

# Title: Multispecies grasslands produce more yield from lower nitrogen inputs across a climatic gradient

**Authors:** James O'Malley<sup>1</sup>, John A. Finn<sup>2\*</sup>, Carsten S. Malisch<sup>3</sup>, Matthias Suter<sup>4</sup>, Sebastian T. Meyer<sup>5</sup>, Giovanni Peratoner<sup>6</sup>, Marie-Noëlle Thivierge<sup>7</sup>, Diego Abalos<sup>3</sup>, Paul R. Adler<sup>8</sup>, T. Martijn Bezemer<sup>9,10</sup>, Alistair D. Black<sup>11</sup>, Åshild Ergon<sup>12</sup>, Barbara Golińska<sup>13</sup>, Guylain Grange<sup>1,2</sup>, Josef Hakl<sup>14</sup>, Nyncke J. Hoekstra<sup>15</sup>, Olivier Huguenin-Elie<sup>4</sup>, Jingying Jing<sup>16</sup>, Jacob M. Jungers<sup>17</sup>, Julie Lajeunesse<sup>18</sup>, Ralf Loges<sup>19</sup>, Gaëtan Louarn<sup>20</sup>, Andreas Lüscher<sup>4</sup>, Thomas Moloney<sup>21</sup>, Christopher K. Reynolds<sup>22</sup>, Ievina Sturite<sup>23</sup>, Ali Sultan Khan<sup>2</sup>, Rishabh Vishwakarma<sup>1</sup>, Yingjun Zhang<sup>16</sup>, Feng Zhu<sup>24</sup>, Caroline Brophy<sup>1</sup>

## Affiliations:

<sup>1</sup>School of Computer Science and Statistics, Trinity College Dublin, Dublin 2, Ireland.

<sup>2</sup>Environment, Soils and Land Use Dept., Teagasc, Johnstown Castle, Co. Wexford, Ireland.

<sup>3</sup>Department of Agroecology, Aarhus University, Tjele, Denmark.

<sup>4</sup>Agroscope, Reckenholzstrasse, Zurich, Switzerland.

<sup>5</sup>School of Life Sciences, Technical University of Munich, Munich, Germany.

<sup>6</sup>Laimburg Research Centre, Laimburg 6, Vadena/Pfatten, Italy.

<sup>7</sup>Agriculture and Agri-Food Canada, Quebec Research and Development Centre, Quebec City, Quebec, Canada.

<sup>8</sup>United States Department of Agriculture, Agricultural Research Service, PA, USA.

<sup>9</sup>Institute of Biology, Leiden University, Leiden, The Netherlands.

<sup>10</sup>Netherlands Institute of Ecology, NIOO-KNAW, Wageningen, The Netherlands.

<sup>11</sup>Department of Agricultural Sciences, Lincoln University, Christchurch, New Zealand.

<sup>12</sup>Dept. of Plant Sciences, Norwegian University of Life Sciences, Norway.

<sup>13</sup>Department of Grassland and Natural Landscape Sciences, Poznan University of Life Sciences, Poland.

<sup>14</sup>Department of Agroecology and Crop Production, Czech University of Life Sciences Prague, Czech Republic.

<sup>15</sup>Louis Bolk Institute, Bunnik, The Netherlands.

<sup>16</sup>College of Grassland Science and Technology, China Agricultural University, Beijing, China.

<sup>17</sup>Department of Agronomy and Plant Genetics, University of Minnesota, MN, USA.

<sup>18</sup>Agriculture and Agri-Food Canada, Research farm, Normandin, Quebec, Canada.

<sup>19</sup>Institute of Animal Nutrition and Physiology, Group of Organic Farming, Kiel University, Kiel, Germany.

<sup>20</sup>INRAE UR4 URP3F, Lusignan, France.

<sup>21</sup>DLF, Ballymountain, Ferrybank, Co. Waterford, Ireland.

<sup>22</sup>School of Agriculture, Policy and Development, University of Reading, Early Gate, UK.

<sup>23</sup>Department of Grassland and Livestock, Norwegian Institute of Bioeconomy Research (NIBIO), Ås station Steinkjer, Norway.

<sup>24</sup>Hebei Key Laboratory of Soil Ecology, Key Laboratory of Agricultural Water Resources, Center for Agricultural Resources Research, Institute of Genetic and Developmental Biology, Chinese Academy of Sciences, Shijiazhuang, China.

5       \*Corresponding author. Email: John.Finn@teagasc.ie

### **Abstract**

10       High-yielding forage grasslands frequently comprise low species diversity and receive high inputs  
of nitrogen fertilizer. To investigate multispecies mixtures as an alternative strategy, the 26-site  
international ‘LegacyNet’ experiment systematically varied the diversity of sown grasslands using  
up to six high-yielding forage species (grasses, legumes, and herbs), managed under moderate  
nitrogen inputs. Multispecies mixtures outyielded two widely used grassland practices: a grass  
monoculture with higher nitrogen fertilizer, and a two-species grass-legume community. High  
15       yields in multispecies mixtures were driven by strong positive grass-legume and legume-herb  
interactions. In warmer sites, the yield advantage of legume-containing multispecies mixtures over  
monocultures and the high-nitrogen grass increased. Improved design of grassland mixtures can  
inform more environmentally sustainable forage production and may enhance adaptation of  
productive grasslands to a warming climate.

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### **One Sentence Summary**

25       High-yielding mixtures of grasses, legumes and herbs outperform communities managed under  
common grassland practices.

## Main Text:

To feed a growing global population, agricultural production systems have undergone significant simplification and intensification to increase productivity and food/feed quality (1). In the context of ongoing resource depletion and the global climate and biodiversity crises, innovative agricultural practices are needed to balance food security with environmental sustainability (2-5). Ruminant livestock production is a major contributor to the global agricultural economy, and associated grassland forage production varies from high-input, intensively managed monocultures to more extensive, low-input systems (6). Sown grasslands in temperate regions (hereafter ‘productive grasslands’) typically comprise a small number of high-yielding perennial species, often grass monocultures reliant on high nitrogen fertilizer inputs or two species grass-legume communities, typically comprising 70% *Lolium perenne* (perennial ryegrass) and 30% *Trifolium repens* (white clover). Despite promoting yield increases, high-nitrogen inputs contribute to several agri-environmental problems, including greenhouse gas emissions, reduced soil and water quality, and biodiversity loss (1). The use of multispecies grasslands has been proposed to achieve high yields and increase sustainability (7, 8). However, critical gaps remain in understanding whether higher plant diversity with lower nitrogen inputs can match yields of productive grasslands with high inputs across varying climates and environmental conditions.

Biodiversity and ecosystem function is well-studied in semi-natural grassland experiments, where higher plant diversity generally increases yield (e.g., (8-10)) and enhances resistance and resilience to environmental disturbance (11). However, most semi-natural grasslands have low yields and/or limited forage quality, and many species mixtures fail to out-yield the most productive monoculture (12). Based on ecological principles, combining productive species with complementary traits has potential to deliver high yields with moderate inputs (8, 13). Mixtures of grasses and legumes in productive grasslands at low to medium nitrogen fertilizer levels can outyield the component monocultures (at the same level of nitrogen fertilizer) and achieve the same or higher yields as highly fertilized grass monocultures due to the nitrogen-fixing abilities of legume species (14-17). The inclusion of herb species (defined as non-leguminous forbs) in grass-legume mixtures increases functional diversity, which can increase overall resource utilization and ecosystem function (10, 18). However, the nitrogen-saving and yield-related benefits in productive grasslands and mixtures with more than two functional groups are largely unexplored.

Investigations of the addition of herbs to grass or grass-legume communities in productive grasslands are difficult to synthesize because they vary considerably in their experimental design (19-26). Systematic investigation across varying conditions is required for the development of robust agricultural practices intended for wide implementation. We established LegacyNet, a voluntary, coordinated 26-site network of grassland experiments spanning a broad climatic gradient within temperate regions across North America, Europe, Asia, and New Zealand (Fig. 1A, Data S1). LegacyNet sites implemented a common field experiment (27), where the composition and sown proportions of six high-yielding forage species (two grasses, two legumes, and two herbs, denoted G1, G2, L1, L2, H1 and H2) were manipulated at plot scale (Table S1), to assess the suitability of the wide scale adoption of multispecies mixtures in productive grasslands. Given the range of environmental conditions across sites, each site selected species suited to the locality (27). Nevertheless, there was high overlap in species across sites (Data S1); the species most commonly used across sites were G1 *L. perenne*, G2 *Phleum pratense* (timothy), L1 *Trifolium pratense* (red clover), L2 *T. repens*, H1 *Cichorium intybus* (chicory), and H2 *Plantago lanceolata* (plantain). Sites applied none (two sites) or moderate levels of nitrogen fertilizer, over an average duration of 24 months (Data S1). Mixture and monoculture performances were

compared to a grass monoculture (*L. perenne* at 21 of 26 sites) with a higher level of nitrogen fertilizer (at least twice the moderate rate), and a two-species community of 70:30 *L. perenne* and *T. repens*. Thus, LegacyNet investigated (a) whether diversity of plant species and/or functional groups affects the yields of productive grasslands; (b) whether higher-diversity mixtures can equal or exceed the yields of conventional management practices; and (c) the extent to which climate alters potential yield benefits of multispecies mixtures.

### Mixing of functional groups underpinned a high degree of overyielding

Yield per growing season (27) varied substantially across sites, with median values for plots at each site ranging from 4.65 – 14.89 t ha<sup>-1</sup>, reflecting the range of climates, soil conditions and management practices. Many mixture plots yielded higher than monoculture plots at individual sites (Fig. 1B).

Across sites, yields of the six forage species in monoculture were highest for L1, and all other species were similarly high to each other (Fig. 2; predicted from a Diversity-Interactions model (28-30), Tables S2 and S3). Overyielding occurs when a mixture outyields the weighted average of the component monocultures ('weighted average monoculture' hereafter) (31). The six-species grass-legume-herb equi-proportional mixture (GLH) and four-species equi-proportional mixtures of grass-legume (GL), legume-herb (LH), and grass-herb (GH) all displayed overyielding by outperforming their weighted average monoculture by 3.13 (GLH, +34%), 2.90 (GL, +31%), 2.46 (LH, +26%), and 0.78 (GH, +9%) t ha<sup>-1</sup> respectively (each  $P < 0.0001$ , testing whether the net interactions (Fig. 2) differed from zero). Strong overyielding occurred across a wide range of sown proportions of grasses, legumes, and herbs (Figs. 3A and B). We identified other six-species mixtures that outperformed the equi-proportional six-species mixture (e.g., Fig. 3A: the optimal mixture, G:L:H = 0.24: 0.59: 0.17, yielded 12.83 (+4%) compared to 12.31 t ha<sup>-1</sup> for the equi-proportional mixture, cyan versus magenta circle;  $P < 0.0001$ ). Thus, we found overwhelming evidence of overyielding in mixtures that was robust across a wide range of sown functional group proportions; this was due to strong interaction effects (Fig. 3A, Table S2), with interactions being important even when some functional groups had low sown proportions (partially due to the non-linear term theta (29, 32) in Eq. 3 (27) and Table S2, Fig. S1).

Transgressive overyielding occurs when a mixture outperforms the best-performing monoculture (31). Across sites, a wide range of sown proportions of grasses, legumes and herbs performed better than (Fig. 3C, the blue region) or comparably to (Fig. 3C, the two light grey regions) the best-performing monoculture. This high degree of transgressive overyielding is only possible due to positive net effects of interspecific interactions (quantified in Table S2 and illustrated in grey in Fig. 2). There were strong positive interactions between grasses and legumes, between herbs and legumes, and to a lesser degree between grasses and herbs (Table S2). The interaction between the two legumes species was moderate, but interactions between the two grasses and between the two herbs were non-significant. Although we cannot discern among the various mechanisms that underpin these interactions, they likely include the ability of mixtures to utilize a wider range of soil, nutrient and light resources, especially nitrogen (33), as well as a reduced susceptibility to pests and diseases. Strong grass-legume interactions are consistent with previous research at single sites (16, 33), and across environmental conditions (14, 34), and reflect the importance of nitrogen fixation by legumes and the ability of other functional groups to transform the additional available nitrogen into biomass. Some evidence for interactions of herbs with grasses or legumes has been shown in single-site studies (22, 23) but our results provide large-scale evidence that multispecies mixtures that include herb species can also deliver high yields.

### Increasing species diversity within functional groups can benefit yield

When two species are functionally redundant (28), they are interchangeable at sowing without any impact on yield. At the 26 individual sites, the two species within each functional group were only functionally redundant at seven sites for grasses, four sites for legumes and seven sites for herbs (Fig. S2). Functional redundancy, however, may have even lower incidence if multiple responses are considered, and/or over different timescales (35).

We further investigated whether yields could be optimized by sowing one rather than two species per functional group. Across sites, equi-proportional mixtures with three species spanning three functional groups yielded on average  $0.91 \text{ t ha}^{-1}$  lower (-7%, Fig. S3) than the equi-proportional six-species mixture, clearly indicating a yield advantage of the latter. As richness increased from three to six species, any increase in yield strongly depended on species composition (Fig. S4). At individual sites, the majority of equi-proportional three-species combinations yielded lower (125 of 208 comparisons) or comparably (81 of 208 comparisons) to the equi-proportional six-species mixture and yielded higher in only two comparisons (Fig. S3). In the absence of prior knowledge on local species' performance, sowing two species within each functional group, rather than one, is a more reliable strategy to optimize yield and reduce sensitivity to changes in sown functional group proportions (Fig. S5). Thus, even with a targeted choice of high-performing forage species, six-species GLH mixtures are better than three-species GLH mixtures.

### Multispecies mixtures with lower nitrogen outperformed a high N grass monoculture

To compare mixture performance with a grass monoculture with high nitrogen, the LegacyNet design included a high-nitrogen application (on average across sites  $260.5$  and  $108.7 \text{ kg ha}^{-1} \text{ yr}^{-1}$  for high and moderate N respectively, i.e., 2.4 times higher; Data S1 and Table S1) on additional monocultures of G1 ('high N grass' hereafter). Across sites, yields of multispecies mixtures across a wide range of sown functional group proportions and managed with moderate nitrogen fertilizer either outyielded or were comparable to the high N grass yield (Fig. 3D, blue plus two light grey regions). The high N grass yielded  $11.07 \text{ t ha}^{-1}$ , and the equi-proportional six-species mixture was  $1.24 \text{ t ha}^{-1}$  higher ( $P = 0.0002$ , +11%; Fig. 2: six-species equi-proportional mixture versus the dashed red line), despite the average nitrogen rate being  $152 \text{ kg ha}^{-1}$  lower for the multispecies mixture. Therefore, functionally-diverse mixtures with much lower nitrogen application can outyield a high N grass monoculture. Mixtures that contained little to no legumes had lower yields than the high N grass (Fig. 2, grass-grass, herb-herb and grass-herb predictions, and Fig. 3D, black region). At 21 of 26 sites, the yield of the six-species equi-proportional mixture was higher (12) or comparable (nine) to the high N grass, and significantly lower only at five sites (Fig. S6A, Table S4). The extent of these effects provides evidence that farmers can utilize multispecies mixtures in lieu of highly fertilized grass monocultures to reduce their financial costs and environmental impacts while simultaneously maintaining or improving their yields.

### Multispecies mixtures outperformed a two-species grass-legume community

Twenty-one of 26 LegacyNet sites sowed *L. perenne* as their G1 species, and 20 of 26 sowed *T. repens* as their L2 species (Data S1). Therefore, we use our model to estimate the performance of a two-species community of 70% *L. perenne* and 30% *T. repens* ('70:30 G1:L2 community' hereafter). Across sites, the equi-proportional six-species mixture and the equi-proportional four-species GL and LH mixtures, outyielded the 70:30 G1:L2 community ( $10.44 \text{ t ha}^{-1}$ ; Fig. 2 dashed black line) by  $1.86 \text{ t ha}^{-1}$  (+18%),  $1.79 \text{ t ha}^{-1}$  (+17%), and  $1.53 \text{ t ha}^{-1}$  (+15%), respectively ( $P <$

0.0001 each) (Fig. 2). Similar results could also be seen at the individual site level (Fig. S6B, Table S4). A wide range of four- and six-species mixtures of grasses, legumes, and herbs (where species within each functional group were sown in equal proportion) significantly outyielded the two-species 70:30 G1:L2 community (Fig. 3E). These results underline that increases in species richness (from two to four to six) and manipulation of relative abundances of four-species grass-legume and six-species grass-legume-herb mixtures can result in higher yields than those from the two-species 70:30 G1:L2 community. While legumes play a key role (Fig. 3A), six-species mixtures of grasses, legumes, and herbs always out-performed two- and four-species grass-legume communities when comparing across communities with the same sown legume percentage, and for values less than 70% (Fig. S7).

### **Mixtures with legumes increased yield advantages across a temperature gradient**

Yield generally showed a quadratic relationship with average daily temperature across sites (Fig. 4A, Table S2). Due to the correlation between temperature and growing season length, the temperature effects in our model also reflect some of the site-to-site variation in growing season duration. Yields were reduced considerably at lower temperatures (Fig. 4A); for example, the equi-proportional six-species mixture yielded 10.47 t ha<sup>-1</sup> at 5°C compared to 12.50 t ha<sup>-1</sup> at 11°C. Although the effect of temperature was similar on all monocultures and grass-herb mixtures (Fig. 4A), any mixture containing legumes yielded proportionately more as temperature increased, because the grass-legume and legume-herb interactions were stronger at higher temperatures (Table S2, climate terms). Thus, yield patterns across the equi-proportional grass-legume, legume-herb and grass-legume-herb communities were quite consistent from 9°C to 13°C (Fig. 4A and Fig. S8A); e.g., at 9°, 11°, and 13°C in Fig. 4A, the six-species equi-proportional mixture yielded 12.21, 12.50 and 12.39 t ha<sup>-1</sup> respectively. Importantly, at higher temperatures, these legume-related interactions caused an increased yield difference between the six-species equi-proportional mixture and both the high N grass monoculture (Fig. 4B) and all the other monocultures (Fig. 4A). There were combinations of sown grass-legume-herb proportions with clear evidence of i) overyielding (Fig. S8B) across the temperature gradient, ii) transgressive overyielding at and above 9°C (Fig. S8C), iii) outperformance of the high N grass at and above 7°C (Fig. S8D), and iv) outperformance of the 70:30 G1:L2 community at all temperatures (Fig. S8E).

### **Implications for agronomic practice**

To optimize yield and nitrogen-saving benefits, we identified a range of functional group proportions defined by: 30 – 70% of legumes, a minimum of 15% of grasses, and a minimum of 10% of herbs (Fig. 4C, shaded region). Many diverse mixtures within this region exhibited transgressive overyielding by outperforming the highest-yielding monoculture (L1, red clover, in 23 of 26 sites). In practice, red clover monocultures would not be sown in productive grasslands, given the risk of disease in fields repeatedly cropped with it, bloat risk for grazing ruminants, and negative environmental effects on nitrous oxide emissions and nitrate leaching (36, 37). Despite being an overly stringent comparison, it is all the more impressive that many mixtures outperformed red clover, the highest-yielding monoculture.

We retrospectively identified the optimal-yielding communities at each site (Fig. S9), which were generally within or close to the optimal region of community proportions across sites (Fig. 4C). However, the site-specific sown proportions of these optimal communities would not be known in advance and, furthermore, would likely vary depending on the weather conditions in the year of establishment and subsequent years. Therefore, aiming for sown proportions of the

functional groups within the specified region across sites (Fig. 4C) is a more dependable approach to optimize yield. The wide range of species proportions in this region also allows more targeted design of grassland communities to match different farming systems, without any compromise in yields, e.g., lower legume proportions (~30%) would be more appropriate for a grassland grazed by ruminants, whereas higher legume proportions may better suit an ungrazed grassland ley in a rotation.

Productive grasslands are expected to deliver more than just forage yield, and communities in the optimal region (Fig. 4C) can also reduce agri-environmental harms associated with nitrogenous gaseous emissions and leaching (36-39), and lead to benefits across multiple ecosystem functions (multifunctionality), including agronomic (40, 41), livestock (21, 23, 42) and other environmental (13, 43) responses.

The duration of the LegacyNet experiments generally matches well with that of grassland leys as implemented within rotational cropping systems, where they can enhance soil carbon, disrupt pest and weed life cycles, and reduce GHG emissions and nitrate leaching (44). Even within a short multispecies grassland ley, savings from reduced nitrogen fertilizer far exceed additional seed costs. Productive grassland systems can have a four- to eight-year duration that exceeds our experimental length. Although we show yield benefits of mixtures in the initial years, species' proportions may shift away from the optimal region (Fig. 4C) over several years; however, adaptive farming management (e.g. over-sowing or slot-seeding of seeds of declining species, rather than ploughing and reseeding (e.g. (45))) can direct grassland composition back to the optimal region. The insights provided by this study on the value of multispecies mixtures can incentivize longer-term agronomic and grazing studies, as well as improved selection of forage plant species and cultivars that are more persistent, maintain functional diversity over time, and improve synergistic interactions among species in mixtures.

Grassland production contributes greatly to livelihoods in rural regions and is threatened by the climate crisis (46, 47). Our study strengthens the evidence that legume-containing multispecies mixtures are an adaptation option for future climate scenarios (48, 49). Climate change also increases the incidence of extreme weather events, for which our results do not necessarily provide insight. However, multispecies mixtures can enhance yield resilience to weather-related stresses, including drought (11, 24, 50).

More diverse multispecies mixtures can generally deliver higher yields than either a grass monoculture with higher nitrogen input or a two-species grass-legume mixture. Overall, we highlight the strong potential of combining high-performing plants from different functional groups to enhance forage yields across a wide gradient of temperate climates and soil conditions, while achieving reductions in nitrogen fertilizer inputs.

## References and Notes:

1. G. Lemaire, F. Gastal, A. Franzluebbers, A. Chabbi, Grassland–cropping rotations: an avenue for agricultural diversification to reconcile high production with environmental quality. *Environmental Management* **56**, 1065-1077 (2015).
- 5 2. M. B. Cole, M. A. Augustin, M. J. Robertson, J. M. Manners, The science of food security. *npj Science of Food* **2**, 14 (2018).
3. H. C. J. Godfray *et al.*, Food security: the challenge of feeding 9 billion people. *Science* **327**, 812-818 (2010).
- 10 4. H. C. J. Godfray, T. Garnett, Food security and sustainable intensification. *Philosophical Transactions of the Royal Society B: Biological Sciences* **369**, 20120273 (2014).
5. Y. Yang *et al.*, Climate change exacerbates the environmental impacts of agriculture. *Science* **385**, eadn3747 (2024).
6. FAO, "Transforming the livestock sector through the Sustainable Development Goals," (Food and Agriculture Organization of the United Nations, 2018).
- 15 7. G. Tamburini *et al.*, Agricultural diversification promotes multiple ecosystem services without compromising yield. *Science Advances* **6**, eaba1715 (2020).
8. F. Isbell *et al.*, Benefits of increasing plant diversity in sustainable agroecosystems. *Journal of Ecology* **105**, 871-879 (2017).
9. L. Zheng *et al.*, Effects of plant diversity on productivity strengthen over time due to trait-dependent shifts in species overyielding. *Nature Communications* **15**, 2078 (2024).
- 20 10. W. W. Weisser *et al.*, Biodiversity effects on ecosystem functioning in a 15-year grassland experiment: Patterns, mechanisms, and open questions. *Basic and Applied Ecology* **23**, 1-73 (2017).
11. F. Isbell *et al.*, Biodiversity increases the resistance of ecosystem productivity to climate extremes. *Nature* **526**, 574-577 (2015).
- 25 12. B. J. Cardinale *et al.*, Impacts of plant diversity on biomass production increase through time because of species complementarity. *Proceedings of the National Academy of Sciences* **104**, 18123-18128 (2007).
13. J. A. Finn *et al.*, Design principles for multi-species productive grasslands: Quantifying effects of diversity beyond richness. *Journal of Ecology* **112**, 2471-2479 (2024).
14. J. A. Finn *et al.*, Ecosystem function enhanced by combining four functional types of plant species in intensively managed grassland mixtures: a 3-year continental-scale field experiment. *Journal of Applied Ecology* **50**, 365-375 (2013).
- 30 15. M. Jørgensen, A. K. Bakken, L. Østrem, C. Brophy, The effects of functional trait diversity on productivity of grass-legume swards across multiple sites and two levels of nitrogen fertiliser. *European Journal of Agronomy* **151**, 126993 (2023).
- 35 16. D. Nyfeler *et al.*, Strong mixture effects among four species in fertilized agricultural grassland led to persistent and consistent transgressive overyielding. *Journal of Applied Ecology* **46**, 683-691 (2009).
17. M. Suter *et al.*, Nitrogen yield advantage from grass–legume mixtures is robust over a wide range of legume proportions and environmental conditions. *Global Change Biology* **21**, 2424-2438 (2015).
18. M. W. Cadotte, K. Carscadden, N. Mirotchnick, Beyond species: functional diversity and the maintenance of ecological processes and services. *Journal of Applied Ecology* **48**, 1079-1087 (2011).
- 40 19. K. M. McCarthy, C. G. McAloon, M. B. Lynch, K. M. Pierce, F. J. Mulligan, Herb species inclusion in grazing swards for dairy cows—A systematic review and meta-analysis. *Journal of Dairy Science* **103**, 1416-1430 (2020).
20. C. Grace *et al.*, The effect of increasing pasture species on herbage production, chemical composition and utilization under intensive sheep grazing. *Grass and Forage Science* **73**, 852-864 (2018).
- 45 21. C. Grace *et al.*, Grazing multispecies swards improves ewe and lamb performance. *Animal* **13**, 1721-1729 (2019).
22. S. Baker *et al.*, A comparison of the nutritive value of perennial ryegrass, perennial ryegrass and white clover and multispecies-based farmlet systems. *Grassland Research* **2**, 129-139 (2023).
- 50 23. A. I. Roca-Fernández, J. L. Peyraud, L. Delaby, R. Delagarde, Pasture intake and milk production of dairy cows rotationally grazing on multi-species swards. *Animal* **10**, 1448-1456 (2016).
24. G. Grange, J. A. Finn, C. Brophy, Plant diversity enhanced yield and mitigated drought impacts in intensively managed grassland communities. *Journal of Applied Ecology* **58**, 1864-1875 (2021).
25. J. B. Pinxterhuis *et al.*, Implementing plantain (*Plantago lanceolata*) to mitigate the impact of grazing ruminants on nitrogen losses to the environment: A review. *Grass and Forage Science* **79**, 144-157 (2024).
- 55



26. M. A. Sanderson *et al.*, Plant species diversity and management of temperate forage and grazing land ecosystems. *Crop Science* **44**, 1132-1144 (2004).
27. Materials and methods.
28. L. Kirwan *et al.*, Diversity–interaction modeling: estimating contributions of species identities and interactions to ecosystem function. *Ecology* **90**, 2032-2038 (2009).
29. J. Connolly *et al.*, An improved model to predict the effects of changing biodiversity levels on ecosystem function. *Journal of Ecology* **101**, 344-355 (2013).
30. R. A. Moral *et al.*, Going beyond richness: Modelling the BEF relationship using species identity, evenness, richness and species interactions via the DImodels R package. *Methods in Ecology and Evolution* **14**, 2250-2258 (2023).
31. B. R. Trenbath, in *Advances in Agronomy*, N. C. Brady, Ed. (Academic Press, 1974), vol. 26, pp. 177-210.
32. R. Vishwakarma, L. Byrne, J. Connolly, R. de Andrade Moral, C. Brophy, Estimation of the non-linear parameter in Generalised Diversity-Interactions models is unaffected by change in structure of the interaction terms. *Environmental and Ecological Statistics* **30**, 555-574 (2023).
33. D. Nyfeler, O. Huguenin-Elie, M. Suter, E. Frossard, A. Lüscher, Grass-legume mixtures can yield more nitrogen than legume pure stands due to mutual stimulation of nitrogen uptake from symbiotic and non-symbiotic sources. *Agriculture, Ecosystems & Environment* **140**, 155-163 (2011).
34. E. Sturludóttir *et al.*, Benefits of mixing grasses and legumes for herbage yield and nutritive value in Northern Europe and Canada. *Grass and Forage Science* **69**, 229-240 (2014).
35. F. Isbell *et al.*, High plant diversity is needed to maintain ecosystem services. *Nature* **477**, 199-202 (2011).
36. S. Cummins *et al.*, Beneficial effects of multi-species mixtures on N<sub>2</sub>O emissions from intensively managed grassland swards. *Science of the Total Environment* **792**, 148163 (2021).
37. D. Nyfeler, O. Huguenin-Elie, E. Frossard, A. Lüscher, Effects of legumes and fertiliser on nitrogen balance and nitrate leaching from intact leys and after tilling for subsequent crop. *Agriculture, Ecosystems & Environment* **360**, 108776 (2024).
38. I. Feigenwinter, L. Hörtnagl, N. Buchmann, N<sub>2</sub>O and CH<sub>4</sub> fluxes from intensively managed grassland: The importance of biological and environmental drivers vs. management. *Science of The Total Environment* **903**, 166389 (2023).
39. A. Egan, T. Moloney, J. B. Murphy, P. J. Forrestal, Ribwort plantain inclusion reduces nitrate leaching from grass-clover swards; A multi-year five soil study. *Agriculture, Ecosystems & Environment* **380**, 109376 (2025).
40. M. Suter, O. Huguenin-Elie, A. Lüscher, Multispecies for multifunctions: combining four complementary species enhances multifunctionality of sown grassland. *Scientific Reports* **11**, 3835 (2021).
41. G. Grange, C. Brophy, R. Vishwakarma, J. A. Finn, Effects of experimental drought and plant diversity on multifunctionality of a model system for crop rotation. *Scientific Reports* **14**, 10265 (2024).
42. L. M. Cranston, P. R. Kenyon, S. T. Morris, P. D. Kemp, A review of the use of chicory, plantain, red clover and white clover in a sward mix for increased sheep and beef production. *Journal of New Zealand Grasslands* **77**, 89-94 (2015).
43. I. Ikoyi, G. Grange, J. A. Finn, F. P. Brennan, Plant diversity enhanced nematode-based soil quality indices and changed soil nematode community structure in intensively-managed agricultural grasslands. *European Journal of Soil Biology* **118**, 103542 (2023).
44. C. S. Malisch *et al.*, The importance of multi-species grassland leys to enhance ecosystem services in crop rotations. *Grass and Forage Science* **79**, 120-134 (2024).
45. M. Dodd, T. Rhodes, Multi-year performance of white clover oversown into eastern North Island hill country. *Journal of New Zealand Grasslands* **86**, 129-134 (2024).
46. A. K. Knapp *et al.*, Rainfall variability, carbon cycling, and plant species diversity in a mesic grassland. *Science* **298**, 2202-2205 (2002).
47. D. Loka *et al.*, Impacts of abiotic stresses on the physiology and metabolism of cool-season grasses: A review. *Food and Energy Security* **8**, e00152 (2019).
48. Å. Ergon *et al.*, How can forage production in Nordic and Mediterranean Europe adapt to the challenges and opportunities arising from climate change? *European Journal of Agronomy* **92**, 97-106 (2018).
49. M.-N. Thivierge *et al.*, Perennial forages in cold-humid areas: Adaptation and resilience-building strategies toward climate change. *Agronomy Journal* **115**, 1519-1542 (2023).
50. E. Haughey *et al.*, Higher species richness enhances yield stability in intensively managed grasslands with experimental disturbance. *Scientific Reports* **8**, 15047 (2018).

51. J. O'Malley *et al.*, Multispecies grasslands produce more yield from lower nitrogen inputs across a climatic gradient, *Dryad* (2025). <https://doi.org/10.5061/dryad.8931zcs2t>
52. N. T. Longford, *Random coefficient models*. (Oxford University Press, New York, 1993).
53. B. T. West, K. B. Welch, A. T. Gałeczki, *Linear mixed models: a practical guide using statistical software, second edition*. (Chapman and Hall/CRC, New York, ed. 2, 2022).
54. M. Loreau *et al.*, Biodiversity and ecosystem functioning: current knowledge and future challenges. *Science* **294**, 804-808 (2001).
55. Q. H. Vuong, Likelihood ratio tests for model selection and non-nested hypotheses. *Econometrica* **57**, 307-333 (1989).
56. R Core Team, R: a language and environment for statistical computing, version 4.4.2. <https://www.R-project.org/> (2024).
57. SAS Institute Inc., in *SAS/STAT® 15.2 User's Guide*. (Cary, NC: SAS Institute Inc., 2023).
58. H. Wickham, ggplot2: Elegant graphics for data analysis, version 3.5.1. <https://ggplot2.tidyverse.org> (2016).
59. D. Kahle, H. Wickham, ggmap: spatial visualization with ggplot2. *The R Journal* **5**, 144-161 (2013).
60. R. Vishwakarma, C. Brophy, L. Byrne, C. Hurley, DImodelsVis: visualising and interpreting statistical models fit to compositional data, version 1.0.1. <https://CRAN.R-project.org/package=DImodelsVis> (2024).
61. R. Vishwakarma, C. Brophy, C. Hurley, PieGlyph: axis invariant scatter pie plots, version 1.0.0. <https://CRAN.R-project.org/package=PieGlyph> (2024).

## Acknowledgements:

We acknowledge use of the experimental design and elements of the sampling protocol developed by LegacyNet (<https://legacynet.scss.tcd.ie/>).

## Funding:

We acknowledge the contribution of research resources by participating institutions, which made this voluntary network possible.

Research Ireland Frontiers for the Future programme, grant number 19/FFP/6888 (CB, JOM).

TCD Postgraduate Research Studentship, code 1252 (JOM).

Multi4More (project ref. 21R456) funded by the Department of Agriculture, Food & the Marine and the Department of Agriculture, Environment and Rural Affairs (JAF, RV).

European Union's Horizon 2021 doctoral network programme under the Marie Skłodowska-Curie grant agreement No. 101072579 (LegumeLegacy) (CB, JAF, CSM, BG, CKR, NJH).

Teagasc Walsh Scholarships Programme (GG, ref: 2017021) and (ASK, ref: 2019002).

The Research Council of Norway (ÅE, grant agreement 332810).

## Author contributions

Conceptualization: JOM, CB, JAF, CSM, MS, GG, AL

Data curation: JOM, CB, RV

Formal Analysis: JOM, CB, JAF, MS, RV

Funding acquisition: JOM, CB, JAF, AL

Investigation: JAF, CSM, STM, GP, MNT, DA, PRA, TMB, ADB, ÅE, BG, GG, JH, NJH, OHE, JJ, JMJ, JL, RL, GL, AL, TM, CKR, IS, ASK, YZ, FZ

Methodology: JOM, CB, JAF, MS, AL, RV

Project administration: CB, JAF, CSM

5 Software: JOM, CB, RV

Supervision: CB, JAF, CSM, MS

Visualization: JOM, CB, JAF, MS, RV, AL

Writing – original draft: JOM, CB, JAF, CSM, MS, STM, GP, MNT, AL

10 Writing – review and editing: JOM, CB, JAF, CSM, MS, STM, GP, MNT, DA, PRA, TMB, ADB, ÅE, BG, GG, JH, NJH, OHE, JJ, JMJ, JL, RL, GL, AL, TM, CKR, IS, ASK, RV, YZ, FZ

**Competing interests:** Authors declare that they have no competing interests

15 **Data and materials availability:** No new materials were generated in this study. All data and code required to perform the analysis is publicly available on Dryad, DOI: 10.5061/dryad.8931zcs2t (51).

### **Supplementary materials**

20 Materials and methods

Figures S1 – S9

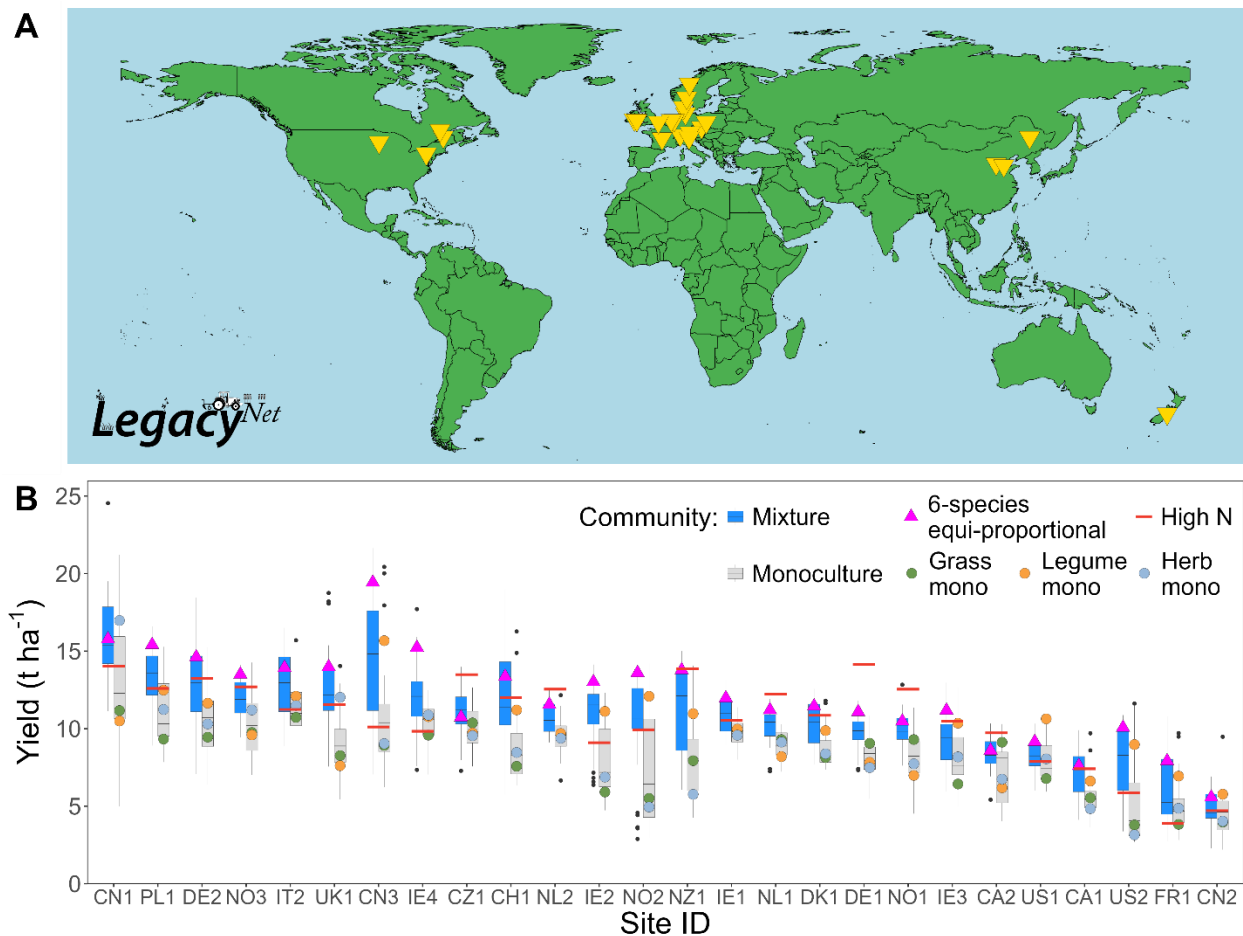
Tables S1 – S4

References (52-61)

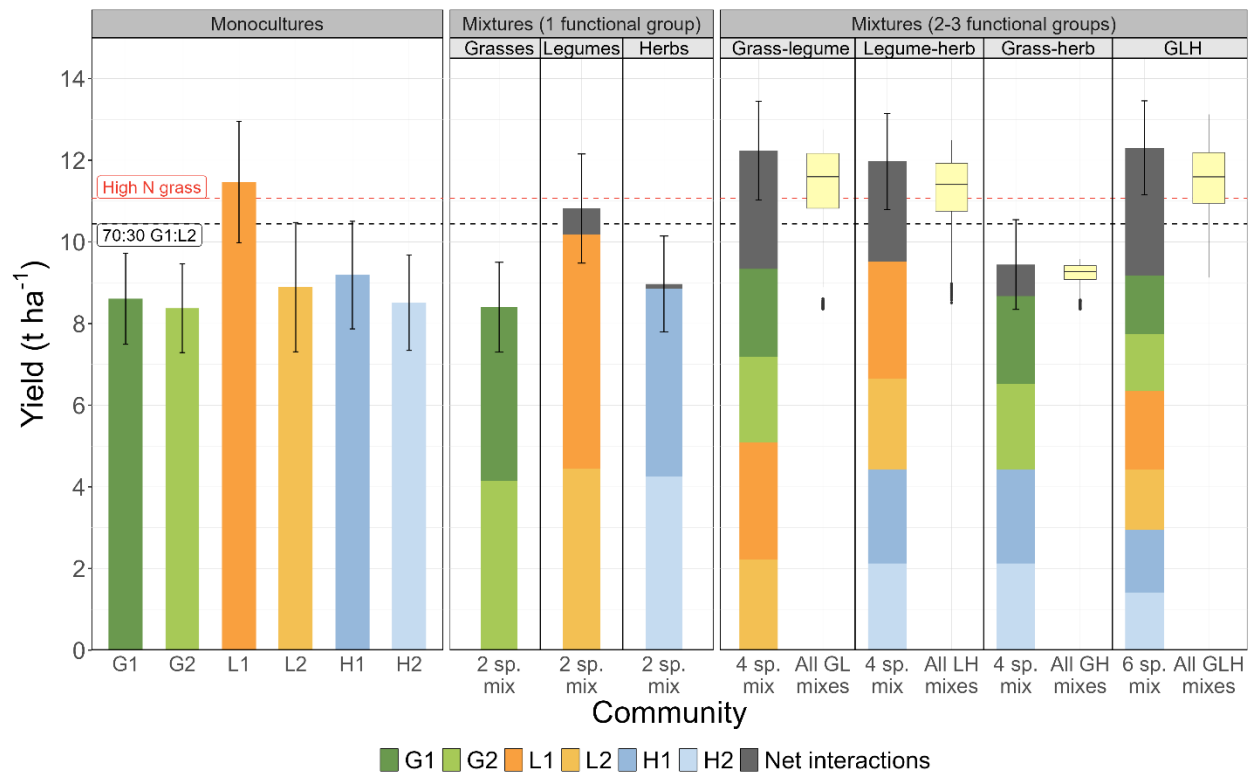
25 **Other Supplementary Materials for this manuscript include the following:**

Data S1 (available on Dryad (51))

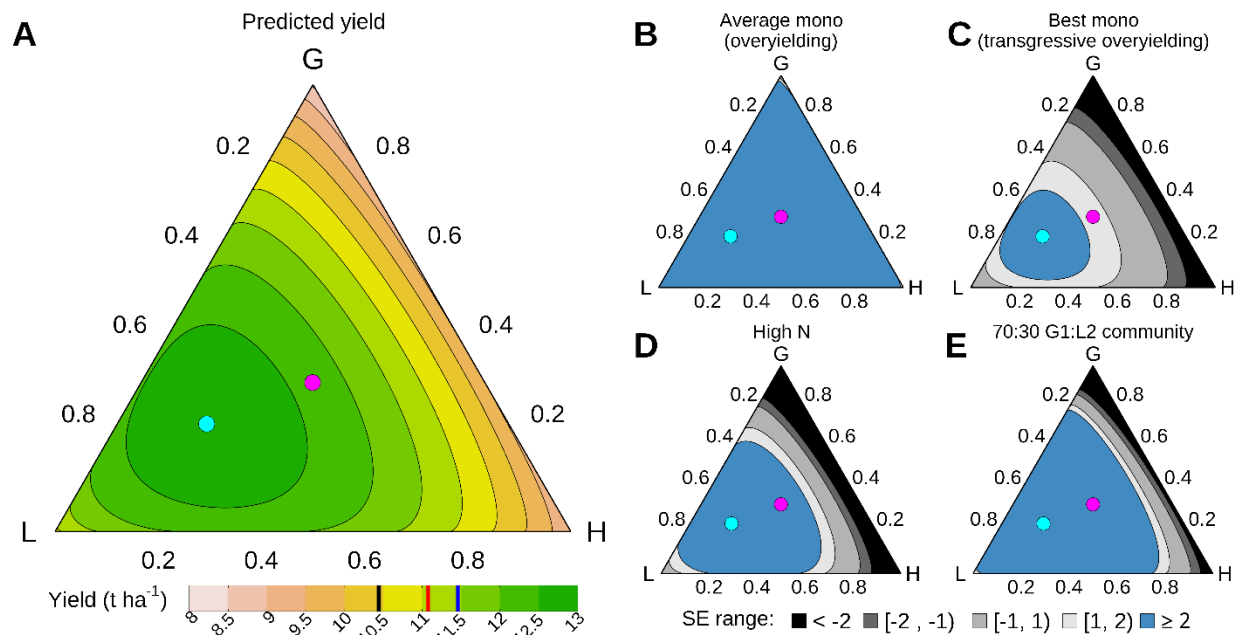
Figures



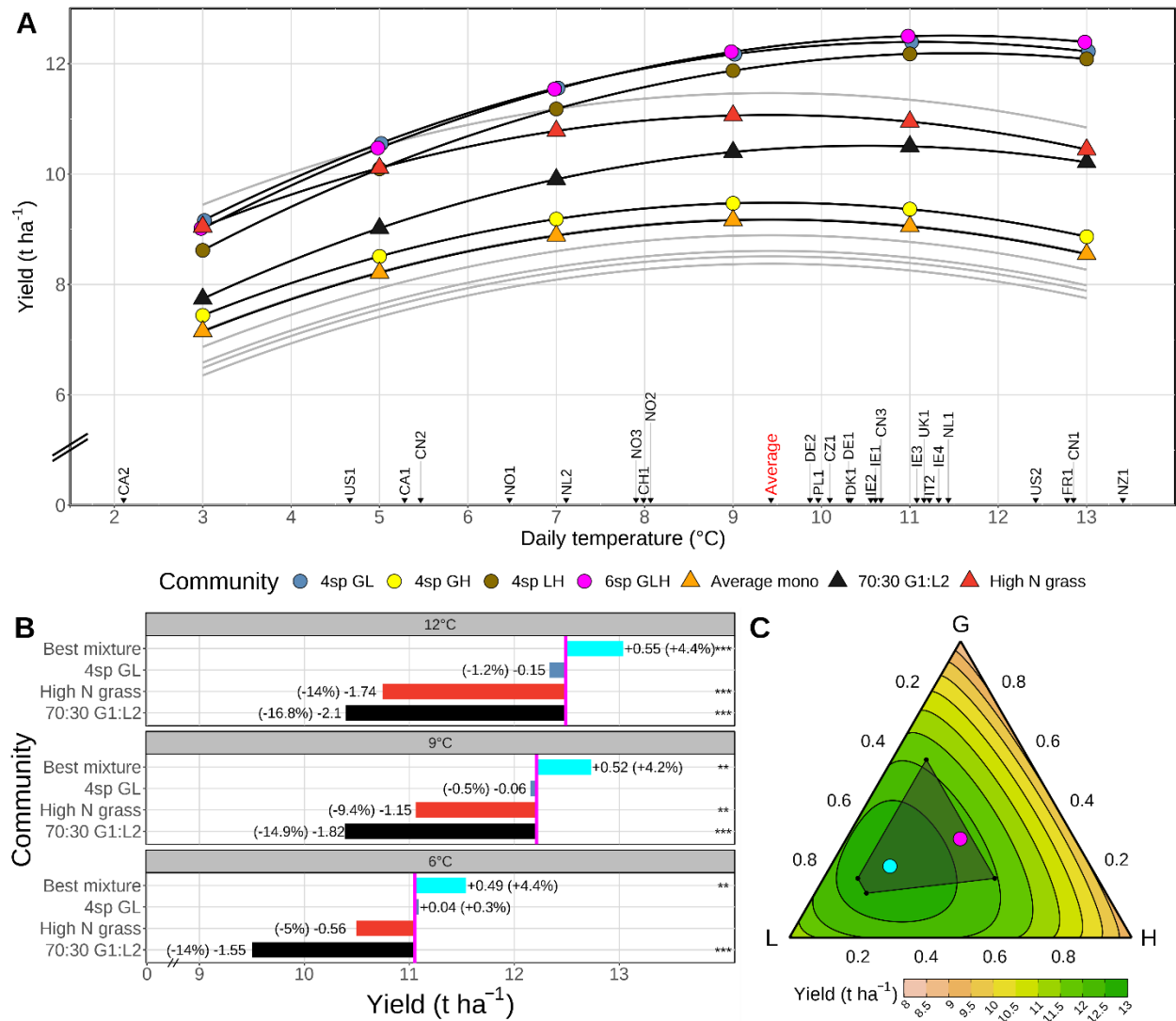
**Fig. 1. Yields varied substantially across the LegacyNet sites. (A)** The locations of the 26 LegacyNet sites indicated by inverted yellow triangles (see Data S1 for the site location details and ID codes). **(B)** The yield per growing season ( $\text{t ha}^{-1}$ ) based on plot-level measurements for each site are shown in boxplots that are grouped by mixtures (blue; 29 plots per site) and monocultures (grey; 18 plots per site), at the moderate N fertilizer level. The average yield of the six-species equi-proportional mixture plots (three plots per site) is shown as a magenta triangle. The average yield of the monoculture plots from each functional group is highlighted with a circle (green for grass, orange for legume and light blue for herb; six monoculture plots per functional group per site). The average yield of the high N grass monoculture (five plots per site) is shown by a red horizontal line. Sites are arranged on the x-axis in order of decreasing median yield.



**Fig. 2. Yields of monocultures and multispecies mixtures with varying functional group richness.** Predicted yield per growing season ( $\text{t ha}^{-1}$ ) for selected communities across sites (predicted from the model estimates in Table S2,  $n = 1,382$ ). For each bar, yield predictions are broken down by the components of the model prediction (model species' identity effect estimates, each scaled by the respective sown proportion, plus scaled net interactions for mixtures; G1 = grass 1, G2 = grass 2, L1 = legume 1, L2 = legume 2, H1 = herb 1 and H2 = herb 2). The error bars show 95% confidence intervals for each prediction. The monoculture bars show predicted yield for the six monoculture communities. The 'Mixtures (1 functional group)' bars show predictions for the equi-proportional two-species mixtures where the two species are from the same functional group. For the G1:G2 equi-proportional mixture, the interaction term is negative and therefore not shown (effect =  $-0.09 \text{ t ha}^{-1}$ ,  $\text{SE} = 0.17$ ); the height of the bar represents the contribution of G1 and G2 to the yield, minus the negative interaction effect. The 'Mixtures (2–3 functional groups)' bars show predicted yields for the four-species equi-proportional GL, LH and GH mixtures, and the predicted yield of the six-species equi-proportional GLH mixture. The boxplots show the estimated distributions of predicted responses for all possible GL mixtures, LH mixtures, GH mixtures, and GLH mixtures. The dashed red line is the predicted yield of the high N grass monoculture. The dashed black line is the predicted yield of a 70:30 G1:L2 two-species community, where G1 was *L. perenne* and L2 was *T. repens* at the majority of sites.



**Fig. 3. Higher yields from increased plant diversity.** (A) Ternary diagram illustrating predicted yield (t ha<sup>-1</sup>) across all sites as the sown proportions of the three functional groups vary, and with the two species within each functional group sown in equal proportions to each other. Note that the vertices of the ternary are two-species communities of grasses (G), legumes (L), or herbs (H), not monocultures of individual species. The highest predicted yield is marked by a cyan circle (with sown functional group proportions: G:L:H = 24:59:17 and corresponding sown species proportions = 0.12: 0.12: 0.295: 0.295: 0.085: 0.085). In the yield legend, values are marked for the predicted responses of the 70:30 G1:L2 community (black), the high N grass monoculture (red), and the highest yielding monoculture (blue). The predicted yield for the equi-proportional six-species mixture is shown by a magenta circle. The remaining panels show the difference (measured in standard errors) of the predicted yield in A from: (B) the weighted average monoculture (for the component species at each point in the ternary; overyielding), (C) the highest yielding monoculture (i.e., L1, which was *T. pratense* at most sites; transgressive overyielding), (D) the high N grass monoculture, and (E) the 70:30 G1:L2 two-species community, where G1 was *L. perenne* and L2 was *T. repens* at most sites. For example, a point on panel D within the highest contour level (colored blue) represents a mixture whose predicted yield is more than two standard errors greater than the predicted yield of the high N grass monoculture. The six-species equi-proportional mixture and the optimal mixture are marked in B to E for comparison to panel A.



**Fig. 4. As mean site temperatures increased, multispecies mixtures best maintained yield. (A)** Predicted yields across the gradient of  $3^{\circ}\text{C}$  to  $13^{\circ}\text{C}$  average daily temperature for selected communities: the four-species equi-proportional mixtures of grass-legume, grass-herb and legume-herb (blue, yellow and brown circles, respectively), the six-species equi-proportional mixture of grass, legume and herb (magenta circle), the average of the six monocultures (orange triangle), the two-species 70:30 G1:L2 community (black triangle), and the high N grass monoculture (red triangle). Grey curves show the predicted yields of the six monoculture species (from highest- to lowest-yielding these are L1, H1, L2, G1, H2, G2). Circles on the top two curves are jittered. Site ID labels (Data S1) are included along the x-axis to indicate the average daily temperature at each site during the experimental period, the across-site average of daily temperatures is indicated as ‘Average’ (in red). **(B)** The predicted yield ( $\text{t ha}^{-1}$ ) for the equi-proportional six-species mixture for three average daily temperatures  $3^{\circ}\text{C}$ ,  $9^{\circ}\text{C}$  and  $12^{\circ}\text{C}$  (vertical magenta line in each panel). For each temperature, differences are shown between the six-species equi-proportional mixture and each of four selected communities (as labeled on the y-axis): 70:30 G1:L2 community (black), high N grass (red), four-species equi-proportional grass-legume mixture (blue), and the optimal ‘best’ mixture (cyan). Significant differences are

highlighted on the right-hand side (\*\* $p < 0.0001$ , \*\*  $p < 0.001$ , \*  $p < 0.05$ ). (C) Ternary diagram showing predicted yield ( $\text{t ha}^{-1}$ ) across all sites. The shaded region identifies a range of sown proportions of grasses, legumes and herbs for multispecies communities that optimize yield.