Exploring Grant Opportunities and Trends for buildOn

NLP Analysis for buildOn Development Team





Organization Development Goal:

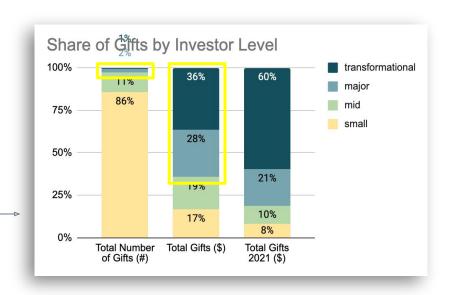
 Increase share of revenue from major (\$10k+) and transformational (\$100k+) gifts

Organization Development Goal:

 Increase revenue from major and transformational gifts

Major Gifts are Key to Scaling

- Only 3% of donors at major-gift level make up >60% of revenue
- Larger returns to major gift cultivation



Strategy:

• Improve potential major donor identification for fundraising team

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Improve potential major donor identification for fundraising team

Metis Project Scope:

- Using an NLP algorithm to explore historical grant information, identify the following:
 - Topic trends in giving comparing mid/major vs transformational level gifts
 - Recommended grantmakers to target

2. METHODOLOGY | DATA

- **Source:** Foundation Directory
- n = 1,038
- Unit of Analysis: Individual grant
- **Corpus:** Grant Descriptions
- Features:
 - Grantmaker / Grantee
 - Amount
 - Year
 - Description



2. METHODOLOGY | METHOD

Text Preprocessing:

- Tokenization, lemmatization, n-grams, entities identification | **spaCy**
- Doc-Term Matrix vectorization | **TFIDF** (sklearn)

Document Similarity Analysis:

• Topic Modeling | scattertext, NMF (sklearn)

Recommender:

• Content Based Filtering | numpy.linalg.norm



3. RESULTS

Topic Modeling for Major v. Transformational Grants

Overview: Topic Modeling analysis comparing Mid/Major v. Transformational Grants, using Grant Descriptions as the corpus

74% Mid/Major Grants (\$5-100k)

Shorter Descriptions (1-2 sentences)

26% Transformational Grants (\$100k+)

- Longer Descriptions (paragraph)

Topic Modeling for Major v. Transformational Grants

| Mid/Major | Transformational | |
|-----------------------------|-------------------------------|--|
| 0: 'General Support' | 0: 'School/Student Programs' | |
| 1: 'Equipment' | 1: 'General Support' | |
| 2: 'College/Career Success' | 2: 'Arts' | |
| 3: 'General Operating' | 3: 'NY/Boston' | |
| 4: 'General Operations' | 4: 'After School Programs' | |
| 5: 'Scholarship/Fund' | 5: 'Early Education | |
| 6: 'Gift Matching' | 6: 'Scholarship' | |
| 7: 'Youth Ed/Arts Programs | 7: 'College & Career Success' | |
| 8: 'Unrestricted/Grants' | 8: 'Health/Foster' | |
| 9: 'School Student Support' | 9: 'Job/Career Training' | |

 More tactical/administrative funding for mid/major gifts ___

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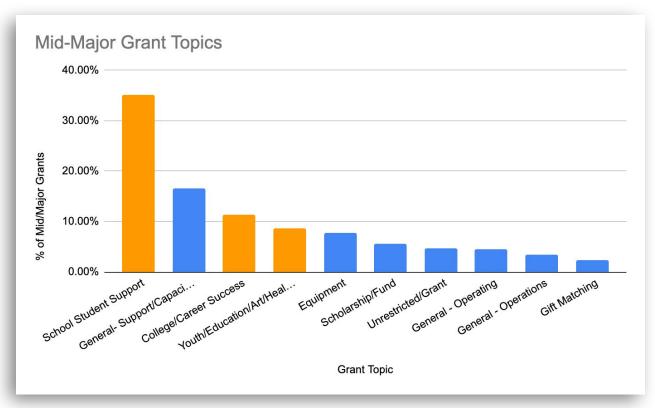
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- More tactical/administrative funding for mid/major gifts
- NY & Boston is a hub for transformational giving
- Youth Arts / After School programs and Job/Career Training appear in both models
- Early Education & Health/Foster Services are more prevalent in Transformational Giving

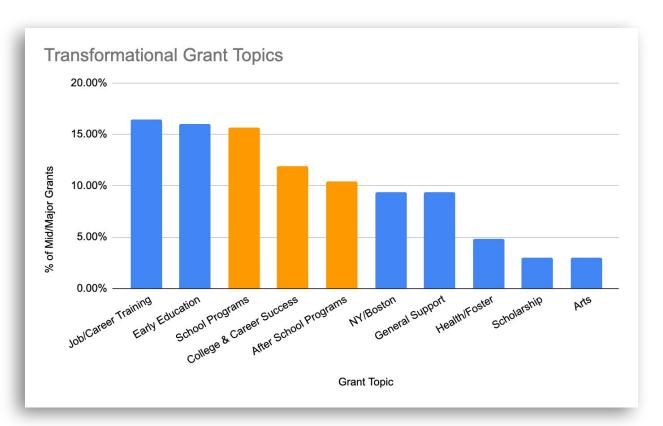
buildOn Alignment with Grant Topics: Mid-Major Grants



Among the topics buildOn is most aligned (in orange):

442 grants representing **\$15** million for 2021-2022

buildOn Alignment with Grant Topics: Transformational Grants



Among the topics buildOn is most aligned (in orange):

102 grants representing **\$262** million for 2021-2022

buildOn Grantmaker Recommendations: Major Grants

| Grantmaker | Granted 2021-22 | # Grants Authorized |
|---------------------------------------|-----------------|------------------------|
| Paul M. Angell Family Foundation | \$865,000 | 22 |
| New York Community Trust | \$517,500 | 15 |
| The Wicklander Foundation | \$24,000 | 4 |
| Best Buy Foundation | \$190,500 | 13 |
| J. E. & Z. B. Butler Foundation, Inc. | \$316,475 | 8 |

These orgs had the highest TFIDF scores for buildOn related topics.

62 grants
representing
\$2.5 million for
2021-2022

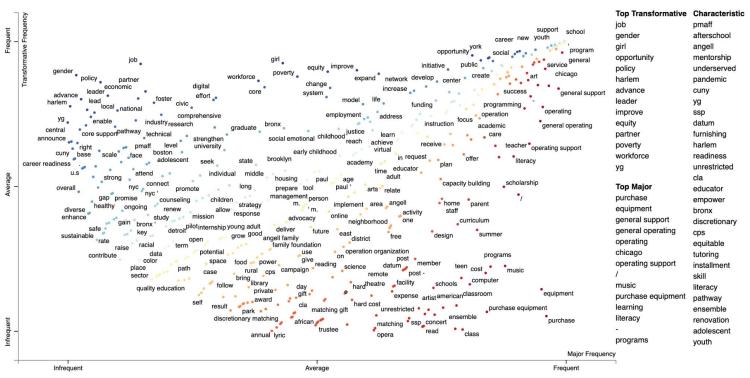
buildOn Grantmaker Recommendations: Transformational Grants

| Grantmaker | Granted 2021-22 | # Grants Authorized |
|--|-----------------|------------------------|
| New York Community Trust | \$4,666,000 | 24 |
| Carnegie Corporation of New York | \$5,520,000 | 20 |
| Charles Hayden Foundation | \$4,455,000 | 23 |
| East Bay Community Foundation | \$5,850,000 | 10 |
| The Harry and Jeanette Weinberg Foundation, Inc. | \$2,010,000 | 10 |

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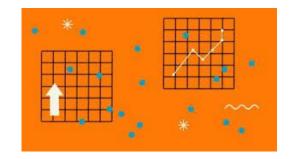
87 grants
representing
\$22.5 million for
2021-2022

buildOn Grantmaker Recommendation Tool: Scattertext



4. CONCLUSIONS

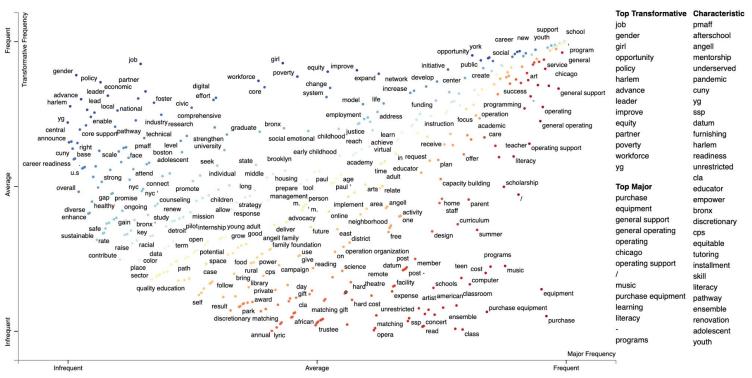
- Mid/Major Grants have a larger percentage of general funding and tactical funding, while Transformational Grants are more topical
- Topic Modeling allowed finer filtering to buildOn related grants and grantmakers
- Great initial set of prospects / prospecting tool with scattertext
- Further work to do:
 - Identify better corpus dataset for international funding
 - o Build bigger corpus across several years
 - Improve Topic Modeling esp for mid/major
 - Analyze trends over time







3. RESULTS | Full Data EDA



3. RESULTS | Transformative v Mid/Major

| Topic 00 / School Programs school (6.07) high (3.88) student (3.01) program (2.33) | Topic 01 / General Support general (32.68) support (24.47) operating (7.40) operation (6.18) | Topic 02 / Arts/Culture attend (9.06) bronx (8.53) instruction (8.06) provide (7.11) | Topic 03 / NY/Boston Schools new (10.03) york (9.92) city (6.36) boston (3.38) | Topic 04 / After School Programs college (10.01) program (3.70) career (2.53) success (2.48) |
|---|---|--|---|--|
| Topic 05 / | Topic 06 / | Topic 07 / College & Career Success youth (7.60) health (4.19) foster (3.91) service (3.07) | Topic 08 / | Topic 09 / |
| Early Education | Scholarship | | Health / Foster | Job/Career Training |
| education (4.25) | fund (19.66) | | afterschool (14.00) | training (3.10) |
| early (3.79) | scholarship (13.90) | | improve (10.86) | job (2.73) |
| childhood (3.44) | paul (3.91) | | reading (10.05) | career (2.18) |
| quality (2.25) | 19 (2.68) | | instruction (8.42) | workforce (1.42) |
| Topic 00 / General Support/ Capacity Building general (50.14) support (36.97) capacity (1.35) building (1.32) | Topic 01 / Equipment purchase (29.46) equipment (28.48) computer (9.89) furnishing (5.37) | Topic 02 / College/Career Success program (16.40) college (12.02) success (4.74) bound (3.62) | Topic 03 / General - Operating operating (52.79) general (7.81) support (4.02) give (3.44) | Topic 04 / General - Operations operation (26.58) organization (21.39) general (12.93) operations (2.58) |
| Topic 05 / | Topic 06 / Gift Matching matching (17.95) gift (17.12) discretionary (16.91) trustee (16.66) | Topic 07 / | Topic 08 / | Topic 09 / |
| Scholarship/Fund | | Youth Edu/Art Programs | Unrestricted/Grant | School Student Support |
| scholarship (34.20) | | education (19.90) | grant (19.89) | school (3.79) |
| student (7.84) | | youth (3.91) | unrestricted (18.25) | student (2.21) |
| fund (7.07) | | music (2.97) | give (12.77) | high (1.69) |
| award (2.85) | | chicago (2.80) | honorary (11.84) | support (1.22) |

3. **RESULTS** | Grant Recommendations