

# Estimating Construction and Demolition Waste in Project Proposals

Columbia University and Lehman College in partnership  
with the New York City Housing Authority

Special thanks to The Gordian Group

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COLUMBIA UNIVERSITY  
IN THE CITY OF NEW YORK



LEHMAN  
COLLEGE



NEW YORK CITY  
HOUSING  
AUTHORITY

THE  
**GORDIAN**  
GROUP®

08/05/2022

# Project Overview

- Given the JOC project proposals, we want to estimate the project's construction and demolition waste.
- In order to achieve this, we need an efficient way of reading project proposal line items and estimating their associated waste.

ITEM	DESCRIPTION OF WORK	QUANTITY	D/I	UNIT	UNIT PRICE	Adjustment Factor	Line Total
<b>01 - General Requirements</b>							
1	Carpenter, Heavy Construction Work	16.00	I	HR	\$129.88	1.2316	\$2,559.36
2	Carpenter, Heavy Construction Work	16.00	I	HR	\$129.88	1.2316	\$2,559.36
3	Certified Industrial Hygienist	8.00	I	HR	\$125.42	1.2316	\$1,235.74
4	Firewatch F01, Fireguard F60	80.00	I	HR	\$25.00	1.2316	\$2,463.20
5	Principal Architect	40.00	I	HR	\$225.00	1.2316	\$11,084.40
6	Principal Engineer	40.00	I	HR	\$200.00	1.2316	\$9,852.80
7	Principal Engineer	52.00	I	HR	\$200.00	1.2316	\$12,808.64
8	Flagperson For Traffic Control	320.00	I	HR	\$76.58	1.2316	\$30,181.10
9	80' Engine Powered, Articulating (Up/Over) Boom Man Lift With Platform	4.00	I	MO	\$5,772.67	1.2316	\$28,438.48
10	2,000 Watt, 115 Volt, 2 Lamp, Portable Light Stand With Tripod	28.00	I	MO	\$317.75	1.2316	\$10,957.55
11	5 Ton, 20' Lift, 2-Speed, 230/460 Volt, 60 Cycle, Electric Chain Hoist	6.00	I	MO	\$575.00	1.2316	\$4,249.02
12	Up To 400#, Manual Swing Roof Hoist	4.00	I	MO	\$685.32	1.2316	\$3,376.16
13	Electrician Minimum Charge	1.00	I	EA	\$1,221.76	1.2316	\$1,504.72
14	Sheet Metal Worker Minimum Charge	1.00	I	EA	\$1,056.79	1.2316	\$1,301.54
15	Bacteria Test (Total Coliform Bacteria And E. Coli Bacteria)	20.00	I	EA	\$29.49	1.2316	\$726.40
16	Temporary 100 Amperes, NEMA 1 Or 3R, Disconnect Switch With Fuses	1.00	I	EA	\$1,577.06	1.2316	\$1,942.31
17	Temporary 100 Amperes, Panelboard Complete With GFCI Circuit Breakers	1.00	I	EA	\$1,567.66	1.2316	\$1,930.73
18	Temporary 200 Amperes, Panelboard Complete With GFCI Circuit Breakers	2.00	I	EA	\$2,253.85	1.2316	\$5,551.68
19	Temporary Branch Circuit Conduit And Wiring For Temporary Disconnect Switches And Temporary	200.00	I	LF	\$7.38	1.2316	\$1,817.84
20	Temporary High Bay Light	42.00	I	EA	\$455.33	1.2316	\$23,552.95
21	Temporary Wood Walkway, 3/4" Plywood On 2 x 6 Stringers	50.00	I	SF	\$5.80	1.2316	\$357.16
22	Temporary Wooden Guardrail, 42" High, Posts, Handrail, And Intermediate Rail	600.00	I	LF	\$34.07	1.2316	\$25,176.37
23	Scaffolding With Bracing Accessories - Area Based On 5' Wide Sections (CCF / Month)	1,920.00	I	CCF	\$21.82	1.2316	\$51,597.14
24	Scaffolding With Bracing Accessories - Area Based On 3' Wide Sections (CCF / Month)	6.00	I	CCF	\$32.73	1.2316	\$241.86
25	For Up To 25, Add	6.00	I	MOD	\$13.09	1.2316	\$96.73
26	Up To 20' Height Scaffolding Initial Erection And Final Dismantling, Per CCF Of Scaffolding And Accessori	31.50	I	CCF	\$59.29	1.2316	\$2,300.18
27	>80' Height Scaffolding Initial Erection And Final Dismantling, Per CCF Of Scaffolding And Accessories	640.00	I	CCF	\$112.65	1.2316	\$88,793.43
28	Netting for Exterior Building Scaffolding	281.25	I	CSF	\$32.50	1.2316	\$11,257.59
29	10 Mil, Fire Retardant, Reinforced, Plastic Sheeting, Applied To Scaffolding	2,150.00	I	SF	\$0.83	1.2316	\$2,197.79
30	Temporary Metal Door And Frame	1.00	I	EA	\$626.32	1.2316	\$771.38
31	Installation of Heavy Duty Steel Post And Beam Sidewalk Bridge Assembly	200.00	I	LF	\$189.74	1.2316	\$46,736.76
32	For Each Additional Foot Over 8' Wide, Add	1,600.00	I	MOD	\$3.00	1.2316	\$5,911.68
33	For Each Additional Foot Over 8' High, Add	800.00	I	MOD	\$2.00	1.2316	\$1,970.56
34	Monthly Rental Of Up To 8' Wide, 8' - 12' High, 2 Post System, Heavy Duty Steel Post And Beam	600.00	I	LF	\$9.66	1.2316	\$7,138.35
35	Monthly Rental of Netting for Sidewalk Bridge	600.00	I	LF	\$1.61	1.2316	\$1,189.73
36	Removal of Heavy Duty Steel Post And Beam Sidewalk Bridge Assembly	200.00	I	LF	\$39.49	1.2316	\$9,727.18
37	For Each Additional Foot Over 8' Wide, Add	1,600.00	I	MOD	\$1.25	1.2316	\$2,463.20

# Methods

In order to convert the catalog, we wrote a Python algorithm (now on GitHub) which performs the following steps

1. Does a raw conversion of the PDF into a CSV.
2. Breaks the CSV up by line, then separates line items from unit types and other information.
3. Reads the line item to determine material type and size specifications, then determines weight of associated waste.
4. Prints line item, material, and waste to output file.



## 01 General Requirements

### 01 20 Price and Payment Procedures (01)

#### 01 22 Unit Prices (01 20)

##### 01 22 16 Unit Price Payment (01 22)

01 22 16 00-0001	Reimbursable Fees (01 22 16)	
	<i>Note: Reimbursable fees include but are not limited to permits, special inspections, special insurance, additional warranties, tolls, expedited shipping costs, etc. which are not included in a task or an Adjustment Factor as explained in the Contract or The Construction Task Catalog®.</i>	
01 22 16 00-0002	EA Reimbursable Fees	1.00
	<i>Note: Reimbursable Fees will be paid to the contractor for eligible costs as directed by Owner. Insert the appropriate quantity to adjust the base cost to the actual Reimbursable Fee. If there are multiple Reimbursable Fees, list each one separately and add a comment in the "note" block to identify the Reimbursable Fee (e.g. sidewalk closure, road cut, various permits, extended warranty, expedited shipping costs, etc.). A copy of each receipt shall be submitted with the Price Proposal.</i>	

##### 01 22 20 Wage Rates (01 22)

*Note: All Wage Rates, including modifiers, shall always be multiplied by the Day Shift Monday - Friday Adjustment Factor. Include the appropriate modifiers to adjust the Wage Rates for Shift Differential, Time and One Half, and Double Time.*

##### 01 22 20 00-0001 Local Labor/Wage Rates (01 22 20)

*Note: Welders receive the rate prescribed for the craft performing the operation to which the welding is incidental.*

01 22 20 00-0002	HR Asbestos Handler	82.29
	<i>Note: For tasks not included in the Construction Task Catalog® and as directed by owner only.</i>	
	For Shift Differential, Add	2.00
	For Time And One Half, Add	19.00
	For Double Time, Add	30.00
	For Foreman, Add	4.11
	For Apprentice, Deduct	-10.45
01 22 20 00-0003	HR Boilermaker	135.37
	<i>Note: For tasks not included in the Construction Task Catalog® and as directed by owner only.</i>	
	For Shift Differential, Add	6.60
	For Time And One Half, Add	66.42
	For Double Time, Add	110.00
	For Foreman, Add	6.77
	For Apprentice, Deduct	-27.07
01 22 20 00-0004	HR Bricklayer	123.88
	<i>Note: For tasks not included in the Construction Task Catalog® and as directed by owner only.</i>	
	For Shift Differential, Add	4.00
	For Time And One Half, Add	20.00
	For Double Time, Add	67.04
	For Foreman, Add	5.19
	For Apprentice, Deduct	-24.70
01 22 20 00-0005	HR Carpenter, Building Commercial	126.84
	<i>Note: For tasks not included in the Construction Task Catalog® and as directed by owner only.</i>	
	For Shift Differential, Add	5.00
	For Time And One Half, Add	27.30
	For Double Time, Add	64.76
	For Foreman, Add	6.34
	For Apprentice, Deduct	-26.37
01 22 20 00-0006	HR Carpenter, Heavy Construction Work	136.37
	<i>Note: For tasks not included in the Construction Task Catalog® and as directed by owner only.</i>	
	For Shift Differential, Add	5.00
	For Time And One Half, Add	20.47
	For Double Time, Add	60.00
	For Foreman, Add	5.00
	For Apprentice, Deduct	-27.27
01 22 20 00-0007	HR Carpenter, Sidewalk Shed, Scaffold And Hoist	123.11
	<i>Note: For tasks not included in the Construction Task Catalog® and as directed by owner only.</i>	
	For Shift Differential, Add	4.00
	For Time And One Half, Add	20.00
	For Double Time, Add	62.00
	For Foreman, Add	5.10
	For Apprentice, Deduct	-24.00
01 22 20 00-0008	HR Carpenter - Wood Water Storage Tank Mechanic	74.20
	<i>Note: For tasks not included in the Construction Task Catalog® and as directed by owner only.</i>	
	For Foreman, Add	3.71
	For Apprentice, Deduct	-14.04
	For Shift Differential, Add	2.00
	For Time And One Half, Add	17.00
	For Double Time, Add	36.00
01 22 20 00-0009	HR Carpenter - Wood Water Storage Tank Helper	63.34
	<i>Note: For tasks not included in the Construction Task Catalog® and as directed by owner only.</i>	
	For Foreman, Add	3.17
	For Apprentice, Deduct	-12.07
	For Shift Differential, Add	2.00
	For Time And One Half, Add	14.12
	For Double Time, Add	20.23

# Methods

In order to convert the catalog, we wrote a Python algorithm (now on GitHub) which performs the following steps

1. Does a raw conversion of the PDF into a CSV.
2. Breaks the CSV up by line, then separates line items from unit types and other information.
3. Reads the line item to determine material type and size specifications, then determines weight of associated waste.
4. Prints line item, material, and waste to output file.

```
56 #Break up cell by line
57 for row in range(len(df.index)):
58     curCell=(str.splitlines(str(df.loc[row][0])))
59     #For each line, break up substrings by double space
60     for line in curCell:
61         curSubStrSet=line.split(' ')
62         #For each substring, if substring contains '...', do more
63         lineIdx=-1
64         for curSubStrIdx in range(len(curSubStrSet)):
65             if curSubStrSet[curSubStrIdx]!='':
66                 lineIdx+=1
67                 if lineIdx==2:
68                     #Set Unit
69                     unitIdx=curSubStrIdx-1
70                     while unit == None:
71                         if curSubStrSet[unitIdx]!='':
72                             unit=curSubStrSet[unitIdx].strip()
73                     else:
74                         unitIdx-=1
75                 if unit!=False:
76                     #Set Line Item
77                     lineItem = curSubStrSet[curSubStrIdx].split('...')[0].strip()
78                     #Set Material
79                     for material in materials_set:
80                         if material in lineItem.lower():
81                             curMaterial = material
82                     #Set Weight
83                     weight='WEIGHT'
84                     if curMaterial!='MATERIAL':
85                         weightRow=None
86                         weightColumn=None
87                         for row in range(28):
88                             if curMaterial==str(weights_df.loc[row][0]):
89                                 weightRow=row
90                                 for col in range(6):
91                                     if unit==str(weights_df.loc[0][col]):
92                                         weightColumn=col
93                                     if unit in square_set:
94                                         depth=0
95                                     if '' in lineItem:
96                                         if '/' in lineItem:
97                                             try:
```

# Excel Use

Our final step was to write excel macros to read our waste catalog

J3 : x ✓ fx =INDEX('https://d.docs.live.net/7e1c3008d405868a/PIT-DSC/Edited%20Cost%20Sheets/OneDrive\_1\_7-28-2022/[05WorkCostBreakdownforOMB (16).xls]Sheet2!\$C\$2:\$F\$2357,MATCH(B3,'https://d.docs.live.net/7e1c3008d405868a/PIT-DSC/Edited%20Cost%20Sheets/OneDrive\_1\_7-28-2022/[05WorkCostBreakdownforOMB (16).xls]Sheet2!\$C\$2:\$C\$2357,0),2)

ITEM	DESCRIPTION OF WORK	QUANTITY	D/I	UNIT	UNIT PRICE	Adjustment Factor	Line Total	User Note	Material	Weight	Hazardous	Material Sum
<p>PROJECT MANAGER: [REDACTED]            BID COMPARISON DATE: [REDACTED]            CONTRACT #: GR1925097            ORACLE #:            BID DATE:            TITLE: Interior &amp; Exterior Restoration @ Fredrick Samuel Houses Building #35            DEVELOPMENT: SAMUEL (MHOP)</p>												
<b>01 - General Requirements</b>												
1	Carpenter, Heavy Construction Work	16.00	I	HR	\$129.88	1.2316	\$2,559.36	Probes to verify type 'A' Partition condition.	#N/A	#N/A	#N/A	steel 0
2	Carpenter, Heavy Construction Work	16.00	I	HR	\$129.88	1.2316	\$2,559.36	2 men at 1 day to confirm operation of all windows. report to be issued to client for confirmation	#N/A	#N/A	#N/A	masonry 0
3	Certified Industrial Hygienist	8.00	I	HR	\$125.42	1.2316	\$1,235.74	Asbestos Abatement Plan	#N/A	#N/A	#N/A	gypsum 5.9167
4	Firewatch F01, Fireguard F00	80.00	I	HR	\$25.00	1.2316	\$2,463.20		#N/A	#N/A	#N/A	wood 5.2135
5	Principal Architect	40.00	I	HR	\$225.00	1.2316	\$11,084.40	tpp1	#N/A	#N/A	#N/A	stone 0
6	Principal Engineer	40.00	I	HR	\$200.00	1.2316	\$9,852.80	Design for Sidewalk bridge & scaffold	#N/A	#N/A	#N/A	insulation 2.75
7	Principal Engineer	52.00	I	HR	\$200.00	1.2316	\$12,808.64	Shoring system & plan for stabilization of wood joist removal & replacement	#N/A	#N/A	#N/A	plaster 3.3125
8	Flagperson For Traffic Control	320.00	I	HR	\$76.58	1.2316	\$30,181.10	2 men @ 1 month allowance for flagging deliveries, pedestrian protection during work hours	#N/A	#N/A	#N/A	linoleum 0
9	80' Engine Powered, Articulating (Up/Over) Boom Man Lift With Platform	4.00	I	MO	\$5,772.67	1.2316	\$28,438.48		#N/A	#N/A	#N/A	carpet 0
10	2,000 Watt, 115 Volt, 2 Lamp, Portable Light Stand With Tripod	28.00	I	MO	\$317.75	1.2316	\$10,957.55	2 per floor @ 2 months	#N/A	#N/A	#N/A	glass 0
11	5 Ton, 20' Lift, 2-Speed, 230/460 Volt, 60 Cycle, Electric Chain Hoist	6.00	I	MO	\$575.00	1.2316	\$4,249.02		#N/A	#N/A	#N/A	plastic 0
12	Up To 400#, Manual Swing Roof Hoist	4.00	I	MO	\$685.32	1.2316	\$3,376.16		#N/A	#N/A	#N/A	vinyl 0
13	Electrician Minimum Charge	1.00	I	EA	\$1,221.76	1.2316	\$1,504.72	Confirm operation of existing kitchen exhaust	#N/A	#N/A	#N/A	aluminum 15.70
14	Sheet Metal Worker Minimum Charge	1.00	I	EA	\$1,056.79	1.2316	\$1,301.54	Confirm operation of existing kitchen exhaust	#N/A	#N/A	#N/A	copper 303
15	Bacteria Test (Total Coliform Bacteria And E. Coli Bacteria)	20.00	I	EA	\$29.49	1.2316	\$726.40	10% of the system capacity	#N/A	#N/A	#N/A	rubber 0
16	Temporary 100 Amperes, NEMA 1 Or 3R, Disconnect Switch With Fuses	1.00	I	EA	\$1,577.06	1.2316	\$1,942.31		#N/A	#N/A	#N/A	sand 0
17	Temporary 100 Amperes, Panelboard Complete With GFCI Circuit Breakers	1.00	I	EA	\$1,567.66	1.2316	\$1,930.73		#N/A	#N/A	#N/A	bitumin 0
18	Temporary 200 Amperes, Panelboard Complete With GFCI Circuit Breakers	2.00	I	EA	\$2,253.85	1.2316	\$5,551.68		#N/A	#N/A	#N/A	Total 336.65
19	Temporary Branch Circuit Conduit And Wiring For Temporary Disconnect Switches And Temporary	200.00	I	LF	\$7.38	1.2316	\$1,817.84		#N/A	#N/A	#N/A	
20	Temporary High Bay Light	42.00	I	EA	\$455.33	1.2316	\$23,552.95	6 units per floor x 7 =	#N/A	#N/A	#N/A	
21	Temporary Wood Walkway, 3/4" Plywood On 2 x 6 Stringers	50.00	I	SF	\$5.80	1.2316	\$357.16		#N/A	#N/A	#N/A	
22	Temporary Wooden Guardrail, 42" High, Posts, Handrail, And Intermediate Rail	600.00	I	LF	\$34.07	1.2316	\$25,176.37	4 locations of 5x5 perimeter x 6 levels of protection	wood	2.2344	FALSE	
23	Scaffolding With Bracing Accessories - Area Based On 5' Wide Sections (CCF / Month)	1,920.00	I	CCF	\$21.82	1.2316	\$51,597.14	200lf @ 5x8 = 8000cf x 8 stories = 64,000 x 3 month minimum = 192,000 = 1920ccf	#N/A	#N/A	#N/A	
24	Scaffolding With Bracing Accessories - Area Based On 3' Wide Sections (CCF / Month)	6.00	I	CCF	\$32.73	1.2316	\$241.86	10' x5'x3' = 150cf/100 = 1.5ccf x 4 months during structural replacements = 6ccf	#N/A	#N/A	#N/A	
25	For Up To 25, Add	6.00	I	MOD	\$13.09	1.2316	\$96.73		#N/A	#N/A	#N/A	
26	Up To 20' Height Scaffolding Initial Erection And Final Dismantling, Per CCF Of Scaffolding And Accessori	31.50	I	CCF	\$59.29	1.2316	\$2,300.18	10' x5'x3' = 150cf/100 = 1.5ccf x 7 stories x 3 locations = 31.5ccf	#N/A	#N/A	#N/A	
27	>80' Height Scaffolding Initial Erection And Final Dismantling, Per CCF Of Scaffolding And Accessories	640.00	I	CCF	\$112.65	1.2316	\$88,793.43	200lf @ 5x8 = 8000cf x 8 stories = 64,000 = 640ccf	#N/A	#N/A	#N/A	
28	Netting for Exterior Building Scaffolding	281.25	I	CSF	\$32.50	1.2316	\$11,257.59	125' high @ 220 = 28125sf = 281.25	#N/A	#N/A	#N/A	
29	10 Mil, Fire Retardant, Reinforced, Plastic Sheeting, Applied To Scaffolding	2,150.00	I	SF	\$0.83	1.2316	\$2,197.79	50sf/ opening @ 43 total = 2150	plastic	0	FALSE	
30	Temporary Metal Door And Frame	1.00	I	EA	\$626.32	1.2316	\$771.38	for work isolation	#N/A	#N/A	#N/A	
31	Installation of Heavy Duty Steel Post And Beam Sidewalk Bridge Assembly	200.00	I	LF	\$189.74	1.2316	\$46,736.76		#N/A	#N/A	#N/A	
32	For Each Additional Foot Over 8' Wide, Add	1,600.00	I	MOD	\$3.00	1.2316	\$5,911.68	200lf x 8' wide = 1600	#N/A	#N/A	#N/A	
33	For Each Additional Foot Over 8' High, Add	800.00	I	MOD	\$2.00	1.2316	\$1,970.56	200lf x 4' higher = 800	#N/A	#N/A	#N/A	
34	Monthly Rental Of Up To 8' Wide, 8' - 12' High, 2 Post System, Heavy Duty Steel Post And Beam	600.00	I	LF	\$9.66	1.2316	\$7,138.35	3 month minimum	#N/A	#N/A	#N/A	
35	Monthly Rental of Netting for Sidewalk Bridge	600.00	I	LF	\$1.61	1.2316	\$1,189.73	3 month minimum	#N/A	#N/A	#N/A	
36	Removal of Heavy Duty Steel Post And Beam Sidewalk Bridge Assembly	200.00	I	LF	\$39.49	1.2316	\$9,727.18		#N/A	#N/A	#N/A	
37	For Each Additional Foot Over 8' Wide, Add	1,600.00	I	MOD	\$1.25	1.2316	\$2,463.20		#N/A	#N/A	#N/A	

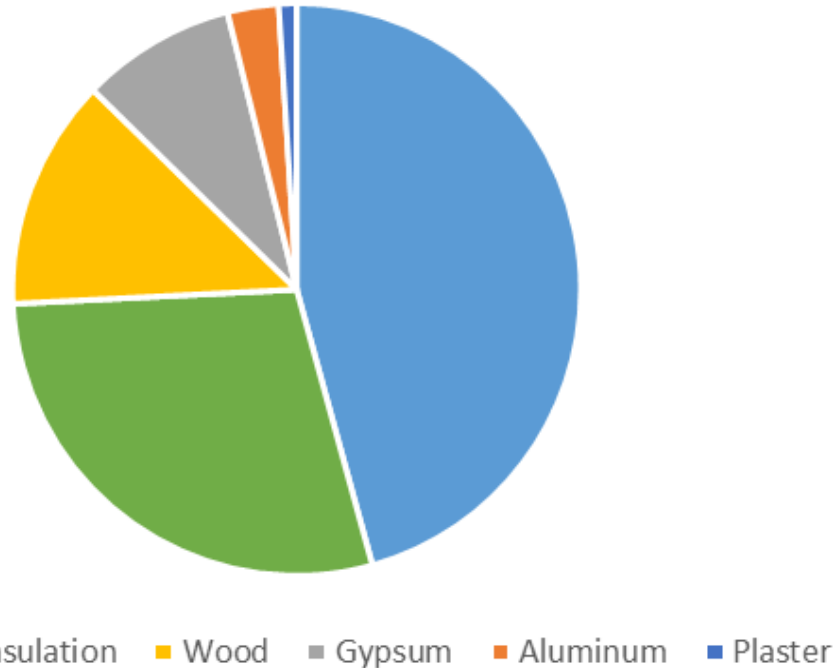
Sheet1 Sheet2

# Sample Cost Estimate

## Interior & Exterior Restoration at Fredrick Samuel Houses Building #35

Material	Weight (lb)
Copper	75,330
Insulation	46,970
Wood	21,562
Gypsum	14,496
Aluminum	4,795
Plaster	1,670
Total	164,822

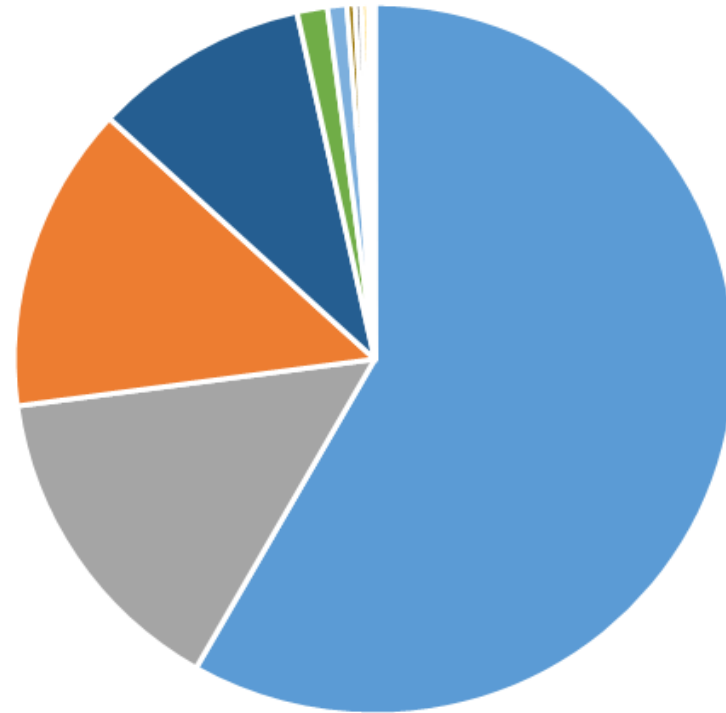
Waste Stream by Material



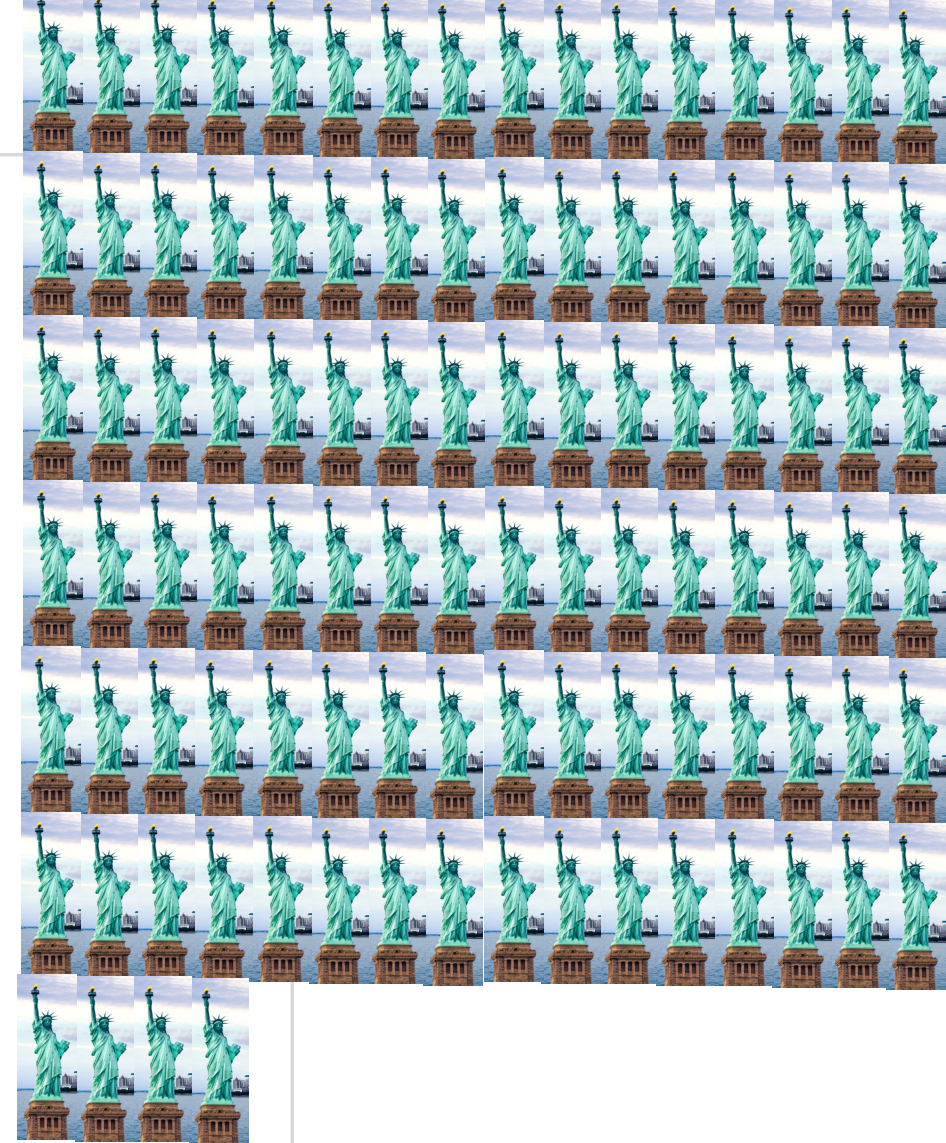
# 2021 Aggregate Findings

Material	Weight (lb)
Concrete	3,215,484
Asphalt	807,896
Stone	769,184
Wood	535,295
Copper	75,330
Insulation	48,001
Sand	19,750
Gypsum	16,270
Steel	15,831
Aluminum	9,318
Plaster	3,872
Plastic	2,366
Glass	675
Tile	146
Total	6,253,077

Waste Stream by Material



- Concrete
- Asphalt
- Stone
- Wood
- Copper
- Insulation
- Sand
- Gypsum
- Steel
- Aluminum
- Plaster
- Plastic
- Glass
- Tile



In 2021, the construction projects we analyzed produced waste equal to more than 100 Statues of Liberty.

# Next Steps & Areas for Improvement

- The excel template is being left with the team, which can be modified to add additional new catalog entries. There does exist outside databases for other materials such as steel.
- The NYCHA team will also have access to our python code for instantiating the catalog and aggregating values.
- Our algorithm only processes units of cubic and square yards/feet. As a result many materials which use other less well defined unit types are typically excluded: EA, LF, etc.
- This may contribute to the underrepresentation of other materials in our waste estimates, as such, we should assume any figures produced by the current iteration of our work are lower estimates.
- Improving upon our work, it would be wise to seek to expand the number of valid line items in order to get a better estimate of true waste output.