

# A Formalisation of the Balog–Szemerédi–Gowers Theorem in Isabelle/HOL

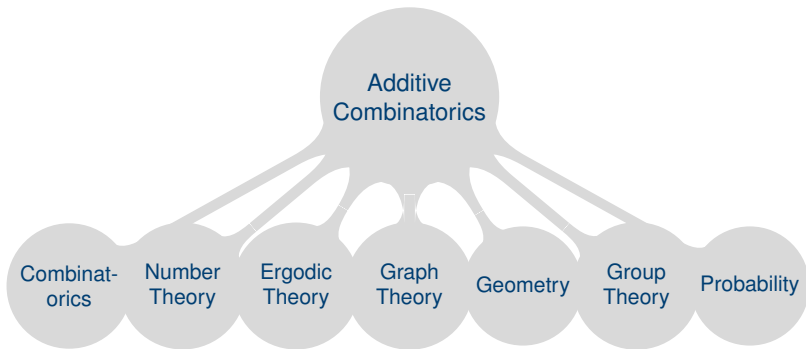
Angeliki Koutsoukou-Argyraiki | Mantas Bakšys | [Chelsea Edmonds](#)

ak2110@cam.ac.uk | mb2412@cam.ac.uk | cle47@cl.cam.ac.uk

Department of Computer Science & Technology, University of Cambridge, UK

# Additive Combinatorics

Additive combinatorics is, at heart, the study of combinatorial questions involving *the additive structure of sets*



# What is "Additive Structure"?

Given an additive abelian group  $G$  and finite subsets  $A$  and  $B$  we define:

▶ **Sumset:**  $A + B = \{a + b \mid a \in A, b \in B\}$ .

▶ **Difference Set:**  $A - B = \{a - b \mid a \in A, b \in B\}$ .

▶ **Additive Energy:**

$$E(A) = |\{(a, b, c, d) \in A \times A \times A \times A \mid a + b = c + d\}| / |A|^3.$$

*Simple concepts = many questions*

e.g. Is the sumset a subgroup or is it close to being one? What are the bounds on cardinality? Do sets contain an arithmetic progression?

...

# The Balog–Szemerédi–Gowers Theorem

**Balog & Szemerédi (1994):** Every finite subset  $A$  (of given additive energy) in an abelian group *must* contain a subset  $A'$  of  $A$  so that the cardinality of  $A'$  is large *but* the cardinality of the sumset  $A' + A'$  is small.

**Gowers (2001):** New proof of the above with much better bounds on the cardinalities (BSG). Key ingredient of Gowers's new proof of the celebrated Szemerédi's Theorem on arithmetic progressions.

# Why Formalise?

## Modern Interesting Relevant

- ▶ Additive combinatorics: active field with many open problems.
- ▶ BSG formal theorem: first formalisation & crucial tool in current research on additive combinatorics.
- ▶ BSG proof techniques: a fascinating interplay between *additive combinatorics*, *graph theory* and *probability theory*.
- ▶ Formal combinatorics libraries are quickly growing. Isabelle AFP: 58/316 Mathematics entries. Mirrored in other proof assistants (e.g. Lean).



# Our Key Contributions

- ▶ Background formalisations in additive combinatorics and probability theory as required.
- ▶ A new, extensive, extensible, generalised graph theory library.
- ▶ **Formalisation of the Balog–Szemerédi–Gowers Theorem in Isabelle/HOL (first in any proof assistant).**
- ▶ A case study on the locale-centric approach in Isabelle/HOL - including the interplay in proof of different mathematical fields.
- ▶ Formalisation of some additional related results in additive combinatorics & an alternative version of the main theorem (sumsets vs difference sets).

# Background Resources

- ▶ Previous work on basic sumset theory from the AFP entry "The Plünnecke-Ruzsa Inequality" by Koutsoukou-Argraki & Paulson.
- ▶ ...built on the AFP entry "A Case Study in Basic Algebra" by Ballarin.
- ▶ 2022 lecture notes by Gowers: "Introduction to Additive Combinatorics" for the University of Cambridge.

# A new general undirected graph theory library

Motivated by:

- ▶ Limitations and inflexibility of existing libraries specific to entries.
- ▶ Unnecessary complexity introduced by general *directed* library in Isabelle (Noschinski, 2015).

```
type_synonym uvert = nat
type_synonym uedge = "nat set"
type_synonym ugraph = "uvert set × uedge set"
```

Basic Undirected  
Graphs  
(Noschinski)

```
record ('v, 'w) graph =
  nodes :: "'v set"
  edges :: "('v × 'w × 'v) set"
```

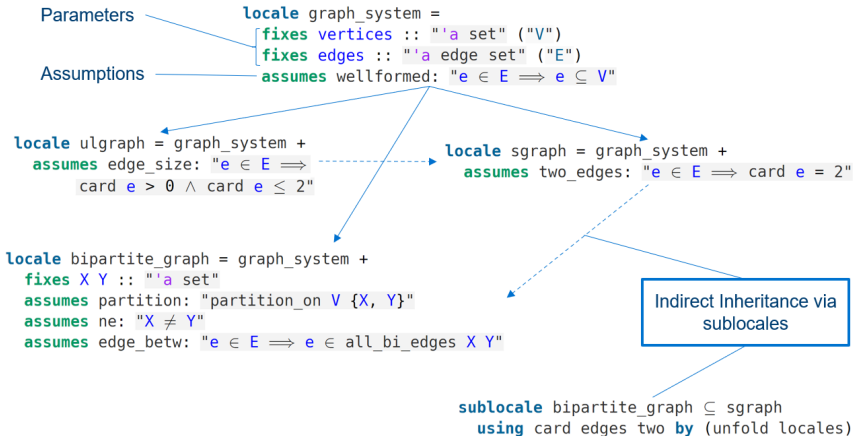
Dijkstra's Algorithm  
(Nordhoff & Lammich)

```
record ('a, 'b) pre_digraph =
  verts :: "'a set"
  arcs :: "'b set"
  tail :: "'b ⇒ 'a"
  head :: "'b ⇒ 'a"
```

Digraphs  
(Noschinski)



# Locales



# The Balog–Szemerédi–Gowers Theorem

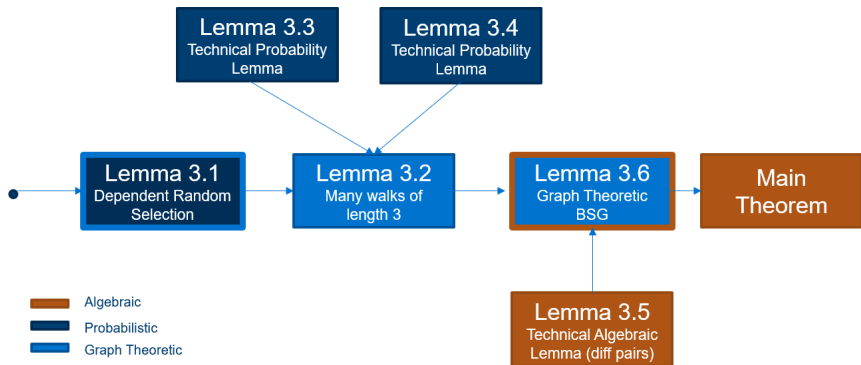
The formal statement of the theorem:

## Theorem (Balog–Szemerédi–Gowers)

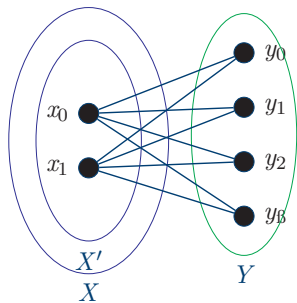
*Let  $c > 0$ . For every finite subset of an abelian group  $A$  with additive energy  $2c$  there exists a subset  $A'$  in  $A$  of cardinality at least  $c^2|A|/4$  such that  $|A' - A'| \leq 2^{30}|A|/c^{34}$ .*

*Note: analogous version for sumsets, various different versions and refinements of the theorem/proof are available (Zhao, Sudakov & Szemerédi & Vu).*

# Sketch of the proof



# The Dependent Random Selection Method



## Lemma (3.1)

*Intuitively: Given a dense bipartite graph ( $\delta = |E|/|X||Y|$ ), we can restrict one of its vertex sets to a large subset in which almost all pairs of vertices are joined by many paths of length two (codegree = number of paths of length two).*

*How do we find a random subset with better properties, based on the structure of the original set?*

# The Dependent Random Selection Method

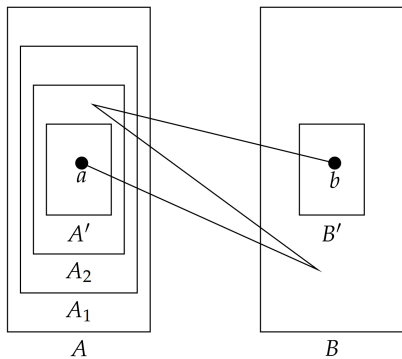
## Method Sketch.

Instead of defining  $X'$  randomly, define  $X'$  by picking  $y \in Y$  at random, and let  $X' = \text{neighbourhood}(y)$ . Now determine properties of  $X'$ , e.g. the expected size of  $X'$  is average degree of  $y \in Y$ . □

```
let ?M = "uniform_count_measure Y"
interpret P: prob_space ?M
  by (simp add: Y_not_empty partitions_finite prob_space_uniform_count_measure)
have sp: "space ?M = Y"
  by (simp add: space_uniform_count_measure)
(* First show that the expectation of the size of X' is the average degree of a vert
have avg_degree: "P.expectation ( $\lambda y . \text{card} (\text{neighborhood } y)$ ) = density * (card X)"
proof -
  have "density = ( $\sum y \in Y . \text{degree } y$ ) / (card X * card Y)"
    using edge_size_degree_sumY density_simp by simp
  then have d: "density * (card X) = ( $\sum y \in Y . \text{degree } y$ ) / (card Y)"
    using card_edges_between_set edge_size_degree_sumY partitions_finite(1) partitio
  have "P.expectation ( $\lambda y . \text{card} (\text{neighborhood } y)$ ) = P.expectation ( $\lambda y . \text{degree } y$ )"
    using alt_deg_neighborhood by simp
  also have "... = ( $\sum y \in Y . \text{degree } y$ ) / (card Y)" using P.expectation_uniform_count
    by (simp add: partitions_finite(2))
  finally show ?thesis using d by simp
qed
```

## Lemma 3.2

*There are many paths of length 3 between vertices in subsets*



Lemma 3.2 Diagrammatically (Zhao, 2019)

## Lemma 3.2

*There are many paths of length 3 between vertices in subsets*

### Lemma

*Let  $G$  be a bipartite graph with finite vertex sets  $X$  and  $Y$  and density  $\delta$ . Then there are subsets  $X' \subseteq X$  and  $Y' \subseteq Y$  with  $|X'| \geq \delta^2|X|/16$  and  $|Y'| \geq \delta|Y|/4$  such that for every  $x \in X'$  and  $y \in Y'$  the number of paths of length 3 between  $x$  and  $y$  in  $G$  is at least  $\delta^6|X||Y|/2^{13}$ .*

```
lemma (in fin_bipartite_graph) walks_of_length_3_subsets_bipartite:
  obtains X' and Y' where "X'  $\subseteq$  X" and "Y'  $\subseteq$  Y" and
  "card X'  $\geq$  (edge_density X Y)^2 * card X / 16" and
  "card Y'  $\geq$  edge_density X Y * card Y / 4" and
  " $\forall x \in X'. \forall y \in Y'. \text{card } \{p. \text{connecting\_walk } x \ y \ p \wedge \text{walk\_length } p = 3\} \geq$ 
  (edge_density X Y)^6 * card X * card Y / 2^13"
```

# "Transporting" Information across proofs

Lemma 3.2 involves many different probability spaces ( $X_2 \subset X$ )

```
interpret P1: prob_space "uniform_count_measure X"
```

```
interpret P2: prob_space "uniform_count_measure X2"
```

```
interpret P3: prob_space "uniform_count_measure Y"
```

... And several graph constructs

```
interpret H: fin_bipartite_graph "(?X1 U Y)" "{e ∈ E. e ⊆ (?X1 U Y)}" "?X1" "Y"
```

```
let ?E_loops = "mk_edge ` {(x, x') | x x'. x ∈ X2 ∧ x' ∈ X2 ∧  
(H.codegree_normalized x x' Y) ≥ ?δ ^ 3 / 128}"
```

```
interpret Γ: ulgraph "X2" "?E_loops"
```

We can transport information easily using locale definitions

```
have neighborhood_unchanged: "∀ x ∈ ?X1. neighbors ss x Y = H.neighbors ss x Y"
```

```
using neighbors ss def H.neighbors ss def vert adj def H.vert adj def by auto
```

```
then have degree_unchanged: "∀ x ∈ ?X1. degree x = H.degree x"
```

```
using H.degree neighbors ssX degree neighbors ssX by auto
```



# The Graph Theoretic "BSG" Lemma 3.6

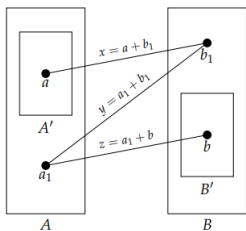
## Lemma

*Let  $A$  be a finite subset of an abelian group  $G$  with additive energy  $2c$ . Then  $A$  has subsets  $B$  and  $C$  with  $|B| \geq c^4|A|/16$  and  $|C| \geq c^2|A|/4$  such that  $|C - B| \leq 2^{13}c^{-15}|A|$ .*

## Proof Elements:

- ▶ Create an auxiliary graph using the  $\theta$ -popular difference:  $d \in G$  is  $\theta$ -popular if  $|\{(a, b) \in A^2 \mid a - b = d\}| \geq \theta|A|$ .
- ▶ Apply Lemma 3.2.
- ▶ Find number of unique sextuples for each  $d \in C - B$  based on popularity properties (Lemma 3.5) and paths of length 3.
- ▶ Determine bounds on  $|C - B|$ .

# Application of the lemma to additive combinatorics



Credit: Zhao, 2019

## Graph Construct

- ▶ Vertices:  $B$  is a copy of  $A \subseteq G$
- ▶ Edges:  $(x_i, y_i) \in E$  if and only if  $y_i - x_i$  is  $\theta$ -popular.
- ▶ Lemma 3.2 then gives large subsets with paths of length 3.

Working in the additive abelian group context:

```
let ?X = "A × {0:: nat}"
let ?Y = "A × {1:: nat}"
let ?E = "mk_edge ` {(x, y) | x y. x ∈ ?X ∧ y ∈ ?Y ∧ (popular_diff (fst y ⊖ fst x) c A)}'"
interpret H: fin_bipartite_graph "?X ∪ ?Y" ?E ?X ?Y
```

# The Graph Theoretic "BSG" Formalisation

## Formalisation Challenges:

- ▶ Counting and cardinalities: This statement took 113 lines to prove formally compared to 1 sentence in literature.

```
have card_ineq1: " $\bigwedge x y. x \in ?B \implies y \in ?C \implies \text{card } \{(z, w) \mid z w. z \in A \wedge w \in A \wedge \text{popular\_diff } (z \ominus x) \text{ c } A \wedge \text{popular\_diff } (z \ominus w) \text{ c } A \wedge \text{popular\_diff } (y \ominus w) \text{ c } A\} \geq (c^{12}) * ((\text{card } A)^2) / 2^{13}$ "
```

- ▶ Functions for projections: e.g. tuple of 3 pairs from sextuples:

```
define f:: "'a × 'a × 'a × 'a × 'a × 'a ⇒ ('a × 'a) × ('a × 'a) × ('a × 'a)" where  
  "f ≡ (λ (p, q, r, s, t, u). ((p, q), (r, s), (t, u)))"
```

# Main Theorem On Paper

## Theorem (Balog–Szemerédi–Gowers)

*Let  $c > 0$ . For every finite subset of an abelian group  $A$  with additive energy  $2c$  there exists a subset  $A'$  in  $A$  of cardinality at least  $c^2|A|/4$  such that  $|A' - A'| \leq 2^{30}|A|/c^{34}$ .*

## Proof.

1. We simply take  $A' = C$  in the previous lemma.
2. and apply the Ruzsa triangle inequality. That tells us that  $|B||C - C| \leq |B - C|^2$ .
3. which by the lemma is at most  $(2^{13}c^{-15}|A|)^2$ .
4. Since  $|B| \geq c^4|A|/16$  from (1) we obtain the bound stated.



# Main theorem in Isabelle/HOL

```
theorem Balog Szemerédi Gowers: fixes A::"a set" and c::real
  assumes afin: "finite A" and "A ≠ {}" and "c>0" and "additive_energy A = 2 * c" and ass: "A ⊆ G"
  obtains A' where "A' ⊆ A" and "card A' ≥ c^2 * card A / 4" and
    "card (differenceset A' A') ≤ 2^30 * card A / c^4"
proof-
  obtain B and A' where bss: "B ⊆ A" and bne: "B ≠ {}" and bge: "card B ≥ (c^4) * (card A)/16"
  and a2ss: "A' ⊆ A" and a2ge: "card A' ≥ (c^2) * (card A)/4"
  and hcardle: "card (differenceset A' B) ≤ 2^13 * card A / c^15"
  using assms obtains subsets differenceset_card_bound by metis
  have Bg0: "(card B :: real) > 0" using bne afin bss infinite_super by fastforce
  have "(card B) * card (differenceset A' A') ≤
    card (differenceset A' B) * card (differenceset A' B)"
  using afin a2ss bss infinite_super ass Ruza_triangle_ineq1 card_minusset' differenceset_commute
  sumset_subset_carrier subset_trans sumset_commute by (smt (verit, best))
  then have "card B * card (differenceset A' A') ≤ (card (differenceset A' B))^2"
  using bss bss power2_eq_square by metis
  then have "(card (differenceset A' A')) ≤ (card (differenceset A' B))^2 / card B"
  using Bg0 nonzero_mult_div_cancel_left[of "card B" "card(differenceset A' A)"]
  divide_right_mono by (smt (verit) of_nat_0 of_nat_mono real_of_nat_div4)
  moreover have "(card (differenceset A' B))^2 ≤ ((2^13) * (1/c^15) * (card A))^2"
  using hcardle by simp
  ultimately have "(card (differenceset A' A')) ≤ ((2^13) * (1/c^15) * (card A))^2 / (card B)"
  using pos_le_divide_eq[OF Bg0] by simp
  moreover have "(c^4) * (card A) / 16 > 0"
  using assms card_0_eq by fastforce
  moreover have "((2^13) * (1/c^15) * (card A))^2 / (card B) =
    ((2^13) * (1/c^15) * (card A))^2 * (1/(card B))" by simp
  moreover have "((2^13) * (1/c^15) * (card A))^2 * (1/(card B)) ≤
    ((2^13) * (1/c^15) * (card A))^2 / ((c^4) * (card A) / 16)"
  using bge calculation(2, 3) frac_le less_eq_real_def zero_le_power2 by metis
  ultimately have "(card (differenceset A' A')) ≤ ((2^13) * (1/c^15) * (card A))^2 / ((c^4) * (card A) / 16)"
  by linarith
  then have "(card (differenceset A' A')) ≤ (2^30) * (card A) / (c^4)"
  using card_0_eq assms by (simp add: power2_eq_square)
  then show ?thesis using a2ss a2ge that by blast
qed
```

(1)

(2)

(3)

(4)

# Challenges and Highlights

- ▶ The locale approach:
  - ▶ Building on previous work - the graph theory library again proved to be modular, easy to work with, and flexible.
  - ▶ NEW: Critical to managing the interplay between different mathematical fields.
- ▶ Probabilistic Methods:
  - ▶ Main challenge = finding theorems, and setting up the formal prob space.
  - ▶ Examples of proof structure in combinatorics.
- ▶ de Bruijn Factor: 13.9 - cardinality/counting/arithmetical lemmas continue to be key contributors.

# Concluding Thoughts

- ▶ With 3 contributors, the formalisation took less than 2 months (including new graph theory library).
- ▶ Key Contributions: The first formalisation of the Balog–Szemerédi–Gowers Theorem, formal techniques for probabilistic methods in combinatorics, and development of the locale-centric approach.
- ▶ Other supplementary results and the sunset alternate also formalised.
- ▶ Future work: More additive combinatorics, further development of probabilistic methods.

# Acknowledgements and Contacts



Angeliki<sup>1</sup>:  
ak2110@cam.ac.uk



Mantas<sup>2</sup>:  
mb2412@cam.ac.uk



Chelsea<sup>3</sup>:  
cle47@cl.cam.ac.uk

## Isabelle AFP Entries:

- ▶ [https://www.isa-afp.org/entries/Balog\\_Szemerédi\\_Gowers.html](https://www.isa-afp.org/entries/Balog_Szemerédi_Gowers.html)
- ▶ [https://www.isa-afp.org/entries/Undirected\\_Graph\\_Theory.html](https://www.isa-afp.org/entries/Undirected_Graph_Theory.html)

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# Examples of Additional Results

## Lemma

*Let  $A$  be a finite subset of an Abelian group with  $|A + A| \leq C|A|$ . Then the additive energy of  $A$  is at least  $C^{-1}$ .*

```
proposition additive_energy_lower_bound_subset: fixes C::real
  assumes "finite A" and "A ⊆ G" and "(card (sumset A A)) ≤ C * card A" and "card A ≠ 0"
  shows "additive_energy A ≥ 1/C"
```

(And analogous result with difference set).