

Argumentative Stance Prediction: An Exploratory Study on Multimodality and Few-Shot Learning

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MOTIVATION

To investigate whether multimodality improves argumentative stance prediction for gun control and abortion related tweets.

Example

Gun control: The past year has seen more #NICS checks than any same month. #Gunsense #guncontrol is dead. #SelfDefense is a #HumanRight

Year	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Nov	Dec	Total
2019	105,152	107,456	110,789	114,234	117,567	120,890	124,123	127,456	130,789	134,012	137,345	140,678	1,550,000
2020	107,234	109,567	112,890	116,123	119,456	122,789	126,012	129,345	132,678	136,012	139,345	142,678	1,560,000
2021	109,345	111,678	115,012	118,345	121,678	125,012	128,345	131,678	135,012	138,345	141,678	145,012	1,570,000
2022	111,456	113,789	117,123	120,456	123,789	127,123	130,456	133,789	137,123	140,456	143,789	147,123	1,580,000
2023	113,567	115,890	119,234	122,567	125,890	129,234	132,567	135,890	139,234	142,567	145,890	149,234	1,590,000
2024	115,678	117,901	121,234	124,567	127,901	131,234	134,567	137,901	141,234	144,567	147,901	151,234	1,600,000
2025	117,789	120,012	123,345	126,678	130,012	133,345	136,678	140,012	143,345	146,678	150,012	153,345	1,610,000
2026	119,890	122,123	125,456	128,789	132,123	135,456	138,789	142,123	145,456	148,789	152,123	155,456	1,620,000
2027	121,901	124,123	127,456	130,789	134,123	137,456	140,789	144,123	147,456	150,789	154,123	157,456	1,630,000
2028	124,012	126,234	129,567	132,890	136,234	139,567	142,890	146,234	149,567	152,890	156,234	159,567	1,640,000
2029	126,123	128,345	131,678	135,012	138,345	141,678	145,012	148,345	151,678	155,012	158,345	161,678	1,650,000
2030	128,234	130,456	133,789	137,123	140,456	143,789	147,123	150,456	153,789	157,123	160,456	163,789	1,660,000
2031	130,345	132,567	135,890	139,234	142,567	145,890	149,234	152,567	155,890	159,234	162,567	165,890	1,670,000
2032	132,456	134,678	138,012	141,345	144,678	148,012	151,345	154,678	158,012	161,345	164,678	168,012	1,680,000
2033	134,567	136,789	140,123	143,456	146,789	150,123	153,456	156,789	160,123	163,456	166,789	170,123	1,690,000
2034	136,678	138,901	142,234	145,567	148,901	152,234	155,567	158,901	162,234	165,567	168,901	172,234	1,700,000
2035	138,789	141,012	144,345	147,678	151,012	154,345	157,678	161,012	164,345	167,678	171,012	174,345	1,710,000
2036	140,890	143,123	146,456	149,789	153,123	156,456	159,789	163,123	166,456	169,789	173,123	176,456	1,720,000
2037	142,901	145,123	148,456	151,789	155,123	158,456	161,789	165,123	168,456	171,789	175,123	178,456	1,730,000
2038	145,012	147,234	150,567	153,890	157,234	160,567	163,890	167,234	170,567	173,890	177,234	180,567	1,740,000
2039	147,123	149,345	152,678	156,012	159,345	162,678	166,012	169,345	172,678	176,012	179,345	182,678	1,750,000
2040	149,234	151,456	154,789	158,123	161,456	164,789	168,123	171,456	174,789	178,123	181,456	184,789	1,760,000
2041	151,345	153,567	156,890	160,234	163,567	166,890	170,234	173,567	176,890	180,234	183,567	186,890	1,770,000
2042	153,456	155,678	159,012	162,345	165,678	169,012	172,345	175,678	179,012	182,345	185,678	189,012	1,780,000
2043	155,567	157,789	161,123	164,456	167,789	171,123	174,456	177,789	181,123	184,456	187,789	191,123	1,790,000
2044	157,678	159,901	163,234	166,567	169,901	173,234	176,567	179,901	183,234	186,567	189,901	193,234	1,800,000
2045	159,789	162,012	165,345	168,678	172,012	175,345	178,678	182,012	185,345	188,678	192,012	195,345	1,810,000
2046	161,890	164,123	167,456	170,789	174,123	177,456	180,789	184,123	187,456	190,789	194,123	197,456	1,820,000
2047	163,901	166,123	169,456	172,890	176,123	179,456	182,890	186,123	189,456	192,890	196,123	199,456	1,830,000
2048	166,012	168,234	171,567	174,901	178,234	181,567	184,901	188,234	191,567	194,901	198,234	201,567	1,840,000
2049	168,123	170,345	173,678	177,012	180,345	183,678	187,012	190,345	193,678	197,012	200,345	203,678	1,850,000
2050	170,234	172,456	175,789	179,123	182,456	185,789	189,123	192,456	195,789	199,123	202,456	205,789	1,860,000
2051	172,345	174,567	177,890	181,234	184,567	187,890	191,234	194,567	197,890	201,234	204,567	207,890	1,870,000
2052	174,456	176,678	180,012	183,345	186,678	190,012	193,345	196,678	200,012	203,345	206,678	210,012	1,880,000
2053	176,567	178,789	182,123	185,456	188,789	192,123	195,456	198,789	202,123	205,456	208,789	212,123	1,890,000
2054	178,678	180,901	184,234	187,567	190,901	194,234	197,567	200,901	204,234	207,567	210,901	214,234	1,900,000
2055	180,789	183,012	186,345	189,678	193,012	196,345	199,678	203,012	206,345	209,678	213,012	216,345	1,910,000
2056	182,890	185,123	188,456	191,789	195,123	198,456	201,789	205,123	208,456	211,789	215,123	218,456	1,920,000
2057	184,901	187,123	190,456	193,789	197,123	200,456	203,789	207,123	210,456	213,789	217,123	220,456	1,930,000
2058	187,012	189,234	192,567	195,890	199,234	202,567	205,890	209,234	212,567	215,890	219,234	222,567	1,940,000
2059	189,123	191,345	194,678	198,012	201,345	204,678	208,012	211,345	214,678	218,012	221,345	224,678	1,950,000
2060	191,234	193,456	196,789	200,123	203,456	206,789	210,123	213,456	216,789	220,123	223,456	226,789	1,960,000
2061	193,345	195,567	198,890	202,234	205,567	208,890	212,234	215,567	218,890	222,234	225,567	228,890	1,970,000
2062	195,456	197,678	201,012	204,345	207,678	211,012	214,345	217,678	221,012	224,345	227,678	231,012	1,980,000
2063	197,567	199,789	203,123	206,456	209,789	213,123	216,456	219,789	223,123	226,456	229,789	233,123	1,990,000
2064	199,678	201,901	205,234	208,567	211,901	215,234	218,567	221,901	225,234	228,567	231,901	235,234	2,000,000
2065	201,789	204,012	207,345	210,678	214,012	217,345	220,678	224,012	227,345	230,678	234,012	237,345	2,010,000
2066	203,890	206,123	209,456	212,789	216,123	219,456	222,789	226,123	229,456	232,789	236,123	239,456	2,020,000
2067	205,901	208,123	211,456	214,789	218,123	221,456	224,789	228,123	231,456	234,789	238,123	241,456	2,030,000
2068	208,012	210,234	213,567	216,890	220,234	223,567	226,890	230,234	233,567	236,890	240,234	243,567	2,040,000
2069	210,123	212,345	215,678	219,012	222,345	225,678	229,012	232,345	235,678	239,012	242,345	245,678	2,050,000
2070	212,234	214,456	217,789	221,123	224,456	227,789	231,123	234,456	237,789	241,123	244,456	247,789	2,060,000
2071	214,345	216,567	219,890	223,234	226,567	229,890	233,234	236,567	239,890	243,234	246,567	249,890	2,070,000
2072	216,456	218,678	222,012	225,345	228,678	232,012	235,345	238,678	242,012	245,345	248,678	252,012	2,080,000
2073	218,567	220,789	224,123	227,456	230,789	234,123	237,456	240,789	244,123	247,456	250,789	254,123	2,090,000
2074	220,678	222,901	226,234	229,567	232,901	236,234	239,567	242,901	246,234	249,567	252,901	256,234	2,100,000
2075	222,789	225,012	228,345	231,678	235,012	238,345	241,678	245,012	248,345	251,678	255,012	258,345	2,110,000
2076	224,890	227,123	230,456	233,789	237,123	240,456	243,789	247,123	250,456	253,789	257,123	260,456	2,120,000
2077	226,901	229,123	232,456	235,789	239,123	242,456	245,789	249,123	252,456	255,789	259,123	262,456	2,130,000
2078	229,012	231,234	234,567	237,890	241,234	244,567	247,890	251,234	254,567	257,890	261,234	264,567	2,140,000
2079	231,123	233,345	236,678	240,012	243,345	246,678	250,012	253,345	256,678	260,012	263,345	266,678	2,150,000
2080	233,234	235,456	238,789	242,123	245,456	248,789	252,123	255,456	258,789	262,123	265,456	268,789	2,160,000
2081	235,345	237,567	240,890	244,234	247,567	250,890	254,234	257,567	260,890	264,234	267,567	270,890	2,170,000
2082	237,456	239,678	243,012	246,345	249,678	253,012	256,345	259,678	263,012	266,345	269,678	273,012	2,180,000
2083	239,567	241,789	245,123	248,456	251,789	255,123	258,456	261,789	265,123	268,456	271,789	275,123	2,190,000
2084	241,678	243,901	247,234	250,567	253,901	257,234	260,567	263,901	267,234	270,567	273,901	277,234	2,200,000
2085	243,789	246,012	249,345	252,678	256,012	259,345	262,678	266,012	269,345	272,678	276,012	279,345	2,210,000
2086	245,890	248,123	251,456	254,789	258,123	261,456	264,789	268,123	271,456	274,789	278,123	281,456	2,220,000
2087	247,901	250,123	253,456	256,789	260,123	263,456	266,789	270,123	273,456	276,789	280,123	283,456	2,230,000
2088	250,012	252,234	255,567	258,890	262,234	265,567	268,890	272,234	275,567	278,890	282,234	285,567	2,240,000
2089	252,123	254,345	257,678	261,012	264,345	267,678	271,012	274,345	277,678	281,012	284,345	287,678	2,250,000
2090	254,234	256,456	259,789	263,123	266,456	269,789	273,123	276,456	279,789	283,123	286,456		