

# ANALYZING THE ROOT CAUSES OF CONSTRUCTION DELAYS: A TEXT ANALYTICS APPROACH

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# 1. Background and Motivation

The NYC Department of Design and Construction (DDC) is responsible for managing capital construction projects for the city. They build and renovate civic facilities like firehouses, libraries, and police precincts, collaborating with city agencies and architects. DDC also improves infrastructure such as roadways, sewers, and water mains in all five boroughs, contributing to a resilient city.

The motivation behind our analysis stems from the crucial role that construction projects play in developing and maintaining a city's infrastructure. By analyzing construction delays in public buildings and infrastructure projects managed by the NYC DDC, we aim to identify and understand the primary causes of these delays. This information is invaluable for improving project management practices, enhancing efficiency, and ensuring that construction projects are completed on time and cost-effectively. Our analysis and findings serve as a valuable resource for the public construction industry in NYC, providing insights that can lead to better decision-making and more successful project outcomes.

#### 2. Strategic Plan

The analysis of the Delay Data was directly influenced by the DDC's strategic plan, which has actively pursued enhancements in reporting measures and data integration in recent years. As articulated in the 2019 Blueprint, "Incorporate Robust Project Controls: The agency will expand the use of extensive data collected on past projects to strengthen, monitor, and continuously improve project cost assessments and standardize schedule durations, project risk management, and agency processes." The Delay Data, a substantial dataset previously unavailable, emerged as a result of the initiatives outlined in the 2019 Blueprint. Our text analytics approach was crafted to digest this dataset, beginning to understand root causes of delay issues. Additionally, the 2022 Blueprint builds upon the 2019 one stating, "Since the 2019 Blueprint, DDC has advanced a rigorous, performance-based approach to agency operations. We have embedded a culture of performance management at all stages of project delivery. Using clear and measurable data alongside ambitious targets, DDC continually monitors performance

<sup>&</sup>lt;sup>1</sup>New York City Department of Design and Construction, "2019 Strategic Blueprint Update," accessed May 13, 2024, https://www.nyc.gov/assets/ddc/images/content/pages/press-releases/2019/2019\_Strategic\_Blueprint\_Update.pdf.

to chart our progress. We also identify opportunities for improvement and devise data-driven strategies to address them."<sup>2</sup> The sophisticated clustering analysis conducted was possible because of the clear and measurable data set forth by the DDC's strategic plan, highlighting the DDC's ongoing efforts to utilize data for informed decision-making.

#### 3. Problem Statements

While the New York City Department of Design and Construction plays a critical role in managing critical infrastructure and public building projects, continued delays pose significant challenges affecting the timely and cost-effective completion of these projects. Construction delays result in increased costs and delay the benefits these projects are designed to provide to the public. Understanding and mitigating these delays is critical to improving project efficiency and effectiveness.

Our study was designed to comprehensively analyze construction delays in public buildings and infrastructure projects managed by the DDC in New York City. Identify the main causes of delays, categorized by project type (public buildings and infrastructure) and construction stage (design, bidding, construction). Evaluate the cluster and project type for these delays.

By addressing these goals, our research aims to contribute to developing targeted strategies that can reduce the incidence of delays and improve the overall project management and execution of construction projects in New York City.

#### 4. Dataset Description

The dataset recorded by NYC DDC contains information about construction delays recorded by the NYC DDC. Each row represents a delay incident and includes details such as the project ID, division, borough, parent project type, project type, delays or gains, delay category, delay subcategory, delay impacted phase, delay description, overall schedule impact in calendar

<sup>&</sup>lt;sup>2</sup> New York City Department of Design and Construction, Strategic Blueprint 2022, accessed May 13, 2024, https://www.nyc.gov/assets/ddc/downloads/publications/Strategic\_Blueprint\_2022.pdf.

construction days (CCDs), delay start date, and delay end date. These delays can occur in various phases of the project and can impact the overall schedule.

It is also necessary to partition these delayed projects into public buildings and infrastructures, as well as further divide them into the three construction phases - design, bid, and build- because this can help analyze the delay factors more effectively. Due to their unique characteristics and requirements, public buildings and infrastructure projects often have different delay factors. Similarly, analyzing delays based on construction phases can provide insights into when and why delays are more likely to occur, allowing for targeted mitigation strategies. This approach can help in identifying patterns and trends specific to each project type and construction phase, leading to more informed decision-making and better project management practices.

# 5. Overview of Subcategory Risk:

- 1 Scope Management
  - 1.01 Scope Changes
  - 1.02 Lack of Definition
  - 1.99 Other
- 2 Schedule Management
  - 2.01 Delay by Vendor
  - 2.02 Delay by External Stakeholder
  - 2.99 Other
- 3 Cost Management
  - 3.01 Funding
  - 3.02 Payments
  - 3.03 Other
- 4 Quality Management
  - 4.01 Design Error
  - 4.02 Design Omission

- 4.03 Construction Quality
- 4.04 Schedule Quality
- 4.05 Estimate Quality
- 4.99 Other
- 5 Resource Management
  - 5.01 DDC Staff
  - 5.02 Standard Procedures
  - 5.03 Technology
  - 5.99 Other
- 6 Procurement Management
  - 6.01 Contract Terms
  - 6.02 Change Order Management
  - 6.03 Procurement Management
  - 6.04 Property Acquisition
  - 6.99 Other
- 7 Stakeholder Management
  - 7.01 Communication
  - 7.02 Oversight
  - 7.03 Public
  - 7.04 Interface with Other Projects
  - 7.99 Other
- 8 External Environment
  - 8.01 Market Conditions
  - 8.02 Public Health Emergency
  - 8.03 Natural Hazards
  - 8.04 Administrative Change
  - 8.99 Other
- 9 Construction Conditions
  - 9.01 Environmental Conditions
  - 9.02 Private Utilities
  - 9.03 Subsurface Field Conditions

9.04 Above Grade Field Condition

9.05 Health and Safety

9.06 Site Access & Ownership

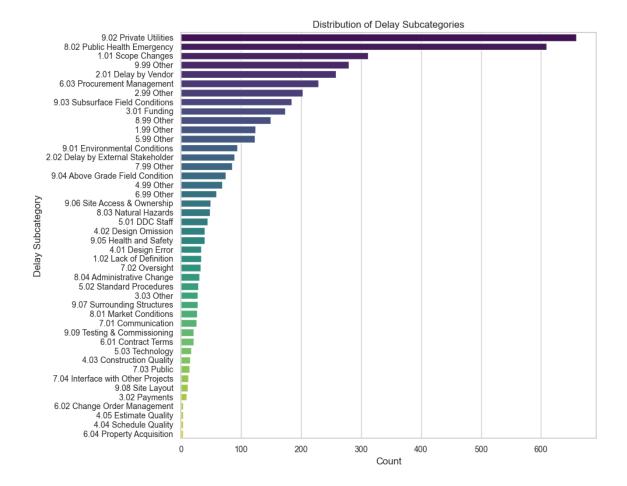
9.07 Surrounding Structures

9.08 Site Layout

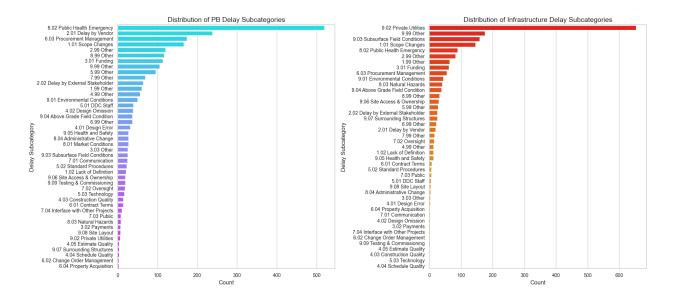
9.09 Testing & Commissioning

9.99 Other

From the "Overall Distribution of Delay Subcategories" chart, it is observable that '9.02 Private Utilities' and '8.02 Public Health Emergency' are the most frequent causes of project delays, highlighting the impact of external environmental factors and unforeseen events on project timelines. Additionally, '2.01 Delay by Vendor' also emerges as a significant factor, pointing out the central role of supply chain management in project management.



Further examination of the PB Delay Subcategories and Infrastructure Delay Subcategories charts reveals distinct patterns. In Public Building projects, "8.02 Public Health Emergency," "2.01 Delay by Vendor," "6.03 Procurement Management," and "1.01 Scope Changes" are more common. In contrast, in Infrastructure projects, the impacts of "9.02 Private Utilities," "9.03 Subsurface Field Condition," "1.01 Scope Changes," and "Public Health Emergency" are more pronounced. These differences suggest that different project types may require tailored strategies and measures in their management and execution.



Lastly, the Heatmap of Delay Subcategory Occurrences by Division provides a visual data analysis that displays the frequency of various delay subcategories across different divisions. This visualization allows managers to quickly identify the primary causes of delays within specific departments and formulate targeted improvement measures accordingly.

Heatmap of Delay Subcategory Occurrences by Division

	1.01 Scope Changes	146	166	
	1.02 Lack of Definition	13	21	
	1.99 Other	64	60	
	2.01 Delay by Vendor	20	238	- 600
	2.02 Delay by External Stakeholder	25	64	000
	2.99 Other	83	120	
	3.01 Funding	61	113	
	3.02 Payments	2	7	
	3.03 Other	3	25	
	4.01 Design Error	3	31	
	4.02 Design Omission	2	38	- 500
	4.03 Construction Quality	1	14	
	4.04 Schedule Quality	1	3	
	4.05 Estimate Quality	1	3	
	4.99 Other	13	56	
	5.01 DDC Staff	5	39	
	5.02 Standard Procedures	6	23	- 400
_	5.03 Technology	1	16	- 400
Delay Subcategory	5.99 Other	27	96	
ğ	6.01 Contract Terms	7	14	
ate	6.02 Change Order Management	2	2	
pc	6.03 Procurement Management	55	174	
Σ	6.04 Property Acquisition	2	2	
>	6.99 Other	22	37	- 300
<u>a</u>	7.01 Communication	2	24	
De	7.02 Oversight	15	18	
_	7.03 Public	6	8	
	7.04 Interface with Other Projects	2	10	
	7.99 Other	16	69	
	8.01 Market Conditions	0	27	
	8.02 Public Health Emergency	89	520	- 200
	8.03 Natural Hazards	40	8	
	8.04 Administrative Change	4	27	
	8.99 Other	32	117	
	9.01 Environmental Conditions	44	50	
	9.02 Private Utilities	653	6	
	9.03 Subsurface Field Conditions	159	25	
	9.04 Above Grade Field Condition	38	37	- 100
	9.05 Health and Safety	13	27	
	9.06 Site Access & Ownership	30	19	
	9.07 Surrounding Structures	25	3	
	9.08 Site Layout	4	7	
	9.09 Testing & Commissioning	2	19	
	9.99 Other	175	105	- 0
		Infrastructure	Public Buildings	- 0
		Divi		
		DIVI	31011	

# 6. Methodology

# **6.1 Analytical Methods**

# 6.1.1 Bag-of-Words

The Bag-of-Words model is a text representation method used to preprocess text into numeric vectors by counting the frequency of each word in the document. Bag-of-Words can account for a single word and a collection of phrases, including two words (2-grams), three words (3-grams), and so on. For this project, 3-grams and 4-grams have been used to provide broader insights into the causes of delay and to reduce redundancy as the size of n-grams

increases. In order to account for the anomaly that was Covid-19, we removed all keywords that were related to Covid-19 pandemic.

#### 6.1.2 Part-of-speech

Part-of-speech tagging (POS), or grammatical tagging, labels each word in a text based on its syntactic context and role. Usually, words can fall into one of the following major grammar categories: Noun, Verb, Adjective, and Adverb. This method helps in understanding the grammatical structure and meaning of sentences. In this analysis, the POS approach extracts the top 30 trigrams and 4-gram words with the highest frequency, excluding adverb words. However, after conducting POS tagging we found it did not offer any new insights after the Bag-of-Words approach.

#### **POS Dictionary:**

- NN: Noun (singular or mass)
- NNS: Noun (plural)
- NNP: Proper noun (singular)
- NNPS: Proper noun (plural)
- VB: Verb (base form)
- VBD: Verb (past tense)
- VBG: Verb (gerund/present participle)
- VBN: Verb (past participle)
- VBP: Verb (non-3rd person singular present)
- VBZ: Verb (3rd person singular present)
- JJ: Adjective
- JJR: Adjective (comparative)
- JJS: Adjective (superlative)

# **6.1.3 Clustering**

In this project, we carried out text cleaning, standardization, and morphology reduction of the "Delay Description" column in the delayed data to prepare the data for further text analysis. Firstly, a bag of words model (BOW) is used to preprocess the text data, generating 3-gram and 4-gram data sets. For better data consolidation, we chose datasets with more risk subcategories. Determining to use a 3-gram or 4-gram dataset, we traced each phrase back to a specific project ID and created a new dataset. In this dataset, if an item contains a risk subcategory, its total is marked in the column for that risk subcategory; If it does not, it is marked as 0. Then, the K-means clustering method is used to analyze the risk subcategory data. Finally, we use Tableau software to visualize the clustering results and show each project's distribution of risk subcategories. This approach enables us to effectively identify and analyze potential risks in the project, providing data support for further risk management and decision-making.

# 7. Analysis of Keyword Frequency

### 7.1 Bag-of-Words Approach

**Top 30 3-gram Frequency** 

Phase	Public Building	Infrastructure
Design (Design and Initiation)	<ul> <li>phase admin building, add in design requested by DOT</li> <li>Ino required fdny, Liasion Officers required Fire Department NY, related to fire prevention and safety services</li> <li>amended design initial</li> <li>bid packaging review</li> <li>updated Ino required, updated Ino required for fire safety was delayed</li> <li>design initial construction</li> <li>initial construction cp, related to rejection of certified to proceed request</li> <li>project hold due</li> <li>procurement jocs mwbe, changed from JOC to meet requirements in MWBE (minority/women-owned)</li> </ul>	<ul> <li>project move fy this project moved to another fiscal year</li> <li>legacy project pre Legacy project / Pre - FEP. Project start date input was draft CPI received date.</li> <li>project pre fep</li> <li>pre fep project</li> <li>fep project start</li> <li>project start date</li> <li>start date input</li> <li>date input draft</li> <li>input draft cpi</li> <li>draft cpi receive</li> <li>cpi receive date</li> </ul>

- business enterprises) in bid phase caused the delay
- amended design cp
- new consultant team
- revised reflect delay
- schedule revised reflect
- reflect delay caused
- bid package intake
- sponsor agency requested
- sponsor agency delayed
- agency delayed provide
- provide updated lno,related to fire prevention and fire safety requirements above
- delayed provide updated
- building roof replacement, related to phase admin building above
- work phase admin, related to phase admin building above
- revise procurement jocs
- fdny approval coordination, related to FDNY approval above
- design procurement team
- submitted ddc review

- design completion date moved to another date
- design task order Delay in this progress
- project roll fy to another fiscal year
- dep revise contract department of environmental protection
- revise contract language
- fy sponsor agency Sponsor agency moved to fiscal year 24/25
- actual design completion
   Competition date is different due to rebid
- design service suspend by NYC DOT
- move project fy To another fiscal year
- move fy fy
- e nd st closure of E. 92nd St entrance ramp was found by NYC DOT to be impractical
- roll fy sponsor
- fy approve april original approved in April FY2022, moved to other Fiscal year
- approve april plan
- funding move fy Funding moved to another fiscal year
- april plan project
- acquisition process project property acquisition process
- put project onhold
- dep request add additional language

		and one unit item to the emergency contracts
Bid (Construction Procurement)	<ul> <li>site safety plan more straightforward, safety of site wasn't in check at first</li> <li>abated architectural drawing interesting, cause of delay was architecture changes?</li> <li>bpl lighting consultant bpl?</li> <li>sub responding consultant</li> <li>spot abatement abatement</li> <li>sponsor delay securing</li> <li>resubmitted budget cp delay due to waiting on certificate to proceed, additional cp related delays below</li> <li>resubmit bid package can potentially cause major delays if the bid package needs to be submitted several times</li> <li>responding consultant request</li> <li>requested cp see above breakdown postponed time acco</li> <li>opening postponed time</li> <li>open bid bid</li> <li>omb reviewed ewa see below 2, potential delay with office of management and budget?</li> <li>omb reviewed approval</li> <li>omb requested cp see above re cp</li> <li>issue associated pql</li> <li>institution ddc manage</li> <li>cp sent omb see above</li> <li>call entire basement</li> <li>budget cp sent issues with the budget?</li> <li>brought light walkthrough</li> <li>breakdown requested contractor</li> <li>breakdown area cp see above re cp</li> <li>breakdown area consultant</li> <li>sub took long a straightforward delay, someone or something took longer</li> </ul>	<ul> <li>project move fy to fiscal year 2024</li> <li>procurement delay due new system passport</li> <li>delay due new</li> <li>due new system</li> <li>new system passport</li> <li>bid open date the bid open date is delayed</li> <li>contract register ntp Notice to Proceed</li> <li>register ntp issue</li> <li>cp approval omb Office of Management and Budgt approved in another fiscal year</li> <li>rei procurement delay</li> <li>cp approval delay</li> <li>cp submit omb Dut to waiting approval by office of management and budget</li> <li>move bid date</li> <li>amend design cp</li> <li>rei task order</li> <li>eo due diligence EO102- due diligence memo</li> <li>due diligence memo</li> <li>bid opening postpone</li> <li>opening postpone due</li> <li>postpone due omb Office of Management and Budget</li> <li>due omb pause Office of Management and Budget</li> <li>omb pause outbreak</li> <li>revision buffer surface Revisions to the buffer surface grade as</li> </ul>

		requested by DDC Public Buildings.  buffer surface grade surface grade request grade request ddc request ddc public ddc public building bid open move open move due
Build (Construction and Closeout)	<ul> <li>time extension approval</li> <li>approved time extension</li> <li>approved delay associated</li> <li>fire alarm device     Wireless fire alarm devices are     missing. Contractor is not sure     when they will be delivered.</li> <li>deteriorated collapsed sewer     Dorm 1- Excavate to expose     existing deteriorated and collapsed     sewer mains. This additional work     was needed to complete the original     scope.</li> <li>court did not decide if the will     install fire alarm devices on     courtroom and lobby which will     affect the contractor planning for     work.</li> <li>install fire alarm</li> <li>device courtroom lobby</li> <li>contractor planning work     Court did not decide if they will     install fire alarm devices on     courtroom and lobby which will     affect the contractor planning for     work.</li> <li>fire alarm system     Pending FDNY inspection date of     the newly installed fire alarm     system.</li> <li>decide install fire</li> <li>alarm device courtroom</li> <li>affect contractor planning</li> <li>part approved time</li> <li>court decide install</li> </ul>	<ul> <li>facility direct interference</li> <li>con edison electric</li> <li>direct interference propose</li> <li>con edison gas</li> <li>new gas main Replace new gas main</li> <li>contractor stop work</li> <li>trunk water main</li> <li>con edison facility Con edison Relocation</li> <li>stop work due</li> <li>interference propose city</li> <li>contractor hand dig</li> <li>con edison electrical</li> <li>due gas cross</li> <li>work due hpd Due HPD funding shortage</li> <li>due phd funding</li> <li>hpd funding shortage</li> <li>edison electric facility</li> <li>religious holiday per</li> <li>national grid interference</li> <li>gas cross electrical</li> <li>cross electrical duct</li> <li>contractor schedule support</li> <li>water main installation</li> <li>gas main installation</li> <li>due inclement weather</li> <li>electric facility direct</li> </ul>

- delay associated work
- lobby affect contractor
- construction start date rescheduled
- item part approved
- work included item
- associated work included
- included item part
- supply chain issue
- site safety plan needs revision or not submitted
- shaft work ccds
- partial stop work
   A partial stop work order was issued by DDC Safety. Contractor must submit SSP and JHA.
- fuel oil tank
   This leak prevented us from
   waterproofing the existing slab of
   the fuel oil tank room. The
   approved delays associated with this
   item are included in the approved
   Time Extension #1 approval.
- work ccds lpc
   Shaft A work 22% 22.00 ccds.
   LPC Approved changes space designs reconfiguration. 55% 55.00 ccds.
- wireless fire alarm
   PAA for the wireless fire alarm
   drawings is not approved by FDNY
   yet.
- space design reconfiguration

- contractor decide work contractor decided not to work
- excavation safety alert
- ave due gas
   41st to 44th Street b/n
   1 Ave to 4 Ave due to gas crossing and electrical ducts.
- stop work order

# **Top 30 4-gram Frequency**

The extension to 4-gram frequency reduces duplication and related terms. For example, during the design phase, the 4-gram approach combines the trigram keywords ('initial construction cp' and 'design initial construction') into the complete phrase 'design initial construction cp.' Similarly, 'phase admin building' and 'work phase admin' are combined into 'work phase admin building'. This extension effectively eliminates redundant terms and enhances the specificity of keyword analysis.

Phase	Public Building	Infrastructure
Design (Design and Initiation)	<ul> <li>amended design initial construction</li> <li>updated lno required fdny</li> <li>design initial construction cp, refer to delayed in approval of design intial construction cp request</li> <li>revised reflect delay caused</li> <li>schedule revised reflect delay</li> <li>sponsor agency delayed provide</li> <li>delayed provide updated lno</li> <li>agency delayed provide updated</li> <li>work phase admin building, related to add in design requested by DOT</li> <li>provide updated lno required</li> <li>ddc design procurement team</li> <li>staff shortage finance procurement</li> <li>revise procurement jocs mwbe, related to updated requirement to meet MWBE</li> <li>submitted ddc review due</li> <li>finance procurement unit unable</li> <li>ddc review due staff</li> <li>approval coordination sponsor dhs</li> <li>cp submitted ddc review</li> <li>procurement unit unable review</li> <li>review due staff shortage</li> <li>fdny approval coordination sponsor</li> <li>shortage finance procurement unit unit due staff shortage</li> <li>fdny approval coordination sponsor</li> <li>shortage finance procurement unit due staff shortage</li> <li>fdny approval coordination sponsor</li> <li>shortage finance procurement unit odue staff shortage finance</li> <li>dd submission found unsatisfactory</li> <li>completion cd document submission</li> <li>lno required fdny filling</li> </ul>	legacy project pre fep     Legacy project / Pre -FEP.     Project start date input was draft CPI received date.     project pre fep project     pre fep project start     fep project start date     project start date input     start date input draft     date input draft cpi     input draft cpi receive     draft cpi receive date     dep revise contract language     project roll fy sponsor     Sponsor agency moved to fiscal year 24/25     roll fy sponsor agency     fy approve april plan     project move fy fy     actual design completion date     problem new system passport     scope change bioswales porous     Scope change from     Bioswales to Porous pavement generated the need for complete design change.     change bioswales porous pavement     bioswales porous pavement generate     porous pavement generate need complete     generate need complete design change.     rediction of the provided pr

	<ul> <li>external factor relating public</li> <li>delay attributed consultant submitting</li> <li>reflect delay caused external</li> <li>unsatisfactory pushed back schedule, refer to Obra's D and DD submission</li> </ul>	<ul> <li>design task order procurement</li> <li>post construction storm water the project now requires post construction storm water management</li> <li>construction storm water management</li> <li>storm water management practice</li> <li>project design completion date</li> <li>design completion delay due</li> <li>due property acquisition process</li> </ul>
Bid (Construction Procurement)	<ul> <li>abated architectural drawing ceiling lots of keywords related to ceiling, see 4 below</li> <li>basement ceiling abated architectural</li> <li>ceiling abated architectural drawing</li> <li>ceiling abatement consultant revise</li> <li>ceiling include spot abatement</li> <li>happened fcb review awarded fcb acronym?</li> <li>changed open bid bid changes cause delays</li> <li>client institution ddc manage</li> <li>code drawing delaying consultant straightforward delay with work taking longer</li> <li>sent omb cp returned see above, cp issue</li> <li>securing additional funding needed additional funding needed to proceed</li> <li>package revision consultant needed see below re consultant</li> <li>funding needed registration supplemental</li> </ul>	<ul> <li>procurement delay due new Rei procurement delay due to new system passport</li> <li>delay due new system</li> <li>due new system passport</li> <li>contract register ntp issue Notice to Proceed</li> <li>rei procurement delay due</li> <li>eo due diligence memo EO-102 due diligence memo</li> <li>bid opening postpone due by omb  Office of Management and Budget pause</li> <li>opening postpone due omb</li> <li>postpone due omb pause</li> <li>due omb pause outbreak</li> <li>revision buffer surface grade</li> <li>buffer surface grade request Revisions to the buffer surface grade as requested by DDC Public Buildings.</li> <li>surface grade request ddc</li> <li>grade request ddc public</li> <li>request ddc public building</li> <li>bid open move due</li> </ul>

	<ul> <li>packaging unit caught legal legal issues?</li> <li>forgot two rfis latest</li> <li>consultant dga included electrical</li> <li>consultant needed time revision see below, delays caused by additional time/work needed by consultant</li> <li>consultant request update ada</li> <li>consultant revise basement ceiling</li> <li>consultant sub took long</li> <li>consultant submitting bid set</li> <li>consultant working area breakdown</li> <li>rfis forgot two rfis</li> <li>revision consultant needed time</li> <li>revise basement ceiling include see above ceiling keywords</li> <li>hold dcla private design dcla?</li> <li>hold due cp omb</li> <li>opening postponed time acco is acco an acronym?</li> <li>omb requested cp breakdown see above, cp related issue</li> <li>bid drawing bid packaging</li> </ul>	<ul> <li>open move due original Bid Opening was moved to due the original Bid Opening date being after a major holiday at the request of potential bidders.</li> <li>move due original bid</li> <li>due original bid open</li> <li>original bid open date</li> <li>bid open date major</li> <li>open date major holiday</li> <li>date major holiday request major holiday request potential</li> <li>holiday request potential bidder</li> <li>bid open date postpone The Bid Opening date had to be postponed due to an MWBE issue.</li> <li>open date postpone due</li> <li>date postpone due mwbe</li> <li>postpone due mwbe issue</li> <li>revise ntp issue utility</li> </ul>
Build (Construction and Closeout)	<ul> <li>approved time extension approval</li> <li>part approved time extension</li> <li>affect contractor planning work         Court did not decide if the will install fire alarm devices on courtroom and lobby which will affect the contractor planning for work.     </li> <li>courtroom lobby affect contractor</li> <li>fire alarm device courtroom Court did not decide if they will install fire alarm devices</li> </ul>	<ul> <li>facility direct interference propose</li> <li>contractor stop work due Due hpd funding shortage</li> <li>direct interference propose city</li> <li>stop work due hpd</li> <li>work due hpd funding</li> <li>due hpd funding shortage</li> <li>con Edison electric facility</li> <li>due gas cross electrical gas crossing and electrical ducts</li> <li>gas cross electrical duct</li> <li>con Edison facility direct</li> </ul>

- on courtroom and lobby which will affect the contractor planning for work.
- device courtroom lobby affect
- alarm device courtroom lobby
- approved delay associated work
- court decide install fire
- install fire alarm device
- decide install fire alarm
- lobby affect contractor planning
- delay associated work included
- associated work included item
- included item part approved
- work included item part
- item part approved time
- shaft work ccds lpc
   Shaft A work 22% 22.00
   ccds. LPC Approved changes
   space designs
   reconfiguration. 55% 55.00
   ccds.
- existing deteriorated collapsed sewer
- space design reconfiguration ccds
- change space design reconfiguration
- approved change space design
- fund ca phase loring
   Now their contract with LiRo
   has ended for CD phase and
   they are requesting additional
   funds for CA phase.
- work ccds lpc approved
- ccds lpc approved change
- submission rejected nd submission
- st submission rejected nd
- expose existing deteriorated collapsed
   Dorm 1- Excavate to expose existing deteriorated and

collapsed sewer mains. This

- ave due gas cross
- edison facility direct interference
- gas main currently directThe gas mains are currently in direct interference with the new sewer layout.
- catch basin chute connection
- electric facility direct interference
- new gas main installation
- con Edison utility interference
- interference propose city dwm Con Edison Electric and Gas facilities in direct interference with proposed City 12-in DWM
- edison electric facility direct
- con Edison ddc issue Con Edison and DDC has issued excavation safety alert
- edison ddc issue excavation
- ddc issue excavation safety
- issue excavation safety alert
- notice condition cause delay
- contractor schedule support con
   The contractor was
  - scheduled to support ConEdison other services
- schedule support con edison
- work perform outside section
- perform outside section U
- religious holiday per councilman
   Religious Holiday - As per Councilman Deutsch
   Request
- holiday per councilman deutsch

additional work was needed to complete the original scope.  • lpc approved change space • deteriorated collapsed sewer main	
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# **Key Findings:**

- Some keywords may be referencing acronyms so need to clarify those to further dig into these keywords as well.
- Delays can also be related to more straightforward reasons, as some roadmapped tasks can take longer than initially anticipated.
- Delay causes also vary by each division during each phase.

#### **Public Building Division:**

- Design phase:
  - In design phase, delays are mainly due to delay in approval requests including add-in to design phase requested by DOT, delayed in FDNY approval, bid packaging review, rejection of certified to proceed request, change and update rule requirement (MWBE).

#### • Bid phase:

- A lot of the delays in the "Bid" phase for Public Buildings are related to the Certificate to Process. Is this a residual effect from issues with the CP during the "Design" phase?
- A lot of the delays in the "Bid" phase for Public Buildings seem to be attributed to consultants either requesting additional information or needing to complete additional work.

#### • Build phase:

- A lot of delays are approved through time extension requests.
- From many projects, it can be found that the installation, absence, or inspection of fire alarm systems has a significant impact on work schedule.

#### **Infrastructure Division:**

Design phase:

- A lot of delays seem to be related to the project being transferred to another fiscal year.
- Many delays require waiting for the receipt of the draft CPI before they can begin.

#### Bid phase:

- A lot of delays seem to be related to the project being transferred to another fiscal year.
- Many delays might be caused by technical issues with the new PASSport Procurement System.

#### • Build phase:

- There are numerous infrastructure delays in Con Edison, which indicates that energy-related projects may often experience construction delays.
- A lot of delays seem to be related to some direct interference to the construction.
- Many contractors stop working due to various funding shortages.

#### **Key Differences:**

#### • Design phase:

- The main cause of delay in public buildings related to fire prevention and fire safety (FDNY) approval, design initial cp request and sponsor agency delay.
   Procurement. Problems in procurement are more likely to occur in public building division, such as staff shortage in DDC procurement team and revise procurement from jocs to mwbe.
- On the other hand, delays in infrastructure are mainly due to front end planning, sponsor agency and scope change from Bioswales to Porous pavement.

#### • Bid phase:

 Public Buildings has more delays related to the Certificates to Proceed and consultants than Infrastructure.

#### • Build phase:

 Comparing the two divisions, delays in Public Buildings are more related to some necessary facilities such as fire alarm systems, which aligns with the construction process of public buildings, while those in Infrastructure are more related to some unavoidable interference because many of them are energy-related.

# **Key Similarities:**

- Design phase:
  - Both Public Buildings and Infrastructure face delays due to design add-in requests and policy/requirements revision and update.
- Bid phase:
  - OMB (Office of Management and Budget) appear in several keywords
  - CP is mentioned a few times in Infrastructure, but appears more frequently in Public Buildings.
- Build phase:
  - Both Public Buildings and Infrastructure have delays caused by the schedule of contractors being affected.

# **7.2 POS**

# **Top 30 3-grams Frequency:**

Phase	Public Building	Infrastructure
Design (Design and Initiation)	Phase Admin Building Phase (NNP): noun Admin (NNP): noun Building (NNP): noun LNO required FDNY LNO (NNP): noun required (VBD): verb FDNY (NNP): noun Schedule revised reflect schedule (NN): noun revised (VBD): verb reflect (JJ): other Revised reflect delay revised (VBD): verb reflect (JJ): other delay (NN): noun Reflect delay caused reflect (JJ): other delay (NN): noun Reflect delay (NN): noun required	project move fy  Project(NN): noun  move(VBD): verb  fy(NNP): noun  the project moved to another fiscal year  legacy project pre  legacy(JJ):adj  project(NN):noun  pre(JJ):adj  project pre fep  project(NN):noun  pre(JJ):adj  FEP(NNP):noun  pre fep project  pre(JJ):adj  FEP(NNP):noun  pre fep project  project(NN):noun  pre fep project  pre(JJ):adj  FEP(NNP):noun  project(NN):noun  project(NN):noun

- updated (JJ): other
- LNO (NNP): noun
- required (VBD): verb

#### Initial construction CP

- initial (JJ): other
- construction (NN): noun
- CP (NNP): noun

## Bid Packaging review

- Bid (NNP): noun
- Packaging (NNP): noun
- review (NN): noun

# Consultant submitting incomplete

- consultant (NN): noun
- submitting (VBG): verb
- incomplete (JJ): other

### FDNY Approval coordination

- FDNY (NNP): noun
- Approval (NNP): noun
- coordination (NN): noun

# Approval coordination Sponsor

- Approval (NNP): noun
- coordination (NN): noun
- Sponsor (NNP): noun

#### Coordination Sponsor DHS

- coordination (NN): noun
- Sponsor (NNP): noun
- DHS (NNP): noun

#### Design initial construction

- design (NN): noun
- initial (JJ): other
- construction (NN): noun

#### **CP** submitted **DDC**

- CP (NNP): noun
- submitted (VBD): verb
- DDC (NNP): noun

#### Submitted DDC review

- submitted (VBD): verb
- DDC (NNP): noun
- review (NN): noun

#### DDC review Due

- DDC (NNP): noun
- review (NN): noun
- Due (NNP): noun

#### Review Due staff

- review (NN): noun
- Due (NNP): noun

#### • start(VB): verb

# This project is either a Legacy project or Pre Front ending plan.

# project start date

- project(NN):noun
- start(VB): verb
- date(NN): noun

# Start date moved to another fiscal year.

#### start date input

- start(VB): verb
- date(NN): noun
- input(VBD): verb

#### date input draft

- date(NN): noun
- input(VB): verb
- draft(NN):noun

# input draft cpi

#### draft cpi receive

- draft(NN):noun
- cpi(NNP): noun
- receive(VB):verb

# cpi receive date

- cpi(NNP):noun
- receive(VB):verb
- date(NN):noun

# Project start date input was draft CPI received date.

# design completion date

- design(NN):noun
- completion(NNP)
- date(NN): noun

#### moved to another date

#### design task order

- design(NN): noun
- task(NN):noun
- order(NN):noun

# Procurement delay

#### project roll fy

- project(NN):noun
- roll(VB):verb
- fy(NNP):noun

# another fiscal year

# dep revise contract

- DEP(NNP):noun
- revise(VB):verb

• staff (NN): noun

Due staff shortage

- Due (NNP): noun
- staff (NN): noun
- shortage (NN): noun

# Staff shortage Finance

- staff (NN): noun
- shortage (NN): noun
- Finance (NNP): noun

#### **Shortage Finance Procurement**

- shortage (NN): noun
- Finance (NNP): noun
- Procurement (NNP): noun

#### Finance Procurement Unit

- Finance (NNP): noun
- Procurement (NNP): noun
- Unit (NNP): noun

#### Procurement Unit unable

- Procurement (NNP): noun
- Unit (NNP): noun
- unable (JJ): other

#### Unit unable review

- Unit (NNP): noun
- unable (JJ): other
- review (NN): noun

# **DDC** Design Procurement

- DDC (NNP): noun
- Design (NNP): noun
- Procurement (NNP): noun

#### Design Procurement team

- Design (NNP): noun
- Procurement (NNP): noun
- team (NN): noun

#### Delay attributed consultant

- Delay (NNP): noun
- attributed (VBD): verb
- consultant (NN): noun

# Attributed consultant submitting

- attributed (VBD): verb
- consultant (NN): noun
- submitting (VBG): verb

# Submitting incomplete CD

- submitting (VBG): verb
- incomplete (JJ): other
- CD (NNP): noun

#### Incomplete CD specification

• contract(NN):noun

revise contract language

- revise(VB):verb
- contract(NN):noun
- language(NN):noun

#### fy sponsor agency

- fy(NNP): noun
- sponsor(NNP):noun
- agency(NNP):noun

# Moved to another fy by sponsor agency

#### actual design completion

- actual(JJ):adj
- design(VB):verb
- completion(NN):noun

### revised due to rebid

design service suspend

- design (VB):verb
- service(NN):noun
- suspend(VBD):verb

#### move project fy

- move(VB): verb
- project(NN):noun
- fy(NNP):noun

#### move fy fy

#### from one fiscal year to another

- move(VB): verb
- fy(NNP):noun
- fy(NNP):noun

#### roll fy sponsor

- Roll (VB): verb
- fy(NNP):noun
- sponsor((NN):noun

#### april plan project

- april(NNP):noun
- plan(VB):verb
- project(NN):noun

# The project moved to another fiscal year on april 2022.

#### acquisition process project

- acquisition(NN):noun
- process(NN):noun
- project(NN):noun

Delay caused the project in acquisition process.

put project onhold

	<ul> <li>specification (NN): noun</li> <li>CD specification estimate</li> <li>CD (NNP): noun</li> <li>specification (NN): noun</li> <li>estimate (NN): noun</li> </ul>	<ul> <li>onhold(JJ):adj</li> <li>dep request add</li> <li>DEP(NNP):noun</li> <li>request(VB):verb</li> <li>add(VB):verb</li> <li>DEP request to add additional language on the contract.</li> <li>problem new system</li> <li>problem(NN):noun</li> <li>new(JJ):adj</li> <li>system(NN):noun</li> <li>new(JJ):adj</li> <li>system(NN):noun</li> <li>new(JJ):adj</li> <li>system(NN):noun</li> <li>passport(NNP):noun</li> <li>problem with the new system</li> <li>called passport</li> <li>scope change bioswales</li> <li>scope(NN):noun</li> <li>change(VB):verb</li> <li>bioswales(NNP):noun</li> </ul>
(Construction Procurement)	site safety plan:  site (NN): noun safety (NN): noun plan (NN): noun abated architectural drawing: abated (VBN): verb architectural (JJ): adjective drawing (NN): noun bpl lighting consultant: bpl (NNP): proper noun lighting (NN): noun consultant (NN): noun sub responding consultant: sub (NN): noun responding (VBG): verb consultant (NN): noun spot abatement abatement: spot (NN): noun abatement (NN): noun sponsor delay securing: sponsor (NN): noun	project move fy:

- delay (NN): noun
- securing (VBG): verb

# resubmitted budget cp:

- resubmitted (VBD): verb
- budget (NN): noun
- cp (NN): noun

#### resubmit bid package:

- resubmit (VB): verb
- bid (NN): noun
- package (NN): noun

# responding consultant request:

- responding (VBG): verb
- consultant (NN): noun
- request (NN): noun

#### requested cp see:

- requested (VBD): verb
- cp (NN): noun
- see (VB): verb

# opening postponed time:

- opening (NN): noun
- postponed (VBN): verb
- time (NN): noun

#### open bid bid:

- open (JJ): adjective
- bid (NN): noun
- bid (NN): noun

#### omb reviewed ewa:

- omb (NNP): proper noun
- reviewed (VBD): verb
- ewa (NN): noun

#### omb review approval:

- omb (NNP): proper noun
- review (NN): noun
- approval (NN): noun

#### omb requested cp:

- omb (NNP): proper noun
- requested (VBD): verb
- cp (NN): noun

#### issue associated pql:

- issue (NN): noun
- associated (VBN): verb
- pql (NN): noun

#### institution ddc manage:

- institution (NN): noun
- ddc (NNP): proper noun
- manage (VBP): verb

#### • register(VB):verb

• ntp(NN):noun

#### register ntp issue

- register(VB):verb
- ntp(NN):noun
- issue(NN):noun

# cp approval omb

- cp(NN):noun
- approval(NN):noun
- omb(NN):noun

#### Rei procurement delay

- rei(NNP):noun
- procurement(NN): noun
- delay(NN):noun

#### cp approval delay

- cp(NN):noun
- approval(NN):noun
- delay(NN):noun

## cp submit omb

- cp(NN):noun
- submit(VB):verb
- omb(NN):noun

#### move bid date

- move(VB):verb
- bid(NN):noun
- date(NN)noun

#### amend design cp

- amend(VB):verb
- design(NN):noun
- cp(NN):noun

#### rei task order

- rei(NNP):noun
- task(NN):noun
- order(NN):noun

#### eo due diligence

- eo(NN):noun
- due(NN):noun
- diligence(NN):noun

#### due diligence memo

- due(NN):noun
- diligence(NN):noun
- memo(NN):noun

#### bid open postpone

- bid(NN):noun
- open(VB):verb
- postpone(VB):verb

#### cp sent omb:

- cp (NN): noun
- sent (VBD): verb
- omb (NNP): proper noun

#### call entire basement:

- call (NN): noun
- entire (JJ): adjective
- basement (NN): noun

#### budget cp sent:

- budget (NN): noun
- cp (NN): noun
- sent (VBD): verb

# brought light walkthrough:

- brought (VBD): verb
- light (NN): noun
- walkthrough (NN): noun

#### breakdown requested contractor:

- breakdown (NN): noun
- requested (VBD): verb
- contractor (NN): noun

#### breakdown area cp:

- breakdown (NN): noun
- area (NN): noun
- cp (NN): noun

#### breakdown area consultant:

- breakdown (NN): noun
- area (NN): noun
- consultant (NN): noun

#### open postpone due

- open(VB):verb
- postpone(VB):verb
- due(JJ):adj

#### postpone due omb

- postpone(VB):verb
- due(JJ):adi
- omb(NN):noun

#### omb pause outbreak

- omb(NN):noun
- pause(VB):verb
- outbreak(NN):noun

#### revision buffer surface

- revision(NN):noun
- buffer(NN):noun
- surface(NN):noun

#### buffer surface grade

- buffer(NN):noun
- surface(NN):noun
- grade(NN):noun

#### surface grade request

- surface(NN):noun
- grade(NN):noun
- request(NN):noun

#### grade request ddc

- grade(NN):noun
- request(NN):noun
- ddc(NN):noun

#### request ddc public

- request(NN):noun
- ddc(NN):noun
- public(JJ):adj

#### ddc public building

- ddc(NN):noun
- public(JJ):adj
- building(NN):noun

#### bid open move

- bid(NN):noun
- open(VB):verb
- move(VB):verb

# open move due

- open(VB):verb
- mover(VB):verb
- due(JJ):adj

#### move due original

• move(VB):verb

		<ul><li>due(JJ):adj</li><li>original(JJ):adj</li></ul>
Build (Construction and Closeout)	time extension approval  time (NNP): noun  extension (NNP): noun  approval (NN): noun  fire alarm device  fire (NN): noun  alarm (NN): noun  device (NN): noun  court decide install  court (NNP): noun  decide (VBP): verb  install (JJ): other  decide install fire  decide (VBP): verb  install (JJ): other  fire (NN): noun  install fire alarm  install (JJ): other  fire (NN): noun  alarm (NN): noun  alarm (NN): noun  alarm device courtroom  alarm (NN): noun  device (NN): noun  courtroom (NN): noun  courtroom (NN): noun  courtroom (NN): noun  courtroom lobby  device (NN): noun  courtroom lobby affect  courtroom (NN): noun  lobby (NN): noun  affect (JJ): other  lobby affect contractor  lobby (NN): noun  affect (JJ): other  contractor (NN): noun  affect (JJ): other  contractor (NN): noun	facility direct interference
	<ul> <li>planning (NN): noun</li> <li>contractor planning work</li> <li>contractor (NN): noun</li> <li>planning (NN): noun</li> </ul>	relocation of Con Edison facility stop work due  stop (VB):verb work(VB):verb
	Preming (111), noun	- ""

• work (NN): noun

Court did not decide if they will install fire alarm devices on courtroom and lobby which will affect the contractor planning for work.

approved delay associated

- approved (VBD): verb
- delay (NN): noun
- associated (VBN): verb

part approved time

- part (NN): noun
- approved (VBD): verb
- time (NNP): noun

approved time extension

- approved (VBD): verb
- time (NNP): noun
- extension (NNP): noun

Delay in EOR to Provide Sketch for RFI # 37 & 39: A/EOR answered RFI 37 and 39 regarding existing sanitary, condensate and steam lines in the way of the fuel oil tank room but did not provide a sketch two months after the RFI was answered. The approved delays associated with this item are included in the approved Time Extension #1 approval.

delay associated work

- delay (NN): noun
- associated (VBN): verb
- work (NN): noun

associated work included

- associated (VBN): verb
- work (NN): noun
- included (VBD): verb

work included item

- work (NN): noun
- included (VBD): verb
- item (NNP): noun

included item part

- included (VBD): verb
- item (NNP): noun
- part (NN): noun

item part approved

- item (NNP): noun
- part (NN): noun

• due(VBD):verb stop work due to heat contingency interference propose city

- interference(NN):noun
- propose(VBD): verb
- city(NN):noun

contractor hand dig

- Contractor (NNP):noun
- Hand(NN):noun
- dig(VB):verb

con edison electrical

- con-edison(NNP):
- electric(NN):noun

work due hpd due hpd funding

- due(VBD):verb
- HPD(NNP):noun
- funding(NN):noun

due to HPD funding shortage hpd funding shortage

- HPD(NNP):noun
- funding(NN):noun
- shortage(NNP):noun gas main install
  - Gas (NN):noun
  - main(NN):noun
  - install(VB):verb

religious holiday per

- religious(JJ):adj
- holiday(NN):noun

religious holiday as per DDC national grid interference

- national(JJ):adj
- grid(NN):noun
- interference(NN):noun

due gas crossing

- due(VBD):verb
- gas(NN):noun
- crossing(VBG):verb

gas crossing electrical

- gas(NN):noun
- crossing(VBD):verb
- electrical(JJ):adj

crossing electrical duct

crossing(VBD):verb

- approved (VBD): verb construction start date rescheduled
  - construction (NN): noun
  - start (NN): noun
  - date (NN): noun

#### fuel oil tank

- fuel (NN): noun
- oil (NN): noun
- tank (NN): noun

This leak prevented us from waterproofing the existing slab of the fuel oil tank room. The approved delays associated with this item are included in the approved Time Extension #1 approval.

#### shaft work ccds

- shaft (NNP): noun
- work (NN): noun
- ccds (NN): noun

# work ccds lpc

- work (NN): noun
- ccds (NN): noun
- lpc (NNP): noun

Shaft A work – 22% - 22.00 ccds. LPC Approved changes – space designs reconfiguration. 55% 55.00 ccds.

- expose existing deteriorated
  - expose (VBD): verb
  - existing (VBG): verb
  - deteriorated (VBN): verb

#### existing deteriorated collapsed

- existing (VBG): verb
- deteriorated (VBN): verb
- collapsed (JJ): other

#### deteriorated collapsed sewer

- deteriorated (VBN): verb
- collapsed (JJ): other
- sewer (NN): noun
- collapsed sewer main

#### conapsed sewer main

- collapsed (JJ): other
- sewer (NN): noun
- main (JJ): other

# complete original scope

- complete (JJ): other
- original (JJ): other
- scope (NN): noun

- electrical(JJ):adj
- duct(NN):noun

due to gas crossing and electrical ducts

#### contractor schedule support

- contractor(NNP):noun
- schedule(VBD):verb
- support(VBD):verb

The contractor was scheduled to support Con Edison.

#### water main installation

- water(NN):noun
- main(NN):noun
- install(VBD):verb

#### due inclement weather

- due(VBD): verb
- inclement(JJ):ADJ
- weather(NN):noun

#### edison facility direct

- con-edison(NNP)noun
- facility(NN):noun
- direct(JJ):adj

#### contractor decide work

- contractor(NN):noun
- decide(VBD:verb
- work(VBD):verb

Contractor decided not to work.

#### excavation safety alert

- Excavation (NN):noun
- safety(NN):noun
- alert(NN):noun

#### ave due gas

- Ave (NNP):noun
- due(VBD):verb
- gas(NN):noun

41st to 44th Street b/n 1 Ave to 4 Ave due to gas crossing and electrical ducts.

#### stop work order

- Stop(VB):verb
- work(NN):noun
- order(NN):noun

NYCDDC or Con-Edison stopped work order.

Dorm 1 - Excavate to expose existing deteriorated and collapsed sewer mains. This additional work was needed to complete the original scope. construction staging area • construction (NN): noun • staging (VBG): verb • area (NN): noun Staging area usage by DHS; West courtyard was taken over by DHS for parking. Contractually this area is designated as construction staging area and allowing general public access for parking creates various liability issues. NSP has claimed delay regarding access to the construction staging area. The approved delays associated with this work are included with Item #7 and are part of the approved Time Extension #1 approval. fund CA phase • fund (NN): noun • CA (NNP): noun • phase (NN): noun

#### **Top 30 4-grams Frequency:**

The extension to 4-gram frequency reduces duplication and related terms. For example, during the design phase, the 4-grams approach combines the two trigram keywords ('initial construction cp' and 'design initial construction') into the complete phrase 'design initial construction cp'. This extension effectively eliminates redundant terms and enhances the specificity of keyword analysis.

Phase	Public Building	Infrastructure
Design (Design and Initiation)	schedule revised reflect delay	legacy project pre fep     legacy(JJ):adj     project(NN):noun     pre(JJ):adj     FEP(NNP):noun

- revised (VBD): verb
- reflect (JJ): other
- delay (NN): noun
- caused (VBD): verb

# updated LNO required FDNY

- updated (JJ): other
- LNO (NNP): noun
- required (VBD): verb
- FDNY (NNP): noun

#### FDNY Approval coordination Sponsor

- FDNY (NNP): noun
- Approval (NNP): noun
- coordination (NN): noun
- Sponsor (NNP): noun

#### Approval coordination Sponsor DHS

- Approval (NNP): noun
- coordination (NN): noun
- Sponsor (NNP): noun
- DHS (NNP): noun

#### design initial construction CP

- design (NN): noun
- initial (JJ): other
- construction (NN): noun
- CP (NNP): noun

#### CP submitted DDC review

- CP (NNP): noun
- submitted (VBD): verb
- DDC (NNP): noun
- review (NN): noun

submitted DDC review Due, related to the next 7 4-grams word, due to staff shortage, Finance and Procurement unit was unable to review the CP submitted

- submitted (VBD): verb
- DDC (NNP): noun
- review (NN): noun
- Due (NNP): noun

#### DDC review Due staff

- DDC (NNP): noun
- review (NN): noun
- Due (NNP): noun
- staff (NN): noun

#### review Due staff shortage

- review (NN): noun
- Due (NNP): noun
- staff (NN): noun

# Legacy project / Pre -FEP. Project start date input was draft CPI received date.

#### project pre fep project

- project(NN):noun
- pre(JJ):adj
- FEP(NNP):noun
- project(NN):noun

## pre fep project start

- pre(JJ):adj
- FEP(NNP):noun
- project(NN):noun
- start(VBD):verb

# fep project start date

- FEP(NNP):noun
- project(NN):noun
- start(VBD):verb
- date(NN):noun

## project start date input

- project(NN):noun
- start(VBD):verb
- date(NN):noun
- input(VBD): verb

#### start date input draft

- start(VBD):verb
- date(NN): noun
- input(VBD): verb
- draft(NN):noun

#### date input draft cpi

- date(NN): noun
- input(VBD): verb
- draft(NN):noun
- cpi(NNP): noun

#### input draft cpi receive

- input(VBD): verb
- draft(NN):noun
- cpi(NNP): noun
- receive(VBD):verb

#### draft cpi receive date

- draft(NN):noun
- cpi(NNP): noun
- receive(VBD):verb
- date(NN):noun

# dep revise contract language

- DEP(NNP):noun
- revise(VBD):verb

• shortage (NN): noun

Due staff shortage Finance

- Due (NNP): noun
- staff (NN): noun
- shortage (NN): noun
- Finance (NNP): noun

Staff shortage Finance Procurement

- staff (NN): noun
- shortage (NN): noun
- Finance (NNP): noun
- Procurement (NNP): noun

Shortage Finance procurement Unit

- shortage (NN): noun
- Finance (NNP): noun
- Procurement (NNP): noun
- Unit (NNP): noun

Finance Procurement Unit unable

- Finance (NNP): noun
- Procurement (NNP): noun
- Unit (NNP): noun
- unable (JJ): other

Procurement Unit unable review

- Procurement (NNP): noun
- Unit (NNP): noun
- unable (JJ): other
- review (NN): noun

DDC Design Procurement team

- DDC (NNP): noun
- Design (NNP): noun
- Procurement (NNP): noun
- team (NN): noun

Delay attributed consultant submitting

- Delay (NNP): noun
- attributed (VBD): verb
- consultant (NN): noun
- submitting (VBG): verb

Attributed consultant submitting incomplete

- attributed (VBD): verb
- consultant (NN): noun
- submitting (VBG): verb
- incomplete (JJ): other

Consultant submitting incomplete CD, refer to incomplete 75% CD's, specification and estimate

• consultant (NN): noun

- contract(NN):noun
- language(NNP):noun

project roll fy sponsor

- project(NN):noun
- Roll (VBD): verb
- fy(NNP):noun
- sponsor((NN):noun

Sponsor agency moved to fiscal year 24/25

roll fy sponsor agency

- Roll (VBD): verb
- fy(NNP):noun
- sponsor((NN):noun
- agency(NN):noun

project move fy fy

- project(NN):noun
- move(VBD): verb
- fy(NNP):noun
- fy(NNP):noun

actual design completion date

- actual(JJ):adj
- design(VBD):verb
- completion(NN):noun
- date(NN):noun

problem new system passport

- problem(NN):noun
- new(JJ):adj
- system(NN):noun
- passport(NNP):noun

scope change bioswales porous

- scope(NN):noun
- change(VBD):verb
- bioswales(NNP): noun
- Porous (JJ):adj

Scope change from Bioswales to Porous pavement generated the need for complete design change. change bioswales porous pavement

- change(VBD):verb
- bioswales(NNP):noun
- Porous (JJ):adj
- pavement(NN):noun

bioswales porous pavement generate

• bioswales(NNP):noun

- submitting (VBG): verb
- incomplete (JJ): other
- CD (NNP): noun

# Submitting incomplete CD specification

- submitting (VBG): verb
- incomplete (JJ): other
- CD (NNP): noun
- specification (NN): noun

## Incomplete CD specification estimate

- incomplete (JJ): other
- CD (NNP): noun
- specification (NN): noun
- estimate (NN): noun

# Delay completion CD document

- Delay (NNP): noun
- completion (NN): noun
- CD (NNP): noun
- document (NN): noun

#### Completion CD document submission

- completion (NN): noun
- CD (NNP): noun
- document (NN): noun
- submission (NN): noun

#### Obra DD Submission found

- Obra (NNP): noun
- DD (NNP): noun
- submission (NN): noun
- found (VBD): verb

#### DD submission found unsatisfactory

- DD (NNP): noun
- submission (NN): noun
- found (VBD): verb
- unsatisfactory (JJ): other

#### Submission found unsatisfactory pushed

- submission (NN): noun
- found (VBD): verb
- unsatisfactory (JJ): other
- pushed (VBN): verb

#### Found unsatisfactory pushed back

- found (VBD): verb
- unsatisfactory (JJ): other
- pushed (VBN): verb
- back (RP): other

# Unsatisfactory pushed back schedule, refer to Obra's D and DD submission

• unsatisfactory (JJ): other

- Porous (JJ):adj
- pavement(NN):noun
- generate(VBD):verb

# porous pavement generate need

- Porous (JJ):adj
- pavement(NN):noun
- generate(VBD):verb
- need(VBD):verb

# pavement generate need complete

- pavement(NN):noun
- generate(VBD):verb
- need(VBD):verb
- complete(VBD):verb

# generate need complete design

- generate(VBD):verb
- need(VBD):verb
- complete(VBD):verb
- design(NN):noun

## need complete design change

- need(VBD):verb
- complete(VBD):verb
- design(NN):noun
- change(VBD):verb

# design task order procurement

- Design(VBD):verb
- task(NN):noun
- order(NN):noun
- procurement(NN)noun

# post construction storm water

- post(JJ):adj
- construction(NN):noun
- storm(NN):noun
- water(NN):noun

# construction storm water management

- construction(NN):noun
- storm(NN):noun
- water(NN):noun
- management(NN)

# storm water management practice

- storm(NN):noun
- water(NN):noun
- management(NN)
- practice(NN):noun

	<ul> <li>pushed (VBN): verb</li> <li>back (RP): other</li> <li>schedule (NN): noun</li> <li>Obra proving inefficient managing</li> <li>Obra (NNP): noun</li> <li>proving (VBG): verb</li> <li>inefficient (JJ): other</li> <li>managing (VBG): verb</li> <li>Proving inefficient managing coordination</li> <li>proving (VBG): verb</li> <li>inefficient (JJ): other</li> <li>managing (VBG): verb</li> <li>Coordination (NNP): noun</li> </ul>	the project now requires post construction stormwater management project design completion date
Bid (Construction Procurement)	basement ceiling abated architectural:	procurement delay due new

- abatement (NN): noun happened fcb review awarded:
  - happened (VBD): verb, past tense
  - fcb (NN): noun
  - review (NN): noun
- awarded (VBD): verb, past tense changed open bid bid:
  - changed (VBD): verb
  - open (JJ): adjective
  - bid (NN): noun

client institution ddc manage:

- client (NN): noun
- institution (NN): noun
- ddc (NNP): proper noun
- manage (VBN): verb

code drawing delaying consultant:

- code (NN): noun
- drawing (NN): noun
- delaying (VBG): verb
- consultant (NN): noun

sent omb cp returned:

- sent (VBD): verb, past tense
- omb (NN): noun
- cp (NN): noun
- returned (VBD): verb

securing additional funding needed:

- securing (VBG): verb, gerund/present participle
- additional (JJ): adjective
- funding (NN): noun
- needed (VBD): verb

package revision consultant needed:

- package (NN): noun
- revision (NN): noun
- consultant (NN): noun
- needed (VBD): verb

funding needed registration supplemental:

- funding (NN): noun
- needed (VBD): verb
- registration (NN): noun
- supplemental (JJ): adjective

packaging unit caught legal:

- packaging (NN): noun
- unit (NN): noun

• register(VB):verb rei procurement delay due

- rei(NNP):noun
- procurement(NN): noun
- dely(NN):noun
- due(JJ):adj

eo due diligence memo

- eo(NN):noun
- due(JJ):adj
- diligence(NN):noun
- memo(NN):noun

bid open postpone due

- bid(NN):noun
- open(VB):verb
- postpone(VB):verb
- due(JJ):adj

open postpone due omb

- open(VB):verb
- postpone(VB):verb
- due(JJ):adj
- omb(NN):noun

postpone due omb pause

- postpone(VB):verb
- due(JJ):adj
- omb(NN):noun
- pause(NN):noun

due omb pause outbreak

- due(JJ):adi
- omb(NN):noun
- pause(NN):noun
- outbreak(NN):noun

revision buffer surface grade

- revision(NN):noun
- buffer(NN):noun
- surface(NN):noun
- grade(NN):noun

buffer surface grade request

- buffer(NN):noun
- surface(NN):noun
- grade(NN):noun
- request(NN):noun

surface grade request ddc

- surface(NN):noun
- grade(NN):noun
- request(NN):noun
- ddc(NNP):noun

- caught (VBD): verb
- legal (JJ): adjective

forgot two rfis latest:

- forgot (VBD): verb, past tense
- two (CD): cardinal number
- rfis (NNS): noun, plural
- latest (JJS): adjective

consultant dga included electrical:

- consultant (NN): noun
- dga (NN): noun
- included (VBN): verb
- electrical (JJ): adjective

consultant needed time revision:

- consultant (NN): noun
- needed (VBD): verb
- time (NN): noun
- revision (NN): noun

consultant request update ada:

- consultant (NN): noun
- request (NN): noun
- update (NN): noun
- ada (NN): noun

consultant revise basement ceiling:

- consultant (NN): noun
- revise (VB): verb
- basement (NN): noun
- ceiling (NN): noun

consultant sub took long:

- consultant (NN): noun
- sub (NN): noun
- took (VBD): verb
- long (JJ): adjective

consultant submitting bid set:

- consultant (NN): noun
- submitting (VBG): verb
- bid (NN): noun
- set (NN): noun

consultant working area breakdown:

- consultant (NN): noun
- working (VBG): verb
- area (NN): noun
- breakdown (NN): noun

rfis forgot two rfis:

- rfis (NNS): noun, plural
- forgot (VBD): verb
- two (CD): cardinal number

grade request ddc public

- grade(NN):noun
- request(NN):noun
- ddc(NNP):noun
- public(JJ):adj

request ddc public building

- request(NN):noun
- ddc(NNP):noun
- public(JJ):adj
- building(NN):noun

bid opening move due

- bid(NN):noun
- opening(NN):noun
- move(VB):verb
- due(JJ):adj

opening move due original

- opening(NN):noun
- move(VB):verb
- due(JJ):adj
- original(JJ):adj

move due original bid

- move(VB):verb
- due(JJ):adj
- original(JJ):adj
- bid(NN):noun

due original bid open

- due(JJ):adj
- original(JJ):adj
- bid(NN):noun
- open(NN):noun

original bid open date

- original(JJ):adj
- bid(NN):noun
- open(NN):noun
- date(NN):noun

bid open date major

- bid(NN):noun
- open(NN):noun
- date(NN):noun
- major(JJ):adj

open date major holiday

- open(NN):noun
- date(NN):noun
- major(JJ):adj
- holiday(NN):noun

date major holiday request

	<ul><li>rfis (NNS): noun, plural</li></ul>	• date(NN):noun
	revision consultant needed time:	<ul><li>major(JJ):adj</li></ul>
	• revision (NN): noun	<ul><li>holiday(NN):noun</li></ul>
	• consultant (NN): noun	<ul><li>request(NN):noun</li></ul>
	<ul><li>needed (VBD): verb</li></ul>	major holiday request potential
	• time (NN): noun	<ul><li>major(JJ):adj</li></ul>
	revise basement ceiling include:	<ul><li>holiday(NN):noun</li></ul>
	<ul><li>revise (VB): verb</li></ul>	<ul><li>request(NN):noun</li></ul>
	<ul> <li>basement (NN): noun</li> </ul>	<ul><li>potential(JJ):adj</li></ul>
	<ul><li>ceiling (NN): noun</li></ul>	holiday request potential bidder
	<ul><li>include (VB): verb</li></ul>	<ul><li>holiday(NN):noun</li></ul>
	hold dcla private design:	<ul><li>request(NN):noun</li></ul>
	<ul><li>hold (VB): verb</li></ul>	<ul><li>potential(JJ):adj</li></ul>
	• dcla (NN): noun	• bidder(NN):noun
	<ul> <li>private (JJ): adjective</li> </ul>	bid opening date postpone
	• design (NN): noun	• bid(NN):noun
	hold due cp omb:	<ul><li>opening(NN):noun</li></ul>
	<ul><li>hold (VB): verb</li></ul>	• date(NN):noun
	• due (JJ): adjective	<ul><li>postpone(NN):noun</li></ul>
	• cp (NN): noun	opening date postpone due
	• omb (NN): noun	<ul><li>opening(NN):noun</li></ul>
	opening postponed time acco:	<ul><li>date(NN):noun</li></ul>
	<ul><li>opening (VBG): verb</li></ul>	<ul><li>postpone(NN):noun</li></ul>
	<ul> <li>postponed (VBD): verb, past</li> </ul>	• due(JJ):adj
	tense	date postpone due mwbe
	• time (NN): noun	<ul><li>date(NN):noun</li></ul>
	<ul> <li>acco (NNP): proper noun</li> </ul>	<ul><li>postpone(NN):noun</li></ul>
	omb requested cp breakdown:	• due(JJ):adj
	• omb (NN): noun	• mwbe(NN):noun
	<ul> <li>requested (VBD): verb, past</li> </ul>	postpone due mwbe issue
	tense	<ul><li>postpone(NN):noun</li></ul>
	• cp (NN): noun	• due(JJ):adj
	<ul> <li>breakdown (NN): noun</li> </ul>	• mwbe(NN):noun
	bid drawing bid packaging:	• issue(NN):noun
	• bid (NN): noun	revise ntp issue utility
	<ul><li>drawing (NN): noun</li></ul>	<ul><li>revise(VB):verb</li></ul>
	<ul><li>packaging (NN): noun</li></ul>	• ntp(NN):noun
		• issue(NN):noun
		<ul><li>utility(NN):noun</li></ul>
Build	court decide install fire	facility direct interference propose
(Construction	• court (NNP): noun	• facility(NN):noun
and Closeout)	• decide (VBP): verb	• direct(JJ):adj
and Closcout)	• install (JJ): other	• interference(NN):noun
	• fire (NN): noun	<ul><li>propose(VB): verb</li></ul>
	decide install fire alarm	contractor stop work due
	decide mount me didin	confidence stop work due

- decide (VBP): verb
- install (JJ): other
- fire (NN): noun
- alarm (NN): noun

#### install fire alarm device

- install (JJ): other
- fire (NN): noun
- alarm (NN): noun
- device (NN): noun

## fire alarm device courtroom

- fire (NN): noun
- alarm (NN): noun
- device (NN): noun
- courtroom (NN): noun

## alarm device courtroom lobby

- alarm (NN): noun
- device (NN): noun
- courtroom (NN): noun
- lobby (NN): noun

#### device courtroom lobby affect

- device (NN): noun
- courtroom (NN): noun
- lobby (NN): noun
- affect (JJ): other

# courtroom lobby affect contractor

- courtroom (NN): noun
- lobby (NN): noun
- affect (JJ): other
- contractor (NN): noun

#### lobby affect contractor planning

- lobby (NN): noun
- affect (JJ): other
- contractor (NN): noun
- planning (NN): noun

# affect contractor planning work

- affect (JJ): other
- contractor (NN): noun
- planning (NN): noun
- work (NN): noun

Court did not decide if the will install fire alarm devices on courtroom and lobby which will affect the contractor planning for work.

# part approved time extension

- part (NN): noun
- approved (VBD): verb

- contractor(NNP):noun
- stop(VB):verb
- work(VB):verb
- due(JJ):adi

# Due hpd funding shortage

direct interference propose city

- direct(JJ):adj
- interference(NN):noun
- propose(VB): verb
- city(NN):noun

#### stop work due hpd

- stop (VB):verb
- work(VB):verb
- due(VB):verb
- HPD(NNP):noun

## work due hpd funding

- work(VB):verb
- due(VBD):verb
- HPD(NNP):noun
- funding(NN):noun

# due hpd funding shortage

- due(JJ):adi
- HPD(NNP):noun
- funding(NN):noun
- shortage(NN):noun

## con edison electric facility

- con-edison(NNP):noun
- electric(NN):noun
- facility(NN):noun

## due gas crossing electrical

- due(VBD):verb
- gas(NN):noun
- crossing(VBD):verb
- electrical(JJ):adj

#### gas crossing electrical duct

- gas(NN):noun
- crossing(VBD):verb
- electrical(JJ):adj
- duct(NN):noun

#### con edison facility direct

- con-edison(NNP):
- facility(NN):noun
- direct (JJ): adj

edison facility direct interference

- time (NNP): noun
- extension (NNP): noun approved time extension approval
  - approved (VBD): verb
  - time (NNP): noun
  - extension (NNP): noun
  - approval (NN): noun

Delay in EOR to Provide Sketch for RFI # 37 & 39: A/EOR answered RFI 37 and 39 regarding existing sanitary, condensate and steam lines in the way of the fuel oil tank room but did not provide a sketch two months after the RFI was answered. The approved delays associated with this item are included in the approval.

delay associated work included

- delay (NN): noun
- associated (VBN): verb
- work (NN): noun
- included (VBD): verb

associated work included item

- associated (VBN): verb
- work (NN): noun
- included (VBD): verb
- item (NNP): noun

work included item part

- work (NN): noun
- included (VBD): verb
- item (NNP): noun
- part (NN): noun

included item part approved

- included (VBD): verb
- item (NNP): noun
- part (NN): noun
- approved (VBD): verb

item part approved time

- item (NNP): noun
- part (NN): noun
- approved (VBD): verb
- time (NNP): noun

Staging area usage by DHS; West courtyard was taken over by DHS for parking. Contractually this area is designated as construction staging area

- con-edison(NNP): noun
- facility(NN):noun
- direct (JJ): adj
- interference(NN):noun

new gas main instal

- new(JJ):adj
- gas(NN):noun
- main(NN):noun
- instal(VBD):verb

ave due gas crossing

- Ave (NNP):noun
- due(VBD):verb
- gas(NN):noun
- crossing(VBG):verb

1st to 44th Street b/n 1 Ave to 4 Ave due to gas crossing and electrical ducts.

gas main currently direct

- gas(NN):noun
- main(NN):noun
- currently(RB): adv
- Direct (JJ) adj

The gas mains are currently in direct interference with the new sewer layout.

catch basin chute connection

- catch(VBD):verb
- basin(NN):noun
- chute (NN):noun
- connection(NN):noun

electric facility direct interference

- electric(JJ):adj
- facility(NN):noun
- direct(JJ):adj
- interference(NN):noun

con edison utility interference

- con-edison(NNP):Noun
- utility(NN):noun
- interference(NN):noun

interference propose city dwm

- direct(JJ):adi
- interference(NN):noun
- propose(VBD): verb
- DWM(NNP):noun

and allowing general public access for parking creates various liability issues. NSP has claimed delay regarding access to the construction staging area. The approved delays associated with this work are included with Item #7 and are part of the approved Time Extension #1 approval.

shaft work ccds LPC

- shaft (NNP): noun
- work (NN): noun
- ccds (NN): noun
- LPC (NNP): noun

expose existing deteriorated collapsed

- expose (VBD): verb
- existing (VBG): verb
- deteriorated (VBN): verb
- collapsed (JJ): other

Dorm 1- Excavate to expose existing deteriorated and collapsed sewer mains. This additional work was needed to complete the original scope.

existing deteriorated collapsed sewer

- existing (VBG): verb
- deteriorated (VBN): verb
- collapsed (JJ): other
- sewer (NN): noun

deteriorated collapsed sewer main

- deteriorated (VBN): verb
- collapsed (JJ): other
- sewer (NN): noun
- main (JJ): other

Dorm 1 - Excavate to expose existing deteriorated and collapsed sewer mains. This additional work was needed to complete the original scope. approved delay associated work

proved deray associated work

- approved (VBD): verb
- delay (NN): noun
- associated (VBN): verb
- work (NN): noun

fund ca phase loring

- fund (NN): noun
- ca (NNP): noun
- phase (NN): noun
- loring (NNP): noun

Con Edison Electric and Gas facilities in direct interference with proposed City 12-in DWM

edison electric facility direct

- con-edison(NNP):noun
- electric(JJ):adj
- facility(NN):noun
- direct(JJ):adj

con edison DDC issue

- con-edison(NNP):noun
- DDC(NNP):noun
- issue(NN):noun

Con Edison and DDC has issued excavation safety alert

edison ddc issue excavation

- con-edison(NNP):noun
- DDC(NNP):noun
- issue(NN):noun
- Excavation (NN):noun ddc issue excavation safety
  - DDC(NNP):noun
  - issue(NN):noun
  - Excavation (NN):noun
  - Safety (NN):noun

issue excavation safety alert

- issue(NN):noun
- Excavation (NN):noun
- Safety (NN):noun
- alert(NN):NOUN

notice condition cause delay

- notice(VBD):verb
- condition(NN):noun
- cause(VBD):verb
- delay(VBD):verb

DDC notice causing delay contractor schedule support con

- contractor(NNP):noun
- schedule(VBD):verb
- support(VBD):verb
- con-edison(NNP):noun

work perform outside section

- work(NN):noun
- perform(VBD):verb
- outside(JJ) adj
- section(NN):non

Now their contract with LiRo has ended for CD phase and they are requesting additional funds for CA phase.

work ccds LPC approved

- work (NN): noun
- ccds (NN): noun
- LPC (NNP): noun
- approved (NNP): noun

ccds LPC approved change

- ccds (NN): noun
- LPC (NNP): noun
- approved (NNP): noun
- change (NN): noun

LPC approved change space

- LPC (NNP): noun
- approved (NNP): noun
- change (NN): noun
- space (NN): noun

approved change space design

- approved (NNP): noun
- change (NN): noun
- space (NN): noun
- design (NN): noun

change space design reconfiguration

- change (NN): noun
- space (NN): noun
- design (NN): noun
- reconfiguration (NN): noun

space design reconfiguration ccds

- space (NN): noun
- design (NN): noun
- reconfiguration (NN): noun
- ccds (NN): noun

Shaft A work – 22% - 22.00 ccds. LPC Approved changes – space designs reconfiguration. 55% 55.00 ccds.

extended closeout period corrected

- extended (VBN): verb
- closeout (NNP): noun
- period (NN): noun
- corrected (VBD): verb

closeout period corrected schedule

- closeout (NNP): noun
- period (NN): noun
- corrected (VBD): verb
- schedule (NN): noun

religious holiday per councilman

- religious(JJ):adj
- holiday(NN):noun
- councilman(NN): noun

Religious Holiday - As per Councilman Deutsch Request extended closeout period and corrected schedule

## **Key Findings:**

- Some keywords may be referencing acronyms so need to clarify those to further dig into these keywords as well.
- Delays can also be related to more straightforward reasons, as some roadmapped tasks can take longer than initially anticipated.
- Delay causes also vary by each division during each phase.

## **Public Building Division:**

- Design Phase:
  - In the design phase, delays are mainly due to delay in approval requests including delayed in FDNY approval, bid packaging review, rejection of certified to proceed request. There are new delay causes that appear in top 30 in POS, which are 'Obra's D and DD submission were found unsatisfactory and pushed back the schedule'. Some delays caused in top 30 by Bag-of-Words approach that don't appear in top 30 using POS are change and update rule requirement (MWBE), and add-in design requested by DOT.

#### • Bid Phase:

- A lot of the delays in the "Bid" phase for Public Buildings are related to the Certificate to Process. Is this a residual effect from issues with the CP during the "Design" phase?
- A lot of the delays in the "Bid" phase for Public Buildings seem to be attributed to consultants either requesting additional information or needing to complete additional work.

#### • Build Phase:

- Many delays are approved through time extension requests. They are related to RFI, DHS, accidental leak, space designs reconfiguration, etc.
- From many projects, it can be found that the installation, absence, or inspection of fire alarm systems has a significant impact on work schedule.

Other delays are related to additional work caused by pipeline aging, rescheduled
construction start date, the application for additional funding for the new phase of
the contract, and the extended closeout period and corrected schedule.

#### **Infrastructure Division:**

## Design Phase:

- A lot of delays seem to be related to the project being transferred to another fiscal year.
- Other delays are related to legacy projects, the receipt of the draft CPI,
   procurement delay, moving by the sponsor agency, rebid, acquisition process,
   technical issues such as passport, etc.

#### • Bid Phase:

- A lot of delays seem to be related to the project being transferred to another fiscal year.
- Many delays might be caused by technical issues with the new PASSport Procurement System.
- Some delays are related to the opening of bids and the bidding process, like "bid open postpone."

#### • Build Phase:

- A lot of delays seem to be related to some direct interference to the construction.
- There are many infrastructure delays in Con Edison, which indicates that energyrelated projects may often experience construction delays.
- Many contractors stop working due to various funding shortages.

## **Key Differences:**

## • Design Phase:

 The main cause of delay in public buildings related to fire prevention and fire safety (FDNY) approval, design initial cp request and sponsor agency delay.
 Procurement. Problems in procurement are more likely to occur in the public building division, such as staff shortage in the DDC procurement team.  On the other hand, delays in infrastructure are mainly due to legacy projects or Pre-front end planning which probably needs to be revised, scope change by sponsor agency, and incomplete scope change, one highlighted example is Bioswales to Porous pavement.

#### • Bid Phase:

• Public Buildings has more delays related to the Certificates to Proceed and consultants than Infrastructure.

#### Build Phase:

 Comparing the two divisions, delays in Public Buildings are more related to some necessary facilities such as fire alarm systems and pipelines, which aligns with the construction process of public buildings, while those in Infrastructure are more related to some unavoidable interference because many of them are energyrelated.

# **Key Similarities:**

- Design Phase:
  - Both Public Buildings and Infrastructure face delays due to design add-in requests and policy/requirements revision and update.
- Bid Phase:
  - OMB (Office of Management and Budget) appears in several keywords.
  - CP is mentioned a few times in Infrastructure, but appears more frequently in Public Buildings.
- Build Phase:
  - Both Public Buildings and Infrastructure have delays caused by the schedule of contractors being affected.

## 8. Tableau Clustering Analysis

## 8.1 Public Building

**Original Data - Design Phase** 

#### Public Buildings Design Clustering

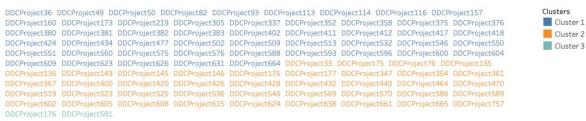
```
DDCProject2 DDCProject31 DDCProject31 DDCProject32 DDCProject42 DDCProject43 DDCProject45
DDCProject47 DDCProject48 DDCProject49 DDCProject50 DDCProject51 DDCProject52 DDCProject54 DDCProject75 DDCProject75 DDCProject81
DDCProject82 DDCProject93 DDCProject95 DDCProject96 DDCProject97 DDCProject113 DDCProject116 DDCProject117 DDCProject118
DDCProject128 DDCProject131 DDCProject132 DDCProject133 DDCProject136 DDCProject140 DDCProject141 DDCProject145
DDCProject146 DDCProject147 DDCProject148 DDCProject150 DDCProject152 DDCProject153 DDCProject154 DDCProject155 DDCProject157
DDCProject160 DDCProject162 DDCProject164 DDCProject164 DDCProject173 DDCProject174 DDCProject176 DDCProject177
DDCProject179 DDCProject182 DDCProject304 DDCProject317 DDCProject351 DDCProject352 DDCProject356 DDCProject357 DDCProject359
DDCProject371 DDCProject375 DDCProject376 DDCProject380 DDCProject380 DDCProject383 DDCProject385 DDCProject386
DDCProject387 DDCProject388 DDCProject399 DDCProject391 DDCProject392 DDCProject393 DDCProject394 DDCProject395 DDCProject396
DDCProject410 DDCProject411 DDCProject412 DDCProject417 DDCProject418 DDCProject422 DDCProject424 DDCProject427
DDCProject428 DDCProject431 DDCProject436 DDCProject437 DDCProject439 DDCProject444 DDCProject445 DDCProject447 DDCProject450
DDCProject454 DDCProject456 DDCProject458 DDCProject461 DDCProject462 DDCProject463 DDCProject465 DDCProject466 DDCProject467
DDCProject476 DDCProject477 DDCProject478 DDCProject479 DDCProject480 DDCProject480 DDCProject502 DDCProject503 DDCProject505
DDCProject506 DDCProject508 DDCProject509 DDCProject511 DDCProject512 DDCProject513 DDCProject516 DDCProject517 DDCProject522
DDCProject524 DDCProject526 DDCProject528 DDCProject529 DDCProject530 DDCProject532 DDCProject537 DDCProject538 DDCProject539
DDCProject549 DDCProject550 DDCProject551 DDCProject554 DDCProject558 DDCProject560 DDCProject562 DDCProject574 DDCProject578
DDCProject581 DDCProject585 DDCProject586 DDCProject592 DDCProject594 DDCProject595 DDCProject596 DDCProject599 DDCProject600
DDCProject603 DDCProject604 DDCProject617 DDCProject611 DDCProject613 DDCProject614 DDCProject615 DDCProject617
DDCProject627 DDCProject628 DDCProject629 DDCProject630 DDCProject634 DDCProject636 DDCProject640 DDCProject641 DDCProject647
DDCProject664 DDCProject667 DDCProject668 DDCProject675 DDCProject676 DDCProject679 DDCProject694 DDCProject695 DDCProject675
DDCProject30 DDCProject35 DDCProject36 DDCProject44 DDCProject414 DDCProject114 DDCProject137 DDCProject142 DDCProject144
DDCProject151 DDCProject194 DDCProject195 DDCProject219 DDCProject305 DDCProject353 DDCProject358 DDCProject377 DDCProject381
DDCProject446 DDCProject448 DDCProject459 DDCProject543 DDCProject544 DDCProject556 DDCProject564 DDCProject597 DDCProject597
```

Clusters
Cluster 1
Cluster 2

- Cluster 1: 182 projects
  - Moderate values across all risk subcategories.
  - "1.01 Scope Changes," "1.02 Lack of Definition," and "2.01 Delay by Vendor" are notable but not extreme.
- Cluster 2: 24 projects
  - Higher values for "2.02 Delay by External Stakeholder" and "5.02 Standard Procedures."
- Cluster 2 likely includes projects with more complex external stakeholder interactions or procedural complications.
  - The projects within this cluster relate to DCAS Court Facility, Transportation DOT Facility, Brooklyn Public Library Facility, Queens Public Library Facility, and Cultural Affairs Cultural Facility.

#### **Original Data - Bid Phase**

#### Public Buildings Bid Clustering



- Cluster 1: 50 projects
  - Higher presence of "3.01 Funding" and "6.03 Procurement Management."
  - Moderate occurrences of "2.02 Delay by External Stakeholder" and "6.04 Property Acquisition."

- Cluster 2: 40 projects
  - Significant occurrences of "6.04 Property Acquisition" and "8.01 Market Conditions."
  - Moderate occurrences of "9.05 Health and Safety" and "9.07 Surrounding Structures."
- Cluster 3: 2 projects
  - Very high occurrences for "1.01 Scope Changes."
- Cluster 2 includes projects with significant property acquisition and market conditions concerns, indicating a focus on real estate and economic factors.
  - O The projects within this cluster are related to DCAS Court Facility, Homeless Services Homeless-Related Facility, Health-Related Facility, Brooklyn Public Library Facility, New York Public Library Facility, Queens Public Library Facility, Police Public Safety-Related Facility, Cultural Affairs Cultural Facility, DCAS Court Facility, DCAS City-Owned Building Project, Environmental Protection DEP Facility, Sanitation Facility.

# Original Data - Build Phase

#### Public Buildings Build Clustering



Clusters
Cluster 1
Cluster 2
Cluster 3

- Cluster 1: 243 projects
  - High presence of "4.01 Design Error," "4.03 Construction Quality," and "6.03 Procurement Management."
  - Moderate occurrences of "1.01 Scope Changes," "2.01 Delay by Vendor," and "7.02 Oversight."
- Cluster 2: 23 projects

- Significant occurrences of "2.01 Delay by Vendor," "2.02 Delay by External Stakeholder," "5.02 Standard Procedures," and "1.02 Lack of Definition," "6.03 Procurement Management," and "8.01 Market Conditions,"
- Cluster 3: 6 projects
  - Significant presence of "4.03 Construction Quality," "9.07 Surrounding Structures."
  - Moderate occurrences of "3.01 Funding" and "8.01 Market Conditions."
- Cluster 2 includes projects with significant delays by vendors and external stakeholders.
  - The projects within this cluster relate to DCAS Court Facility, Health-Related Facility, Brooklyn Public Library Facility, New York Public Library Facility, Queens Public Library Facility, Cultural Affairs Cultural Facility, Sanitation Facility.

# **BOW Coded Data - Design Phase**

Public Buildings Design Clustering

DDCProject131 DDCProject35 DDCProject42 DDCProject45 DDCProject45 DDCProject137 DDCProject138 DDCProject146 DDCProject162
DDCProject163 DDCProject317 DDCProject317 DDCProject317 DDCProject317 DDCProject318 DDCProject318 DDCProject319 DDCProject319 DDCProject319 DDCProject319 DDCProject310 DDCPro



- Cluster 1: 34 projects
  - High values for "1.01 Scope Changes," "1.02 Lack of definition," "2.02 Delay by External Stakeholder," "2.99 Other," "4.99 Other," "5.02 Standard Procedures," and "6.03 Procurement Management."
- Cluster 2: 5 projects
  - High values for "1.02 Lack of definition," "2.02 Delay by External Stakeholder,"
     "6.03 Procurement Management."
- Cluster 2 project relate to Brooklyn Public Library Facility and New York Public Library Facility
  - The projects within this cluster are related to Brooklyn Public Library Facility and New York Public Library Facility.

## **BOW Coded Data - Bid Phase**

Public Buildings Bid Clustering

DDCProject114 DDCProject175 DDCProject382 DDCProject383 DDCProject428 DDCProject375 DDCProject550



- Cluster 1: 5 projects
  - High values for "6.03 Procurement Management," "2.02 Delay by External Stakeholder," "3.01 Funding," "2.01 Delay by Vendor."

- Cluster 2: 1 project
  - High values of "6.03 Procurement Management," "2.02 Delay by External Stakeholder," "3.01 Funding," "6.04 Property Acquisition."
- Cluster 3: 1 project
  - High values of "6.03 Procurement Management," "2.01 Delay by Vendor," "2.02 Delay by External Stakeholder," "3.01 Funding," "4.01 Design Error," and "4.03 Construction Quality
- Cluster 1 projects relate to Brooklyn Public Library Facility and New York Public Library Facility.

#### **BOW Coded Data - Build Phase**

# Public Building Build Clustering

DDCProject19 DDCProject20 DDCProject22 DDCProject130 DDCProject134
DDCProject156 DDCProject177 DDCProject347 DDCProject350 DDCProject365
DDCProject371 DDCProject436 DDCProject457 DDCProject461 DDCProject466
DDCProject507 DDCProject582 DDCProject661 DDCProject68 DDCProject21
DDCProject92 DDCProject139 DDCProject475 DDCProject593 DDCProject663
DDCProject672 DDCProject27



- Cluster 1: 20 projects
  - High values for "2.02 Delay by External Stakeholder," "6.02 Change Order Management," "6.03 Procurement Management," "9.01 Environmental Conditions," "9.02 Private Utilities," "9.03 Subsurface Field Conditions," and "9.04 Above Grade Field Condition."
- Cluster 2: 7 projects
  - High values for "1.02 Lack of definition" and "2.02 Delay by External Stakeholder."
- Cluster 3: 1 project
  - High values for "2.99 Other," "2.02 Delay by External Stakeholder," "2.01 Delay by Vendor," "1.02 Lack of Definition," and "4.04 Schedule Quality."
- Cluster 3 contains a value of 99.0 for variable "1.02 Lack of Definition."
  - o Projects in this cluster are related to Court Facility

#### 8.2 Infrastructure

#### **Original Data - Design Phase**

#### Infrastructure Design Clusters

```
DDCProject15 DDCProject56 DDCProject98 DDCProject105 DDCProject106 DDCProject107 DDCProject108 DDCProject110
                                                                                                                  Clusters
DDCProject111 DDCProject120 DDCProject186 DDCProject188 DDCProject197 DDCProject201 DDCProject207 DDCProject209
                                                                                                                  Cluster 1
DDCProject216 DDCProject218 DDCProject222 DDCProject225 DDCProject227 DDCProject228 DDCProject231 DDCProject234
                                                                                                                  Cluster 2
DDCProject245 DDCProject240 DDCProject241 DDCProject242 DDCProject245 DDCProject246 DDCProject248
DDCProject249 DDCProject258 DDCProject264 DDCProject265 DDCProject266 DDCProject272 DDCProject272 DDCProject276
DDCProject282 DDCProject292 DDCProject293 DDCProject294 DDCProject295 DDCProject296 DDCProject321 DDCProject327
DDCProject328 DDCProject329 DDCProject504 DDCProject515 DDCProject531 DDCProject673 DDCProject687 DDCProject689
DDCProject693 DDCProject716 DDCProject734 DDCProject8 DDCProject19 DDCProject11 DDCProject12 DDCProject14
DDCProject16 DDCProject17 DDCProject18 DDCProject58 DDCProject60 DDCProject61 DDCProject83 DDCProject84
DDCProject85 DDCProject86 DDCProject87 DDCProject88 DDCProject89 DDCProject90 DDCProject91 DDCProject103
DDCProject109 DDCProject119 DDCProject121 DDCProject124 DDCProject184 DDCProject185 DDCProject187 DDCProject189
DDCProject190 DDCProject192 DDCProject193 DDCProject198 DDCProject200 DDCProject203 DDCProject204 DDCProject205
DDCProject208 DDCProject212 DDCProject213 DDCProject215 DDCProject217 DDCProject223 DDCProject224 DDCProject226
DDCProject233 DDCProject239 DDCProject243 DDCProject263 DDCProject271 DDCProject273 DDCProject274 DDCProject275
DDCProject277 DDCProject278 DDCProject280 DDCProject281 DDCProject283 DDCProject285 DDCProject286 DDCProject288
DDCProject289 DDCProject290 DDCProject291 DDCProject297 DDCProject298 DDCProject299 DDCProject300 DDCProject301
DDCProject302 DDCProject307 DDCProject308 DDCProject309 DDCProject310 DDCProject311 DDCProject312 DDCProject314
DDCProject315 DDCProject316 DDCProject320 DDCProject330 DDCProject331 DDCProject332 DDCProject333 DDCProject334
DDCProject343 DDCProject340 DDCProject341 DDCProject342 DDCProject343 DDCProject344 DDCProject491
DDCProject495 DDCProject499 DDCProject643 DDCProject654 DDCProject657 DDCProject659 DDCProject660 DDCProject671
DDCProject674 DDCProject684 DDCProject685 DDCProject692 DDCProject696 DDCProject697 DDCProject703
DDCProject708 DDCProject709 DDCProject710 DDCProject711 DDCProject712 DDCProject713 DDCProject714 DDCProject715
DDCProject717 DDCProject719 DDCProject720 DDCProject721 DDCProject723 DDCProject724 DDCProject725 DDCProject731
DDCProject732 DDCProject735 DDCProject736 DDCProject737 DDCProject738 DDCProject740 DDCProject741 DDCProject742
DDCProject743 DDCProject745 DDCProject746 DDCProject747 DDCProject748 DDCProject749 DDCProject750 DDCProject751
DDCProject752 DDCProject753 DDCProject754 DDCProject759
```

- Cluster 1: 145 projects
  - High values for "1.01 Scope Changes," "6.03 Procurement Management," and
     "2.99 Others."
- Cluster 2: 59 projects
  - Moderate to high values for "8.02 Public health Emergency," assuming are projects related with covid-19
- Cluster 2 shows a concern for "8.02 Public Health Emergency"
  - O The projects within this cluster relate to Brooklyn Trunk Water Main, Brooklyn Sanitary Sewer Reconstruction, S. Queens Green Infra Program (GI), Brooklyn Green Infra Program (GI), Manhattan & Citywide Intersection Improvement, Brooklyn Pedestrian Safety, S. Queens School Safety Program, Brooklyn Select Bus Service Impr., Brooklyn Roadway Reconstruction, Brooklyn Streetscape, Brooklyn Vision Zero, Manhattan & Citywide Roadway Reconstruction, Brooklyn Pedestrian Ramp Upgrade- Simple/Complex, S. Queens Pedestrian Ramp Upgrade- Simple/Complex, Manhattan and Citywide Pedestrian Ramps Install Simple/Complex, Brooklyn Plazas, S. Queens Select Bus Service Impr., Brooklyn Sidewalk Maintenance, Brooklyn Trench restoration, S. Queens Trench restoration, Manhattan & Citywide Bulkheads & Outfalls, Manhattan & Citywide Storm Sewer Reconstruction, Brooklyn Streetscape, Brooklyn Combined Sewers, S. Queens New Storm Sewers.

#### Original Data - Bid Phase

#### Infrastructure Bid Clustering

```
Clusters
DDCProject6 DDCProject10 DDCProject11 DDCProject12 DDCProject13 DDCProject17 DDCProject18 DDCProject57
DDCProject58 DDCProject61 DDCProject85 DDCProject99 DDCProject100 DDCProject101 DDCProject102 DDCProject104 DDCProject109
                                                                                                                             Cluster 1
DDCProject122 DDCProject123 DDCProject125 DDCProject126 DDCProject183 DDCProject189 DDCProject191 DDCProject196
                                                                                                                             Cluster 2
DDCProject198 DDCProject199 DDCProject200 DDCProject202 DDCProject206 DDCProject210 DDCProject211 DDCProject215
DDCProject221 DDCProject229 DDCProject230 DDCProject233 DDCProject236 DDCProject237 DDCProject238 DDCProject241
DDCProject247 DDCProject250 DDCProject251 DDCProject252 DDCProject253 DDCProject254 DDCProject255 DDCProject256
DDCProject257 DDCProject258 DDCProject259 DDCProject260 DDCProject261 DDCProject262 DDCProject263 DDCProject268
DDCProject279 DDCProject284 DDCProject287 DDCProject303 DDCProject306 DDCProject307 DDCProject309 DDCProject313
DDCProject315 DDCProject318 DDCProject319 DDCProject320 DDCProject324 DDCProject325 DDCProject326 DDCProject330
DDCProject336 DDCProject339 DDCProject487 DDCProject488 DDCProject489 DDCProject492 DDCProject493 DDCProject494
DDCProject496 DDCProject497 DDCProject498 DDCProject510 DDCProject515 DDCProject531 DDCProject653 DDCProject655
DDCProject656 DDCProject657 DDCProject658 DDCProject680 DDCProject682 DDCProject683 DDCProject686 DDCProject688
DDCProject691 DDCProject692 DDCProject698 DDCProject699 DDCProject700 DDCProject701 DDCProject704 DDCProject705
DDCProject706 DDCProject707 DDCProject713 DDCProject718 DDCProject721 DDCProject722 DDCProject723 DDCProject728
DDCProject730 DDCProject739 DDCProject749 DDCProject749 DDCProject749 DDCProject749 DDCProject16
DDCProject112 DDCProject192 DDCProject204 DDCProject214 DDCProject220 DDCProject232 DDCProject269 DDCProject270
DDCProject271 DDCProject322 DDCProject323 DDCProject490 DDCProject681 DDCProject690 DDCProject720 DDCProject726
DDCProject727 DDCProject729 DDCProject744 DDCProject745 DDCProject755 DDCProject756 DDCProject758
```

- Cluster 1: 119 projects
  - High values for "2.02 Delay by External Stakeholder."
- Cluster 2: 27 projects
  - Moderate to high values for "6.03 Procurement Management."
- Cluster 2 displays a variety of issues including delays, financial constraints and difficulties. The projects grouped in this cluster are associated with several types of facilities: Brooklyn Trunk Water Main, Brooklyn Distribution Water main, Brooklyn Green Infra Program (GI), Brooklyn Vision Zero, Brooklyn Roadway Reconstruction, Manhattan & Citywide Roadway Reconstruction, Brooklyn Pedestrian Ramp Upgrade-Simple/Complex, Brooklyn Sidewalk Maintenance, Manhattan & Citywide Distribution Water main, Manhattan & Citywide Roadway Reconstruction, Brooklyn Combined Sewers, Brooklyn Lining, Staten Island Sewer, Staten Island New Storm Sewers, Manhattan & Citywide TV Inspection of Sewer.

#### Original Data - Build Phase

#### Infrastructure Build Clustering



- Cluster 1: 119 projects
  - o High values for "9.02 Private Utilities" and "9.03 Subsurface Field Conditions."

- Cluster 2: 6 projects
  - o High values for "9.02 Private Utilities" and "9.99 Others"
- Cluster 2 has the highest overall risk profile, with projects showing higher levels of risk
  - The projects within this cluster relate to the Brooklyn Distribution Water main, Manhattan & Citywide Pedestrian Safety, Manhattan & Citywide Distribution Water main, Brooklyn Combined Sewers.

## **BOW Coded Data - Design Phase**

#### Infrastructure Design Clustering

```
DDCProject10 DDCProject11 DDCProject12 DDCProject14 DDCProject16 DDCProject16 DDCProject50 DDCProject58 DDCProject58 DDCProject192

DDCProject204 DDCProject216 DDCProject217 DDCProject327 DDCProject687 DDCProject719 DDCProject720 DDCProject721 DDCProject721

DDCProject723 DDCProject83 DDCProject84 DDCProject85 DDCProject86 DDCProject88 DDCProject120 DDCProject184 DDCProject190

DDCProject213 DDCProject213 DDCProject222 DDCProject239 DDCProject243 DDCProject248 DDCProject248 DDCProject275

DDCProject278 DDCProject281 DDCProject288 DDCProject289 DDCProject308 DDCProject310 DDCProject311 DDCProject314

DDCProject316 DDCProject321 DDCProject320 DDCProject330 DDCProject331 DDCProject333 DDCProject334 DDCProject340 DDCProject3
```

- Cluster 1: 18 projects
  - o High values for "2.99 Others," "1.99 Others"
- Cluster 2: 52 projects
  - Moderate to high values for "3.01 Funding," "3.03 Others," "1.01 Scope Changes" and "2.02 Delay by External Stakeholder."
- Cluster 1 has the highest overall risk profile, with projects showing higher levels of risk
  - The projects within this cluster relate to the Brooklyn Trunk Water Main, Brooklyn Distribution Water main, Brooklyn Sanitary Sewer Reconstruction, Brooklyn Storm Sewer Reconstruction, Brooklyn Vision Zero, Brooklyn Pedestrian Safety, Brooklyn Streetscape, Brooklyn Combined Sewers, Brooklyn New Storm Sewers.

#### **BOW Coded Data - Bid Phase**

Infrastructure Bid Clustering

DDCProject8 DDCProject189 DDCProject257 DDCProject263 DDCProject270 DDCProject279 DDCProject287 DDCProject324 DDCProject325 DDCProject326 DDCProject310 DDCProject740 DDCProject744 DDCProject745 DDCProject748 DDCProject11 DDCProject262 DDCProject515 Cluster 1

• Cluster 1: 15 projects

- High values for "6.03 Procurement Management," "2.02 Delay by External Stakeholder."
- Moderate occurrences are "3.01 Funding," "1.02 Lack of Definition," and "1.01 Scope Changes."
- Cluster 2: 5 projects
  - Notable presence of "6.03 Procurement Management."
  - High values for "2.02 Delay by External Stakeholder" and "2.01 Delay by Vendor."
  - Moderate occurrence for "7.01 Communication."
- Cluster 2 displays a variety of issues including delays, financial constraints, and difficulties. The projects grouped in this cluster are associated with several types of facilities: Brooklyn Trunk Water Main, Brooklyn Pedestrian Ramp Upgrade-Simple/Complex, Brooklyn Bulkheads & Outfalls, Brooklyn Combined Sewers, Manhattan & Citywide TV Inspection of Sewer.

#### **BOW Coded Data - Build Phase**

Infrastructure Build Clustering

```
DDCProject13 DDCProject255 DDCProject493 DDCProject493 DDCProject12 DDCProject17 DDCProject57 DDCProject58 DDCProject61 Clusters

DDCProject126 DDCProject126 DDCProject128 DDCProject120 DDCProject220 DDCProject220 DDCProject220 DDCProject230 DDCProject231 DDCProject230 DDCProject231 DDCProject230 DDCProject231 DDCProject230 DDCProject231 DDCProject230 DDCProject231 DDCProject230 DDCProject230 DDCProject231 DDCProject230 DDCProject230 DDCProject230 DDCProject231 DDCProject230 DDCProject230 DDCProject231 DDCProject230 DDCProject231 DDCProject230 DDCProject231 DDCProject231 DDCProject230 DDCProject231 DDCProject23
```

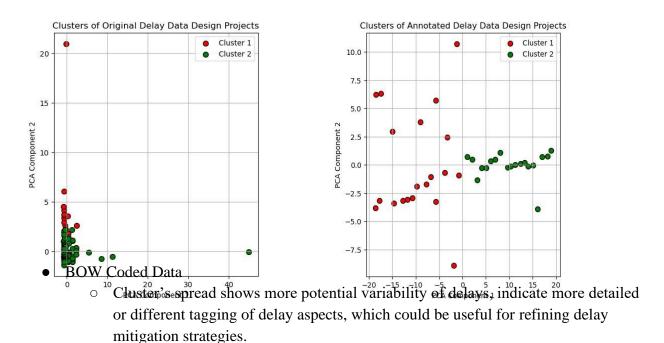
- Cluster 1: 3 projects
  - o Notable presence of "2.01 Delay by Vendor" and "4.04 Schedule Quality."
  - o Moderate values for "9.02 Private Utilities."
- Cluster 2: 37 project
  - High values for "9.02 Private Utilities."
- Cluster 3: 2 projects
  - Notable presence of "2.01 Delay by Vendor," "2.02 Delay by External Stakeholder," and "3.01 Funding."
- Cluster 4: 2 projects
  - High presence of "9.02 Private Utilities."
- Cluster 5: 1 project
  - High presence of "9.02 Private Utilities."
  - Moderate values for "9.03 Subsurface Field Conditions"
- Cluster 5 has the highest overall risk profile, with projects showing higher levels of risk

• The projects within this cluster relate to the Brooklyn Distribution Water Main.

# 9. K-Means Clustering

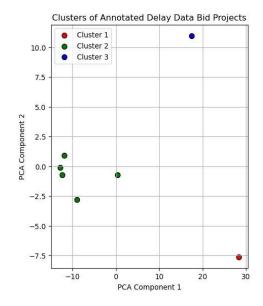
# 9.1 Public Buildings

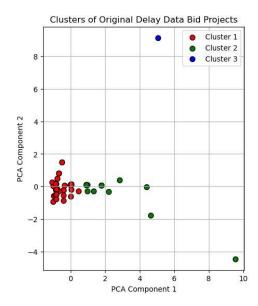
## **Design**



## • Original Data:

- Cluster 1 major delay subcategory: "1.01 Scope Changes."
- o Cluster 2 major delay subcategory: "8.02 Public Health Emergency."
- Majority of projects in cluster 1 faced delay due to scope changes; projects in cluster 2 faced delay issues from external environmental factors.



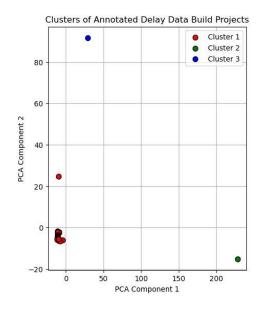


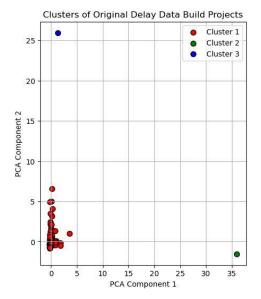
 Clusters show a greater spread and isolation between clusters, indicating more distinct variability among the BOW coded projects.

# • Original Data

- Cluster 1 major delay subcategory: "8.02 Public Health Emergency."
- o Cluster 2 major delay subcategory: "6.03 Procurement Management."
- o Cluster 3 major delay subcategory: "2.01 Delay by Vendor."
- Majority of delays are related to the external environment, particularly public health emergency.

# Build





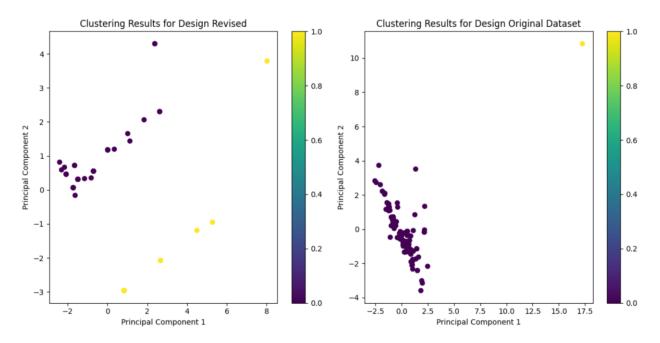
 Clusters show more pronounced dispersion along the axes, suggesting that the annotation process may have identified unique characteristics that the original data's PCA did not capture as distinctly.

# Original Data

- Cluster 1 major delay subcategory: "8.02 Public Health Emergency."
- Cluster 2 major delay subcategory: "9.01 Environmental Conditions."
- o Cluster 3 major delay subcategory: "7.01 Communication."
- Leading delay issue in the majority of these projects is due to public health emergency.

## 9.2 Infrastructure

# Design

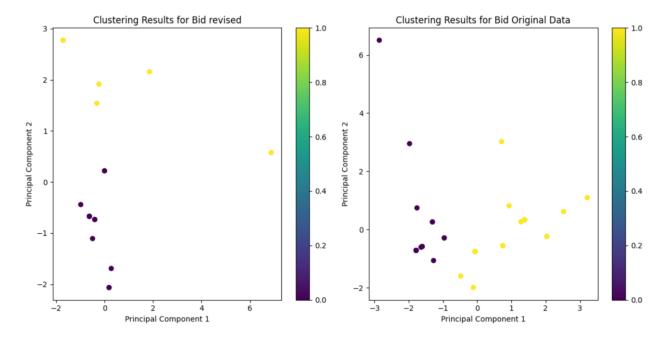


- Cluster 1 major subcategory: "1.01 Scope Changes"
- o Cluster 2 major subcategory: "1.99 Others"

# • Original Data

- Cluster 1 major subcategory: "1.01 Scope Changes"
- o Cluster 2 major subcategory: "8.02 Public Health"
- Lots of projects which should have been labeled as "scope changes" were labelled as "others"
- Public health is mainly correlated with covid, such outliers will disappear less in the future.

# Bid

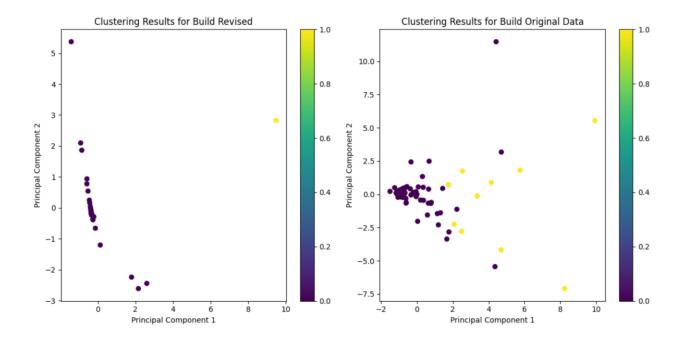


- o Cluster 1 major subcategory: "2.02 Delay by External Stakeholder"
- o Cluster 2 major subcategory: "6.03 Procurement Management"

# • Original Data

- Cluster 1 major subcategory: "2.02 Delay by External Stakeholder"
- Cluster 2 major subcategory: "6.03 Procurement Management"
- There are highly similar characteristics in these two clusters, which means that the classifying methods did a relatively good job in Bid division.

# Build



- Cluster 1 major subcategory: "9.02 Private Utilities"
- o Cluster 2 major subcategory: "3.01 Funding"
- This outlier here is Project 123, which is a railroad reconstruction project in Brooklyn, and is one of the few projects delayed caused by funding shortage in the infrastructure build division. This also caused one of the longest delay periods.

## Original Data

- Cluster 1 subcategory: "9.02 Private Utilities" and "9.03 Subsurface Field Conditions"
- Cluster 2 subcategory: "9.02 Private Utilities" and "9.99 Others"
- Private utilities are the major delay subcategory, most delayed projects in this
  phase experienced "private utilities" issues. Some projects are mislabeled into
  "others" as well, but overall, the classifying is more accurate than in the design
  phase.

# 10. Scope and Limitations

## **10.1 Scope**

 Focuses on construction delays in public buildings and infrastructure projects managed by the NYC DDC.

- Data from the DDC's delay data set is analyzed to identify the main causes of delays, categorized by project type (public building and infrastructure) and construction stage (design, bid, and build).
- Aims to provide insights into the primary causes of delays, enabling the development of targeted strategies to reduce delays and improve project management practices.
- Utilizes text analytics, including Bag-of-Words and clustering, to analyze delay descriptions and identify common themes and patterns.

#### **10.2 Limitations**

- Relies on the accuracy and completeness of the Delay Data set provided by the DDC.
   Any inaccuracies or missing data in this set could impact the validity of the findings.
- Limited to delays recorded by the DDC and may not capture delays that were not properly documented or reported.
- Focuses on delays in public buildings and infrastructure projects in New York City and may not be generalizable to other locations or types of construction projects.
- Might not consider more external factors such as regulatory changes, economic
  conditions, or unforeseen events (except for Covid-19, which was specifically addressed
  by removing related keywords) that may also contribute to construction delays. However,
  Covid-19 related delays were not excluded from original Delay Data for clustering
  analysis.
- The findings and recommendations of this analysis should be interpreted in the context of the specific projects and data analyzed and may not be applicable to all construction projects.
- The dataset is not perfect for clustering because there were only 25-50% of original data kept after completing principal component analysis.