange Revolution missile
Palestinian conflict

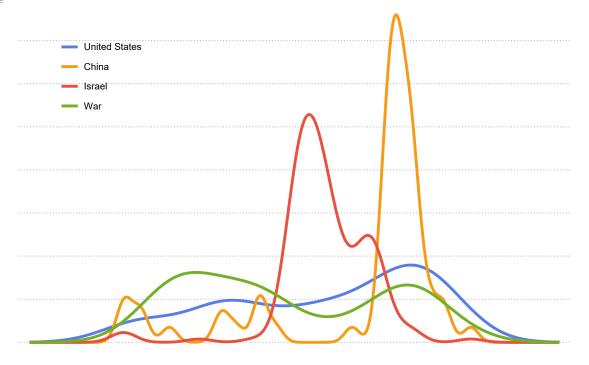
KeywordGraph

```
In[*]:= Options[KeywordsGraph] = {DirectedEdges → False, EdgeWeight → Automatic, "LowerCase" → True,
          "StopWords" → True, VertexLabels → Automatic, VertexWeight → Automatic};
      KeywordsGraph[text_String, number_Integer?Positive, blist_List: {},
         rlist_List: {}, opts: OptionsPattern[{KeywordsGraph, Graph}]] :=
       Module[{keycounts, keywords, edges, edgeCount, data =
           Replace[DeleteCases[TextWords[If[TrueQ[OptionValue["StopWords"]], DeleteStopwords,
                Identity] [If[TrueQ[OptionValue["LowerCase"]], ToLowerCase, Identity] [text]]],
             Alternatives @@ blist], rlist, {1}]}, keycounts = Counts[data];
         Quiet[Check[keywords = TakeLargest[keycounts, number],
           Return[Failure["KeywordCount", <| "MessageTemplate" →
               "Number of specified keywords `1` exceeds the actual number of keywords `2`.",
              "MessageParameters" → {number, Length[keycounts]}|>], Module]]];
         edges = Partition[Cases[data, Alternatives@@ Keys[keywords]], 2, 1];
         edgeCount = If[TrueQ[Replace[OptionValue[DirectedEdges], Automatic → False]],
           KeySelect[Counts[DirectedEdge@@@edges], #[1] # #[2] &],
           KeySelect[Counts[Sort /@ UndirectedEdge @@@ edges], #[1] # #[2] &]];
         Graph[Keys[keywords], Keys[edgeCount], FilterRules[Flatten[Join[{opts,
              VertexWeight → Replace[OptionValue[VertexWeight], Automatic → Values[keywords]],
              EdgeWeight → Replace[OptionValue[EdgeWeight], Automatic → Values[edgeCount]]},
             Options [KeywordsGraph]]], Options [Graph]]]]
 In[@]:= CommunityGraphPlot[KeywordsGraph[DeleteStopwords[webpage], 40,
        VertexSize → "VertexWeight", EdgeStyle → Directive[Blue, Opacity[0.5]]],
       CommunityBoundaryStyle → Directive[Black, Dashed, Opacity[0.8]],
       ImageSize → Large, GraphLayout → "RadialEmbedding"]
Out[0]=
```



KeywordPlot

```
In[@]:= KeywordPlot // ClearAll;
     Options[KeywordPlot] =
       Options[SmoothHistogram] ~ Join ~ {"PlotFunction" → Automatic, "TopN" → All};
     KeywordPlot::nokwd = "Keyword \"`1`\" not found in text.";
     (*Operatorforms*)
     KeywordPlot[keyword_String, opts:OptionsPattern[]] := KeywordPlot[{keyword}, opts];
     KeywordPlot[keywords_List, opts:OptionsPattern[]]:=
       Function[text, KeywordPlot[text, keywords, opts]];
     (*Mainform*)
     KeywordPlot[text_String, keyword_String, opts:OptionsPattern[]]:=
       KeywordPlot[text, {keyword}, opts];
     KeywordPlot[text_String, keywords_List, opts:OptionsPattern[]] :=
      Module[{pltFun, topN, txt, kws, pos, badpos},
       pltFun = OptionValue["PlotFunction"] /. Automatic → SmoothHistogram;
       topN = OptionValue["TopN"];
       txt = RemoveDiacritics@ToLowerCase@text;
       kws = RemoveDiacritics@ToLowerCase@keywords;
       pos = StringPosition[txt, #] [All, 1] & /@ kws;
       badpos = Position[pos, {}];
       If[badpos = ! = {}, ResourceFunction["ResourceSystemMessage"][KeywordPlot::nokwd, #] & /@
          Extract[kws, badpos];
        If[Flatten[pos] == {}, Return@$Failed, (*nokeywordstoplot*)kws = Delete[kws, badpos];
          pos = Delete[pos, badpos];]];
       If[IntegerQ@topN, ord = OrderingBy[pos, -Length[#] &];
         pos = Take[pos[ord]], UpTo@topN];
         kws = Take[kws[ord]], UpTo@topN];];
       pltFun@@ {pos, Sequence@@ FilterRules[{opts}, Options[pltFun]],
          PlotLegends → kws, AspectRatio → 1 / GoldenRatio,
          PlotTheme → "Minimal", ImageSize → Automatic, Frame → None}]
In[@]:= keywords = {"United States", "China", "Israel", "War"};
     KeywordPlot[keywords, ImageSize → Large,
        PlotLegends → Placed[keywords, {{.15, .8}}], PlotTheme → "Business"]@webpage
```



 $\textit{In[o]:=} \ \, \textbf{WordCloud[DeleteStopwords[webpage], ImageSize} \rightarrow \textbf{Large]}$

```
kind Taiwan human leaders Israeli
   look Putin talking democracies
               realist mean doesn't Jews liberal
keywords = {"United States", "China", "Israel", "War"};
KeywordPlot[keywords, ImageSize → Large,
 PlotLegends → Placed[keywords, {{.15, .8}}], PlotTheme → "Business"]@webpage
```

Nonfunctioning Resource Functions

Initializing WordData indices

In[*]:= ResourceFunction["SynonymGraph"]["China", 3, ImageSize → Full]

